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Design and Optimization of a Biomanufacturing-Driven Reference Mission Architecture for the Human Exploration of Mars

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Design and Optimization of a Biomanufacturing-Driven Reference Mission Architecture for the Human Exploration of Mars

by

Aaron Jacob Berliner

A dissertation submitted in partial satisfaction of the

requirements for the degree of

Joint Doctor of Philosophy with The University of California, San Francisco

in

Bioengineering

in the

Graduate Division

of the

University of California, Berkeley

Committee in charge:

Professor Adam P. Arkin, Chair Professor Douglas Clark Professor William Collins Professor Anthony Hunt

Summer 2022

Design and Optimization of a Biomanufacturing-Driven Reference Mission Architecture for the Human Exploration of Mars

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#### Abstract

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#### Joint Doctor of Philosophy with The University of California, San Francisco in Bioengineering

#### University of California, Berkeley

#### Professor Adam P. Arkin, Chair

Despite a myriad of national space agencies, industrial partners, university laboratories, and policy groups preparing for human exploration of the Martian surface, there remains a need for a single reference mission architecture (RMA) that models and captures the vast design parameter space, and hence the complexities, of a Mars human exploration operation. The available literature often focuses on shorter-term, opposition-class exploration missions of approximately 30 days of surface operations, instead of the more probable, longer-term, conjunction-class exploration missions of approximately 500 days of surface operations. A critical aspect of these longer duration missions is determining the food, medicine, and materials that are necessary to support a crew over the specified lengthy time-period. In the following dissertation I demonstrate the progress towards the development of a biomanufactory-driven RMA. A crewed mission to and from Mars may include an exciting array of enabling biotechnologies that leverage inherent mass, power, and volume advantages over traditional abiotic approaches. I begin this dissertation by articulating the scientific and engineering goals and constraints, along with example systems, that guide the design of a surface biomanufactory. Extending past arguments for exploiting stand-alone elements of biology, I argue for an integrated biomanufacturing plant replete with modules for microbial *in situ* resource utilization, production, and recycling of food, pharmaceuticals, and biomaterials required for sustaining future intrepid astronauts. Here I also discuss aspirational technology trends in each of these target areas in the context of human and robotic exploration missions. I then formalize the mathematical framework for modeling a biomanufacturing system developing the resources for sustaining a human exploration mission on the surface of Mars by establishing mission goals, extending the Equivalent System Mass framework for comparison of missions, develop the framework for modeling a Martian resource inventory in terms of supplies both produced via ISRU processes and transported as cargo from Earth, and develop the framework required for sustaining a human crew in terms of essential resources. Using this collection of frameworks, I develop a software framework to implement and integrate process models that can be experimentally validated by the collaborations of the Center for the Utilization for Biological Engineering in Space, beginning with the crop cultivation models for food consumption and pharmaceutical development for astronauts. Finally, I presents an argument for how Space Bioprocess Engineering drives sustainability on- and off-World. Although *raison d'etre* of Space Bioprocess Engineering is the design, realization, and management of biologically-driven technologies for supporting offworld human exploration, it has the potential to offer transformative solutions to the global community in pursuit of the United Nations Sustainable Development Goals. Here we address the growing sentiment that investment in spacefaring enterprises should be redirected towards sustainability programs. In outlining the Earth-benefits of dual-use Space Bioprocess Engineering technologies, we both show that continued investment is justified

and offer insight into specific R&D strategies.

To My Father, Who I laid to Earth in sound.

To My Mother, Who gave me the stars in song.

To My Mentor, With whom that distance I sojourn in symphony.

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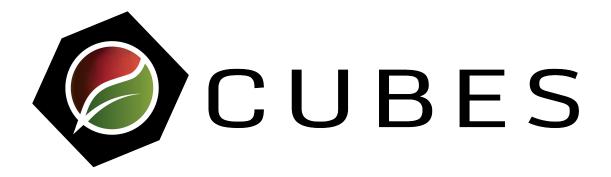
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"If it can be done, it will be done. We can transform Mars and build it like you would build a cathedral, as a monument to humanity and the universe both. We can do it, so we will do it. So -" he held up a palm, as if satisfied that the analysis had been supported by the data in the graph – as if he had examined the periodic table, and found that it still held true – "we might as well start."

# Center for the Utilization of Biological Engineering in Space



Even before NASA reached the Moon, endeavors to design mission specifications were being drafted with step required to reach the surface of Mars[545, 59, 434]. Decades later in 2004, the President Bush unveiled a plan to return to the moon and on to Mars[68]. Now in 2021, the United States of America still dreams of reaching Mars[337].

For decades, NASA has continued to develop a wide array of technologies for advancing human space exploration. In late 2017, and under the premise that biological systems can provide utility in space[372, 371], NASA funded a proposal for the establishment of a Space Technology Research Institute (STRI) called the Center for the Utilization of Biological Engineering in Space (CUBES) to support biomanufacturing for deep space exploration that realizes the inherent mass, power, and volume advantages of space biotechnology over traditional abiotic approaches[209]. I begin my dissertation with this chapter on CUBES, prior to even the introduction and background of science, as homage to the importance of institutional management which makes such science possible. Here, I offer a brief explanation of CUBES in order to (1) establish an envelope of the institution and mandate that scopes the following dissertation; (2) establish the relationship of CUBES with respect to NASA; and (3) give credit to the many scientists and engineers who have build our center.

This center was tasked with advancing the practicality of deploying an integrated, multifunction, multi-organism biological system on a Mars mission through multidisciplinary research culminating in a biomanufacturing demonstration of materials, pharmaceuticals, and food. The primary tasks<sup>[209]</sup> for CUBES are

- 1. In situ microbial media and feedstock division (MMFD), which harnesses Mars atmospheric and regolith resources for downstream biological use;
- 2. In situ manufacture of mission products, which creates outputs like propellants and building materials that are fundamental enablers of any long-duration space mission;
- 3. In situ food and pharmaceutical synthesis, which allows these long-duration space missions to be manned, and uses plants and microbes that provide food, nutrients and medicine;
- 4. Systems design and integration, to optimally allocate and utilize Mars resources, to tightly integrate and automate internal processes, and to satisfactorily achieve performance per mission specifications.

CUBES was designed in alignment with the 2015 NASA Technology Roadmaps, especially TA07 Human Exploration Destination Systems. TA07 includes TA7.1 In Situ Resource Utilization (the MMFD, BBMD, and FPSD will all use such inputs), TA7.2 Sustainability and Supportability (the MMFD, BBMD, and FPSD will all use sustainable resource recycling), TA7.4 Habitat Systems (CUBES will develop a semi-autonomous proof-of-concept biomanufacturing demonstration), and TA7.6 Cross-Cutting Systems (the BBMD additive manufacturing technology will be designed for scaling assembly). Additionally, CUBES will facilitate the development of technologies in TA06 Human Health, Life Support, and Habitation Systems by enabling long-duration, deep-space human exploration through the minimization of resupply consumables and increased Earth independence via Martian in situ resource utilization, synthetic biology, and biomanufacturing. The FPSD will address TA6.3 Human Health and Performance, and the MMFD will address TA6.1 Environmental Control, Life Support Systems and Habitation Systems, and TA6.4 Environmental Monitoring, Safety, and Emergency Response through remediation of toxic perchlorate in the Martian regolith.

As of the writing of this report in completion of this dissertation, CUBES has published  $\sim 68$  papers (all of which can be openly accessed via our website here) and which we have visualized categorically in the Figure below. An analysis of 47 of the referable papers (via WebOfScience) reports 540 citations with an average citation of 11.49/paper – and a CUBES H-Index of 9. Moving into the CUBES no-cost-extension and next phase of CUBES-II we expect to add another  $\sim 5$ -10 publications to our dossier in the coming months.

As we wrap up CUBES, we have officially sunsetted our popular seminar series (schedule available here). Over the course of 5 years, we are proud to have offered  $\sim 60$  seminars drawn from both internal CUBES researchers and external experts in the space and biomanufacturing community. All seminar materials have been achieved and can be accessed here.

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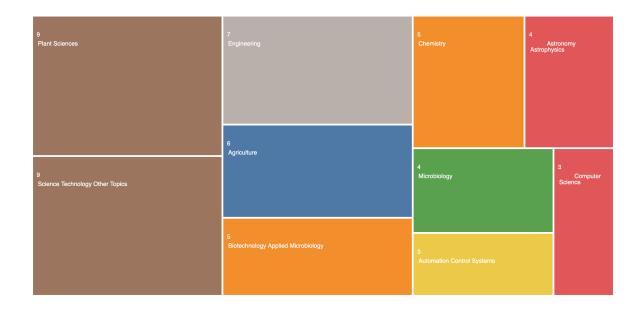


Figure 0.1: NNX17AJ31G TreeMap Visualization



Figure 0.2: Y5 Spring Review Group Photo

# Chapter 1

# Introduction

### 1.1 Background and Motivation

In over a century of grand visions for the human exploration of Mars, the notion of footsteps in red sand have padded from science fiction story devices [458] to the raison d'être of national organizations. Motivational appeals have been cast in a variety of languages; some have argued that we must go as a matter of pure science in an effort to probe the untouched geology for clues to the early solar system or the origins of life. Others have argued that we must go to answer the challenge of climbing the highest mountain, and others still have argued that we must go as a means to forge a new future. While motivations vary, we are certain that meeting the grand scientific and technical challenges required to enable human exploration of Mars represents a call to the better angels of our nature and will usher in new paradigms in discovery, development, and society.

Extended human stay in space or upon the surface of alien worlds like Mars introduces new mission elements that require innovation[394]; among these are the biotechnological elements[371, 372, 401] that support human health, reduce costs, and increase operational resilience. The potential for a Mars mission in the early 2030s[147] underscores the urgency of developing a roadmap for advantageous space biotechnologies.

A major limiting factor of space exploration is the cost of launching goods into space[557]. The replicative capacity of biology reduces mission launch cost by producing goods ondemand using *in situ* resources[444], recycling waste products[221], and interacting with other biological processes for stable ecosystem function[194]. This trait not only lowers initial launch costs, but also minimizes the quantity and frequency of resupply missions that would otherwise be required due to limited food and pharmaceutical shelf-life[156] on deep space missions. Biological systems also provide robust utility via genetic engineering, which can provide solutions to unforeseen problems and lower inherent risk[371, 40]. For example, organisms can be engineered on-site to produce a pharmaceutical to treat an unexpected medical condition when rapid supply from Earth would be infeasible[366]. A so-called "biomanufactory" for deep space missions[370] based on *in situ* resource utilization and com-



**Figure 1.1:** Artist's rendering of a crewed Martian biomanufactory powered by photovoltaics, fed via atmospheric ISRU, and capable of food and pharmaceutical synthesis (FPS), *in situ* manufacturing (ISM), and biological loop closure (LC). Artwork by Davian Ho.

posed of integrated biologically-driven subunits capable of producing food, pharmaceuticals, and biomaterials (Fig. 1.1) will greatly reduce launch and resupply cost, and is therefore critical to the future of human-based space exploration[371, 401].

### 1.2 Thesis Statement

In an effort to address the aforementioned challenges for human exploration of Mars – across the contexts of spacefaring, space bioprocess engineering, and mission design – we summarize our over arching hypothesis as

#### The optimal set of technologies and operational strategies for sustaining a longduration human exploration mission on Mars is driven by the design, optimization, deployment, and management of a surface biomanufactory.

Given that the overarching hypothesis of the CUBES program is that biological engineering technologies can provide utility for long-term human exploration missions on Mars, my proposed project is the design and optimization of a biomanufacturing-driven RMA for the human exploration of Mars. In essence, what follows is a collection of models of various systems designed<sup>1</sup> (1) to demonstrate and physical or engineering principle; (2) to prove data consistency with or discriminate among theories; (3) to predict future behaviors or response

<sup>&</sup>lt;sup>1</sup>These goals of constructing a model, generally, are the guidelines of my PI Adam Arkin

to perturbation; and (5) to design or optimize a system. The reason underlying research questions that guide the construction and integration of these models are

- 1. How can we model the parametric constraints on and tradeoffs among bioprocesses such that they meet or exceed mission need and are engineered to minimize the risk of failure under different orbital, crew, and landing site scenarios?
- 2. What are the critical system parameters for demonstrating the feasibility and advantages of biological engineering on a human exploration mission to Mars?
- 3. Do any requirements for long term exploration exceed the feasible system parameters?

### **1.3** Thesis Outline

In an effort to most efficaciously present the progress towards address the overall hypothesis and the accompanying research questions, the following dissertation is organized as followings.

**Chapter 2** explores the future of Space Bioprocess Engineering (SBE) as an emerging multi-disciplinary field to design, realize, and manage biologically-driven technologies specifically with the goal of supporting life on long term space missions. SBE considers synthetic biology and bioprocess engineering under the extreme constraints of the conditions of space. A coherent strategy for the long term development of this field is lacking. In this Perspective we describe the need for an expanded mandate to explore biotechnological needs of the future missions. We then identify several key parameters – metrics, deployment and training – which together form a pathway towards the successful development and implementation of SBE technologies of the future.

**Chapter 3** presents a perspective that articulates the scientific and engineering goals and constraints, along with example systems, that guide the design of a surface biomanufactory. Extending past arguments for exploiting stand-alone elements of biology, we argue for an integrated biomanufacturing plant replete with modules for microbial *in situ* resource utilization, production, and recycling of food, pharmaceuticals, and biomaterials required for sustaining future intrepid astronauts. We also discuss aspirational technology trends in each of these target areas in the context of human and robotic exploration missions.

**Chapter 4** presents the progress towards formalizing the mathematical framework for modeling a biomanufacturing system developing the resources for sustaining a human exploration mission on the surface of Mars by establishing mission goals, extending the Equivalent System Mass framework for comparision of missions, develop the framework for modeling a Martian resource inventory in terms of supplies both produced via ISRU processes and transported as cargo from Earth, and develop the framework required for sustaining a human crew in terms of essential resources. NASA mission systems proposals are often compared using an equivalent system mass (ESM) framework, wherein all elements of a technology to deliver an effect – its components, operations and logistics of delivery – are converted to effective masses, which has a known cost scale in space operations. To date, ESM methods and the tools for system comparison largely fail to consider complexities stemming from multiple transit and operations stages, such as would be required to support a crewed mission to Mars, and thus do not account for different mass equivalency factors during each period and the inter-dependencies of the costs across the mission segments. Further, ESM does not account well for the differential reliabilities of the underlying technologies. The uncertainty in the performance of a technology should incur an equivalent mass penalty for technology options that might otherwise provide a mass advantage. Here we draw attention to the importance of addressing these limitations and formulate the basis of an extension of ESM that allows for a direct method for analyzing, optimizing, and comparing different mission systems. We outline a preliminary example of applying extended ESM (xESM) through a technoeconomic calculation of crop-production technologies as an illustrative case for developing offworld biomanufacturing systems.

**Chapter 5** presents the computational methods and construction of echusOverlook (eO) software. eO is a tool for designing, exploring, and optimizing a biologically driven RMA for human exploration of Mars

**Chapter 6** presents the first RMA case-study for evaluating the photovoltaics-driven power production on Mars. A central question surrounding possible human exploration of Mars is whether crewed missions can be supported by available technologies using *in situ* resources. Here, we show that photovoltaics-based power systems would be adequate and practical to sustain a crewed outpost for an extended period over a large fraction of the planet's surface. Climate data were integrated into a radiative transfer model to predict spectrally-resolved solar flux across the Martian surface. This informed detailed balance calculations for solar cell devices that identified optimal bandgap combinations for maximizing production capacity over a Martian year. We then quantified power systems, manufacturing, and agricultural demands for a six-person mission, which revealed that photovoltaics-based power generation would require <10 t of carry-along mass, outperforming alternatives over ~50% of Mars' surface.

**Chapter 7** presents the second RMA case-study for Nitrogen accountancy in space agriculture. Food production and pharmaceutical synthesis are critical biotechnologies to enable human exploration of Mars because they reduce mass and volume requirements through scalable and modular agriculture in closed-loop systems. The NASA-sponsored modified energy cascade (MEC) model used to evaluate crop growth is insufficient as a tool to support exploration missions in its monocrop architecture, incomplete material balances on key crop cultivation and life support resources like nitrogen, and lack of the rigorous physical inventory accounting that is required to evaluate mission costs. We expand the MEC model to account for nitrogen dependence across an array of crops and validate our model with experimental fitting of parameters. By adding nitrogen limitations, the extended MEC model accounts for potential interruptions in feedstock supply. Furthermore, we use sensitivity analysis to distil key consequential parameters that may be the focus of future experimental efforts. Finally, the integration of physical system inventories enables comparisons in the choice of architecture and technology.

Chapter 8 presents the 3rd RMA case-study for evaluating the cost of pharmaceutical purification for a long-duration space exploration medical foundry. There are medical treatment vulnerabilities in longer-duration space missions present in the current International Space Station crew health care system with risks, arising from spaceflight-accelerated pharmaceutical degradation and resupply lag times. Bioregenerative life support systems may be a way to close this risk gap by leveraging in situ resource utilization (ISRU) to perform pharmaceutical synthesis and purification. Recent literature has begun to consider biological ISRU using microbes and plants as the basis for pharmaceutical life support technologies. However, there has not yet been a rigorous analysis of the processing and quality systems required to implement biologically produced pharmaceuticals for human medical treatment. In this work, we use the equivalent system mass (ESM) metric to evaluate pharmaceutical purification processing strategies for longer-duration space exploration missions. Monoclonal antibodies, representing a diverse therapeutic platform capable of treating multiple spacerelevant disease states, were selected as the target products for this analysis. We investigate the ESM resource costs (mass, volume, power, cooling, and crew time) of an affinity-based capture step for monoclonal antibody purification as a test case within a manned Mars mission architecture. We compare six technologies (three biotic capture methods and three abiotic capture methods), optimize scheduling to minimize ESM for each technology, and perform scenario analysis to consider a range of input stream compositions and pharmaceutical demand. We also compare the base case ESM to scenarios of alternative mission configuration, equipment models, and technology reusability. Throughout the analyses, we identify key areas for development of pharmaceutical life support technology and improvement of the ESM framework for assessment of bioregenerative life support technologies.

**Chapter 9** demonstrates the impact and value of space-based biomanufacturing. Here we identify specific off-world scenarios where the concept is most applicable, as well as the vital inventories that can be made available thereby. This will serve to increase capabilities of human operations beyond Earth-orbit and allow for extended mission-design through greater autonomy while minimizing risks through redundancy. We sketch the potential routes and systems to arrive at these goals in the form of specialized microbial cell factories that can most meaningfully leverage the resources available along the journey. The strategic vision presented here relies heavily on synthetic biology, integrates with major plans for *in situ* resource utilization, and highlights applications that engineered biology is uniquely suited to address. We finish by advocating for the research and development investments that need to be made in order to significantly increase readiness of these technologies over the coming decade. This dovetails with current efforts to return humans to the Moon – with Mars on the horizon. Besides ensuring the feasibility and sustainability of crewed Space exploration and habitation, the advancement of these technologies may spawn a new scalable microgravity-based biotechnology industry that contributes to the creation of a circular economy on Earth.

**Chapter 10** presents an argument for how Space Bioprocess Engineering drives sustainability on- and off-World. Although *raison d'etre* of Space Bioprocess Engineering is the design, realization, and management of biologically-driven technologies for supporting offworld human exploration, it has the potential to offer transformative solutions to the global community in pursuit of the United Nations Sustainable Development Goals. Here we address the growing sentiment that investment in spacefaring enterprises should be redirected towards sustainability programs. In outlining the Earth-benefits of dual-use Space Bioprocess Engineering technologies, we both show that continued investment is justified and offer insight into specific R&D strategies.

# Chapter 2

# Space Bioprocess Engineering on the Horizon

Space Bioprocess Engineering (SBE) is an emerging multi-disciplinary field to design, realize, and manage biologically-driven technologies specifically with the goal of supporting life on long term space missions. SBE considers synthetic biology and bioprocess engineering under the extreme constraints of the conditions of space. A coherent strategy for the long term development of this field is lacking. In this Perspective we describe the need for an expanded mandate to explore biotechnological needs of the future missions. We then identify several key parameters – metrics, deployment and training – which together form a pathway towards the successful development and implementation of SBE technologies of the future.

The following chapter can also found here: <u>A.J. Berliner</u>, I. Lipsky, D. Ho, J. Hilzinger, G. Vengerova, M. McNulty, K. Yates, N.J.H Averesch, C.S. Cockell, L.C Seefeldt, C.S. Criddle, S. Nandi, K.A. McDonald, A.A. Menezes, A. Mesbah, A.P. Arkin. **Space Bioprocess Engineering on the Horizon**. *Communications Engineering*. (2022). DOI: 10.1038/s44172-022-00012-9.

Biotechnologies may have mass, power and volume advantages compared to abiotic approaches for critical mission elements for long-term crewed space exploration [371, 401]. While there has been progress in demonstration and evaluation of these benefits for specific examples in this field such as for food production, and waste recycling, there is only just emerging possible consensus on the scope of the application of biosynthetic and biotransformative technologies to space exploration. Additionally, there is almost no formal definition of the scope, performance needs and metrics, and technology development cycle for these systems. It is time to formally establish the field of Space Bioprocess Engineering (SBE) to build this nascent community, train the workforce and develop the critical technologies for planned deep-space missions. SBE (Fig. 2.1a) borrows elements from a number of related fields such as the synthetic biology design process from Bioengineering, astronaut sustainability [580, 565] and mission design from Astronautics [232, 147], environmental-context and constraints from the Space Sciences, and living systems habitability and distribution concepts from

Astrobiology [180]. SBE represents an extension of the standard astronautics paradigm in meeting NASA's Space Technology Grand Challenges (STGCs) for expanding the human presence in space, managing resources in space, and enabling transformative space exploration and scientific discovery [514, 372] (Fig. 2.1b). Aspirational realizations of SBE would feature prominently in establishment of in-orbit test-facilities, interplanetary waystations, lunar habitats, and a biomanufactory on the surface of Mars<sup>[44]</sup>. Differentiated from traditional efforts in space systems engineering, these SBE systems would encapsulate elements from *in situ* resource utilization (ISRU) for the production of biological feedstocks such as fixed carbon and nitrogen for use as inputs for plant, fungal, and microbial production systems [90, 302], fertilizers for downstream use by plants [444]; in situ (bio) manufacturing (ISM) to produce materials requisite to forge useful tools and replacement parts[554], food and pharmaceutical synthesis (FPS) via plant, fungal and microbial engineering for increased productivity and resilience in space conditions, production of nutrients and protective/therapeutic agents for sustaining healthy astronauts [76, 367]; and life-support loop closure (LC) for minimizing waste and regenerating life-support functions and biomanufacturing. Maximizing the productivity of the biomanufacturing elements increases the delivery-independent operating time of a biofoundry in space while minimizing cost and risk. [435] (Fig. 2.1c). Ultimately, efforts must be mounted to: (1) update the *mandate* to include SBE as a tool for enabling human exploration; (2) specialize the *metrics and methods* that guide SBE technology life-cycle and development; (3) further develop the *means* by which SBE technologies are designed for ground-based testing and matured on offworld platforms (Fig. 2.1d); and (4) train the *minds* entering the spacefaring workforce to better understand the leverage the SBE advantages and capabilities.

# 2.1 An Inclusive Mandate To Leverage SBE

While previous strategic surveys such as NASA's Journey to Mars program[403] the 2018 Biological and Physical Sciences (BPS) Decadal Survey[2] have acknowledged that plants and microbes may be integral parts of life support and recycling systems, but can present challenges to the environmental operation of engineering systems in space due to contamination and other inherent drawbacks. However, no such survey has coherently called for the development of the science and technology to engineer these organisms and their biotransformative processes in support of space exploration. The SBE community requires a mandate that identifies mission designs and elements for which engineering biosystems would be most appropriate, and defines the productivity, risk and efficiency targets for these systems in an integrated context with other mission elements and in fair comparison to abiotic approaches. This will require integration of SBE resources and knowledge across government, industry, and academia. Previous biological strategies should now specifically call for (1) definition of the physical engineering constraints on the production systems and development of optimized reactor/processing systems for these elements; (2) quantitative assessment of the bioengineering required to meet performance goals in space given the special physiology

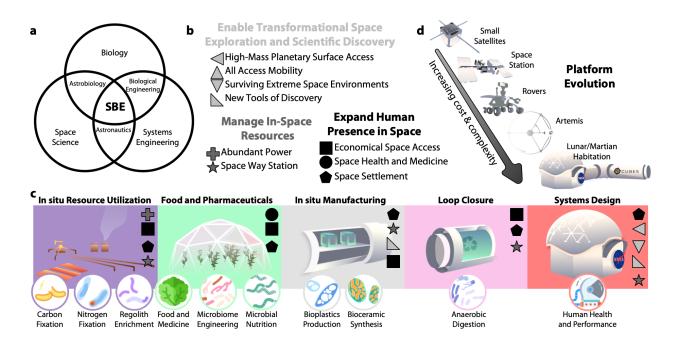


Figure 2.1: Overview of Space Bioprocess Engineering challenges, components, and platforms. (a) Venn Diagrambased definition of Space Bioprocess Engineering (SBE) as an interdisciplinary field. (b) NASA's space technology grand challenges [514] key by shape and colored by group. (c) Possible SBE components separated by colors for *in situ* resource utilization (ISRU), food and pharmaceutical synthesis (FPS), *in situ* manufacturing (ISM), and loop closure (LC), with the biological processes inherent to each represented below in circles. (d) Platform evolution for biological experiments starting with Earth-orbit CubeSats and proceeding through the ISS, Mars-and-Luna-based rovers, to Lunar and cis-Lunar based human and autonomous systems via the Artemis program.

required in an offworld environment; and (3) development of efficient tooling for offworld genetic engineering along with the proper containment and clean-up protocols.

Such a mandate would result in: (1) a deeper, more mechanistic understanding of the growth and phenotypic characteristics of organisms operating in space-based bioprocesses taking into account issues of differences in gravity, radiation, light, water quality; new applications of these organisms off-planet; (3) new reactors, bioprocess control designs and product processing/delivery technologies accounting for these conditions and the specific constraints of scaling and operational simplicity in space. The development of open, publicly accessible data and tools would enable rigorous comparison among biotechnologies and abiotic (physical and chemical) approaches, and across mission-scenarios of higher-fidelity. Ideally, this should create interative sub-communities that may collaborate and compete on different approaches to meet bioengineering goals and metricize results against the mission specifications.

SBE is an emerging engineering discipline and there are long but feasible routes from discovery, through invention to application. Furthermore, SBE is multidisciplinary and its utility within the larger space community demands specialized cross-training of diverse teams. It in such situations agencies like the Department of Energy (DOE) have found it effective to ensure there is specific funding to support longer-term team science to accomplish ambitious scientific and technical goals. The Industrial Assessment Centers (IACs) program is one longest-running DOE programs (started in 1976) and has provided nearly 20,000 no-cost assessments for small- and medium-sized manufacturers and more than 147,000 recommendations in an effort to reduce greenhouse gas emissions without compromising U.S. manufacturing's competitive edge globally [144]. Conversely, successful examples for demonstrating the effect of fostering multidisciplinary centers for space-based biotechnology can be found in NASA's Center for the Utilization of Biological Engineering in Space (CUBES, https://cubes.space/), or ESA's Micro-Ecological Life Support System Alternative (MELiSSA, https://www.melissafoundation.org/) program - with the capabilities to design, prototype, and ultimately translate biological technologies to space while training the necessary workforce. Such centers are tasked with the development of initial concept trade studies; defining requirements; managing life-support interfaces; evaluating ground integration, operations, and maintenance; coordinating mission operations; and supporting and sustaining engineering and logistics [350, 92]. However, these programs are generally restricted to shorter operation timelines – and would benefit from a longer horizon. This is especially true for SBE as biological developments generally require a longer timeframe for integration in industrial endeavors.

# 2.2 Specialization of SBE Metrics and Methods

Response to the proposed expanded mandate above requires careful consideration of the space-specific performance metrics that SBE must fulfill. Payload volume, mass, and power requirements are made as small as possible and are limited in envelope by their carrier system. One of the most compelling aspects of biotechnology is the ability of such systems to adapt to these constraints relative to certain industrial alternatives. To efficiently evaluate and deploy novel biotechnologies, SBE experiments should begin with standardized unit operations that clearly define the desired biological function. This allows for a standardized experimental framework to test modular biotechnologies not only within the system to be engineered, but also within and between research groups. To define the minimal basis set of unit operations for a given mission, test and optimize the biotechnologies for each unit operation, and integrate each unit operation into a stable system, we propose to adopt the methods from standard bioengineering in the form of a Design-Build-Test-Learn (DBTL) cycle[112] (Fig. 2.2).

#### **Performance Metrics**

The design phase of the DBTL cycle begins with the establishment of core constraints and engineering targets that can be explored by standardizing the high-priority performance metrics ({Modularity, Recyclability, Supportability, Autonomy, Sustainability})- which we argue gain special weight in space- from which downstream technoeconomic and life-cycle analysis decisions can be explored (Fig. 2.2a). Modularity assesses the agility of a system in responding to product changeovers and demand variations to maximize flexible biomanufacturing – de-risking on-demand biological production. Recyclability assesses the extent to which wastes and byproducts can be recycled and bioprocesses can be reused/repaired to minimize overall consumable requirements – de-risking circular bioprocessing. Supportability assesses system self-sufficiency to maximize self-reliance and minimize logistic resupply requirements from Earth – de-risking unplanned mission extension. Autonomy assesses the extent to which optimal system performance can be realized under unknown and transient offworld conditions, as well as potential system faults/failures, with minimal human intervention to maximize the system resilience – de-risking robust and fault-tolerant biomanufacturing. Sustainability assesses the flow of environmental assets to minimize environmental footprint and maximize resource efficiency – further de-risking the potential for negative impacts to planetary protection.

The space-specific constraints on performance include: (1) an exceptionally strong weighting on a low mass/volume/power footprint for the integrated bioprocess; (2) limited logistic supply of materials and a narrow band of specifically chosen feedstocks; (3) added emphasis on simplicity of set-up, operation and autonomous function to free up astronaut time; (4) mission-context de-risking against cascading failure; (5) strong requirements for efficiency and closed-loop function to maximize efficient resource use and minimize waste products; (5) a critical need for modularity and 'maintainability' so that parts can be swapped easily, new functions added easily, and repairs can be done without logistical support beyond the crew; (6) an increased dependence on other mission elements such as provision of water, gases, astronaut wastes, power, and other raw materials such a regolith which may vary in abundance, quality, and composition in unpredictable ways; (7) the need to design sustainable and supportable operation across long time horizons without logistical support beyond the bounds of the local mission; (8) increased ability to operate in more extreme environments including low gravity, high radiation, low nutrient input, and other stressors; (9) process compatibility among common media and operational modes to allow for easy process integration and risk-reduction through redundancy of systems; and (10) further consideration and development of biocontainment of engineered organisms to prevent (or at least mitigate) unexpected dispersal of unwanted living systems in pristine or tightly controlled environments[338, 521, 308].

Ideally, this combination of performance metrics provides informative constraints on biology and technology choices. Feedstock, loop-closure, environmental parameters and product needs will constrain the minimal set of organisms to develop and test for growth rate, optimal cultivation, robustness and resilience to space conditions and shelf-life, safety and genetic tractability, product yield, titer and rate, feedstock utilization, ease of biocontainment, streamlining of purification, and waste streams[31]. Once suitable chassis organisms have been evaluated and selected, the DBTL cycle can integrate staged co-design of the optimal process hardware (e.g. molecular biological set-ups, genetic engineering tools, bioreactors, and product post-processing systems) configuration, operating parameters, and process controllers. Aerobic organisms may be much more efficient but only viable in systems in which

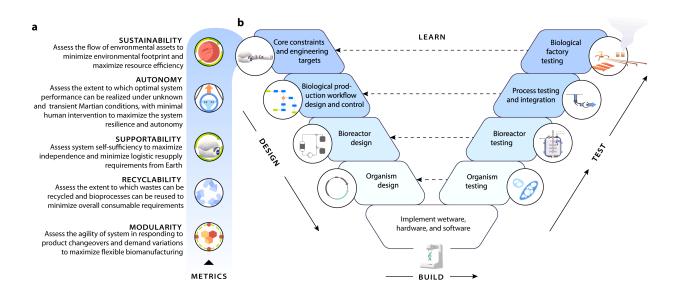


Figure 2.2: Overview of space systems bioengineering (SBE) performance metrics and the SBE-specific Design, Build, Test, Learn (DBTL) cycle. The SBE performance metrics in (a) are shaded to correspond to the top level core constraints and engineering targets within the (b) DBTL cycle.

oxygen is available and easily obtainable. This in particular provides insight into the specific questions that require further study in terms of organism engineering. The question of anaerobic versus aerobic metabolism really depends on the product and the style of process – at small scale aerobics may have an advantage in terms of yield and rate, due to more energy being derived from the transfer of reducing equivalents to cellular metabolism – while at large scale, mass-transfer limitations are dominating these parameters (yield and rate), which gives anaerobics an advantage[560]. Additionally, bioproduct isolation and purification processes need to be considered beyond the Earth-centric means of fermentation. For example, cell-free bioproduction systems may prove critical in biotransformation and point-of-care biosensing as shown in recent space pharming techoeconomic analyses[367]. Operation of the cycle over increasing scale and ever more realistic deployment environments permits controlled traversal of the technology readiness levels for each technology and mission.

#### Design-Build-Test-Learn

In the design phase, we argue that efforts must be made to (1) create a database of engineering targets (products, production rates, production yields, production titers, risk factors, waste/recyclability factors, material costs, operational costs, weight, power demand/generation) that set the core constraints for workflow and mission optimization; (2) leverage emerging pathway design software and knowledge bases[26] to identify the key types of biological production workflows (i.e. metabolic engineering strategies[328]) that need to be modified for different space-based scenarios; (3) identify the supporting biomanufactory design elements within which these production workflows could be implemented[80, 21, 197]; and (4) identify the chassis organisms and other biological components [489, 77, 117] that will be required to compose the complete set for downstream engineering specifications. Systems designed from a minimal set of reliable parts, standard interconnects, and common controller languages also offer the best possible chance of characterized reliability under changing environmental conditions. Therefore, control of hardware and wetware should be augmented through the design and operation of software support. We see a fundamental effort in SBE as the amalgamation of space-driven hardware, software, and wetware that follows a synthetic biology DBTL cycle [97].

The foundation of new SBE performance metrics that guide the design phase of the DBTL cycle must be augmented with additional downstream efforts in the build and test phases to (1) develop a process design framework that takes in specific production needs in amounts/time over acceptable ranges under the constraints expected across different offworld scenarios; (2) create the biological, process, and mission design software platforms to allow sophisticated DBTL, risk assessment, and mission choice support; (3) create the sensor/controller sets that will allow real-time optimization of biological production workflows; and (4) develop the online process controller framework that coordinates reactor conditions and inter-reactor flows to optimize reliable production across all units within acceptable ranges with minimal power and risk. The realization of this SBE DBTL cycle depends on the integration of such benchmark models and modeling standards. These benchmarks describe the dynamics of all SBE processes and relate to the SBE metrics in the design phase from which optimization can be carried out in the learn phase.

DBTL cycles within the scope of SBE must prepare for both ground- and flight-based system operations. Ground-based developments must prioritize designs that meet the requirements for flight-based testing, during which system behaviors may be better characterized in unique environments such as those offered in micro- and zero-gravity. For instance, a biological nitrogen-fixing system on Earth must at least be designed to meet the mass and volumetric constraints required for validated ground-based simulators of microgravity, GCR, other physical stressors. Meeting certain requirements for time, power, and substrate usage is essential for any degree of long-term operation. This allows for the in-flight testing of bioreactors previously evaluated on Earth that can more directly measure the effects micro-gravity, radiation and other stressors on the bioprocessing system. A combination of ground- and flight- based tests are required for the development of functional and robust space biosystems.

#### **Development of Means for SBE Flight**

Deployment of SBE platforms as mission critical elements will likely be reserved for longer duration human exploration missions such as those in the Artemis or Mars programs[44]. These future programs are still in the concept and planning stage in development, but will certainly be composed of a myriad of technologies that range in degree of flight-readiness as standardized by NASA's Technology Readiness Level[339] (TRL, used to rate the maturity of a given technology during the acquisition phase of a program). Recent updates in NASA's definitions of and best-practices for applying the TRL paradigm led to the standardization and merging of exit criteria between hardware and software systems<sup>[229]</sup>. However, the TRL concept as it relates to SBE must be further expanded to include definitions and exit criteria for 'wetware' in addition and in relationship to hardware and software elements.

Deployment of SBE is space requires a level of rigor in technology acceptance that is of a different order than most Earth-based systems because mission failures are exceptionally costly and difficult to recover from. The missions into which SBE processes will integrate are hugely complicated and as noted above will be interdependent in complex ways. Thus while

Platform	Volume	Power	Op. Lifetime	Temperature	Air Comp.
CubeSat	$0.0187 \text{ m}^3$	20-45 W	$\sim 20$ years	Requires heating unit	Self-contained
PocketQube Bioculture System	$0.000125 \text{ m}^3$ Not stated	Variable 140W	~5 years ~60 days	within constraints 37-45°C in main chamber, ambient to 5°C in cooling chamber	Self-contained medical grade gas
WetLab-2 (SmartCycler)	$235.97~\mathrm{m}^3$	350W	Extractions <3hrs, no lifetime stated	50-95°C	
Rodent Habitat Hardware System	$0.019~\mathrm{m}^3$	Not stated	$\sim 30$ day experiments		
Compact Science Experiment Module	$0.0015~\mathrm{m}^3$	3.2W	>1 month experiments	Ambient temp, no	None, reliant on
Vegetable Production System (Veggie)	$0.48 \text{ m}^3$ growth area		>12 day experiments, can replace crops	heating module	cabin air system
Advanced Plant Habitat (APH)	$889.44 \text{ m}^3$ growth area	Not stated	$\sim 1$ year	18-30°C	Self-contained gas supply
Spectrum	$10 \ge 12.7 \text{ cm}$ internal area	Not stated	12 day experiments	18-37°C	None, reliant on cabin air comp
BRIC-60	$11.03 \text{ m}^3$				60M variant can draw from an external gas tank
BRIC-100 BRIC-100VC	$ m 38.78\ m^{3}$ m 16.33\ m^{3}	Unpowered	>12 day experiments 4.5 months	Ambient temp,	Self-contained gas canister of designated
KSC Fixation Tubes (KFTs)	$0.2387~\mathrm{m^3}$	1	67 days	no heating module	Airtight, reliant on cabin air comp
miniPCR	$0.00066 \ {\rm m}^3$	65W	$\sim 2$ year	$< 120^{\circ}\mathrm{C}$	I I I I I I
Group Activation Pack-Fluid Processing Apparatus (GAP-FPA)	Eight $6.5 \text{ cm}^3$ test tubes	Unpowered for manual		4-37°C	
Multi-use Variable-g Platform (MVP)	Twelve 800 $\rm cm^3$ modules	Not stated	Not stated	14-40°C	Airtight, reliant on cabin air comp
MinION	$0.0796~\mathrm{m}^3$	5W	${\sim}1$ year	Ambient temp, no heating module	caom an comp
Perseverance (MOXIE)	$0.017~\mathrm{m}^3$	300W	$\sim 2$ years	800°C operational -60°C ambient	$CO_2$ input $CH_4$ output
Gateway (HALO)	>125 m <sup>3</sup> planned internal volume	$\sim 60 \mathrm{kW}$	>2 years	~18°C	Pressurized cabin air
Mars Hab (6 Crew)	$300 \text{ m}^3$	$\sim 100 \mathrm{kW}$	600 day nominal, 619 day maximum	~18°C	Pressurized cabin air

**Table 2.1:** Constraints on past and current experimental platforms including Small Satellites (light blue), Space Stations (medium blue), Rovers (dark blue), planned Lunar Habitation (light red), and Martian Habitation (red). The shade of color darkens with increasing complexity and cost. The specific sources can be found in the SI.

low levels TRLs can be reach through unit testing in modest formats both on Earth and in limited flight experiments, the integrated nature of the bioprocess control and engineering will require integration testing even at the TRL 4 and 5 levels[229]. To meet acceptance at TRL 6 and beyond will require long term planning realistic integration and deployment testing with actual sophisticated space missions and their logistics.

Even at low TRLs, research on the timescales needed to validate extended-use systems as would be leveraged on extended-stay forward deployment such as Martian or lunar missions are not possible given the current ISS capabilities and constraints. Constraints in astronaut time and limitations in hardware designed for shorter experiments prevent testing times comparable to long duration missions. Table 2.1 outlines a number of constraints on past and current experimental platforms and provides some basis for constraints of future systems (Fig. 2.1d). Here we note that extended multigenerational studies, especially in microbiology, can be difficult with some of the operational lifetimes. [85]. Volume is also constrained, and available space is broken up into segmented rack testbeds and independent machines, which can prevent aspects of a system from interacting with each other (Table 2.1). Much of the testing hardware on the ISS is designed for front-end processing and basic science, and many experiments in microbial observation 286, 67, hybrid life support 284, antibiotic response [28], and more all require returning samples to Earth for efficient processing, limiting the end-product downstream analysis and use as feedstocks for other integrated processes, as is needed to advance TRL beyond 6. This also cuts down on the ability to run DBTL diagnostics and SBE performance metrics on the system *in toto* as recyclability and sustainability are reliant on those end-products, and supportability if the processing is often reliant on Earth resources. Though much of the potential testing: PCR[56], imaging[311], and DNA sequencing [361, 256] is possible with current miniaturized ISS modules, it may not all be at the scale needed for future experiments, and there may be gaps in capability as the field matures. Improved in situ data analysis through development of new, high-throughput instruments could help close those gaps [280] and allow better metricization of whole systems under these new performance paradigms.

Lunar and Martian gravity is likely to have distinct biological effects compared to Earth gravity, resource composition, and radiation profile – and the ISS has only a limited volume in which to simulate them [583]. Additionally, both ambient environmental and target temperature windows span an extensive range across extraterrestrial environments, as do gas compositions, making representative testing more difficult in growth and testing chambers (plant, animal, and microbial) without full environmental control (Table 2.1). Environmental Control and Life Support System (ECLSS) systems for large-scale plant science requisite for advancing TRL for downstream lunar and Martian missions also require larger volume bounding boxes than is currently provided on the ISS[508]. Here we note the trade-offs with the tight volume and power stores on board. Smaller satellite modules can get technologies off the ground to advance TRL[351, 329, 469], but feature even greater size handicaps, and may prevent testing at the integrated, factory level in the DBTL cycle[124, 259]. Scientific instruments and modules on rovers have been geared primarily for exploration and observation, not technology validation. Dedicated rovers or simply landing SBE payloads

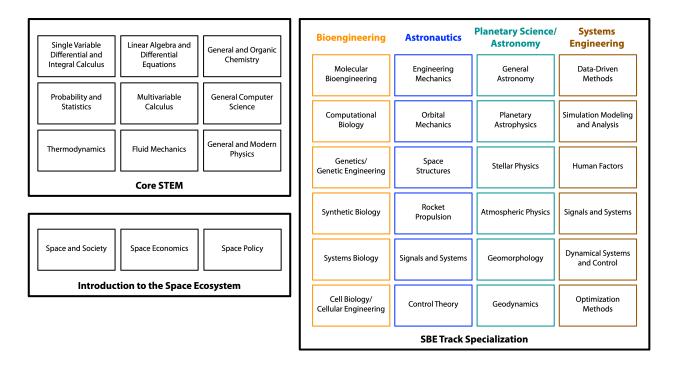


Figure 2.3: Conceptual undergraduate SBE program. The SBE program is broken in three segments: core STEM courses, introduction to space ecosystem courses, and track specialization courses for tracks in bioengineering, astronautics, planetary science & astronomy, and systems engineering.

onto extraterrestrial sites, SBE-ready orbiters, and Artemis operations as a stepping-stone to Mars can all demonstrate technology within a representative context and stand as some of the premier testbeds to "flight qualify" SBE prototypes[339]. In situ testing is key to the proposed SBE performance metrics: it forces technology and bioprocesses into accurate, integrated environments, and provides better confidence under radiation, microgravity, and isolation.

# 2.3 Training of SBE Minds

Maturation of space bioprocess engineering requires specialization of the training needed to produce the next generation of spacefaring scientists, engineers, astronauts, policy makers, and support staff[243]. Lessons learned from the Space Transportation System (STS) era led to calls for an increase in Science-Technology-Engineering-Mathematics (STEM) educational programs[170] beginning in secondary schools[162] and propagating to novel astronautics-based undergraduate[62] and graduate programs[501], and to the establishment of specialty space research centers[365] focused on technology transfer[174]. The calls for workforce development were repeated just prior to the collapse of the STS program, noting the dangers likely to arise from the lack of educational and training resources for those entering the space industry.[204]. Such a risk as described is especially poignant in the case of space-

based biotechnologies given that mature technologies are far fewer, the new applications more futuristic, and the disciplines are not well represented in the traditional physics and engineering curricula. The Universities Space Research Association (USRA) lists 114 institutions with Space Technologies/Science academic programs while recent accounting of bioastronautics programs numbers 36[579]. However, the intersection between these lists yields only 22 schools. Given that US News names 250 world schools that have tagged themselves with Space Science programs, only  $\sim 8\%$  of these are currently offering bioastronautics specialization – demonstrating that efforts that integrate human performance, life support and bioengineering are under-served. Furthermore, the bioastronautics programs such as those offered by schools like Harvard-MIT, University of Colorado Boulder, and Baylor University are not focused on biomanufacturing aspects that underlie SBE[289].

Academia must be prepared to capitalize on the opportunities of future SBE applications starting with either the creation of new and interdisciplinary programs or by assembling those from related disciplines (Fig. 2.1a). Because scientific and mathematical core courses are relatively standard across SBE-related disciplines, an effective foundation of technical skills could be easily constructed from the shared curriculum (Fig. 2.3). From there, specific SBEdriven training can be offered in (1) effects of space on plant and microbes; (2) process design for low gravity/high radiation; (3) management and storage of biological materials in space based operations; (4) low energy/low mass bioreactor/bioprocessor design; (5) integrated biological systems engineering; (6) biological mission planning and logistics; (7) risk and uncertainty management; (8) containment and environmental impact of biological escape, films, corrosion and cleanup; (9) policy awareness/development; and (10) ethics of cultivation and deployment. While the logistics for organizing such pathways for formal SBE training are non-trivial within the academic machine, we note that nearly all schools listed by USRA offer the component programs in bioengineering, planetary science or astronomy, and electrical or systems engineering. Since the courses for such engineering programs are standardized [120], it stands to reason that establishing focused SBE programs can begin by collecting and highlighting course combinations. As programs grow, additional faculty with SBE-driven research can be sourced. Such openings offer a much needed opportunity to address systemic issues of diversity, equity, and inclusion both within SBE-based academia and the industrial space community at large[406].

## 2.4 Moving Forward

Making progress on the program above requires scientists, engineers, and policy experts to work together to verify, open, and update campaign specifications. The science requires scientists from multiple disciplines spanning biological and space systems engineering that require a degree of modularity, small footprints, and robustness not found elsewhere. Additionally, bioprocess and biological engineering must be applied to the building of cross-compatible and scalable processing systems and optimized organisms within the confines of space reactor and product. Finally, coordination mission specialists are critical to deploy tests into space during the run-up and through crewed missions. We argue that such groundwork requires multidisciplinary centers that can build long term partnerships and understanding; train the workforce in this unique application space; and perform the large-scale, long-term science necessary to succeed.

# Chapter 3

# Perspective: Towards a Biomanufactory on Mars

A crewed mission to and from Mars may include an exciting array of enabling biotechnologies that leverage inherent mass, power, and volume advantages over traditional abiotic approaches. In this perspective, we articulate the scientific and engineering goals and constraints, along with example systems, that guide the design of a surface biomanufactory. Extending past arguments for exploiting stand-alone elements of biology, we argue for an integrated biomanufacturing plant replete with modules for microbial *in situ* resource utilization, production, and recycling of food, pharmaceuticals, and biomaterials required for sustaining future intrepid astronauts. We also discuss aspirational technology trends in each of these target areas in the context of human and robotic exploration missions.

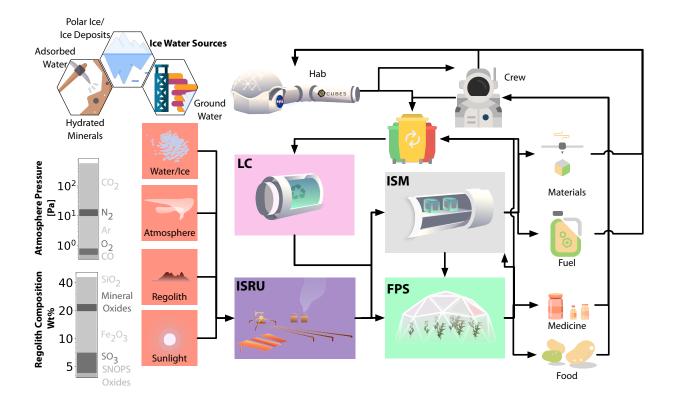
The following chapter can also found here: <u>A.J. Berliner</u>, J.M. Hilzinger, A.J. Abel, G. Makrygiorgos, N. Averesch, A. Benvenuti, D. Caddell, S. Cestellos-Blanco, A. Doloman, S. Friedline, D. Ho, W. Gu, S. Sen Gupta, A. Hill, P. Kusuma, I. Lipsky, M. McNulty, J. Meraz, V. Pane, K. Sander, F. Shi, J. Skerker, A. Styer, K. Valgardson, K. Wetmore, S. Woo, Y. Xiong, K. Yates, C. Zhang, B. Bugbee, D. Coleman-Derr, S. Nandi, R. Waymouth, P. Yang, C.S. Criddle, K.A. McDonald, L.C. Seefeldt, A. Mesbah, D.S. Clark, A.A. Menezes, A.P. Arkin. Towards a Biomanufactory on Mars. *Frontiers in Astronomy and Space Sciences* (2021). DOI: 10.3389/fspas.2021.711550.

# 3.1 Feasibility, Needs, and Mission Architecture

The standard specifications for Mars exploration from 2009[147] and 2019[319] are not designed as biomanufacturing-driven [40] due to the novelty of space bioengineering. Here, we outline biotechnological support to produce food, medicine, and specialized construction materials on a long-term mission with six crew-members and surface operations for  $\sim 500$  sols (a Martian sol is  $\sim 40$  min longer than an Earth day) flanked by two interplanetary transits of  $\sim 210$  days[376]. We further assume predeployment cargo that includes *in situ* resource utilization (ISRU) hardware for Mars-ascent propellant production[467], which is to be launched from Earth to a mission site. Additional supplies such as habitat assemblies[232, 113], photovoltaics[300, 301], experimental equipment, and other non-living consumables[38] will be included.

The proposed biomanufactory would augment processes for air generation and water and waste recycling and purification – typically associated with Environmental Control and Life Support Systems (ECLSS)[221, 194] – since its needs overlap but are broader, and drive a wider development of an array of ISRU, *in situ* manufacturing (ISM), food and pharmaceutical synthesis (FPS), and loop closure (LC) technologies (Fig. 3.1).

Food, medicine, and gas exchange to sustain humans imposes important ECLSS feasibility constraints [576, 574, 551]. These arise from a crewmember (CM) physiological profile, with an upper-bound metabolic rate of  $\sim$ 11-13 MJ/CM-sol that can be satisfied through



**Figure 3.1:** Proposed surface operations are drawn from inventories of *in situ* resources (red) such as ice, atmosphere, regolith, and sunlight. Atmospheric feedstocks of carbon and nitrogen are biologically fixed via the ISRU (*in situ* resource utilization) biomanufactory components (including abiotic processes, purple), providing the source of biopolymer manufacturing via the ISM (*in situ* manufacturing) component (grey) and food via the FPS (food and pharmaceutical synthesis) component (green), which are used for astronaut consumption and utilization during mission operations. Waste from each of these elements is collected and fed into the LC (loop closure) element (pink) to maximize efficiency and reduce the cost of supply logistics from Earth.

prepackaged meals and potable water intake of 2.5 kg/CM-sol[17, 321]. Sustaining a CM also entails providing oxygen at 0.8 kg/CM-sol and recycling the 1.04 kg/CM-sol of CO<sub>2</sub>, 0.11 kg of fecal and urine solid, and 3.6 kg of water waste within a habitat kept at  $\sim$ 294 K and  $\sim$ 70 kPa. Proposed short duration missions lean heavily on chemical processes for life support with consumables sent from Earth[147]. As the length of a mission increases, demands on the quantity and quality of consumables increase dramatically. As missions become more complex with longer surface operations, biotechnology offers methods for consumable production in the form of edible crops and waste recycling through microbial digestion[221]. Advancements in biomanufacturing for deep space exploration will ensure a transition from short-term missions that are reliant on single-use-single-supply resources to long-term missions that are sustainable.

#### **Biomanufactory Systems Engineering**

Efficiency gains in a biomanufactory come in part from the interconnection (Fig. 3.1) and modularity of various unit operations (Figs. 3.2-3.5)[121]. However, different mission stage requirements for assembly, operation, timing, and productivity can lead to different optimal biomanufactory system configurations. A challenge therefore exists for technology choice and process optimization to address the high flexibility, scalability, and infrastructure minimization needs of an integrated biomanufactory. Current frameworks for biomanufacturing optimization do not dwell on these aspects. A series of new innovations in modeling processes and developing performance metrics specific to ECLSS biotechnology is called for, innovations that can suitably capture risk, modularity, autonomy, and recyclability. Concomitant invention in engineering infrastructure will also be required.

## **3.2** Food and Pharmaceutical Synthesis

An estimated  $\sim 10,000$  kg of food mass is required for a crew of six on a  $\sim 900$  day mission to Mars[371]. Food production for longer missions reduces this mission overhead and increases food store flexibility, bolsters astronaut mental health, revitalizes air, and recycles wastewater through transpiration and condensation capture[536, 298]. Pharmaceutical life support must overcome accelerated instability ( $\sim 75\%$  of solid formulation pharmaceuticals are projected to expire mid-mission at 880 days[371]) and long re-supply times. Pharmaceutical production for longer missions can mitigate the impact of this anticipated instability and accelerate response time to unanticipated medical threats. In early missions, FPS may boost crew morale and supplement labile nutrients[286]. As mission scale increases, FPS may meet important food and pharmaceutical needs[76]. A biomanufactory that focuses on oxygenic photoautotrophs, namely plants, algae and cyanobacteria, enhances simplicity, versatility, and synergy with intersecting life support systems[563, 194]. While plant-based food has been the main staple considered for extended missions[147, 17, 76], the advent of cultured

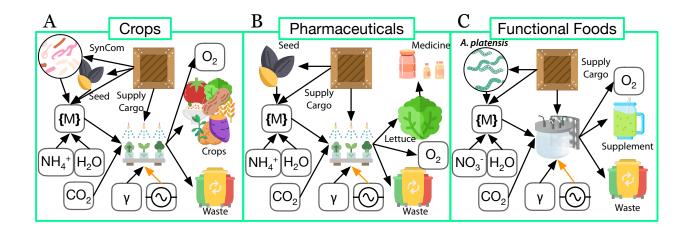


Figure 3.2: FPS (green) system breakdown for biomanufactory elements of (A) crops, (B) a biopharmaceutical, and (C) functional food production. In all cases, growth reactors require power (electrical current symbol) and light  $(\gamma)$ . (A) Crop biomass and oxygen gas (O<sub>2</sub>) are produced from hydroponically grown plants using seeds and media ({M}) derived from supply cargo. The reactor is also supplied with an ammonium (NH<sub>4</sub><sup>+</sup>) nitrogen source and CO<sub>2</sub> carbon source from ISRU processes. (B) In a similar fashion, medicine can be produced from genetically modified crops such as lettuce. (C) Functional foods such as nutritional supplements are produced via autotrophic growth of *A. platensis*. In all cases, biomass is produced, collected, and inedible biomass is distributed to the LC module for recycling.

and 3D printed meat-like products from animal, plant and fungal cells may ultimately provide a scalable and efficient alternative to cropping systems [73, 420, 226].

FPS organisms for Mars use must be optimized for growth and yields of biomass, nutrient, and pharmaceutical accumulation. Providing adequate and appropriate lighting will be a challenge of photoautotrophic-centric FPS on Mars[352, 296]. Developing plants and algae with reduced chloroplast light-harvesting antenna size has the potential to improve whole-organism quantum yield by increasing light penetration deeper into the canopy, which will reduce the fraction of light that is wastefully dissipated as heat and allow higher planting density[181]. Developing FPS organisms for pharmaceutical production is especially complicated, given the breadth of production modalities and pharmaceutical need (e.g., the time window of intervention response, and molecule class)[366]. Limited-resource pharmaceutical purification is also a critically important consideration that has not been rigorously addressed. Promising biologically-derived purification technologies[334, 555] should be considered for processing drugs that require very high purity (e.g., injectables).

Developing FPS growth systems for Mars requires synergistic biotic and abiotic optimization, as indicated by lighting systems and plant microbiomes. For lighting, consider that recent advancements in LED efficiency now make LEDs optimal for crop growth in extraterrestrial systems[213]. The ideal spectra from tunable LEDs will likely be one with a high fraction of red photons for maximum production efficiency, but increasing the fraction of shorter wavelength blue photons could increase crop quality[257]. Similarly, higher photon intensities increase production rates but decrease production efficiency. Understanding the associated volume and power/cooling requirement tradeoffs will be paramount to increasing overall system efficiency.

For microbiomes, consider that ISS open-air plant cultivation results in rapid and widespread colonization by atypically low-diversity bacterial and fungal microbiomes that often lead to plant disease and decreased plant productivity[286]. Synthetic microbial communities (Syn-Coms, Fig. 3.2A) may provide stability and resilience to the plant microbiome and simultaneously improve the phenotype of host plants via the genes carried by community members. A subset of naturally occurring microbes are well known to promote growth of their plant hosts[215], accelerate wastewater remediation and nutrient recycling[411], and shield plant hosts from both abiotic and biotic stresses[72], including opportunistic pathogens[464, 49, 305]. While SynCom design is challenging, the inclusion of SynComs in life support systems represents a critical risk-mitigation strategy to protect vital food and pharma resources. The application of SynComs to Mars-based agriculture motivates additional discussions in tradeoffs between customized hydroponics versus regolith-based farming, both of which will require distinct technology platforms and applied SynComs.

#### **FPS** Integration into the Biomanufactory

Our biomanufactory FPS module has three submodules: crops, pharmaceuticals, and functional foods (Fig. 3.2). The inputs to all three submodules (Fig. 3.2) are nearly identical in needing H<sub>2</sub>O as an electron donor, CO<sub>2</sub> as a carbon source, and light as an energy source, with the required nitrogen source being organism-dependent (e.g., *A. platensis* requires nitrate). H<sub>2</sub>O, CO<sub>2</sub>, and light are directly available from the Martian environment. Fixed nitrogen comes from the biomanufactory ISRU module. The submodules output O<sub>2</sub>, biomass, and waste products. However, the crop submodule (Fig. 3.2A) chiefly outputs edible biomass for bulk food consumption, the pharmaceutical submodule (Fig. 3.2B) synthesizes medicines, and the functional foods submodule (Fig. 3.2C) augments the nutritional requirements of the crop submodule with microbially-produced vitamins (e.g., vitamin B<sub>12</sub>). These outputs will be consumed directly by crew-members, with waste products entering the LC module for recycling.

All submodules will have increased risk, modularity, and recyclability relative to traditional technological approaches. Increased risk is associated with biomass loss due to lower-than-expected yields, contamination, and possible growth system failure. Increased modularity over shipping known pharmaceuticals to Mars derives from the programmability of biology, and the rapid response time of molecular pharming in crops for as-needed production of biologics. Increased recyclability stems from the lack of packaging required for shipping food and pharmaceuticals from Earth, as well as the ability to recycle plant waste using anaerobic digestion.

At a systems integration level, FPS organism care will increase the crew time requirements for setup, maintenance, and harvesting compared to advance food and pharmaceutical shipments. However, overall cost impacts require careful scrutiny: crop growth likely saves on shipping costs, whereas pharmaceutical or functional food production on Mars may increase costs relative to shipping drugs and vitamins from Earth.

# 3.3 In situ Materials Manufacturing

Maintaining FPS systems requires cultivation vessels/chambers, support structures, plumbing, and tools. Such physical objects represent elements of an inventory that, for short missions, will likely be a combination of predeployment cargo and supplies from the crewed transit vehicle[147]. As mission duration increases, so does the quantity, composition diversity, and construction complexity of these objects. The extent of ISM for initial exploration missions is not currently specified[147]. Nevertheless, recent developments[417, 418, 391] imply that ISM will be critical for the generation of commodities and consumables made of plastics[82], metals[168], composite-ceramics[279], and electronics[554] as mission objects, with uses ranging from functional tools[199] to physical components of the life-supporting habitat[418].

Plastics will make up the majority of high-turnover items with sizes on the order of small parts to bench-top equipment, and will also account for contingencies [437]. Biotechnology in combination with additive manufacturing can produce such polymeric constructs from basic feedstocks in a more compact and integrated way than chemical synthesis, because microbial bioreactors operate much closer to ambient conditions than chemical processes [336]. The versatility of microbial metabolisms allows direct use of  $CO_2$  from Mars' atmosphere, methane (CH<sub>4</sub>) from abiotic Sabatier processes [227], and/or biologically synthesized  $C_2$  compounds such as acetate, as well as waste biomass.

A class of bioplastics that can be directly obtained from microorganisms[399] are polyhydroxyalkanoates (PHAs). While the dominant natural PHA is poly(3-hydroxybutyrate) (PHB), microbes can produce various co-polymers with an expansive range of physical properties[396]. This is commonly accomplished through co-feeding with fatty acids or hydroxyalkanoates, which get incorporated in the polyester. These co-substrates can be sourced from additional process inputs or generated *in situ*. For example the PHA poly-lactic acid (PLA) can be produced by engineered *E. coli*[276], albeit to much lower weight percent than is observed in organisms producing PHAs naturally. PHA composition can be modulated in other organisms[452]. The rapid development of synthetic biology tools for non-model organisms opens an opportunity to tune PHA production in high PHB producers and derive a range of high-performance materials.

Before downstream processing (melting, extrusion / molding), the intracellularly accumulating bioplastics need to be purified. The required degree of purity determines the approach and required secondary resources. Fused filament fabrication 3D-printing, which works well in microgravity[436, 437], has been applied for PLA processing and may be extendable to other bio-polyesters. Ideally, additive manufacturing will be integrated in-line with bioplastics production and filament extrusion.

#### ISM Integration into the Biomanufactory

Figure 3.3 depicts the use of three organism candidates (*Cupriavidus, Methylocystis, Halomonas*) that can meet bioplastic production needs requires a different set of parameters to optimize

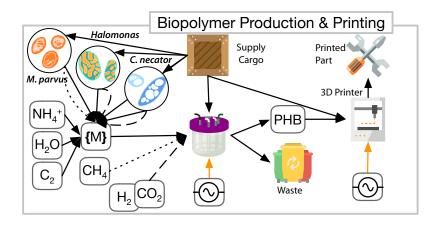


Figure 3.3: ISM systems breakdown for biomanufactory elements of biopolymer production and 3D-printing. 3D printed parts are fabricated from bioproduced plastics. Biopolyesters such as PHB, along with corresponding waste products, are formed in cargo-supplied reactors with the aid of microorganisms. A variety of available carbon feedstocks can serve as substrates for aerobic auto-, hetero-, or mixotrophic microorganisms such as *C. necator*, *Methylocystis parvus* and *Halomonadaceae*. All three microbes are capable of using  $C_2$  feedstocks (like acetate), while *C. necator* and *Methylocystis* can also use  $C_1$  feedstocks. The former utilizes a combination of  $CO_2$  and  $H_2$  (large dotted line), while only *M. parvus* can leverage  $CH_4$  (small dotted line).

their deployment, which strongly affects reactor design and operation. These microbes are capable of using a variety of carbon sources for bioplastic production, each with a trade-off. For example, leveraging  $C_2$  feedstocks as the primary source will allow versatility in the microbe selection, but may be less efficient and autonomous than engineering a single organism like *C. necator* to use  $CO_2$  directly from the atmosphere. Alternatively, in the event that  $CH_4$  is produced abiotically for ascent propellant[394], a marginal fraction of total  $CH_4$ will be sufficient for producing enough plastic without additional hardware costs associated with ISRU  $C_2$  production. Relying on *Halomonas* in combination with acetate as substrate may allow very rapid production of the required bioplastic, but substrate availability constraints are higher than for  $CH_4$  or  $CO_2/H_2$ . A terminal electron acceptor is required in all cases, which will almost certainly be  $O_2$ . Supplying  $O_2$  safely without risking explosive gas mixtures, or wasting the precious resource, is again a question of reactor design and operation. Certain purple non-sulfur alphaproteobacteria (e.g., *Rhodospirillum rubrum* and *Rhodopseudomonas palustris*) also feature remarkable substrate flexibility and can produce PHAs.

Bioplastic recovery and purification is a major challenge. To circumvent the need for halogenated organic solvents, an osmolysis process [445] may be employed with the halophile [515, 96]. As this still requires substantial amounts of water, an alternative for all three proposed organisms is to use acetate or methanol as solvents [15, 24]. These inputs can be provided from other biomanufactory modules.

The high crystallinity of pure PHB makes it brittle and causes it to have a narrow melting range, resulting in warp during extrusion and 3D-printing. Such behavior places operational constraints on processing and hampers applications to precision manufacturing[342]. Workarounds may be through additives, biocomposite synthesis, and copolymerization. However, this ultimately depends on what biology can provide[392]. There is a need to advance space bio-platforms to produce more diverse PHAs through synthetic biology.

ISM of biomaterials can reduce the mission cost, increase modularity, and improve system recyclability compared to abiotic approaches. In an abiotic approach, plastics will be included in the payload, thereby penalizing up-mass at launch. As with elements of FPS and ISRU, ISM increases flexibility and can create contingencies during surface operations, therefore reducing mission risk. The high modularity of independent plastic production, filament formation, and 3D-printing allows for a versatile process, at the cost of greater resources required for systems operations. Overall, this maximizes resource use and recyclability, by utilizing mission waste streams and byproducts for circular resource management.

## 3.4 In situ Resource Utilization

Biomanufacturing on Mars can be supported by flexible biocatalysts that extract resources from the environment and transform them into the complex products needed to sustain human life. The Martian atmosphere contains  $CO_2$  and  $N_2[371]$ . Water and electrolytically produced  $O_2$  and  $H_2$  are critical to mission elements for any Mars mission. It is very likely that the expensive and energy-intensive Sabatier plants[227, 369, 107] for  $CH_4$  production will be available per DRA 5.0[147]. While a Haber-Bosch plant could be set up for ammonia production, this is neither part of the current DRA[147] nor exceptionally efficient (citation). Thus, For a biomanufactory, we must have carbon fixation reactors to fix  $CO_2$ into feedstocks for non-methanotrophs, and have nitrogen fixation reactors to fix  $N_2$  to fulfill nitrogen requirements for non-diazotrophs. Trace elements and small-usage compounds can be transported from Earth, or in some cases extracted from the Martian regolith. In the case where power is provided from photocollection or photovoliatics, light energy will vary with location and season, and may be critical to power our bioreactors.

Although photosynthetic organisms are attractive for FPS, a higher demand for carbonrich feedstocks and other chemicals necessitates a more rapid and efficient  $CO_2$  fixation strategy. Physicochemical conversion is inefficient due to high temperature and pressure requirements. Microbial electrosynthesis (MES), whereby reducing power is passed from abiotic electrodes to microbes to power  $CO_2$  reduction, can offer rapid and efficient  $CO_2$ fixation at ambient temperature and pressure[3]. MES can produce a variety of chemicals including acetate[323], isobutanol[316], PHB[324], and sucrose[402], and therefore represents a flexible and highly promising ISRU platform technology[5].

Biological N<sub>2</sub>-fixation offers power- and resource-efficient ammonium production. Although photoautotrophic N<sub>2</sub> fixation with, for example, purple non-sulfur bacteria, is possible, slow growth rates due to the high energetic demand of nitrogenase limits throughput[145]. Therefore, heterotrophic production with similar bacteria using acetate or sucrose as a feedstock sourced from electromicrobial CO<sub>2</sub>-fixation represents the most promising production scheme, and additionally benefits from a high degree of process redundancy with heterotrophic bioplastic production.

Regolith provides a significant inventory for trace elements (Fe, K, P, S, etc.) and, when mixed with the substantial cellulosic biomass waste from FPS processes, can facilitate recycling organic matter into fertilizer to support crop growth. However, regolith use is hampered by widespread perchlorate [125, 86, 407], indicating that decontamination is necessary prior to enrichment or use. Dechlorination can be achieved via biological perchlorate reduction using one of many dissimilatory perchlorate reducing organisms[559, 132, 70, 71].

#### ISRU Integration into the Biomanufactory

A biomanufactory must be able to produce and utilize feedstocks along three axes as depicted in Figure 3.4:  $CO_2$ -fixation to supply a carbon and energy source for downstream heterotrophic organisms or to generate commodity chemicals directly, N<sub>2</sub>-fixation to provide ammonium and nitrate for plants and non-diazotrophic microbes, and regolith decontamination and enrichment for soil-based agriculture and trace nutrient provision. ISRU inputs are submodule and organism dependent, with all submodules requiring water and power. For the carbon fixation submodule (Fig. 3.4A),  $CO_2$  is supplied as the carbon source, and electrons are supplied as H<sub>2</sub> or directly via a cathode. Our proposed biocatalysts are the lithoautotrophic *Cupriavidus necator* for longer-chain carbon production (e.g., sucrose[402]) and the acetogen *Sporomusa ovata* for acetate production. *C. necator* is a promising chassis for metabolic engineering and scale-up[402], with *S. ovata* having one of the highest current consumptions for acetogens characterized to date[326]. The fixed-carbon outputs of this

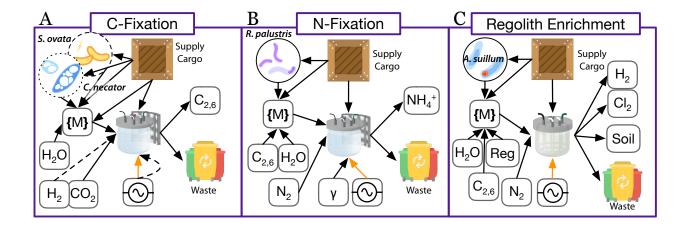


Figure 3.4: ISRU (purple in Fig. 3.1) system breakdown of biomanufactory elements. (A) Carbon fixation with the autotrophic bacteria *Sporomusa ovata* or *Cupriavidus necator* through electrosynthesis or lithoautotrophic fixation of  $C_1$ -carbon (cathodes or  $H_2$  as the electron donor). (B) Microbial nitrogen fixation with diazotrophic bacteria like *Rhodopseudomonas palustris* growing photoheterotrophically. (C) Regolith (Reg) enrichment using the perchlorate-reducing microbe *Azospira suillum*. Black lines represent material and energy flows related to biological consumption and production. Orange lines indicate additional power supply to the system.

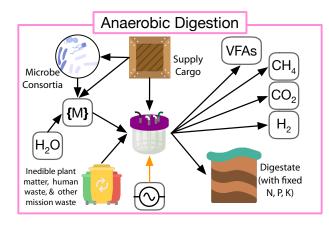
submodule are then used as inputs for the other ISRU submodules (Fig. 3.4B,C) in addition to the ISM module (Fig. 3.1). The inputs to the nitrogen fixation submodule (Fig. 3.4B) include fixed carbon feedstocks, N<sub>2</sub>, and light. The diazotrophic purple-non sulfur bacterium *Rhodopseudomonas palustris* is the proposed biocatalyst, as this bacterium is capable of anaerobic, light-driven N<sub>2</sub> fixation utilizing acetate as the carbon source, and has a robust genetic system allowing for rapid manipulation[145, 5]. The output product is fixed nitrogen in the form of ammonium, which is used as a feedstock for the carbon-fixation submodule of ISRU along with the FPS and ISM modules. The inputs for the regolith enrichment submodule (Fig. 3.4C) include regolith, fixed carbon feedstocks, and N<sub>2</sub>. *Azospira suillum* is a possible biocatalyst of choice due to its dual use in perchlorate reduction and nitrogen fixation[71]. Regolith enrichment outputs include soil for the FPS module (in the event that solid support-based agriculture is selected instead of hydroponics), H<sub>2</sub> that can be fed back into the carbon fixation submodule and the ISM module, chlorine gas from perchlorate reduction, and waste products.

Replicate ISRU bioreactors operating continuously in parallel with back-up operations lines can ensure a constant supply of the chemical feedstocks, commodity chemicals, and biomass for downstream processing in ISM and FPS operations. Integration of ISRU technologies with other biomanufactory elements, especially anaerobic digestion reactors, may enable (near-)complete recyclability of raw materials, minimizing resource consumption and impact on the Martian environment [431, 332].

# 3.5 Loop Closure and Recycling

Waste stream processing to recycle essential elements will reduce material requirements in the biomanufactory. Typical feedstocks include inedible crop mass, human excreta, and other mission wastes. Space mission waste management traditionally focuses on water recovery and efficient waste storage through warm air drying and lyophilization [576, 17]. Mission trash can be incinerated to produce CO<sub>2</sub>, CO, and H<sub>2</sub>O [228]. Pyrolysis, another abiotic technique, yields CO and H<sub>2</sub> alongside CH<sub>4</sub>[482]. The Sabatier process converts CO<sub>2</sub> and CO to CH<sub>4</sub> by reacting with H<sub>2</sub>. An alternate thermal degradation reactor [79], operating under varying conditions that promote pyrolysis, gasification, or incineration, yields various liquid and gaseous products. The fact remains however, that abiotic carbon recycling is inefficient with respect to desired product CH<sub>4</sub>, and is highly energy-intensive.

Microbes that recover resources from mission wastes are a viable option to facilitate loop closure. Aerobic composting produces  $CO_2$  and a nutrient-rich extract for plant and microbial growth [442, 443]. However, this process requires  $O_2$ , which will likely be a limited resource. Hence, anaerobic digestion, a multi-step microbial process that can produce a suite of end-products at lower temperature than abiotic techniques (~35-55°C compared to ~500-600°C, an order of magnitude difference), is the most promising approach for a Mars biomanufactory [368, 506] to recycle streams for the ISM and FPS processes. Digestion products  $CH_4$  and volatile fatty acids (VFA, such as acetic acid) can be substrates for



**Figure 3.5:** LC-based (pink) anaerobic digestion of mission waste such as inedible plant matter, microbial biomass, human, and other wastes produce methane, volatile fatty acids (VFAs), and digestate rich with key elemental nutrients (N, P, K), thereby supplementing ISRU operation.

polymer-producing microbes [397, 94]. Digestate, with nutrients of N, P, and K, can be ideal for plant and microbial growth [384], Fig. 3.5. Additionally, a  $CH_4$  and  $CO_2$  mixture serves as a biogas energy source, and byproduct  $H_2$  is also an energy source [474, 285].

Because additional infrastructure and utilities are necessary for waste processing, the extent of loop closure that is obtainable from a treatment route must be analyzed to balance yield with its infrastructure and logistic costs. Anaerobic digestion performance is a function of the composition and pretreatment of input waste streams (crop residuals, feces, urine, end-of-life bioproducts), as well as reaction strategies like batch or continuous, number of stages, and operation conditions such as organic loading rate, solids retention time, operating temperature, pH, toxic levels of inhibitors ( $H_2S$ ,  $NH_3$ , salt) and trace metal requirements 474, 23, 368, 506, 322, 456]. Many of these process parameters exhibit trade-offs between product yield and necessary resources. For example, a higher waste loading reduces water demand, albeit at the cost of process efficiency. There is also a potential for multiple co-benefits of anaerobic digestion within the biomanufactory. Anaerobic biodegradation of nitrogen-rich protein feedstocks, for example, releases free  $NH_3$  by ammonification. While  $NH_3$  is toxic to anaerobic digestion and must thus be managed [456], it reacts with carbonic acid to produce bicarbonate buffer and ammonium, decreasing  $CO_2$  levels in the biogas and buffering against low pH. The resulting digestate ammonium can serve as a fertilizer for crops and nutrient for microbial cultures.

#### LC Integration into the Biomanufactory

FPS and ISM waste as well as human waste are inputs for an anaerobic digester, with output recycled products supplementing the ISRU unit. Depending on the configuration of the waste streams from the biomanufactory and other mission elements, the operating conditions of the process can be varied to alter the efficiency and output profile. Open problems include the design and optimization of waste processing configurations and operations, and the identification of optimal end-product distributions based on a loop closure metric[39] against mission production profiles, mission horizon, biomanufacturing feedstock needs, and the possible use of leftover products by other mission elements beyond the biomanufactory. A comparison with abiotic waste treatment strategies (incineration and pyrolysis) is also needed, checking power demand, risk, autonomy, and modularity benefits.

# 3.6 Discussion and Roadmap

Biomanufactory development must be done in concert with planned NASA missions that can provide critical opportunities to test subsystems and models necessary to evaluate efficacy and technology readiness levels (TRLs)[339]. Figure 3.6 is our attempt to place critical elements of a biomanufactory roadmap into this context. We label critical mission stages using RMA-S and RMA-L, which refer to Mars surface missions with short ( $\sim$ 30 sols) and long (>500 sols) durations, respectively.

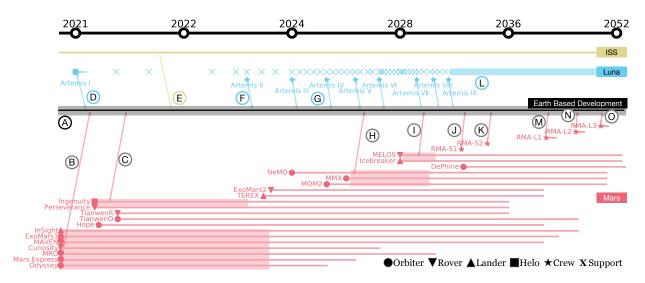


Figure 3.6: Proposed roadmap from 2021 to 2052 in log<sub>2</sub>-scale time of Earth-based developments (black) and their relationships to ISS (gold), lunar (blue), and Martian (red) missions. Missions range in status from currently operational, to enroute, planned, and proposed. Reference Mission Architecture (RMA)-S is a 30-sol mission, and RMA-L are missions with more than 500 sols of surface operations. RMA-L1 is the mission target for deployment of a biomanufactory. An arrival at target location is denoted with a symbol to indicate its type as orbiter, rover, lander, helicopter, support, or crewed operations. Circled letters are colored by location and correspond to specific milestones or opportunities for biomanufactory development.

Reliance on biotechnology can increase the risk of forward biological contamination [430]. Beyond contamination, there are ethical issues that concern both the act of colonizing a new land and justifying the cost and benefits of a mission given needs of the many here on earth. Planetary protection policies can provide answers or frameworks to address extant ethical questions surrounding deep-space exploration, especially on Mars[516, 457]. Critically, scientists and engineers developing these technologies cannot be separate or immune to such policy development.

#### **Autonomous Martian Surface Missions**

Figure 3.6(B) denotes the interconnection between current Martian mission objects 347, 349, 33, 355, 348, 345, 1] and Earth-based process development elements for a biomanufactory (Figs. 3.2-3.5). Together with *en route* autonomous surface missions [346, 344] (Fig. 3.6(C)), these missions provide a roadmap for continued mission development based on landing location biosignatures [69, 532]. The biomanufactory (Figs. 3.2-3.5) will require ample water in media, atmospheric gas feedstocks, and power that can be bounded by measurements from autonomous missions. Upcoming sample return missions offer an opportunity to shape the design of ISRU processes such as regolith decontamination from perchlorate and nitrogen enrichment for crop growth. Additional orbiters [254] and lander/rover pairs (Fig.  $3.6(\mathbb{H})$ ) have been planned and will aid in the selection of a landing site for short term Martian exploration missions (Fig. 3.6(J), (K)). Such locations will be determined based on water/ice mining/availability [362] in Fig. 3.6(1). These missions can be deployed with specific payloads to experimentally validate biomanufactory elements. Low TRL biotechnologies can be flown as experimental packages on upcoming rovers and landers, offering the possibility for TRL advancement of biology-driven subsystems. Planning for such testing will require coordination with, and validation on, ISS and satellite payloads (Fig. 3.6(E)), for instance, to understand the impact of Martian gravity, to contrast levels of radiation exposure, and so on.

#### **Artemis Operations**

The upcoming lunar exploration missions, Artemis[497] and Gateway[122], provide additional opportunities for integration with Earth-based biomanufactory development. Early support missions (Fig. 3.6(D, F)) will provide valuable experience in cargo predeployment for crewed operations, and is likely to help shape logistics development for short-term (Fig. 3.6(J, K)) as well as long-term Mars exploration missions (Fig. 3.6(M)) when a biomanufactory can be deployed. Although ISRU technologies for the Moon and Mars will be sufficiently distinct due to different resource availabilities, crewed Artemis missions (Fig. 3.6(F), (G)) provide a testing ground for crewed Mars bioprocess infrastructure. Later Artemis missions (Fig. 3.6(L)) also provide a suitable environment to test modular, interlocked, scalable reactor design, as well as the design of compact molecular biology labs for DNA synthesis and transformation. Since these technologies are unlikely to be mission critical during Artemis, their TRL can be increased and their risk factors studied through in-space evaluation.

The Artemis missions also provide a testbed to evaluate the space-based evolution of microbes and alterations of seedstocks as a risk inherent to the biological component of the biomanufactory. This risk can be mitigated by incorporating backup seed and microbial freezer stocks to reset the system. However, ensuring that native and/or engineered traits remain robust over time is critical to avoid the resource penalties that are inherent to such a reset. Consequently, while optimal organisms and traits can be identified and engineered prior to a mission, testing their long-term performance on future NASA missions prior to inclusion in life support systems will help to assess whether engineered traits are robust to off-planet growth, whether microbial communities are stable across crop generations, and whether the *in situ* challenges that astronauts will face when attempting to reset the biomanufacturing system are surmountable. Quantifying these uncertainties during autonomous and crewed Artemis missions will inform tradeoff and optimization studies during the design of an enhanced life support system for Martian surface bio-operations.

#### Human Exploration of Mars

Crewed surface operations of  $\sim 30$  sols by four to six astronauts are projected [147] to begin in 2031 (Fig. 3.6( $\overline{J}$ )), with an additional mission similar in profile in 2033 (Fig. 3.6( $\overline{K}$ )). Given the short duration, a mission-critical biomanufactory as described herein is unlikely to be deployed. However, these short-term, crewed missions RMA-S1,S2 provide opportunities to increase the TRL of biomanufactory elements for  $\sim 500$  sol surface missions RMA-L1 (Fig. 3.6(M) in ~2040 and RMA-L2 (Fig. 3.6(N)) in ~2044. Building on the abiotic ISRU from early Artemis missions, we propose that RMA-S1 carry experimental systems for C-and-Nfixation processes such that a realized biomanufactory element can be properly scaled (Fig. 3.4). Since RMA-S1,S2 will be crewed, regolith process testing becomes more feasible to be tested onsite on the surface of Mars, than during a complex sample return mission. Additionally, while relying on prepacked food for consumption, astronauts in RMA-S1 will be able to advance the TRL of platform combinations of agriculture hardware, crop cultivars, and operational procedures. An example is growing crops under various conditions (Fig. 3.2A) to validate that a plant microbiome can provide a prolonged benefit in enclosed systems, and to determine resiliency in the event of pathogen invasion or a loss of microbiome function due to evolution. Additionally, the TRL for crop systems can be re-evaluated on account of partial gravity and/or microgravity.

The RMA-S1 and RMA-S2 crews will be exposed for the first time to surface conditions after interplanetary travel, allowing for an initial assessment of health effects that can be contrasted to operations on the lunar surface (Fig. 3.6(F)), and that may be alleviated by potential biomanufactory pharmaceutical and functional food outputs (Fig. 3.2B,C). The RMA-S1 and RMA-S2 mission ISRU and FPS experiments will also provide insight into the input requirements for downstream biomanufactory processes. ISM technologies such as bioplastic synthesis and additive manufacture (Fig. 3.3) can be evaluated for sufficient TRL. Further, loop closure performance for several desired products can also be tested. This will help estimate the impact of waste stream characteristics changes on recycling[60].

### **Moving Forward**

We have outlined the design and future deployment of a biomanufactory to support human surface operations during a 500 day manned Mars mission. We extended previous stand-alone biological elements with space use potential into an integrated biomanufacturing system by bringing together the important systems of ISRU, synthesis, and recycling, to yield food, pharmaceuticals, and biomaterials. We also provided an envelope of future design, testing, and biomanufactory element deployment in a roadmap that spans Earthbased system development, testing on the ISS, integration with lunar missions, and initial construction during shorter-term initial human forays on Mars. The innovations necessary to meet the challenges of low-cost, energy and mass efficient, closed-loop, and regenerable biomanufacturing for space will undoubtedly yield important contributions to forwarding sustainable biomanufactory will be replete with science, engineering, and ethical challenges. But that is the excitement — part-and-parcel — of the journey to Mars.

# Chapter 4

# Mathematical Formulations For Mission Design, Comparison, and Optimization

NASA mission systems proposals are often compared using an equivalent system mass (ESM) framework, wherein all elements of a technology to deliver an effect – its components, operations and logistics of delivery – are converted to effective masses, which has a known cost scale in space operations. To date, ESM methods and the tools for system comparison largely fail to consider complexities stemming from multiple transit and operations stages, such as would be required to support a crewed mission to Mars, and thus do not account for different mass equivalency factors during each period and the inter-dependencies of the costs across the mission segments. Further, ESM does not account well for the differential reliabilities of the underlying technologies. The uncertainty in the performance of a technology should incur an equivalent mass penalty for technology options that might otherwise provide a mass advantage. Here we draw attention to the importance of addressing these limitations and formulate the basis of an extension of ESM that allows for a direct method for analyzing, optimizing, and comparing different mission systems. We outline a preliminary example of applying extended ESM (xESM) through a technoeconomic calculation of crop-production technologies as an illustrative case for developing offworld biomanufacturing systems.

The following chapter can also found here: D. Ho, G. Makrygiorgos, A. Hill, <u>A.J. Berliner</u> **Towards the Extension of Equivalent System Mass for Human Exploration Missions on Mars**. *npj Microgravity*. (2022) DOI: 10.1038/s41526-022-00214-7

# 4.1 Towards an Extension of Equivalent System Mass

Travel to space is limited by the expense of transporting resources beyond Earth's gravity well[556]. As a result, early metrics of usability for space systems, especially life support[270], favored mass as the primary decision factor. Following a request to "provide the designers"

of future missions with mature technologies and hardware designs, as well as extensive performance data justifying confidence that highly reliable Advanced Life Support Systems (ALS) that meet mission constraints can be developed" by the 1997 NASA Research Council (NRC)[116], the scope of the Equivalent System Mass (ESM) framework was broadened to account for differences in the cost of resources[150]. The general principle behind this early metric was to calculate the mass of all of the resources required to make the system work[153]. ESM was expanded from theory[314] to the practice of accounting for processes ranging from controls[375], agriculture[416], and recycling[295, 233]. Currently, ESM remains the standard metric for evaluating ALS technology development[388, 7, 295] and systems[17, 154, 511, 473]. It has been adopted for use in trade studies[313, 176, 171], as the metric for life support sizing[574, 572, 573], and has been incorporated into several tools[129, 137, 415].

In its current form [312], the total ESM M is defined only for the operations at a specific location as the sum over the set of all systems as

$$M = L_{\rm eq} \sum_{i=1}^{\mathcal{A}} \left[ \underbrace{(M_i \cdot M_{\rm eq}) + (V_i \cdot V_{\rm eq}) + (P_i \cdot P_{\rm eq}) + (C_i \cdot C_{\rm eq})}_{M_{\rm NCT}} + \underbrace{(T_i \cdot D \cdot T_{eq})}_{M_{\rm CT}} \right]$$

for subsystem  $i \in \mathcal{A}$  of the ESM excluding crew-time  $M_{\text{NCT}}$  and the ESM including crewtime  $M_{\rm CT}$  where  $M_i, V_i, P_i, C_i$  are the initial mass [kg], volume [m<sup>3</sup>], power requirement [kW<sub>e</sub>], and cooling requirement  $|kg/kW_{th}|$ , D is the duration of the mission segment |sol|,  $T_i$  is the crew-time requirement based on an astronaut crew-member (CM) [CM-h/sol],  $M_{eq}$  is the stowage factor for accounting for additional structural masses for a subsystem such as shelving [kg/kg],  $V_{eq}$  is the mass equivalency factor for the pressurized volume support infrastructure  $[kg/m^3]$ ,  $P_{eq}$  is the mass equivalency factor for the power generation support infrastructure  $[kg/kW_e]$ ,  $C_{eq}$  is the mass equivalency factor for the cooling infrastructure [kg/kW<sub>th</sub>],  $T_{\rm eq}$  is the mass equivalency factor for the crew-time [kg/CM-h], and  $L_{\rm eq}$  is the location factor for the mission segment [kg/kg] which accounts for the cost to transport mass from one location in space to another (such as Earth orbit to Martian orbit). Mass equivalency factors  $(V_{eq}, P_{eq}, C_{eq}, T_{eq})$  are used to convert the non-mass parameters to mass. While the ESM framework[312] has been widely adopted in Environmental Control and Life Support Systems (ECLSS) analysis 165, 138, 136, 137, 126, 429, it has faced critique for the ambiguity in its application as well as its difficulty in accounting for development costs[261]and uncertainty 6. Alternative frameworks have been proposed to replace 264 or extend ESM with additional metrics [273] that factor in complexity [272]. Given the widespread use of ESM, we believe that the framework should be improved with the addition of missing elements rather than replaced completely.

Previous efforts to quantify the cost in problems of mission-planning/space logistics have relied on metrics based solely on the Initial Mass to Low Earth Orbit (IMLEO)[231, 444] for constant commodity supply and demand[249] or on carryalong mass[143]. In such logistics frameworks like SpaceNet[307, 201, 202] and HabNet[142], cost is kept simple to allow for the analysis of complex mission architectures with multiple mission segments. Comparatively, ESM has been most fully developed for ECLSS where the costs of capital equipment, power,

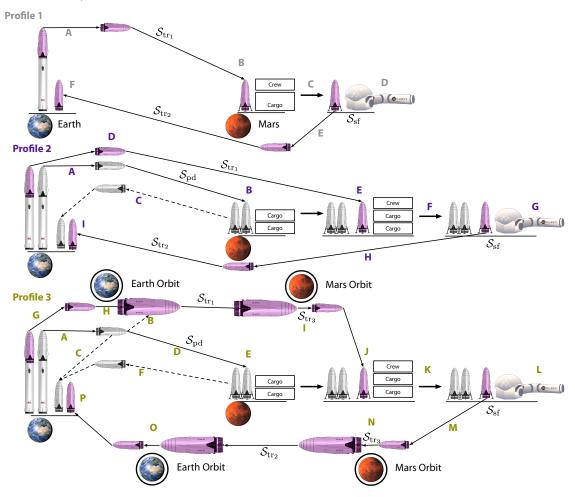


Figure 4.1: Transit Diagram of proposed Mission Architecture. In Profile 1(grey), (A) a crewed transit ship is launched directly from the surface of Earth and (B) lands on the surface of Mars where (C) the crew assembles the cargo in a habitat and carries out (D) surface operations until (E) the crew launches from their initial transit ship from the surface of Mars into space and (F) lands back on the surface of Earth. In Profile 2(purple), (A) cargo transit ships without crew are launched directly from the surface of Earth and (B) land on the surface of Mars where cargo can be unloaded. In the case of reusable rocket systems [449], (C) the cargo rockets can be launched from Mars and returned to Earth. Once all the cargo has been loaded onto the surface of Mars, (D) a crewed transit ship is launched directly from the surface of Earth and (E) lands on the surface of Mars where (F) the crew assembles the cargo in a habitat and carries out (G) surface operations until (H) the crew launches from their initial transit ship from the surface of Mars into space and (I) lands back on the surface of Earth. In Profile 3(green), a number of (A) cargo transit ships without crew are launched directly from the surface of Earth and either (B) supply a previously interplanetary rocket then (C) return to the surface of Earth or (D) travel to the surface of Mars where (E) cargo can be unloaded. In the case of reusable rocket systems, (F) the cargo rockets can be launched from Mars and returned to Earth. Once all the cargo has been loaded on the surface of Mars, (G) a crewed transit ship is launched directly from the surface of Earth to Earth Orbit (H) where it rendezvous with an interplanetary rocket which (I) travels to Martian orbit. The crew (J) then boards a descent vehicle and lands on the surface of Mars where (K) the crew assembles the cargo in a habitat and carries out (L) surface operations until (M) the crew launches from their initial transit ship from the surface of Mars into (N) Martian orbit where they again rendezvous with their interplanetary rocket which travels to (O) Earth orbit at which point they board a descent rocket in which they (P) finally return to the surface of Earth.

operations, transport, and other things have been captured on a common unit scale of mass. While it provides a method for summing the weighted terms of many subsystems, there is no explicit ESM equation that captures total mission costs across systems in various stages of a complex mission [261]. Thus the standard ESM approach faces limitations in that there (1) exists no explicit language for capturing the set of all segments and (2) there exists interdependent relationships between the decision variables within separate segments. Here we see a trade-off in the complexity of the cost function for the complexity of the mission architecture.

As plans for human exploration continue to be made in anticipation of returning to the moon[190, 497] and travelling to Mars[404, 44], an added emphasis will be required for optimization of mission architecture<sup>[202]</sup>. As of now, the current instance of the ESM framework does not lend itself for use as an objective function in an optimization over a mission - although this ESM has been proposed as the metric for mission optimization [267]. The result is that this standard framework remains fixed for multi-stage missions and generally (but not always [138]) faces challenges in providing design or planning information based on subsystem risk. Thus, the ESM metric is not always helpful when comparing missions with differential reliability for systems in their proper context. That is, given two possible technologies for meeting a mission objective, the one that is less likely to fail might be a better choice. To demonstrate how to formally add reliability metrics to the ESM framework, we take the case of a new technology platform, biomanufacturing [371, 401, 44], for which there are known and quantifiable reliability concerns and for which there is little *in situ* testing for space missions. In the following work, we propose an extended ESM (xESM) framework to account for the proposed multi-stage missions and critical mission features, such as reliability. As the scope of human exploration missions has expanded, the need for new technology platforms has grown, and it has been proposed that these features best capture the potential of biomanufacturing systems [44]. We do not claim a completion of xESM, but rather, we demonstrate progress along this trajectory in the form of a more generalized framework to (1) account for multi-staged mission segments (beyond simple summation); (2) account for reliability; and (3) feed into downstream optimization problems. We also note that this later progress is less developed in more in line with a discussion rather than a ready-to-use operational strategy.

## 4.2 Extending ESM for Long-Duration Mission Profiles

Figure 4.1 depicts three profiles with varied transit architectures. Profile 1 (grey) uses a single journey from Earth to Mars, and although it has been proposed in some forms [590], it is unlikely this architecture will be adopted due to the substantial mass demands of the transit ship and the ascent propellant required to leave Mars[61]. In the case of Profile 2 (purple), cargo can be predeployed to Mars through some number of predeployment missions. Profile 2 introduces segments to a crewed mission to Mars which are not actually crewed, but instead are either purely cargo-based in which case only the M and V terms factor into the ESM cost, or autonomous where M, V, P and C for uncrewed operations matter.

Since cargo missions do not require life support systems, the M cost is reduced greatly[17], leading to a reduction in overall mission cost, especially for missions that require a great quantity of goods that can be predeployed. In the most likely Profile 3[394, 395] (green), crew transportation can further broken down such that smaller crewed vehicles make the jump from planet to surface and vice-versa, but the interplanetary transit is made on a larger craft to reduce the mass required for egress from planetary gravity wells.

Previous ESM literature allows for varied equivalency factors based on mission staging[312], and in such cases, the ESM of distinct segments of a mission are calculated separately, then normalized through the use of location factors[172]. However, ESM M for any set of systems is calculated using a single location factor  $L_{eq}$  term as a multiplier. In this form it is assumed that each subsystem is transported in uniform fashion or that all parts of a subsystem would correspond to a single  $L_{eq}$  term. The profile expansion in Figure 4.1 shows that inventory can be transported in different segments using different crafts which change the value of  $L_{eq}$ . This is supported by non-ESM logistics methods[202]. We argue that the use of predeployment missions for transporting cargo implies that a system on one particular segment may utilize components transported from multiple segments, each with different location factors, motivating the a more generalized articulation of xESM ( $M_0$ ) as

$$M_{0} = \sum_{k}^{\mathcal{M}} \underbrace{L_{\text{eq},k} \sum_{i}^{\mathcal{A}_{k}} \left[ (M_{k_{i}} \cdot M_{\text{eq},k}) + (V_{k_{i}} \cdot V_{\text{eq},k}) + (P_{k_{i}} \cdot P_{\text{eq},k}) + (C_{k_{i}} \cdot C_{\text{eq},k}) + (T_{i} \cdot D_{k} \cdot T_{\text{eq},k}) \right]}_{M_{0,k}}$$
$$= M_{0,\text{pd}} + M_{0,\text{sf}} + M_{0,\text{tr}_{1}} + M_{0,\text{tr}_{2}} + M_{0,\text{tr}_{3}}$$

where  $\mathcal{M}$  is sum of ESM for segments in a mission set with index k. Mission segment  $\mathcal{S}$  can be constructed via set-builder notation as  $\mathcal{S} = \{(i, j) \mid i \in \mathcal{L}_2; j \in \mathcal{O}\}$  for specific combinations of locations and operations (see Methods for additional definitions). Essentially, we have established a graph where the locations represent nodes and the segments represent arcs, which matches previous formulations of mission logistics[202], although our set of location nodes is reduced for simplicity and does not include specific Lagrange Points[231]. The generalization enables accounting of mission segment-specific terms such as location factor  $L_{eq}$  and equivalency factors ( $M_{eq}$ ,  $V_{eq}$ ,  $P_{eq}$ ,  $C_{eq}$ ,  $T_{eq}$ ). This generalization also allows for indexing of mission segment specific subsystems  $\mathcal{A}$ , further enabling an accounting of inventory  $\mathcal{I}$  elements between mission segments  $\mathcal{S}$ .

Since these developments have been primarily applied to longer-duration ECLSS systems for the International Space Station (ISS) and not Mars missions, xESM does not include recent developments in resupply logistics[263] as enabled by the decreasing cost to LEO[266]. Despite a decreased cost to LEO, resupply logistics will be unlikely to impact the initial set of crewed exploration missions[61] given the difference in resupply costs between the  $\frac{1}{2}$ and  $\frac{1}{2}$  systems. Although arguments have been raised against the adoption of crew-time within the ESM[271], we include these terms in our formulation as it has been the standard.

#### **Inventories and Dependent Factors**

With the addition of our method for indexing factors by their location, operation, and hardware, we are now able to address the accountancy of relationships between equivalency/location factors and the segment inventory that defines them. In essence, equivalency/location factors convert non-mass properties to mass properties by means of a ratio, but because that mass originates from some subset of inventory elements, equivalency and location factors

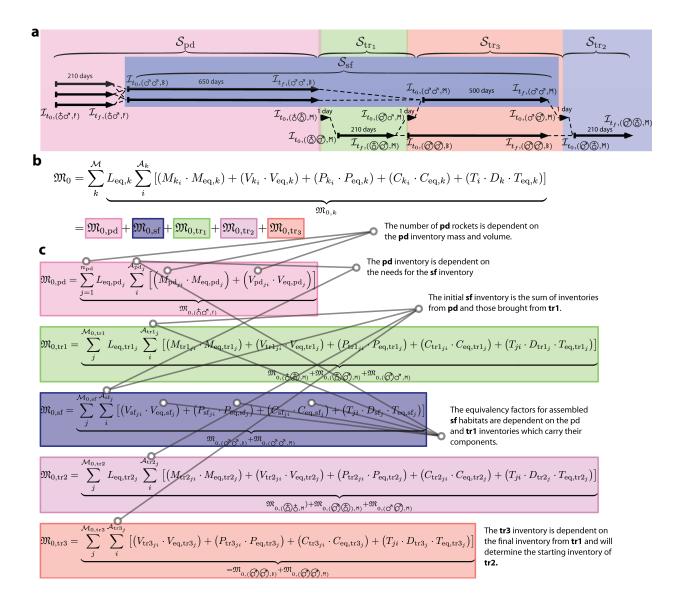


Figure 4.2: xESM equation for Profile 3 (Figure 4.1) with terms decomposed by subsystem. (a) Breakdown of inventory transfers across mission timeline colored by mission segment. (b) The generalized xESM equation colored by mission segment. (c) Expanded xESM equation with colored by mission segment with a non-exhaustive set of specific segment-dependent relationships elucidated.

are coupled. The exact nature of this interaction depends on the scenario and the modeling itself, and we aim to present a preliminary rendering of these relationships in Figure 4.2. In our assumptions, we say that predeployment cargo is grouped into cargo shipments in set j of  $\mathcal{M}_{\mathrm{pd}_j}$  across some number of predeployments  $n_{pd}$ . We assume that this set of cargo is composed of items such as habitat assemblies, control hardware, photovoltaics & batteries, reactors, tanks refrigerators, various experimental apparatus, 3D printers, and other tools[17]. In the more expanded surface operations term, Figure 4.2 demonstrates that inventory for surface operations is composed of an assembled habitat, process and reactor assemblies, mission crew, and integrated power systems. In this scenario, a set of equivalency factors are required for each segment of the mission.

The location factor  $L_{eq}$  is the reciprocal of the payload fraction for transporting mass between two points in space and can be evaluated as the sum of across multiple orbital maneuvers with different  $\Delta v$ . Each element in the location mapping  $\mathcal{L}_2$  has a specific required  $\Delta v$ . Any segment describing operations in a single location, such as Martian surface operations, has no mass transport and thus will have a  $L_{eq} = 1.0$ . Since  $\Delta v$  can be related to the specific impulse  $I_{\rm sp}$  and mass fraction  $m_0/m_f$  via the Tsiolkovsky rocket equation [556], we see how the mass of a specific segment inventory affects the location factor term. In terms of specific calculations, the mass fraction is the ratio of the of initial total rocket mass  $m_0$  to final total mass  $m_f$ , and the payload fraction is the ratio of initial total mass  $m_0$  to final delivered mass  $m_p$  (no propellant, tanks, etc). Meanwhile, the  $m_0$ ,  $m_f$ , and  $m_p$  will be constrained by rocket technology choice. The scaling of the location factor is nonlinear in the case where some number of predeployments are each limited in payload mass. We calculate the  $M_{0,pd}$  as the sum over the number of total predeployments  $n_{pd}$  where a given predeployment j has a set of cargo  $\mathcal{I}_{pd_i}$  that doesn't require V, P, or T. The number of predeployment rockets will be parametric based on the  $m_p$  for predeployment rockets and the sum of all inventory mass to be used on the martian surface shipped by predeployment. As shown in Figure 4.2, the  $L_{eq,pd_j}$  in the  $M_{0,pd}$  term can be related to the M and V terms for the components of predeployment j, while the  $L_{eq,tr_1}$  and  $L_{eq,tr_2}$  terms are related to the M and V for all cargo transported in the complete mission.

Like  $L_{eq}$ , equivalency factors are also parametric based on certain elements of a segment inventory as showed by the cross-dependent mission-segment network (Figure 4.2c). For example, the volume equivalency  $V_{eq}$  for crewed transits in space will be based on the pressurized volume[172, 155] of the vehicle. Our notation affords the specification of equivalencies with relation to other decision variables, as opposed to the cruder method of assigning general constants. Figure 4.2 illustrate how the equivalency factors for one segment will often be parametrically related to decision variables in other segments. This realization only enforces the importance of our extension by which multiple segments are represented by a single optimization metric.

#### Example Calculations

To illustrate the process for calculating xESM with both the traditional approach and our

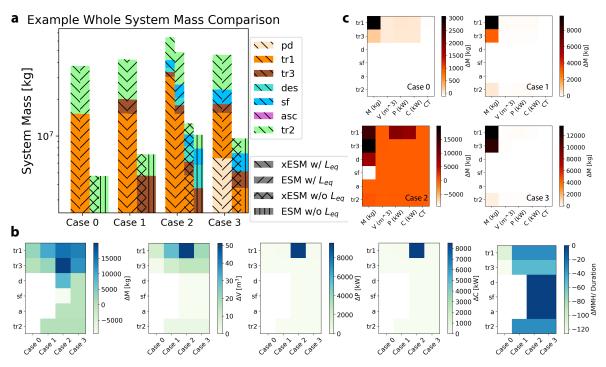


Figure 4.3: Comparison of ESM and xESM metrics for whole system mass scenarios. (a) Log-scale comparison of mission segment mass for increasing mission assembly. Case 0 is a baseline inventory for the flight from Earth orbit to Mars orbit  $(tr_1)$  and back  $(tr_2)$ , while life support for a 500 day Mars orbit  $(tr_3)$  is added in Case 1. The mission in Case 2 includes descent (des), Mars surface operations (sf), and ascent (asc). All inventory for sf is predeployed (pd) in Case 3. As the mission grows, both the mass required and the difference between xESM and ESM increases. The final case shows falling xESM with the removal of sf inventory from  $tr_1$  and des. (b) Inventory difference between xESM and ESM in raw mass, volume, power, cooling, and crewtime across each mission segment, before the application of location and equivalency factors. (c) Raw inventory difference between xESM and ESM displayed across the four cases.

proposed method, we provide the following example problems. The first explores a calculation across all inventory systems of a mission (Figure 4.3) and the second that has been scoped to the food production (Figure 4.4) using Controlled Ecological Life Support Systems (CELSS)[561, 32], which we feel serves as an established and graspable biomanufacturingbased technology[44] for comparison against "bring-everything" or physical/chemical life support systems[260].

The first example is offered to demonstrate a broad comparison between ESM/xESM, and in Case 0, we represent a base mission with the corresponding inventory required to fly from Earth orbit to Mars orbit ( $S_{tr_1}$ : 210d, 6CM) and back ( $S_{tr_2}$ : 210d, 6CM), and we assume the orbital mechanics allow for this transit. In Case 0, the inventory elements in a craft are scaled for their entire duration of use (420d), and consumables (food, waste collection, water) are used or discarded as time passes. In Case 1, we build on the base case by including the segment in which the crew would orbit Mars ( $S_{tr_3}$ : 210d, 6CM); and like in the previous case, items in a craft are scaled for their entire duration of use (920d). In Case 2, we continue to

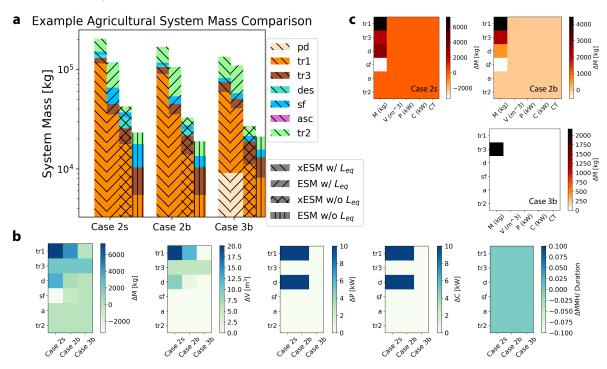


Figure 4.4: Comparison of ESM and xESM metrics focused on the stored food cost. (a) Log-scale comparison of mission segment mass for different food strategies. Case 2s is the food cost of Case 2 in Figure 4.3. Case 2b reduces the amount of stored food for sf from 500 days to 70 days, assuming a hypothetical future agriculture system could grow the difference. In Case 3b, the sf inventory is predeployed, and grown food also sustains the majority of sf. The ESM differences between 2s and 2b and between 2s and 3b show the rough mass requirement for the design and development of such an agricultural system. (b) Raw inventory difference between xESM and ESM mass, volume, power, cooling, and crewtime across each mission segment, before the application of location and equivalency factors. (c) Raw inventory difference between xESM and ESM displayed across the three cases.

build on the previous case by including descent ( $S_{dec}$ : 500d, 4CM), surface operations ( $S_{sf}$ : 500d, 4CM), and ascent ( $S_{asc}$ : 1d, 4CM). Here the M, V, P, C inventory terms needed for  $S_{sf}$  are carried in  $S_{tr_1}$  and  $S_{dec}$  (with crewtime requirements for these items not accounted for). Here, 4 crew-members are left in orbit on  $S_{tr_3}$ . In calculating xESM, the M term for  $\mathcal{I}_{sf}$  is ignored during  $S_{sf}$ , as no mass is "moved" during this segment as it was previously transported to the surface via  $S_{tr_2}$  and  $S_{dec}$ ; additionally,  $S_{asc}$  is assumed only to transport crew-members back to orbit. In Case 3, we achieve the proposed Profile 3 architecture from Figure 4.1 where the surface mission inventory is supplied via predeployment ( $S_{pd}$ ) rather than the initial transit and decent. Calculations of system mass (ESM and xESM) in Figure 4.3 show the expected increase in cost moving from Case 0 to Case 2 in which the size of the inventory grows in relation to the complexity of the situation (see SI for details). Also as expected, the use of predeployments in Case 3 deduces the xESM cost by ~26\% while only reducing ESM cost by ~2.5\% (Figure 4.3a). As the mission scope grows, both the mass required and the difference between xESM and ESM increases as outlined by Figure 4.3b,c.

The three Cases in Figure 4.4 consider the food system and the potential impact of

agricultural biotechnology to supply astronauts with their caloric and nutritional needs. We assume that each of 6 CMs has a daily dry mass food requirement of 0.617 kg/CM-d[17]. We use this requirement to calculate the prepackaged food requirements of the two transit legs of each mission scenario, as well as the extra 70 or 500 days of food for surface operations in Cases 2s and 2b respectively. Given the recently updated infrastructure costs [17] associated with a Mars Surface Habitat Vehicle<sup>[574]</sup>, we calculate ESM through consideration of the food subsystem including food, packaging, refrigeration 574, 17, and processing. In Case 2s, we consider only the stored food requirements from Case 2 from Figure 4.3. In Case 2b, we consider the stored food requirements during surface operations decreased from 500d to 70d and the remaining food was produced via agriculture. In a long-duration mission scenario in which food is grown during surface operations, and where literature suggests that a sizable initial hardware set would be required [17]. This set could include hydroponic growth chambers, water filtration, refrigeration, etc. along with additional support hardware like pumps, filters, etc[17]. In Case 3, we consider the transportation of the biomanufacturing system during predeployment rather than with the crew. During initial transit as well as the return transit, the crew relies on prepackaged food – crop growth begins on the first day of surface operations, necessitating another  $\sim 70$  days of predeployed food while the surface hardware grows the first crop[17]. Variation in crop selection and growth conditions during surface operations have been proposed, but this bounding assumption is consistent with crops such as lettuce and wheat 17, 561, 542.

Like Cases 0-4, xESM costs for Cases 2s, 2b, and 3b are larger than their ESM alternative, however, in Case 2s (w/o biomanufacturing, only 'bring everything') and Case 2b (w/biomanufacturing), the xESM option is significantly larger than the ESM option for calculation. The difference between the xESM and ESM calculation results is an increased mass on the transit to Mars and reduced mass for surface operations and return transit. The primary trade-off here is that xESM provides a higher fidelity model for multi-segmented missions given that it includes the costs for all mission segments where an item is carried, while the ALSSAT's ESM calculation method does not include preceding mission segments ALSSAT<sup>[574]</sup>. This result is especially important considering downstream biomanufacturing options which show a reduced xESM metric in scenarios where predeployment is leveraged to reduce the cost associated with the transit. Additionally, our "bring everything" mission which does not rely on biomanufacturing yields larger costs overall from increased stored food. All three scenarios have equivalent  $Tr_2$  ESM and xESM; this shows that in the last leg of the journey, or in a segment that is not influenced by future operations, ESM equals xESM. While simplified, this captures many of the critical features necessary to demonstrate the need for ESM extension. In cases where inventory from one segment can be used to satisfy constraints in another segment, the ESM summation of separately optimized mission segments can be less optimal than an ESM optimized with an objective function that accounts for both segments and constraint functions containing both terms from both segments. Given that system mass analyses are often used in the preliminary evaluation of technologies, it becomes more important for when considering biomanufacturing platforms to leverage the xESM formulation to provide a higher fidelity and more favourable metric. However, we

also must clarify that the aim in exploring this example is not to make claims about specific technology, but rather to provide an example for differentiating ESM and xESM.

### 4.3 Towards xESM Analysis and Optimization Under Uncertainty

So far, we have looked at the xESM framework for calculating segmented costs. Based on the scenario chosen, the xESM metric is ultimately determined based on some set of specific technologies that are used. Simpler cases, as the ones given in the examples assume that (1) the behavior of a particular system is fully known on Mars and (2) the operation of the systems is undisturbed by external factors. Although several systems can reliably be considered as deterministic in this scope, effects such as micro-gravity might affect the dynamics of specific processes in a biomanufacturing context. Moreover, each process possesses a set of faulty states, i.e., technical issues may cause a system to under-perform significantly. Detailed analysis of novel systems, e.g., in the biomanufacturing case, requires the description of the operation of systems using mathematical models. To this end, the xESM framework can be used both to analyze the cost of individual processes as well as the cost of integrated processes in any desired segment, as they operate in time. A simulation-based analysis, either some cost analysis of specific elements or some end-to-end optimization procedure, makes use of models to simulate the systems, the environment and associated costs for achieving the mission objectives. As a remark, we should note that the sophistication of the simulated case study can vary. For instance, higher-level decisions can be optimized for without the need of detailed models for individual components, while exact scheduling [47] and operational decision making should involve dynamical models for the various subsystems [383]. This principle has been widely adopted in manufacturing settings for design and control. Parts of the costs not commonly accounted for in cost calculations for space missions like ESM are uncertainty and risk. The latter are important factors during the design phase as we need to ensure safety in a robust, worst-case setting 398.

Uncertainty can be broken down categorically into two groups: aleatory[20] and epistemic[139]. Aleatory uncertainties are random and stochastic in nature and, although they can be examined via systematic testing, they cannot be reduced below some threshold. On the other hand, epistemic uncertainties can be reduced through applying additional knowledge and testing much more effectively. Moreover, uncertainties can be categorized and modeled as time-varying and time-invariant. In our case, there are several components, both explicitly and implicitly appearing in the xESM framework, that can be considered as uncertain. Let  $\theta \in \Theta \subset \mathbb{R}^n_{\theta}$  denote a vector of uncertainties (both time-varying and invariant). Epistemic uncertainties include time-varying variables such as unmodeled dynamics (e.g., states of the system not taken into account) or time-invariant variables, for example, physical parameters of systems (e.g., kinetic parameters) or operational factors (e.g., efficiency of lights). Aleatory uncertainties can include purely stochastic dynamics

of systems and are typically time-varying, while including operational uncertainties related to equipment switching to a faulty state. In our context, note that the multi-segment approach allows for considering segment-specific uncertainties, for example,  $\theta_{pd} \subset \Theta$  are the predeployment-specific uncertainties and  $\theta_{sf} \subset \Theta$  are the uncertainties directly related to the surface operations.

Before formally defining an optimization problem, we should mention that the cost is generally a function of decision variables which reflect design choices regarding the specific utilization of available technology. Let us now focus on a particular segment, i.e., the surface operations and let  $u_{sf} \in \mathbb{R}^n$  denote a set of decision variables for the surface operations. (e.g., amount of crop biomass that should be grown over some production cycle or the allocated area for plant growth). The mass-equivalent cost for the surface operations in this case is a function in the form  $M_{0,sf}(u_{sf}; \theta_{sf})$ . The decision variables can be fixed a priori or, more realistically, should be determined upon the solution of an optimization problem that seeks to minimize  $M_{0,sf}$  in while accounting for uncertainties. The latter implies that typically we are interested in some expected value of the cost, i.e.,  $\mathbb{E}_{\Theta}[M_{0,sf}(u_{sf}; \theta_{sf})]$ . In a more general sense, each segment j induces an expected cost  $\mathbb{E}_{\Theta}[M_{0,j}(u_j, \theta_j)]$ . Thus, reliability and uncertainty metrics also should be considered in an optimization setting. [441].

As the entire mission is broken down into segments and sub-segments, we can define taskspecific performance level requirements which, when not fulfilled at several points in time, the mission can be considered to be failing. In other words, when simulating some part of the mission, uncertainty can lead to a sequence of faults manifesting themselves (either due to uncertainty in the system dynamics or due external disturbances and equipment faults) until the mission has to be abandoned. This is a useful definition for incorporating risk into the mission design given the dynamic nature of operations and the breakdown of mission stages that was introduced earlier. Using the notion of segments, we can define as  $\pi_{t,j}(\boldsymbol{\theta}_j; u_j)$  the probability density function of segment j failing the earliest at time t, under some decision variable vector  $u_i$ . Subsequently, we can rely on sample-based methods to calculate the aforementioned probability, e.g., Monte Carlo sampling. Subsequently, we can define the expected failure time of segment j under the set of decisions  $u_j$  as  $t_f(u_j) = \mathbb{E}_{\Theta}[\pi_{t,j}(\boldsymbol{\theta}_j; u_j)],$ which also reflects the reliability of the design  $u_i$ . Note that faults and failure are connected but not identical [535]. We define as faults the sequence of events that need to occur such that their accumulation over time (in terms of number and magnitude) lead to an overall failure condition. Therefore, all uncertainties can be propagated into a single indicator which is the time of mission failure, which can be used for further analysis.

We can now shift our attention towards a stochastic optimal decision making for  $u_j$ , discussing the elements that would construct a proper stochastic optimization problem [373, 374]. The main element is the objective function. In a naive approach, we would seek the design  $u_j$  such that the expected segment cost is minimized. Nevertheless, this is not the best approach because we need to account for the confidence in the value of the expected cost. Therefore, the objective should include the variance of the segment cost due to uncertainty, i.e.,  $\mathbb{V}[M_{0,j}(u_j, \theta_j)]$ . Last, but not least, a design that causes the segment to fail at a particular day should be incur a penalty to the objective, related to the probability of failure

as opposed to the probability of a loss of crew (Pr(LOC))[140]. We can define a scale of that penalty as  $s(u_j)$ , which can assume many forms, with the requirement that a mission that lasts longer is penalized less.

Under the simple assumptions that (1) the goal of human exploration missions is to carry out science experiments [61] and that (2) experiments are carried out each day, a worst case scenario is a complete mission scrub in which all science objectives planned beyond the day of mission failure cannot be completed. Overall, the main idea is that if the mission is to fail on the very first days, then it would need to be redone on a following mission. The assumption being made by this simple penalty is that if a mission were to fail early, the ESM cost of that mission left incomplete would be partially added onto next one. We argue that this is a valid initial construction of a penalty term based on assumption that incomplete work during a mission is required. This statement is especially valid for early human exploration missions where experimental use of new equipment is important in validating its use or raising technology readiness level to acceptable values for future missions. While we recognize that the standard recommendation in Decision Theory is to ignore sunk costs, we argue that the in our paradigm, this added penalty is not such a sunk cost. In classical decision analysis, a sunk cost is a sum paid in the past that is no longer relevant to decisions in the future 244 and thus should be ignored when making decisions. We argue that in our paradigm, we are analyzing the impact on a mission of some choice in technology that has some defined uncertainty, and thus no cost has been sunk. In the parlance of decision analysis, this is an example of a prospective cost, and is not to be ignored.

The objective for an optimization problem on a segment can now be written as

$$f(u_j) = \mathbb{E}\left[M_{0,j}(u_j, \theta_j)\right] + w_v \mathbb{V}\left[M_{0,j}(u_j, \theta_j)\right] + w_p s(u_j)$$

where  $w_v$  is a weight that assesses the importance of variance of the cost in the objective and  $w_p$  is a cost, in system mass units, which, as discussed, attains values approximately equal to a nominal ESM cost for the segment. Moreover, depending on the nature of the problem, the optimization is complemented with various robust constraints. The latter ensure the safe operation of the systems, such as achieving several thresholds of productivity. A detailed optimal decision making problem formulation is heavily case-dependent and a complex issue to address, however, we envision that the objective function would generally attain this particular in most cases. Last, but not least, the optimization can be extended to a mission-wide horizon by replacing the segment-specific cost with the total cost.

### 4.4 Future Work

The use of the xESM framework helps guide the development and implementation of software for a reference mission architecture for long-duration human exploration of Mars. We recognize that this extension of ESM as a metric for mission scenario comparison is preliminary and not exhaustive in its scope. We also note that no single analytical result such as ESM or xESM will be the sole factor the technology specification or platform decision-making. The

differences presented are important but modest and are in scale with the uncertainty of the quantities used as the inputs. In addition to incorporation of mission parameters, specific constants and terms in our formulation are required, such as a more precise calculation of equivalency factors for cooling, power, volume, and crew-time and distillation of the specifics for risk fractions. Future endeavors include a comprehensive optimization problem formulation and solution based on the xESM framework both for biologically and non-biologically driven missions. Moving forward, we hope that our extension of ESM provides the basis for continued systems engineering and analysis research for a more quantitative and inclusive design and optimization of long-term human exploration missions.

### 4.5 Methods

#### Mathematics

Let  $\mathcal{L}$  be a set of locations composed by  $\mathcal{L} = \{ \mathfrak{z}, \mathfrak{F}, \mathfrak{T}, \mathfrak{F} \}$  where  $\mathfrak{z}$  is Earth surface,  $\mathfrak{F}$  is low Earth orbit,  $\mathfrak{T}$  is Martian Surface, and  $\mathfrak{F}$  is low Martian orbit. Let  $\mathcal{L}_2$  be the set of pairs in  $\mathcal{L}$  which describe from starting to ending location. Let  $\mathcal{O}$  be the set of operations composed by  $\mathcal{O} = \{ \mathfrak{k}, \mathfrak{k}, \mathfrak{N} \}$  where  $\mathfrak{k}^1$  is cargo,  $\mathfrak{k}^2$  is robotic, and  $\mathfrak{N}^3$  is crewed. Let  $\Lambda(i, j)$  be the mapping from some pair of  $i \in \mathcal{L}_2, j \in \mathcal{O}$  to the set  $\mathcal{R}$  of rockets, vehicles, and habitats. A mission segment  $\mathcal{S}$  can be constructed via set-builder notation as  $\mathcal{S} = \{ (i, j) \mid i \in \mathcal{L}_2; j \in \mathcal{O} \}$  for specific combinations of locations and operations as

$$\begin{split} \mathcal{S} &= \{ (i,j) \mid i \in \mathcal{L}_2; j \in \mathcal{O} \} \\ \mathcal{S}_{\mathrm{pd}} &= \{ (i,j) \mid i \in \{ \mathtt{J}(\mathfrak{F}), \mathfrak{F} \} \\ &= \{ (\mathtt{J}(\mathfrak{F}), \mathtt{F}) + (\mathfrak{F}) \mathfrak{F} \} \\ &= \{ (\mathtt{J}(\mathfrak{F}), \mathtt{F}) + (\mathfrak{F}) \} \\ \mathcal{S}_{\mathrm{sf}} &= \{ (i,j) \mid i = \mathfrak{F}, \mathtt{F} \} \\ &= \{ (\mathfrak{F}, \mathfrak{F}) + (\mathfrak{F}, \mathfrak{F}), \mathtt{F} \} \\ &= \{ (\mathfrak{F}, \mathfrak{F}) + (\mathfrak{F}, \mathfrak{F}), \mathtt{F} \} \\ \mathcal{S}_{\mathrm{tr}_1} &= \{ (i,j) \mid i \in \{ \mathtt{J}(\mathfrak{F}), \mathfrak{F}), \mathfrak{F} , \mathfrak{F} \} \\ &= \{ (\mathtt{J}(\mathfrak{F}), \mathtt{F}) + (\mathfrak{F}, \mathfrak{F}), \mathfrak{F} , \mathfrak{F} \} \\ &= \{ (\mathtt{J}(\mathfrak{F}), \mathtt{F}) + (\mathfrak{F}, \mathfrak{F}), \mathfrak{F} , \mathfrak{F} \} \\ &= \{ (\mathfrak{F}, \mathfrak{F}) \mid i \in \{ \mathfrak{F}, \mathfrak{F}, \mathfrak{F} , \mathfrak{F} \} \\ &= \{ (\mathfrak{F}, \mathtt{F}) \mid i \in \{ \mathfrak{F}, \mathfrak{F} , \mathfrak{F} \} \\ &= \{ (\mathfrak{F}, \mathfrak{F}) \mid i \in \{ \mathfrak{F}, \mathfrak{F} , \mathfrak{F} \} \\ &= \{ (\mathfrak{F}, \mathfrak{F}) \mid i \in \{ \mathfrak{F}, \mathfrak{F} \} \\ &= \{ (\mathfrak{F}, \mathfrak{F}) \mid i \in \{ \mathfrak{F}, \mathfrak{F} \} \\ &= \{ (\mathfrak{F}, \mathfrak{F}) \mid i \in \{ \mathfrak{F}, \mathfrak{F} \} \\ &= \{ (\mathfrak{F}, \mathfrak{F}) \mid \mathfrak{F} \} \\ &= \{ (\mathfrak{F}, \mathfrak{F}) \} \\ &= \{ (\mathfrak{F}, \mathfrak$$

for the abstract segments of predeployment (pd), crewed transit from Earth to Mars  $(tr_1)$ , Martian surface operations (sf), crewed transit back from Mars to Earth  $(tr_2)$ , and either autonomous or crewed operations aboard the interplanetary vehicle in Martian orbit  $(tr_3)$ .

<sup>&</sup>lt;sup>1</sup>Elder Furthark[519] rune <code>\* \*fehu meaning "cattle"</code>, used here to imply "cargo"

<sup>&</sup>lt;sup>2</sup>Elder Furthark rune § \*berkanan meaning "tree", used here to imply "autonomy"

<sup>&</sup>lt;sup>3</sup>Elder Furthark rune M \*mannaz meaning "man", used here to imply "crewed"

The complete mission object  $\mathcal{M}$  is therefore constructed as the collection of these abstract segments in conjunction with the selection of a specific technology in  $\mathcal{R}$  as

$$\mathcal{M} = \{ (k, \ell) \mid k = (i, j) \forall \{ \mathcal{S}_{\mathrm{pd}}, \mathcal{S}_{\mathrm{sf}}, \mathcal{S}_{\mathrm{tr}_1}, \mathcal{S}_{\mathrm{tr}_2}, \mathcal{S}_{\mathrm{tr}_3} \}; \ell = \Lambda(i, j) \}$$

and can be used in the construction of a generalized total mission ESM  $M_0$  as

$$M_{0} = \sum_{k}^{\mathcal{M}} \underbrace{L_{\text{eq},k} \sum_{i}^{\mathcal{A}_{k}} \left[ (M_{k_{i}} \cdot M_{\text{eq},k}) + (V_{k_{i}} \cdot V_{\text{eq},k}) + (P_{k_{i}} \cdot P_{\text{eq},k}) + (C_{k_{i}} \cdot C_{\text{eq},k}) + (T_{i} \cdot D_{k} \cdot T_{\text{eq},k}) \right]}_{M_{0,k}}$$

 $= M_{0,\mathrm{pd}} + M_{0,\mathrm{sf}} + M_{0,\mathrm{tr}_1} + M_{0,\mathrm{tr}_2} + M_{0,\mathrm{tr}_3}$ 

as the sum of ESM for segments in a mission set  $\mathcal{M}$ . Essentially, we have established a graph where the locations represent nodes and the segments represent arcs, which matches previous formulations of mission logistics[202], although our set of location nodes is reduced for simplicity and does not include specific Lagrange Points[231]. The generalization enables accounting of mission segment-specific terms such as location factor  $L_{eq}$  and equivalency factors ( $M_{eq}$ ,  $V_{eq}$ ,  $P_{eq}$ ,  $C_{eq}$ ,  $T_{eq}$ ). This generalization also allows for indexing of mission segment specific subsystems  $\mathcal{A}$ , further enabling an accounting of inventory elements between mission segments.

#### **Example Problem Calculations**

Inventories for the whole system mass in Figure 4.3 and the agricultural system mass in Figure 4.4 are rendered from ALSSAT[574] calculation outputs for a Closed Loop (Air and Water subsystems) mission. The segment parameters for a full transit are as follows; tr1: 6 crew, 210 days, tr2: 6 crew, 210 days, tr3: 2 crew, 500 days, sf: 4 crew, 500 days, asc: 4 crew, 1 day, desc: 4 crew, 1 day. All other configurations are set to their default value. Note that to calculate xESM inventories, technologies that remain on the same craft were scaled to their upper bound of usage. For example, the air processing equipment for the craft throughout tr1, tr2, and tr3 were scaled for 920 days of operation. Consumables (such as stored food) were initially be scaled for 920 days and decreased accordingly as they were used.

#### **Penalty for Mission Failure**

The penalty associated with the mission failure can be defined in various ways. For example, we can define the following relationship between the penalty cost and the duration of the mission

$$s(u_j) = \left(1 - \frac{\hat{t}_f(u_j)}{t_{tot}}\right),\,$$

which expresses a linear decrease of the penalization with the number of days.

### Chapter 5

## Computational Methods and Construction of echusOverlook Software

Design practices and tools for human exploration missions have evolved in concert with mission complexity over the past half century of the space age. As collective thought turns toward the exploration of Mars and of the Moon, including the Artemis Program, technologies new and old have been proposed to address challenges in astronautics. However, the coordination of these challenges has lagged behind the advances of technologies themselves. This drives our development of echusOverlook (eO), an opensource Python library that captures the explorable mission design space, standardizes the definition of mission components, and democratizes the process of distilling technologies to sustain human exploration. No existing mission design software allows users to build and simulate technologies of their own design, because they are limited to the space of hard coded options. The open and modular framework of eO attempts to reflect and integrate the collaborative contributions of the community. For a given configuration, eO calculates the exchange of resources between system components using a crewmember model and mass balancing logic. This mission representation is a precursor to computations including inventory generation, techno-economic analysis, and performance assessment of simulated discrete and stochastic behavior. Calculations are benchmarked against and on par with the ALSSAT for inventory generation, and with HabNet for mission simulation. eO supports both private, local data and the publishing of mission designs to a central public server, where they can be extended by the global community. We reproduce the ALSSAT model of a closed-loop mission with a biomass system, and extend it in eO with the modular addition of a novel bioprocess that produces parathyroid hormone for skeletal anabolism. The expansion of mission technologies beyond abiotic hardware to biotic design is a key motivator for eO's accessibility, which attempts to meet NASA's Space Technology Grand Challenges by bridging the space sciences and biological engineering communities. Our software, data, and models will be released and maintained on GitHub.

The following chapter is under development for publication as <u>A.J. Berliner</u>, D. Ho, K. Yates, G. Makrygiorgos, A. Mesbah, S. Nandi, K. McDonald, A.P. Arkin. echusOverlook: In silico Knowledge-base and Simulation Framework for Human Exploration Operations of Mars. (In preparation, expected submission Fall 2022).

### 5.1 Introduction to Mission Design Software

Design practices and tools for human exploration missions have existed since the earliest of the Mercury program [87] and have evolved in concert with mission complexity over the past half century of the space age [304]. As the collective thought across multiple space agencies turns to the exploration of Mars [546, 503], technology platforms – new and old, incremental, and novel – have been proposed to address a wide array of challenges across nearly all aspects of astronautics [147, 385]. However, the coordination of such challenges has lagged behind specific advances of the technologies themselves – motivating a need for systems engineering frameworks capable of exploring the interplay between platforms and solutions [377]. Such a design space must be subtended in order to distill an optimal set of technologies and operational strategies for sustaining a long-duration human exploration mission on Mars.

Among the many newly-proposed technologies that have been shown as critical in enabling human exploration on Mars, biological technologies have been identified as critical in sustaining astronauts and reducing mission  $\cos[371, 372]$ . The optimal set of technologies and operational strategies for sustaining a long-duration human exploration mission on Mars is driven by the design, optimization, deployment, and management of a surface biomanufactory [44]. Recently the components of Space Bioprocess Engineering (SBE) [43] have been codified to include (1) in situ microbial media production, which harnesses Mars atmospheric and regolith resources for downstream biological use; (2) in situ manufacture of mission products, which creates outputs like propellants and building materials that are fundamental enablers of any long-duration space mission; and (3) in situ food and pharmaceutical synthesis, which enables manned long-term space missions and the use of plants and microbes for food, nutrients and medicine to astronauts [44]. The realization of these systems into a technology platform for future work by NASA requires both the biological engineering required to achieve technology milestones as described above, and the systems engineering needed to analyze, test, improve, and integrate the many processes into a single biomanufacturing system. Here we present the design and construction of the echusOverlook (eO) software as a means and method for evaluating mission architecture across a myriad of metrics common to Environmental Control and Life Support System (ECLSS)[429]. Such metrics may include equivalent system mass (ESM)[314, 314, 152], reliability, and costbenefit trade-offs.

Mission 'planners' have requirements for basal support of the crew for particular [17, 230]. These requirements are staged out from prelaunch through the return in multiple stages – each with different requirements to be met that may include preparation for the next stage and operation within a stage [147]. A fraction of these can be provided by systems that

incorporate biological components beyond the crew themselves- plants and microbes most probably[42]. These systems each have their own costs and benefits that accrue in both their independent operation and their connections to other mission systems and operations across stages[41]. Costs include material costs, power costs, weight, operational costs in labor and risks of failure, etc. Benefits include the production of required functions and possible sidebenefits to other mission operations (e.g. waste recycling or air filtration). There may be more than one possible system available to fulfill a given requirement. Thus, selection of a set of biotechnologies to fulfill a set high level mission requirements, calls for selecting a set of operationally compatible biotechnological systems optimized within and across the mission elements and mission stages so that the most optimal system configuration can be chosen.

Various aspects of mission design have been explored across a number of software artifacts as shown in Table 5.1. Beginning with the Microsoft Excel-based Advanced Life Support Sizing Analysis Tool (ALSSAT)[573] in 1998, the complexity of such software has grown through the establishment of dynamic modeling methods. Likewise, the fidelity of models has increased with moderate tradeoffs in convergence time. Table 5.1 also shows that software has been developed in parallel by both NASA and ESA which underscores a lack

Modeling Tool	Year of Initial Release	Year of Last Update	Summary	SS/D/S	Fidelity	Speed	Availability	Programming Language
ALSSAT[573, 572, 574]	1998[360]	2012[575]	NASA's Advanced Life Support Sizing Analysis Tool was developed for use in the sizing and analysis of Environmental Control and Life Support Systems (ECLSS) for spacecraft and habitats. The purpose of this tool is to perform life support system trade studies and analysis.	SS	L	O(s)	Lengthy application through NASA's Software Portal. Under export control	Microsoft Excel and Visual Basic Macros
ELISSA[138, 136]	1999[ <mark>360]</mark>	2018[137]	The Environment for Life-Support Systems Simulation and Analysis (ELISSA) tool has been developed at the Institute of Space Systems (IRS), University of Stuttgart since the mid-90s and allows the analysis and validation of new ECLSS designs, as well as system optimization	SS/D	М	O(m)	Unavailable	MATLAB
EcoSim[428]	1999[ <mark>534</mark> ]	2021[149]	ESA's Standard Software based on a simulation tool developed by Empresarios Agrupados for modelling physical processes that can be expressed in terms of Differential algebraic equations or Ordinary differential equations and Discrete event simulation.	$\mathrm{D}/\mathrm{S}$	М	O(w)	Commercial Payware	Standalone Tool in Visual Basic and C++
BioSim	2003[293]	2015[292]	Intended for detailed ECLSS controls and operations analysis. Developed by TracLabs (NASA JSC Contractor) exclusively for integrated ECLSS controls research Developed by TU-Munich dynamically simulates life support	$\mathrm{D}/\mathrm{S}$	Н	O(s)	Available. GPL v3	Java
V-Hab[476, 130]	2009[128]	2019[440]	systems and their subsystems, as well as their interactions with a modeled crew metabolism. the goal of V-HAB is to create a holistic tool that can be used during the complete life cycle of an ECLSS, from the initial feasibility studies, through requirements definition to subsystem and system design and even utilization and operation of the system.	$\mathrm{D}/\mathrm{S}$	Н	O(m)	Private. Accessible by request.	MATLAB
SCALISS /ALiSSE	2010[63]	2017[57]	operation of the system. A European Tool for Automated Scaling of Life Support Systems. The aim of the SCALISS study was to understand and investigate in ECLSS functionality, technologies and scalabilities in order to produce a robust initial design starting point for future Phase-A studies with an automated tool.	SS	М	O(m)	Unavailable	Standalone Tool, Java
HabNet	2015[142]	2019[58]	Developed by MIT as an integrated habitation and supportability architecting and analysis package. Tool quantitatively evaluates various technology options for a proposed mission architecture in terms of their functional performance, their failure modes, their supportability requirements, and ultimately their initial deployment and lifecycle operational costs.	D	Н	O(m)	Partially accessible.	MATLAB
eO	2021	-	Tool for designing, exploring, and optimizing a biologically-driven reference mission architecture for human exploration of Mars	$\mathrm{D}/\mathrm{S}$	Н	O(m)	Available and Open Source	Python

Table 5.1: Comparison of Life Support Systems Software Packages

of standardization between space agencies. Moreover, the development of recent tools has been outsourced either by private industries in the case of EcoSimPro[428] or by academic institution via V-Hab[128] or HabNet[142]. The result of such outsourcing has led to two primary issues with the life support systems software: tools (1) operate on poorly-standardized mission architectures, methods, and data (2) are predominately either protected for reasons of academic priority or private financial concerns. Propagation of such issues has led to barriers in both the free discussion of methods and the agency for new players to contribute – in many forms ranging from mission elements to performance metrics to general biological ideas – to the grander mission of human exploration.

As outlined in Table 5.1, the echusOverlook software has been designed to maximize availability to the space mission design community while also meeting the fidelity and convergence time of previously developed tools. What cannot be captured by these criteria, however, is that eO is a dynamic, living software framework. There are no predetermined and immutable data types, calculations, metrics, or simulations. At this level of abstraction, eO fully supports the design of non-biological missions while being extensible enough to accurately describe and model complex bioengineering systems. *Any* mission to Mars with any reference mission architecture, any set of processes, and any inventory can be described and modeled inside eO. This allows eO to address both the ECLSS-based goals of SBE[372] and meet NASA's Space Technology Grand Challenges[514] by bridging the space sciences and biological engineering communities[43]. eO fosters both Standardization of mission elements and operations by the space science and engineering community and Democratization of novel biological system elements by the biological science and engineering community to meet the needs and requirements of both user-groups.

### 5.2 Preliminary eO Software Design and Overview

Initial feedback in regards to eO gathered from NASA stakeholders at the CUBES Y4 Spring Review stressed the importance of not developing the software in a vacuum – and encouraged our team to renew our efforts to establish communication with NASA's mission design specialists. After much assistance from our NASA point-of-contact, Dr. John Hogan, we were able to schedule an initial meeting to

- 1. Form a community of mission planners, life support systems designers, espace scientists, and bioengineers;
- 2. Review what is known about possible mission specification or modeling that has been done for chemical and biotechnologies that support food, pharmaceutical and material production in space; and
- 3. Explore current Bioregenerative LSS and ECLSS and determine what elements have been missing from mission design.

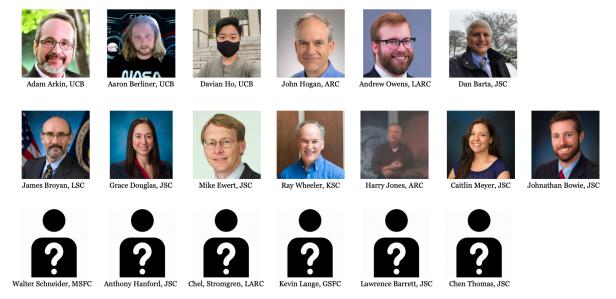


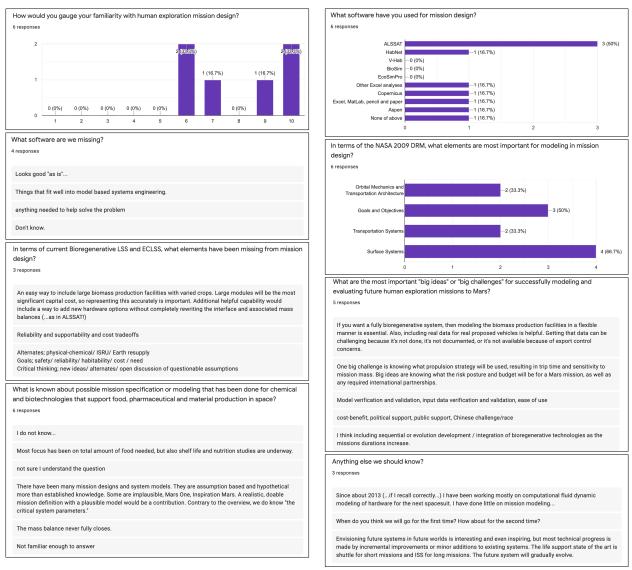
Figure 5.1: eO Meeting Attendees

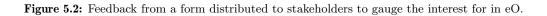
Prior to the meeting with the attendees outlined in Figure 5.1, we solicited feedback to a set of questions designed to gauge the interest for the echusOverlook software for human exploration mission design and optimization (emphasizing biomanufactory-driven RMAs and technologies). We collected the responses and presented them back to the attendees at the meeting which was designed to explain our preliminary efforts, discuss struggles, collect needs, and learn of others we might need to interview. The responses are presented in Figure 5.2.

We presented eO with a preliminary user story in which a user would want

- 1. to specify mission goals formally,
- 2. to be prompted towards inclusion of mission elements/processes to support those goals,
- 3. be able to efficiently populate those processes with possible inventories to support those processes and models of their operation, and
- 4. given these constraints to select from possible mission architectures that can support lift of these processes to their sites of action.

Given these sets of possible alternatives to process, inventory and mission architecture, we proposed that the user would wish to be able to create more or less optimal scenario composed of these and compare them for trade-offs against different mission metrics including standard mass, power requirements; modularity/ interoperability requirements, minimum waste and maximum recycling requirements, etc. The user story provided a preliminary design pathway in which the proposed story would be supported through:





- 1. Creation of a databases of processed, models, inventory elements, mission architectures that can be extended, and used together to create models of different mission scenarios
- 2. Allow building of multiple and community extension of models of mission elements ranging from very top level ESM like models of their costs to detailed dynamical models of their operation
- 3. Allow model optimization, sensitivity/uncertainty analysis, and cross-model comparison for decision support.

4. Allow open, transparent, FAIR sharing of data, models and analysis among diverse communities to support effective comparison, incremental development, and ease of checking/rechecking results.

Following the preliminary meeting, we established a set of future goals:

- 1. Collecting and collating all known information about the physical specifications and form factors for operation of technological elements (life support, biomanufacturing, etc.) on-board transit craft, space-stations and surface elements.
- 2. Collecting and collated all known information about costs/models for operations of these platforms that affect the costs and operations of the tech support elements (how different rockets, etc. effect the cost of operations in 1.)
- 3. Collecting and collating all known actual and possible mission architectures for planned missions over the next 30 years to serve as templates for the RMA structures in echusOverlook
- 4. Collecting, improving, and testing different models of critical technological elements in the LSS, ECLSS, biomanufacturing space or other biologically-linked operations for test bedding the system and supporting the evolution of this community for driving innovation in these elements over the next decades.
- 5. Developing a community to ensure we are building a usable, accelerating software framework for the larger community even beyond space bioengineering;
- 6. Developing a clear communication and alliance with other mission planning and tech development groups so we remain relevant.

### 5.3 Software Overview

eO models the parametric constraints on and tradeoffs among bioprocesses such that they meet or exceed mission need and are engineered to minimize the risk of failure under different orbital, crew, and landing site scenarios. Through the integration of both a knowledge-base and simulations, eO is designed to elucidate the critical system parameters for demonstrating the feasibility and advantages of biological engineering on a human exploration mission to Mars. The echusOverlook repository is available for download (https://github.com/cubes-space/echusOverlook) and can be accessed via command line, Jupyter notebook, or text editor.

### User Story

The user story diagram (Figure 5.3a) describes how a user starts with the setup of "campaign" and proceeds through from design to the technoeconomic calculation through simulation

and ends with either the submission of results back to the eO database or an adjusting of parameters for additional calculation and/or simulation. Users begin by creating a space logistics network (SLN) by selecting the data elements for use from existing data in eO which can then be modified. eO is initially seeded with a library of common ontologies, datasets, and operations, and the user community is encouraged to upload new components and their results. Each SLN is used to determine mission needs and constraints and is

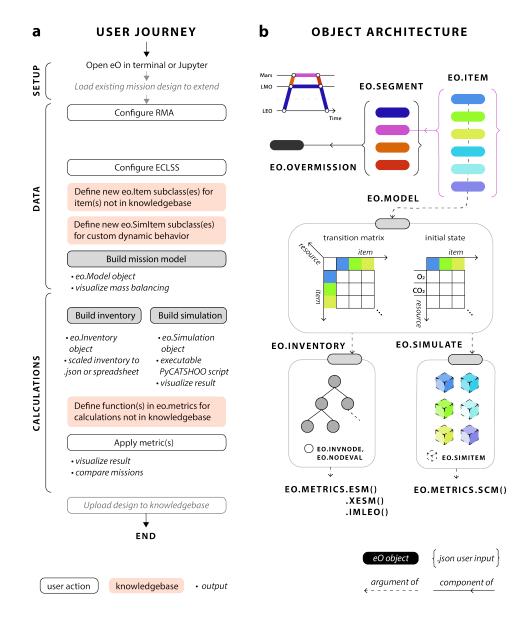


Figure 5.3: Overview or echusOverlook software. Design of eO (a) user journey/story with (b) system architecture.

composed of operations across a series of mission segment with locations such as Earth, Low Earth Orbit (LEO), Cis-lunar Space, Luna, Interplanetary Space, Martian Orbit, Mars, etc. Default mission data packages are available as a starting point for users to not only decrease the barrier of entry to space mission design, but also to standardize the use of eO across multiple instances. The user can easily create additional ontologies, variables, and models by uploading new types of information, allowing for the freedom to construct a mission component using any data type necessary to describe it. Once a SLN has been validated, the user can perform downstream a variety technoeconomic analyses and/or initiate a simulation for exploring the dynamics of their system.

#### Systems Architecture

The eO data module acts as a knowledgebase to describe the mission parameters – both user-defined and calculated – and can be considered as the set of instructions from which simulations are first constructed, parametrized, and run – and later as the container in which simulation results are added. The interactions of these components (Figure 5.3b) are governed by a number of modules including OrbitalMechanics, MartianEnviornment, Processes, Inventory, and Crew. A number of "start-up" examples are provided in the knowledgebase and include complete reference mission architectures and other case studies such as inventory constructs from NASA's ALSSAT[575] and BVAD[16] and sortie and outpost surface missions described in HabNet[142].

Mission architectures are assembled from disparate data types, from graphs [231] to inventories [16] to simulated processes [128]. Currently, data and their associated context are siloed in spreadsheets, on pencil and paper, and in publications. Not only is there no initiative for communicating and sharing this data, but this also slows the process of making global updates across the field based on new information. To address these issues, we use CORAL: a backend framework for creating FAIR data—findable, accessible, interoperable, and reusable—among a community of researchers [91]. CORAL supports dynamic creation of FAIR data types for data kept in spreadsheets, translating information stored locally into objects that can be found and used by others. All data uploaded to the eO database through CORAL is validated by eO ontologies and accompanied by context, such as units, sources, and references to other modules.

Through CORAL, spreadsheet uploads to describe components of the mission, including the inventory, processes, and reference mission architecture, allow users of eO to build and simulate missions of their own design. Default and user-defined information that has been uploaded through CORAL resides in an ArangoDB database instance on the local machine.

### 5.4 Results

The following results are presented for three distinct case studies that validate eO against alternative frameworks for TEA calculations and process simulation while also demonstrating the extensibility of eO for the creation and analysis of novel SSB technologies in a mission context.

### Case Study 1: Technoeconomic Analysis and Validation of "Bring Everything" Scenario

eO was designed to be competitive with previously created software such as the ALSSAT[575] and thus requires methods for carrying out technoeconomic analysis (TEA) in the form of sizing and trade studies – and thus eO's TEA methods require the inclusion of mission design metrics. The history of space mission design is replete with a number of such metrics that range in scope and complexity (Table 5.2). ECLSS technology selection was initially carried out by assigning a Technology Readiness Level (TRL)[339] value and has evolved to account for Integration and Systems Readiness (IRL, SRL)[470, 471, 472, 473]. However, despite the standardization of TRL criteria[179, 229], such "mangagement" metrics are often considered lacking in objectivity[269] and do not readily lend themselves to optimization.

The impact of specific technology choices are usually evaluated through the more quantifiable metric of the equivalent system mass (ESM)[312] which provides a method for distilling the mass of all of the resources of a larger system. Despite its status as the gold standard, ESM has been criticized for a number of short-comings such as ambiguity of application and non-accounting of development costs[261] and uncertainty[6]. Efforts to address these challenges metric have been proposed in the form of (extended ESM) which addresses unresolved complexities stemming from multiple transit and operations stages, such as would be required to support a crewed mission to Mars and also provides an accountancy for the uncertainties inherent in mission planning[41]. Additionally, a number of alternative metrics have been proposed to surplant [264, 273] ESM that consider complexity [272]. Most recently, the Life Support Multi-Dimensional Assessment Criteria (LSMAC) metric has been proposed to incorporate a myriad influences of influences including maintainability, risk Analysis, TRL, radiation impacts, manufacturing costs, reliability, human factors, and autonomous operation<sup>6</sup>. Such a multitude of metrics underlying TEA has led to a difficulty in comparing the technologies that have been evaluated differently – compounding complexity to the previously described differences in technology specifications from across multiple data-sets and literature sources. The initial release of eO addresses these challenges through the inclusion of all frameworks in Table 5.2 – enabling multi-metric TEA. Additionally, the extensibility of eO provides for creation of new metrics which can be uploaded and shared similarly to specific technology objects – further standardizing and democratizing mission design.

Preliminary RMAs propose 30 sols of surface operations driven by an opposition-class transit by a small crew of 4-6 astronauts[147]. Such short-term missions do not led themselves construction and operation of biomanufactory-based set of technologies and instead opt for a "bring everything" (BE) scenario in which the majority of consumables such as food, tools, and medicine are packaged turn-key and transported via predeployment or as cargo on the primary mission vehicle[44, 42]. Given that the BE scenario serves as a standard

Metric	Description	Formulation
Technology- Integration-Systems Readiness Level (T/I/S-RL)[339, 473]	A series of methods for estimating the maturity, interoperability, usability of technologies on a scale from 1-9 during the acquisition phase of a program	$T, I \in [1, 9], S = \sum_{j=1}^{n} \sum_{i=1}^{n} \frac{I_{ij}T_j}{m_j}$
Equivalent System Mass (ESM)[314, 312]	A method to evaluate a system or tech- nology based upon its mass, volume, power, cooling and manpower require- ments by relating all parameters to mass equivalency.	$M = L_{eq} \sum_{i=1}^{\mathcal{A}} [(M_i \cdot M_{eq}) + (V_i \cdot V_{eq}) + (P_i \cdot P_{eq}) + (C_i \cdot C_{eq}) + (T_i \cdot D \cdot T_{eq})]$
Extended Equiva- lent System Mass (xESM)[41, 367]	A method for extending ESM to ac- count for multi-staged missions and re- liability and feed into downstream opti- mization problems.	$M = \sum_{k}^{\mathcal{M}} L_{\text{eq},k} \sum_{i}^{\mathcal{A}_{k}} [(M_{k_{i}} \cdot M_{\text{eq},k}) + (V_{k_{i}} \cdot V_{\text{eq},k}) + (P_{k_{i}} \cdot P_{\text{eq},k}) + (C_{k_{i}} \cdot C_{\text{eq},k}) + (T_{i} \cdot D_{k} \cdot T_{\text{eq},k})]$
Initial Mass to Low Earth Orbit (IM- LEO)[444, 231] Systems Com- plexity Metric	A method for calculating the total mass of a system from to LEO for down- stream relationship to the gear ratio. A method for evaluating the complex- ity of an integrated system in terms of	$M = \sum_{k}^{\mathcal{M}} \sum_{i}^{\mathcal{A}_{k}} M_{k_{i}}$ $C = (L-1)S^{2} + \frac{N^{2}}{S^{L-1}}$
(SCM)[272]	the interactions and interoperability be- tween subsystems.	

**Table 5.2:** Mission desgin metrics. For T/I/S-RL: T and I are the TRL and IRL values in range [1,9], n is the number of subsystems, m is the mass of the subsystem, and S is the SRL value. For ESM, xESM: M is the calculated mass,  $\mathcal{A}$  is the set of subsystems,  $\mathcal{M}$  is the set of mission segments,  $M_i$ ,  $V_i$ ,  $P_i$ ,  $C_i$  are the initial mass [kg], volume [m<sup>3</sup>], power requirement [kW<sub>e</sub>], and cooling requirement [kg/kW<sub>th</sub>], D is the duration of the mission segment [sol],  $T_i$  is the crew-time requirement based on an astronaut crew-member (CM) [CM-h/sol],  $M_{eq}$  is the stowage factor for accounting for additional structural masses for a subsystem such as shelving [kg/kg],  $V_{eq}$  is the mass equivalency factor for the pressurized volume support infrastructure [kg/m<sup>3</sup>],  $P_{eq}$  is the mass equivalency factor for the power generation support infrastructure [kg/kW<sub>e</sub>],  $C_{eq}$  is the mass equivalency factor for the cooling infrastructure [kg/kW<sub>th</sub>],  $T_{eq}$  is the mass equivalency factor for the crew-time [kg/cM-h], and  $L_{eq}$  is the location factor for the mission segment [kg/kg] which accounts for the cost to transport mass from one location in space to another. Mass equivalency factors ( $V_{eq}$ ,  $P_{eq}$ ,  $C_{eq}$ ,  $T_{eq}$ ) are used to convert the non-mass parameters to mass. For IMLEO:,  $\mathcal{M}$  is the set of mission segments to LEO. For SCM: C is the systems complexity value, L is the level number, N is the number of nodes, and S is the number of subsystems.

for RMA design, we leverage the existing literature for programmatic representation of a 500 sol surface mission with an initial inventory population to demonstrate the validation of eO's TEA module. Validations of the eO TEA capabilities are presented in Figure 5.4 as a comparison across a myriad mission architectures using the metrics presented in Table 5.2. Each RMA was constructed by assigning standard mission variables such as crew-number and mission duration, a "scenario" such as open loop (OL) or closed-loop (CL), and technology choices the corresponding variable specification for air, food, thermal and waste subsystems. The comparison of eO's calculated ESM values against those from the ALSSAT validate our agency in constructing the distribution of BE scenarios.

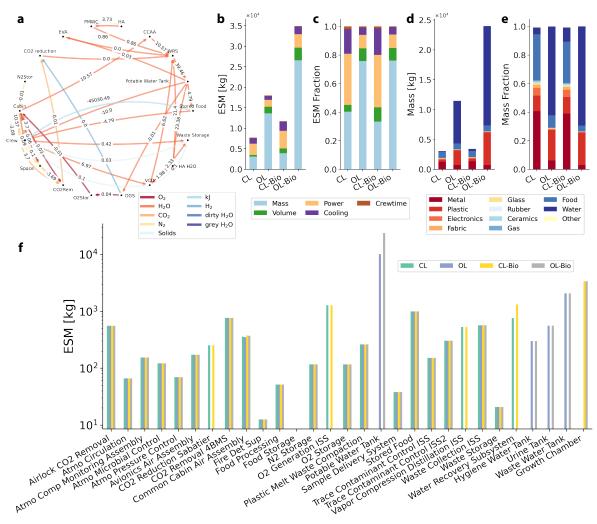


Figure 5.4: Technoeconomic Validation of eO against the NASA ALSSAT. (a) Visual depiction of transition matrix for closed loop "bring everything" scearnio. (b) Bar chart demonstrating eO calculation and comparison of 4 scenarios in terms of the standard ESM metric using a breakdown of ESM by components such as Mass, Volume, Power, Cooling, and Crew Time. (c) Bar chart with same comparisons as (b) using ESM fraction. (d) Bar chart demonstrating eO calculation and comparison of 4 scenarios in terms of the standard ESM metric using a breakdown of ESM by material composition in terms of metal, plastic electronics, water, etc. (e) Bar chart with same comparisons as (d) using ESM fraction. (f) Bar chart comparison of subsystems for each scenario.

The basic schema for carrying out ESM-based TEA in eO is shown in Figure 5.3 in which resources such as  $O_2$  are used to populate stocks of transition matrices given some initial states. The transition matrices (Figure 5.4a) serve as the starting point for all TEA calculations. Transition matrices can be visualized in eO as a combined directed graphic showing the transfer of resources. Here we show an example transition matrix for a closed loop (CL) BE scenario with resources of  $O_2$ ,  $H_2O$ ,  $CO_2$ ,  $N_2$ , solids (define), and energy in [kJ]. In Figure 5.4b we demonstrate eO's agency in calculating and comparing 4 scenarios in

terms of the standard ESM metric, and we further compare each scenario using a breakdown of ESM by components such as Mass, Volume, Power, Cooling, and Crew Time. In Figure 5.4c we breakdown the same elements from 5.4b using ESM fraction rather than pure ESM which allows for a more in depth comparison of ESM components on a standardized scale. In Figures 5.4d,e we further compare each scenario using a breakdown of Mass and Mass Fraction (respectively) by element such as structural metal, plastic, water, biomass, electronics, etc. This demonstrates eO's extensibility beyond the standard ALSSAT. In Figure 5.4f we further expand the subsystem hardware to compare each scenario.

#### **Case Study 2: Dynamic Simulation**

The nature of manned missions and their components can be modeled by hybrid systems that mix two kinds of behaviours: (1) the discrete and stochastic behaviour which is in general due to failures and repairs of the system's constituents and (2) the continuous and deterministic physical phenomena which evolve inside the system. eO was designed to be competitive with previously created software such as the HabNet[142] and thus requires methods for defining and running simulations of both individual systems for exploring the deep subsystem-specific parameters and their local optima and entire campaigns composed of many systems in order to understand their dynamics and interoperabilities globally.

Simulations in eO are carried out using the PyCATSHOO framework[103, 102, 135] for Piecewise Deterministic Markov Processes (PDMPs)[183]. PyCATSHOO is a modeling tool for distributed hybrid stochastic automata. eO endeavors to simulate the failures and repairs of Inventory objects and the continuous products of chemical and physical reactions carried out during surface operations. The relationships between and within the Environment, Inventory, Habitat, Processes, and Crew classes are expressed through PyCATSHOO. Mission reliability is calculated by PyCATSHOO as the expected duration of time that mission parameters are within safety margins. Cases resulting in mission failure as described by Do *et al.* in HabNet[142] included the following: crew starvation, crew dehydration, crew hypoxia, crew hyperoxia, crew CO<sub>2</sub> poisoning, cabin pressure, high fire risk, and crop death. Therefore, while simulating a mission, PyCATSHOO tracks and plots CO<sub>2</sub> levels, O<sub>2</sub> levels, pressure, and amount of food over time.

While inventory models in the previous case explored the technology choice landscape problem [106], the assumptions necessary to static mission design tools limit their ability to describe and compare real missions. Dynamic simulations are required to articulate and asses system behaviors like processing cycles, processor scheduling, supply and demand variations, transients, interruptions, and failures – all of which can determine the cost and success of a proposed mission architecture [265].

The first step towards dynamic models is to raise abstraction barriers between items; for example, through the object-oriented frameworks in tools like Biosim and HabNet [142]. This enables the definition of objects that store attributes about themselves, while responding to incoming information from other objects. Past tools store this mission information in Excel formulas or MATLAB/Java code. However, accessibility and standardized definitions are

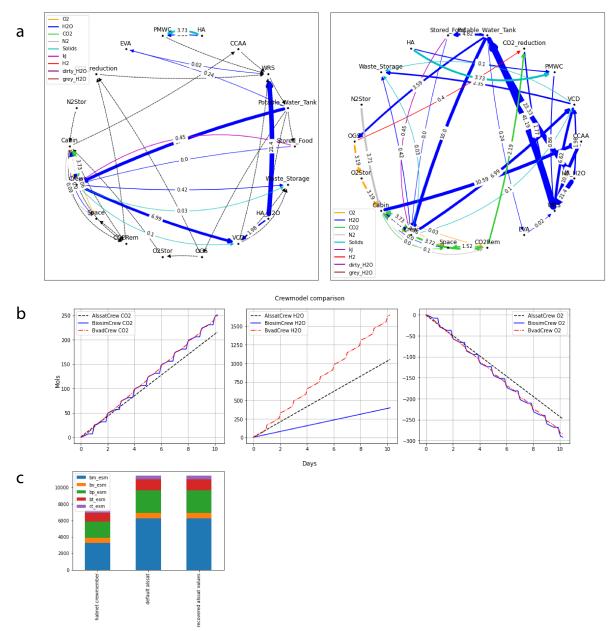


Figure 5.5: Process simulation in terms of (a) representation of systems & states, (b) dynamics, and a preliminary (c technoeconomic analysis.

related: even if an object was dynamic, users would be limited to a static set of said objects if they could not create new items of their own. In eO, we formalize the definition of objects and their interactions. We chose PyCATSHOO for its ability to describe an object's dynamic variables; the conditional update of those values; an object's automata; the conditional transitions between those states; and the importing and exporting of values without prior

knowledge of who to receive resources from, or distribute resources to. Furthermore, the transition rate matrices in eO exposes these innards of a mission, displaying every string in the network that can be pulled, and summarizing them at a glance.

In 5.5, the static mission configuration from the previous section is extended to a duration of 500 days and converted to a dynamic model. The usage requirements of a technology (by which it is scaled) often originate from information that originates from the crewmembers, not the machine itself, so such edges that were once assigned a float value were now defined by a method that is evaluated at each simulation timestep. As a benchmark, these values were recovered after simulation, and their averages were found to be nearly identical to the original static float. The graph on the right was repopulated with simulation results.

Given how mission architectures spring from crew needs, we next benchmarked eO's simulation module on different metabolic models, from HabNet and the BVAD, that capture hourly fluctuations in resource needs based on the daily schedule. Because eO objects are modular, we also used eO to scale the same inventory configuration as before, except with dynamic simulation that allows for fluctuation in crew need, and then calculated ESM. While there was negligible difference between the dynamic model of the static original, using the same mission design with a different crew metabolic models caused great differences in the resulting ESM, showing the need for such a modular framework that allows benchmarking across multiple versions of the same object, and the standardization of which models to use.

### Chapter 6

## Case Study 1: Photovoltaics-Driven Power Production on Mars

A central question surrounding possible human exploration of Mars is whether crewed missions can be supported by available technologies using *in situ* resources. Here, we show that photovoltaics-based power systems would be adequate and practical to sustain a crewed outpost for an extended period over a large fraction of the planet's surface. Climate data were integrated into a radiative transfer model to predict spectrally-resolved solar flux across the Martian surface. This informed detailed balance calculations for solar cell devices that identified optimal bandgap combinations for maximizing production capacity over a Martian year. We then quantified power systems, manufacturing, and agricultural demands for a six-person mission, which revealed that photovoltaics-based power generation would require <10 t of carry-along mass, outperforming alternatives over ~50% of Mars' surface.

The following chapter can also found here: <u>A.J. Berliner</u>, A.J. Abel, M. Mirkovic, W. Collins, A.P. Arkin, D. Clark. **Photovoltaic and Photoelectrochemical Production Capacity can Support Human Exploration on Mars**. *Frontiers in Astronomy and Space Sciences* (2022). DOI: 10.3389/fspas.2022.868519.

### 6.1 Power Production on Mars

Long-duration space missions or continuously-occupied extraterrestrial outposts require Earthindependent power and chemical supply. Mars has an abundance of *in situ* resources, including (sub)surface water ice[567] and carbon and nitrogen in atmospheric CO<sub>2</sub> and N<sub>2</sub>[552]. Efficient conversion of these resources to reduced forms of hydrogen, nitrogen, and carbon would represent an enabling step towards sustaining a permanent human presence in space. In analogy to the proposed terrestrial "Hydrogen Economy", molecular hydrogen (H<sub>2</sub>) can be used as a platform molecule for energy storage, on-demand power supply, and as a reactant

driving  $CO_2$  and  $N_2$  (bio)chemical reduction on Mars[341, 44, 95].

Water electrolysis with selective catalysts can drive water reduction to  $H_2$  on cathode surfaces. This technology is attractive for space manufacturing applications since reactions can proceed at high rates at room temperature, enabling the use of low-weight, 3D-printable plastic reactors[44]. Commercial electrolyzers can evolve  $H_2$  from water with up to ~80% energy efficiency[531]. Directly solar-powered (i.e., photoelectrochemical (PEC)) devices have also received significant attention, with solar-to-chemical efficiencies reaching blue>19% for  $H_2$  production[98]. Once generated,  $H_2$  can drive  $N_2$  reduction to ammonia via the Haber-Bosch process for crop fertilizer[44], CO<sub>2</sub> reduction to CH<sub>4</sub> via the Sabatier process or methanogenesis for ascent propellant generation[371], and CO<sub>2</sub> reduction to bioplastics

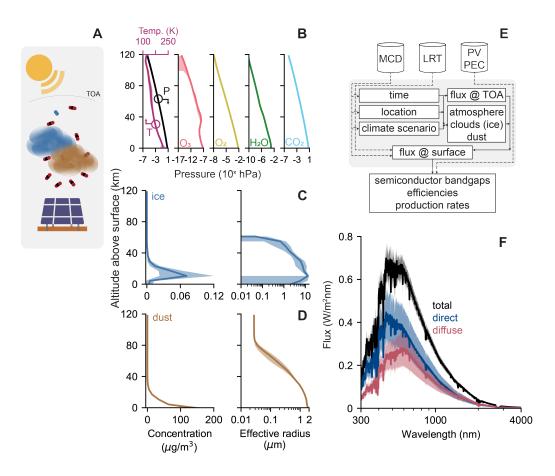


Figure 6.1: Overview and calculation of spectral flux using atmospheric data. (A) Sunlight incident on the solar cells is mediated by orbital geometry and local atmospheric composition of gases, ice, and dust. (B, C, and D) Temperature, partial pressure of atmospheric gases and concentration and effective radii of ice and dust particles as a function of altitude above the surface. (E) Information flow in the calculation scheme. Dotted lines represent functions used for calculations; solid lines represent data used as parameters. MCD, Mars Climate Database; LRT, LibRadtran. (F) Total (black), direct (blue), and diffuse (red) solar flux at Jezero Crater at solar noon averaged over the course of a typical Martian year. In (B), (C), (D), and (F), solid lines represent yearly averages and shaded regions represent the standard deviation due to seasonal variation.

following a variety of metabolic processes for habitat and spare parts manufacturing [44, 401].

The primary alternatives for powering life support systems and chemical production facilities on Mars are miniaturized nuclear fission reactors [147] and photovoltaic (PV) arrays. While fission reactors are expected to behave similarly regardless of their location, the productivity limits of PV and photoelectrochemical devices are not well-characterized for the Martian surface mainly due to differences in the surface temperature and solar intensity and spectrum from typical conditions on Earth or in space.

In an effort to determine the potential of PV and PEC devices to support a crewed mission to Mars, we integrated relevant climate data from the Mars Climate Database 448 into a radiative transfer model, libRadtran 358, to predict spectrally-resolved solar flux across the Martian surface over the course of a year. The modeling overview and sample calculations for Jezero Crater are provided in Fig. 6.1. Sunlight incident on the surface originating from the top of the atmosphere (TOA) is mediated by orbital geometry and local atmospheric composition of gases, ice, and dust for a given location (Fig. 6.1A). We determined the partial pressures of constituent gases (Fig. 6.1B) and the concentrations and effective radii of ice (Fig. 6.1C) and dust (Fig. 6.1D) particles as a function of altitude above the surface and provided these data as inputs to a downstream radiative transfer model (diagrammed in Fig. 6.1E). We then calculated the spectrally-resolved solar flux (Fig. 6.1F). At short wavelengths (<400 nm), light transmission through the atmosphere is limited by molecular scattering (primarily by  $CO_2$ ) and scattering from dust particles [539]. Scattering and absorption by gas molecules is significant at wavelengths below 300 nm, but this region is not considered here because it represents a very small fraction of the available solar flux (<0.5%). Above 400 nm, most transmission loss is due to scattering from dust particles. This is markedly different from the case on Earth, where significant molecular absorption by water molecules limits the transmission of near-infrared light.

### 6.2 Results

The modeling results were used to inform efficiency calculations for PV and PEC devices producing electricity and  $H_2$ . Detailed balance calculations (section 4 in the Supplementary Information)[146, 211] revealed ideal current-voltage characteristics for optically-thick devices consisting of 1-, 2-, and 3- junction PV and 1- and 2-junction PEC absorbers dependent on the bandgaps associated with each absorber (Fig. 6.2). Absorber numbers were selected to represent historical choices for PV devices on Martian rovers[505, 299] and state-of-theart PEC devices[98, 578, 255]. For PEC devices, we assumed an electrical load consisting of the thermodynamic redox potential and a variable overvoltage term that incorporates loss mechanisms inevitable to a practical PEC device beyond radiative recombination already considered in the detailed balance[146, 211].

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The maximum efficiency for PV devices increases from 31.4% (1-junction;  $E_g=1.23$  eV) to 51.3% (3-junction; Eg, 1 = 1.77 eV,  $E_{g,2} = 1.16$  eV,  $E_{g,3} = 0.72$  eV) with judicious

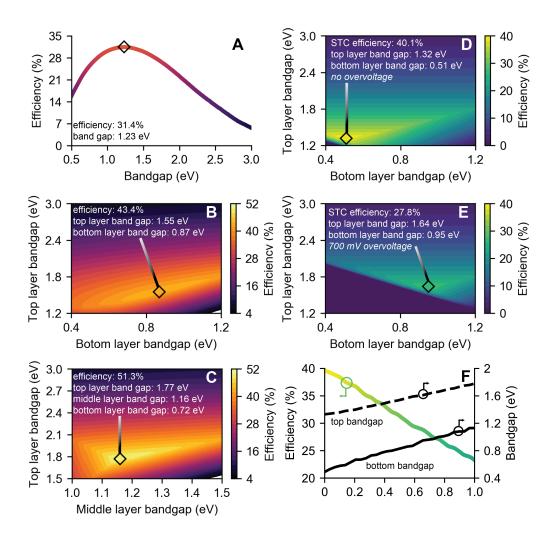


Figure 6.2: Theoretical efficiencies of PV and PEC devices. Detailed-balance efficiency limits as a function of bandgap energies for (A) single-junction, (B) two-junction, (C) three-junction photovoltaic devices. (D, and E) Solar-to-chemical (STC) efficiency for two-junction water splitting PEC devices producing molecular hydrogen with 0 mV (D) and 700 mV (E) overvoltage. (F) STC efficiency and optimal bandgaps for two-junction H<sub>2</sub>-generating PEC devices as a function of overvoltage. Coloring in (A) and (F) correspond to contour coloring in (B, C) and (D, E) respectively. Average flux at solar noon at Jezero Crater is used as the reference solar spectrum.

CHAPTER 6. CASE STUDY 1: PHOTOVOLTAICS-DRIVEN POWER PRODUCTION ON MARS 71

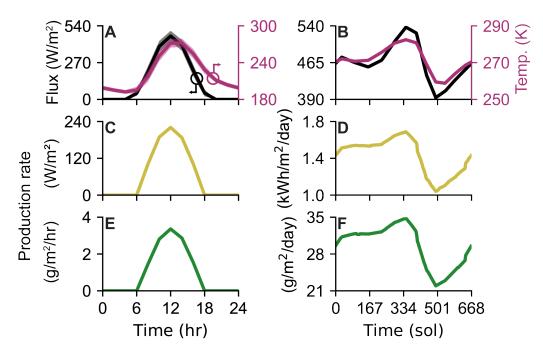


Figure 6.3: PV and PEC production rates. (A) Average and (B) daily maximum solar flux (black, left axis) and surface temperature (purple, right axis) as function of (A) time of day and (B) time of year. (C, E) average and (D, F) daily maximum production capacity of power (C, D) and  $H_2$  (E, F) using 3-junction PV and 2-junction PEC cells as described in the main text. Solid lines in (A, C, E) correspond to averages; shaded areas represent the standard deviation due to seasonal variation. Jezero Crater is used as the location for plots.

choice of bandgaps (Fig. 6.2A-C). For PEC devices, optimal bandgap choice and efficiency are strongly dependent on system losses (Fig. 6.2D-F), reflecting the importance of careful device construction and catalyst selection[239]. For a realistic overvoltage loss of 700 mV[211, 146, 239], a maximum solar-to-chemical blueconversion (SCC) efficiency of 27.8% is feasible for H<sub>2</sub> production.

To evaluate the potential for solar cells to supply power and commodity chemicals, we determined the maximum practical production capacity for 3-junction PV (operating at 80% of the detailed balance limit) and 2-junction PEC devices (with a 700-mV overvoltage) over the course of a Martian year (Fig. 6.3). Daily and seasonal variation in solar flux and temperature (Fig. 6.3A, B) cause substantial (~27% deviation from the yearly average) changes in production rates (Fig. 6.3C, D). We defined solar day (sol) 0 at a solar longitude (Ls) of 0° (vernal equinox) and assumed the solar cell operating temperature was equal to the surface temperature at all points. Dust storm season begins at sol ~372 (Ls~180°) and is primarily responsible for the drop in production capacity from a peak of blue~1.7 kWh/m<sup>2</sup>/day at Jezero Crater to a minimum of blue~1.0 kWh/m<sup>2</sup>/day at the height of dust storm intensity around the winter solstice (Ls ~270°, sol ~514).

Bandgap combinations that maximize production over the course of a year are 5-15%

different from those that optimize efficiency at solar noon (Table S8). For both PV and PEC devices, the top junction bandgap shifted up (for H<sub>2</sub>-generating PEC devices, from 1.64 eV to 1.77 eV), while the bottom junction bandgap shifted down (from 0.95 eV to 0.83 eV). Hence, the photon absorption window for the bottom junction is broadened (by  $\sim$ 35% for the PEC device). This likely works to maximize productivity during the less dusty season (higher solar flux, Fig. 6.3B) by accounting for the relative blue-shift of surface-incident light (Fig. 6.1F) due to reduced scattering.

### 6.3 Discussion

Production capacity of power and commodity chemicals must compare favorably to the demand necessary to sustain a Martian habitat and depends on the outpost location on the planet surface (Fig. 6.4A). Moreover, energy storage capacity is crucial for solar-powered production systems because the sun sets daily. We therefore developed a detailed process model to account for power systems demands, including habitat maintenance (for example, habitat temperature control and pressurization), fertilizer production for agriculture, methane production for ascent propellant, and bioplastics production for spare parts manufacturing (Fig. S12). We considered four different power generation scenarios: (1) nuclear power generation with the miniaturized nuclear fission Kilopower system; (2) PV power generation with battery energy storage (PV+B); (3) PV power generation with compressed  $H_2$ energy storage produced via electrolysis (PV+E); and (4) PEC  $H_2$  generation with compressed  $H_2$  energy storage (PEC). In our calculations, we assumed a capacity factor of 75% to account for the solar flux deviation throughout the Martian year (Fig. 6.3) and sized energy storage systems (batteries or compressed  $H_2$ ) to enable 1 full day of operations from reserve power. We then calculated the carry-along mass requirements for each of the power generation systems considered.

Of the three solar-driven power generation options, only the PV+E system outcompetes the nuclear system based on carry-along mass (Fig. 6.4B, C; supplementary Fig. S13). For the PV+E system, the total carry-along mass increases from ~8.3 t near the equator to ~22.4 t near the South Pole (Fig. 6.4B), corresponding to the reduced average daily power generation of the PV array as the latitude is adjusted away from 0° (Fig. 6.4A). The nuclear power system is predicted to require ~9.5 t; hence, the PV+E system out-performs this option across ~50% of the planet's surface (Fig. 6.4B).

In addition to predicting production capacity and carry-along mass, our model provides design rules for optimal solar cell design. Optimal absorber bandgaps for the PV array are strongly dependent on the location on the surface of Mars blue(Fig. 6.4D-F). Several factors cause this variation: the total depth of the air column above a given location (i.e., the difference between the height of the atmosphere and the altitude), gradients in dust and ice concentrations and particle radii, and orbital geometry effects that cause different effective air column thicknesses for locations near the poles. Lower elevations, higher dust and/or ice concentrations, and increasing distance away from the equator (near-polar latitudes)

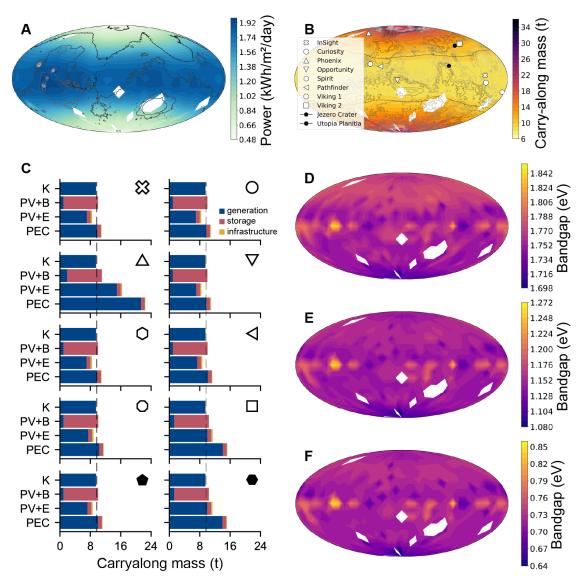


Figure 6.4: Solar productivity across the Martian surface. (A) Average daily solar power production capacity across the Martian surface. (B) Total carry-along mass required for power production using the PV+E generation system. Black dashed line corresponds to breakeven location with nuclear power generation. (C) Carry-along mass breakdown for locations in (B) for each power generation option. Black dashed line corresponds to breakeven with nuclear power generation. Optimal (D) top, (E) middle, (F) bottom bandgaps for the 3-junction PV array.

all cause an increase in the optical depth of the air column, which enhances the fraction of light that is scattered. Because the spectrum of scattered light is slightly red-shifted with respect to direct light (Fig. 6.1F), optimal bandgaps decrease to capture more lowerenergy photons (Fig. 6.4D-F) in regions where the optical depth is higher. For example, at equivalent latitudes, the optimal bandgaps are wider for regions with higher elevations than for those with lower elevations because the fraction of light that gets scattered is lower.

Regional differences in atmospheric conditions can drive countervailing effects; because the Northern Hemisphere experiences generally lower dust concentrations than the Southern Hemisphere, the lower elevation in the Northern Hemisphere does not result in (on average) narrower optimal bandgaps. Instead, the reduced dust concentration (relative to that of the Southern Hemisphere) results in a reduced optical depth, resulting in wider optimal bandgap combinations (Fig. 6.4D-F). blueIn sum, optimal bandgaps for the top absorber range from ~1.7 eV to ~1.84 eV (Fig. 6.4D), from ~1.08 eV to ~1.27 eV for the middle absorber (Fig. 6.4E), and from ~0.64 eV to ~0.85 eV for the bottom absorber (Fig. 6.4F). Optimized triple-junction solar cells could be fabricated from, for example, GaInAsP alloys on Ge substrates with minimal lattice mismatch ( $<\sim1\%$ )[578] or by utilizing compositionally graded buffer layers to minimize threading dislocations[287]. These strategies have been deployed previously with success in high-efficiency triple junction device architectures[186].

In conclusion, solar cell arrays with careful attention to semiconductor choice and device construction represent a promising technology for sustaining an Earth-independent crewed habitat on Mars. Our analysis provides design rules for solar cells on the Martian surface and shows that solar cells can offer substantial reduction in carry-along mass requirements compared to alternative technology over a large fraction of the planet's surface.

### Chapter 7

## Case Study 2: Nitrogen Accountancy in Space Agriculture

Food production and pharmaceutical synthesis are critical biotechnologies to enable human exploration of Mars because they reduce mass and volume requirements through scalable and modular agriculture in closed-loop systems. The NASAsponsored modified energy cascade (MEC) model used to evaluate crop growth is insufficient as a tool to support exploration missions in its monocrop architecture, incomplete material balances on key crop cultivation and life support resources like nitrogen, and lack of the rigorous physical inventory accounting that is required to evaluate mission costs. We expand the MEC model to account for nitrogen dependence across an array of crops and validate our model with experimental fitting of parameters. By adding nitrogen limitations, the extended MEC model accounts for potential interruptions in feedstock supply. Furthermore, we use sensitivity analysis to distil key consequential parameters that may be the focus of future experimental efforts. Finally, the integration of physical system inventories enables comparisons in the choice of architecture and technology.

The following chapter is under development for publication as <u>A.J. Berliner</u>, K. Yates, M. McNulty, P. Kusuma, S. Zhen, S. Sen Gupta, G. Makrygiorgos, A.A. Menezes, B. Bugbee, A. Mesbah, A.P. Arkin, S. Nandi, K. McDonald. **Nitrogen Accountancy in Space Agriculture**. (In preparation, expected submission Summer 2022).

Martian-based agriculture (Fig 7.1A) has been shown to be a feasible [17, 564] alternative to prepackaged meals, but caloric intake alone does not fully describe the requirements for astronaut sustainability; pharmaceutical needs must also be met to ensure crew health. Additionally, the space environment imposes further risk of compromised food consumables necessitates additional reserves of elemental carbon, nitrogen, and phosphorus [366, 253]. While some physico-chemical means exist for recycling a subset of these elements, they are usually mass and energy intensive [356], and generally require additional downstream

processing [173]. Given that the demand for consumable food mass scales nearly linearly with the increasing mission duration/crew size and that storage of larger quantities of food necessitates additional costs in refrigeration, storage, and power, crop cultivation provides a means for cost reduction [581, 41]. Furthermore, consumables must be maintained longer in harsher environments, increasing both financial and mass costs.

Martian-based agriculture (Fig 7.1a) has been shown to be a feasible [17, 564] alternative to prepackaged meals, but caloric intake alone does not fully describe the requirements for astronaut sustainability; pharmaceutical needs must also be met to ensure crew health. Additionally, the space environment imposes further risk of compromised food consumables necessitates additional reserves of elemental carbon, nitrogen, and phosphorus [366, 253].

Variable	Description	Unit	Former Variable[17]
a	Empirical exponent	-	n
$c_{\rm CO2}$	Concentration of $CO_2$ , molar	$\mu mol_{CO2} mol_{air}^{-1}$	$[CO_2]$
$f_{\rm E}$	Fraction of edible biomass after $t_{\rm E}$	-	XFRT
$g_{\mathrm{atm}}$	Atmospheric aerodynamic conductance	$\mathrm{mol}_{\mathrm{water}}\mathrm{s}^{-1}\mathrm{m}^{-2}$	ga
$g_{\rm sfc}$	Canopy surface conductance	$\mathrm{mol}_{\mathrm{water}}\mathrm{s}^{-1}\mathrm{m}^{-2}$	$g_{\mathrm{C}}$
$g_{\rm sto}$	Canopy stomatal conductance	$ m mol_{water}s^{-1}m^{-2}$	$g_{S}$
$h_{ m R}$	Relative humidity	-	RH
$\hat{\dot{m}}_B$	Biomass per time, areal	${ m g}{ m d}^{-1}{ m m}^{-2}$	CGR
$\hat{m}_{\rm E}$	Biomass, areal, edible	$\mathrm{g}\mathrm{m}^{-2}$	TEB
$\hat{m}_{\mathrm{T}}$	Biomass, areal, total	${ m gm^{-2}}$	TCB
ň	Mass, molar	$\mathrm{gmol^{-1}}$	MW
$\hat{\dot{n}}$	Moles per time, areal	$mol  d^{-1}  m^{-2}$	DCG, DOP
$\hat{\dot{n}}_{\mathrm{ps,gross}}$	Gross canopy photosynthesis	$\mu mol_Cs^{-1}m^{-2}$	$P_{GROSS}$
$\hat{\dot{n}}_{\mathrm{ps,net}}$	Net canopy photosynthesis	$\mu mol_C  s^{-1}  m^{-2}$	$P_{NET}$
$P_{\rm atm}$	Total atmospheric pressure	kPa	$P_{ATM}$
$p_{\rm S}$	Saturated vapour pressure	kPa	$VP_{SAT}$
$\tilde{T_{\rm D}}$	Temperature, dark cycle	°C	$T_{DARK}$
$T_{\rm L}$	Temperature, light cycle	°C	$T_{\rm LIGHT}$
$t_{\rm sol}$	Length of local sol	$\rm hd^{-1}$	$D_{PG}$
$\hat{\dot{V}}_{ m trs}$	Daily transpiration rate	$L d^{-1} m^{-2}$	DTR
$w_{\rm C}$	Biomass carbon fraction	-	BCF
$Y_{O2}$	Oxygen production factor	$\mathrm{mol}_{\mathrm{O2}}\mathrm{mol}_{\mathrm{C}}^{-1}$	OPF
$Y_{ m Q}$	Canopy quantum yield	$\frac{\mathrm{mol}_{\mathrm{C, fixed}}}{\mathrm{mol}_{\gamma, \mathrm{absorbed}}}$	CQY
$\Delta p$	Vapour pressure deficit	kPa	VPD
$\eta_{ m C}$	Carbon use efficiency, 24 hr	$\frac{\mathrm{mol}_{\mathrm{C,biomass}}}{\mathrm{mol}_{\mathrm{C,fixed}}}$	$\mathrm{CUE}_{24}$
$\sigma$	Density, areal, mass	${ m kg}{ m m}^{-2}$	-
$\sigma_N$	Density, areal, numeric	$m^{-2}$	-
$\Phi_{\gamma}$	Photosynthetic photon flux	$\mu mol_{\gamma} m^{-2} s^{-1}$	PPF
$\Phi_{\gamma,\mathrm{E}}$	Photosynthetic photon flux, effective	$\mu mol_{\gamma} m^{-2} s^{-1}$	$PPF_{E}$

While some physico-chemical means exist for recycling a subset of these elements, they are usually mass and energy intensive[356], and generally require additional downstream processing[173]. Given that the demand for consumable food mass scales nearly linearly with the increasing mission duration/crew size and that storage of larger quantities of food necessitates additional costs in refrigeration, storage, and power, crop cultivation provides a means for cost reduction[581, 41]. Furthermore, consumables must be maintained longer in harsher environments, increasing both financial and mass costs.

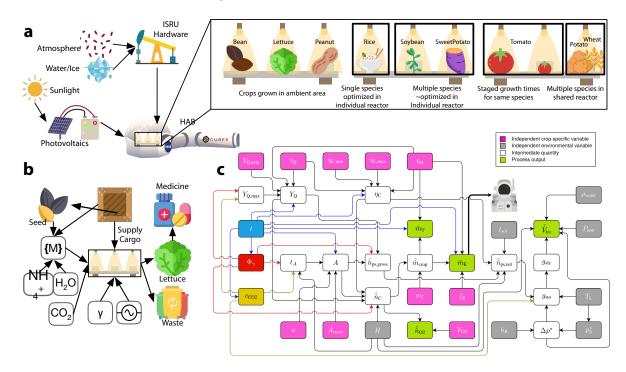
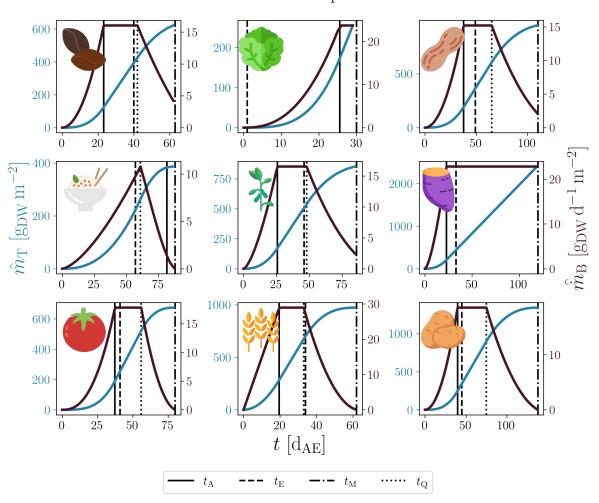


Figure 7.1: Mars-based Agriculture Overview. (a) Scheme for deploying agriculture systems on Mars using ISRU with an expansion of potential crops within habitat and their index within extended MEC model. The expansion of crop systems includes example groupings of crops with hydroponic reactor logistics. (b) Systems diagram for crop growth reactor taking in media ({M}), ammonium (NH<sub>4</sub><sup>+</sup>), water (H<sub>2</sub>O), carbon dioxide (CO<sub>2</sub>), light ( $\gamma$ ), and power ( $\bigotimes$ ) to produce some crop (in this case lettuce), pharmaceuticals, and biowaste. (c) Graphical breakdown of and interaction between MEC Lettuce model variables. **D.** Total crop biomass  $\hat{m}_{\rm T}$  (blue) and crop growth rate  $\hat{m}_B$  (gold) for Dry Bean, Lettuce, Peanut, Rice, Soybean, Sweet Potato, Tomato, Wheat, White Potato at  $\Phi_{\gamma} = 500$  [µmol<sub> $\gamma$ </sub> m<sup>-2</sup> s<sup>-1</sup>],  $c_{\rm CO2} = 1200$  [µmol<sub>CO2</sub> mol<sub>air</sub>].**E.**Contours of biomass accumulation for each crop terminating at each crop's harvest $time <math>t_{\rm M}$  across  $\Phi_{\gamma}$  and  $c_{\rm CO2}$ .</sub>

A primary advantage of a synthetic biology in space is the interconnectivity and recyclability of diverse capability elements. Thus far, crop cultivation has been studied and characterized in many configurations (Fig 7.1a) as an isolated system, with the exception of some studies on air revitalization[158, 194]. Correspondingly, the established crop cultivation mathematics[17] of NASA's modified energy cascade (MEC) model[268] are designed to model crop cultivation behavior of a single crop type in isolation (Fig 7.1b,c), focusing on providing information relevant to traditional crop cultivation outcomes (e.g. food, environ-



Total Biomass and Crop Growth Rate

**Figure 7.2:** Total crop biomass  $\hat{m}_{\rm T}$  (blue) and crop growth rate  $\hat{m}_B$  (gold) for Dry Bean, Lettuce, Peanut, Rice, Soybean, Sweet Potato, Tomato, Wheat, White Potato at  $\Phi_{\gamma} = 500 \; [\mu {\rm mol}_{\gamma} \, {\rm m}^{-2} \, {\rm s}^{-1}], c_{\rm CO2} = 1200 \; [\mu {\rm mol}_{\rm CO2} \, {\rm mol}_{\rm air}].$ 

mental revitalization). In the MEC, biomass per unit area in a single reactor of some crop i is denoted as  $\hat{m}_{B,i}$  and formulated as a continuous differential equation by

$$\frac{d\hat{m}_{B,i}}{dt} = \hat{\tilde{m}}_{B,i} = \frac{\check{m}_{\rm C}}{w_{{\rm C},i}}\hat{\hat{n}}_{{\rm C},i} \tag{7.1}$$

$$= 0.0036 \cdot \frac{\check{m}_{\mathrm{C}}}{w_{\mathrm{C},i}} \left( H_i \cdot \eta_{\mathrm{C},i} \cdot A_i \cdot Y_{\mathrm{Q},i} \cdot \Phi_{\gamma,i} \right)$$
(7.2)

where  $\hat{\tilde{m}}_B$  is areal crop biomass growth rate on a dry weight basis in  $[g m^{-2} d^{-1}]$ , t is time in  $[d_{AE}]$  (days after emergence of the cotyledon),  $\check{m}_C$  is the molar mass of carbon in  $[g mol^{-1}]$ ,

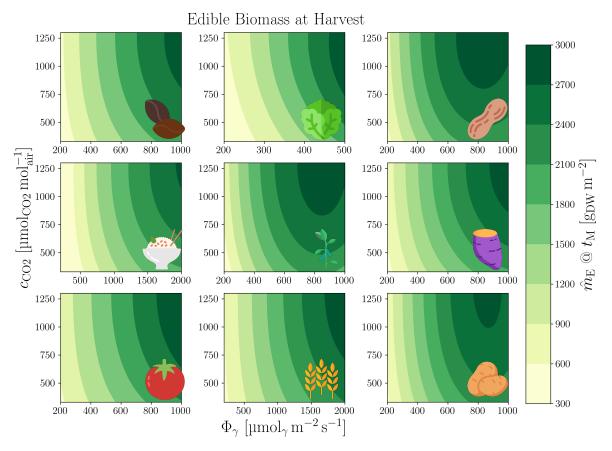


Figure 7.3: Contours of biomass accumulation for each crop terminating at each crop's harvest time  $t_{\rm M}$  across  $\Phi_{\gamma}$  and  $c_{\rm CO2}$ .

 $w_{\rm C}$  is the unitless biomass carbon fraction, and  $\hat{n}_{\rm C}$  is the daily carbon gain in  $[{\rm mol}_{\rm C} {\rm m}^{-2} {\rm d}^{-1}]$ . The  $\hat{n}_{\rm C}$  term can be represented as the product of photoperiod H in  $[{\rm h d}^{-1}]$ , 24-hour carbon use efficiency  $\eta_{\rm C}$  in  $[{\rm mol}_{\rm C,biomass} {\rm mol}_{\rm C,fixed}^{-1}]$ , the unitless fraction of photosynthetic photon flux absorbed by the plant canopy A, canopy quantum yield  $Y_{\rm Q}$  in  $[{\rm mol}_{\rm C,fixed} {\rm mol}_{\gamma}^{-1}_{\rm absorbed}]$ , photosynthetic photon flux density  $\Phi_{\gamma}$  in  $[{\rm \mu mol}_{\gamma} {\rm m}^{-2} {\rm s}^{-1}]$ . We find the total areal biomass  $\hat{m}_{{\rm T},i}$  in  $[{\rm g m}^{-2}]$  and the edible areal biomass  $\hat{m}_{{\rm E},i}$  in  $[{\rm g m}^{-2}]$  for some crop i by

$$\hat{m}_{\mathrm{T},i} = \int_{0}^{t_{\mathrm{M},i}} \hat{\dot{m}}_{B,i} dt$$
(7.3)

$$\hat{m}_{\mathrm{E},i} = f_{\mathrm{E},i} \int_{t_{\mathrm{E},i}}^{t_{\mathrm{M},i}} \hat{\hat{m}}_{B,i} dt$$
(7.4)

where  $f_{\mathrm{E},i}$  is the unitless, crop-specific fraction of daily carbon gain allocated to edible biomass after  $t_{\mathrm{E},i}$ , which is the crop-specific time at onset of organ formation in [d<sub>AE</sub>] (Figs. 7.2,7.3).

Like most of the traditional life support elements, crop cultivation, and the supporting mathematics, require re-packing and updating to meet the demands of long-duration missions, including aspects of synthetic biology. The following characteristics lacking from the current crop cultivation mathematics are critical for a model in a long-duration space exploration mission architecture: (1) systems design – the ability to fit within a larger systems framework and interconnect with upstream and downstream operations; (2) compatibility with equivalent system mass (ESM) based decision making and optimization; (3) well understood parameter sensitivity and robustness. In this work, we aim to adapt the existing MEC model for crop cultivation to improve its readiness for systems integration and nextgeneration space exploration analysis. We implement model improvements in each of the three aforementioned critical characteristics. The MEC model is re-worked for systems design – mathematics are converted into differential equations, communicated in terms of mass and energy balances, generalized for multiple crops and multiple reactors, and written in code compatible with systems integration. Additionally, the model is improved through the inclusion of nitrogen-based limitations. This enables a more robust scenario and systems analysis that may be particularly important for synthetic biological approaches to life support. More robust ESM integration is added, using preliminary and pre-optimized values. Finally, the crop cultivation model mathematics are characterized in further depth through sensitivity analysis.

#### Nitrogen Productivity Model

Nitrogen is an essential plant nutrient central to the synthesis of photosynthetic proteins and pigments. The availability of nitrogen in the rootzone is therefore a decisive factor for plant photosynthetic capacity, growth, and yield [216, 167]. Modeling the effect of nitrogen on plant growth conditions becomes of paramount importance within the scope of biologically-driven mission planning since nitrogen is a limited resource that needs to be optimally allocated to ensure proper food and pharmaceuticals production and subsequently safety of the crew members. A Martian mission design is a non-trivial problem and since the decision making is partially driven by models, any uncertainty regarding their predictive capability should be taken into account. Thus, working toward a validated model that forecasts the success of crop growth given the availability of nitrogen, as well as a description of confidence in this prediction, is of great importance towards our goal.

Nitrogen productivity theory (NPT) is a model of plant growth rate as a linear function of plant nitrogen content[13]. NPT is applicable when nitrogen is the limiting factor for biomass growth. The equation which describes growth has the form:

$$\frac{\mathrm{d}m_B}{\mathrm{d}t} = \dot{Y}_{\mathrm{N}}(m_B, m_{\mathrm{N}})m_{\mathrm{N}} \tag{7.5}$$

where  $m_B$  is total plant biomass on a dry weight basis in  $[g_{DW}]$ , t is time in [d], and  $m_N$  is total amount of nitrogen in the plant in  $[g_N]$ .  $\dot{Y}_N$  is nitrogen productivity, the biomass produced

per amount of nitrogen in the plant per day, a function of  $m_B$  and  $m_N$ , in  $[g_{DW} g_N^{-1} d^{-1}]$ . Rearranging, nitrogen productivity is defined in quantities that can be experimentally measured (Equation 7.6).

$$\dot{Y}_{\rm N} = \frac{1}{m_{\rm N}} \frac{\mathrm{d}m_B}{\mathrm{d}t} \tag{7.6}$$

#### **Results and Discussion**

An experiment was designed to characterize the effect of nitrogen concentration in the nutrient support solution (NSS) of a hydroponic system on biomass generation in *Lactuca sativa* cv. "Waldmann's Green", a loose leaf lettuce. Nitrate (NO<sub>3</sub><sup>-</sup>) was given in equal concentration for all N conditions, while ammonia (NH<sub>3</sub>) concentration varied. Three nitrogen concentrations were chosen: deficient (1.0 mM nitrate, 1.5 mM ammonia), normal (1.0 mM nitrate, 6.5 mM ammonia), and excess (1.0 mM nitrate, 11.5 mM ammonia). Environmental set points were bounded as follows: photosynthetic photon flux density,  $\Phi_{\gamma}$ : 225 ± 25 µmol $\gamma$  m<sup>-2</sup> s<sup>-1</sup>; atmospheric concentration of carbon dioxide,  $c_{CO2}$ : 525 ± 125 ppm; air temperature, T: 22 ± 2 °C; relative humidity,  $h_{\rm R}$ : 50 ± 10%; pH: 6.0 ± 1.0; photoperiod, H: 16 h d<sup>-1</sup>. Biomass and nitrogen measurements were taken at 11, 20, 25, 30, 35, and 40 d<sub>AE</sub>.

The biomass data were compared to the output of the MEC model in Equation 7.1 using the average values of  $\Phi_{\gamma}$  and  $c_{\rm CO2}$  logged in the hydroponic system (Fig. 7.4a). The planting density,  $\sigma_N$ , was normalized to  $19.2 \,\mathrm{m}^{-2}$ , and the fresh weight water fraction was assumed to be 0.95, both per their NASA reference values[17].

The excess nitrogen condition resulted in the lowest average biomass at harvest time ([range-units = single]3035AE), while the normal condition resulted in the highest. The MEC prediction of biomass followed the normal nitrogen condition closely over the time period shown. Its predicted values were similar to the deficient condition measurements until day 30, and its predictions were consistently higher than the measured biomass in the excess condition. This demonstrates that the MEC needs to be extended to account for nitrogen availability whether in deficit or excess.

Over time, the plants under all conditions contained an increasing average quantity of nitrogen (Fig. 7.4b), but the average weight percentage of N decreased. Toward  $t_{\rm M}$ , the average percentage of N in plants in the normal condition was less than that of the plants in the excess condition, but the plants in the normal condition achieved the greatest average biomass, indicating that excess nitrogen condition may result in growth-inhibiting stresses. In the deficient condition, the average plant N content was lower than in the other conditions, but the average biomass was higher than the plants in the excess condition and was similar to that of the plants in the normal condition up to  $30 \, d_{\rm AE}$ . This indicates that the plants in deficient conditions may have used N for growth more efficiently than plants in the other conditions at the expense of their average biomass at  $t_{\rm M}$ .

Nitrogen productivity was calculated from biomass and nitrogen content data. The values are plotted in Figure (Fig. 7.4c). The overall average nitrogen productivity under the

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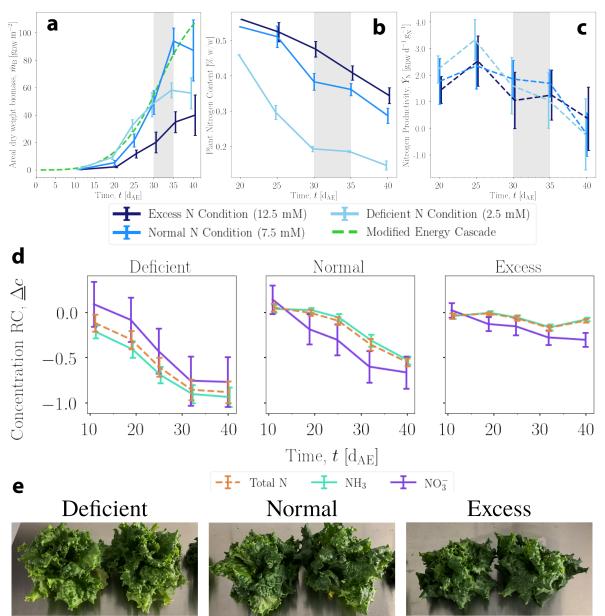


Figure 7.4: (a) Measured areal ("per area") biomass and MEC model prediction. The MEC output was calculated with  $\Phi_{\gamma}$  of 225 mol $\gamma$  m<sup>-2</sup> s<sup>-1</sup> and c<sub>CO2</sub> of 525 ppm. (b) Measured percentage of total nitrogen by weight in plants over time. Only one measurement could be performed at 20 d<sub>AE</sub>. (c) Nitrogen productivity calculated from two measured quantities, biomass and nitrogen content. Error bars represent propagated error. (d) Relative change (RC,  $\underline{\Delta}c$ ), of measured molar concentration, c(t), of ammonia and nitrate, and their calculated sum, to initially charged concentration,  $c(t_0)$ , in NSS reservoirs over time for each N condition, where  $\underline{\Delta}c \equiv [c(t) - c(t_0)]/c(t_0)$ . Error bars represent 1 SD. N = 3 for each data point. (e) Lettuce in different conditions at 27 d<sub>AE</sub>. The range marked in grey is the specified harvest time,  $t_M$ , [range-units = single]3035AE [17]. Error bars represent 1 SD. N = [5, 10] for each data point. Solid lines represent measurements; dotted lines are derived/calculated values

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normal N condition was  $1.33 \pm 0.79 \,\mathrm{g}_{\mathrm{DW}} \,\mathrm{g}_{\mathrm{N}}^{-1} \,\mathrm{d}^{-1}$ ; under the deficient and excess conditions, it was  $1.49 \pm 0.99$  and  $1.90 \pm 1.32$ , respectively. The average of  $\dot{Y}_{\mathrm{N}}$  across all conditions is  $1.47 \pm 0.99$ . Empirical values in literature for  $\dot{Y}_{\mathrm{N}}$  in other plants are on the order of  $10^{-1}$  to  $10^{0}$ , though it should be noted that these mostly describe woody plants [13].  $\dot{Y}_{\mathrm{N}}$  appears to decrease near the end of the exponential phase of growth.

The levels of nitrate and ammonia in the NSS reservoirs were measured from [range-units = single]240AE to determine uptake behavior. The relative change of the concentrations from the initial value is shown in Figure 7.4. Relative to the initial concentration, nitrate was depleted more quickly than ammonia in the excess and normal N conditions, while in the deficient condition it was depleted similarly to the ammonia. The depletion of nitrogen continued even as a number of plants were harvested and removed from the system every 5 days. By  $32 d_{AE}$ , the plants in the deficient condition had depleted almost all available nitrogen. Nonetheless, plants are able to effectively take up nitrogen even when its concentration is near zero [414].

Plant growth and development and depends largely on the available concentration of nitrogen in growth conditions, whether in soil or in soil-less hydroponic systems. The mineral nutrients are absorbed by plant roots and therefore their availability in the soil or hydroponic medium is critical for its absorption to maintain normal physiological processes [447].

Nitrogen plays an essential role in the structure of amino acids and N-bases; therefore its depletion in the growth medium may halt important physiological processes crucial for plant growth[10]. In general, a plant in N stress conditions exhibits symptoms such as stunted growth, yellowing of the leaves, leaf death, and reduction in chlorophyll production, and therefore ultimately contributes heavily to the reduction of overall crop yield[386]. Alternatively, an excess of N availability can also negatively affect plant growth parameters such as root and shoot biomass[447]. In lettuce, nitrogen stress conditions result in a slower growth rate and reduction in water content[480].

Recently, as an alternative to conventional soil production, growing lettuce hydroponically is a popular approach, especially in urban settings, uncultivated lands, and other constrained environments. Comparing key parameters in lettuce plants grown in the same nitrogen and environmental conditions in soil and hydroponics revealed no significant differences in morphological features except enhanced root growth in hydroponics[310]. Therefore, lettuce plants may exhibit comparable morphological features or biomass production in both soil and hydroponics given equal concentration of N, and the results presented here are expected to be applicable across different biomass production systems.

While the value of  $Y_N$  was calculated from measured data and could simply be assumed to be a species-specific constant, a deterministic approach should be pursued. Ågren assumes its form is

$$\dot{Y}_{\rm N} = \alpha - \beta \frac{m_B}{m_{\rm N}} \tag{7.7}$$

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where  $\alpha$  is the leading term in  $[g_{DW} d^{-1} g_N^{-1}]$  and  $\beta$  is a correction term in  $[d^{-1}]$ . Combining Equations 7.5 and 7.7:

$$\frac{1}{m_B}\frac{\mathrm{d}m_B}{\mathrm{d}t} = \alpha \frac{m_\mathrm{N}}{m_B} - \beta \tag{7.8}$$

we define in terms of the two parameters the relative growth rate (left hand side), which is the change in plant biomass per change in time,  $dm_B/dt$  [g<sub>FW</sub> d<sup>-1</sup>], per plant biomass,  $m_B$  [g<sub>FW</sub>], in units of [d<sup>-1</sup>]. Both parameters could be fitted to the empirical data, but a biochemical interpretation is preferred. Ågren presented one such quantity: the amount of nitrogen in the plant allocated for non-growth purposes, which may be described by  $\beta m_B/\alpha$ (from Equation 7.8 rearranged)[13]. Building on NPT, Verkroost & Wassen described  $\alpha$  as the product of the efficiency of formation of photosynthetic nitrogen from total plant nitrogen [unitless] and efficiency of biomass formation from photosynthetic nitrogen [g<sub>DW</sub> d<sup>-1</sup> g<sub>N</sub><sup>-1</sup>] and  $\beta$  as the degradation rate of photosynthetic nitrogen [d<sup>-1</sup>] [537]. Photosynthetic nitrogen refers to biologically active nitrogen in photosynthesis-involved enzymes. A fully deterministic model would also require modeling the nitrogen uptake rate of the plant, which is complicated by the plant's growth and dynamic response to the nature of its nitrogen supply in terms of quantities and molecular forms[247].

#### Methods

Nomenclature reformation considered chemical engineering conventions, IUPAC[220] and IUPAP documentation, and intuitive understanding. Variables and subscripts which refer to quantities are typeset in *italic*, while non-quantitative subscripts are in roman. Accent marks above variables are used to denote per time ( $\dot{\Box}$ ), per area ( $\hat{\Box}$ ), and per volume ( $\check{\Box}$ ). Mnemonically, one might think of the breve above volumetric variables as a vessel to be filled, while the inverted breve above areal variables implies relation to the breve while perhaps reminding one of a surface.

The lettuce plants were grown in an environmentally controlled chamber with their roots immersed in the NSS liquid. The chamber is designed to produce consistent results. Whole plants were harvested and weighed, pooled by nitrogen condition, then frozen to -80 °C, followed by measurement of the nitrogen content via the Dumas method (AOAC 992.15)[https://www.medallionlabs.com/tests/protein-dumas/]. Nitrate concentration in the NSS was measured using a sensor (Horiba Scientific LAQUAtwin NO3-11). Ammonia concentration was determined by a spectrophotometric method adapted from Kempers & Kok[283].

# Chapter 8

# Case Study 3: Evaluating the cost of pharmaceutical purification in space

There are medical treatment vulnerabilities in longer-duration space missions present in the current International Space Station crew health care system with risks, arising from spaceflight-accelerated pharmaceutical degradation and resupply lag times. Bioregenerative life support systems may be a way to close this risk gap by leveraging in situ resource utilization (ISRU) to perform pharmaceutical synthesis and purification. Recent literature has begun to consider biological ISRU using microbes and plants as the basis for pharmaceutical life support technologies. However, there has not yet been a rigorous analysis of the processing and quality systems required to implement biologically produced pharmaceuticals for human medical treatment. In this work, we use the equivalent system mass (ESM) metric to evaluate pharmaceutical purification processing strategies for longer-duration space exploration missions. Monoclonal antibodies, representing a diverse therapeutic platform capable of treating multiple space-relevant disease states, were selected as the target products for this analysis. We investigate the ESM resource costs (mass, volume, power, cooling, and crew time) of an affinity-based capture step for monoclonal antibody purification as a test case within a manned Mars mission architecture. We compare six technologies (three biotic capture methods and three abiotic capture methods), optimize scheduling to minimize ESM for each technology, and perform scenario analysis to consider a range of input stream compositions and pharmaceutical demand. We also compare the base case ESM to scenarios of alternative mission configuration, equipment models, and technology reusability. Throughout the analyses, we identify key areas for development of pharmaceutical life support technology and improvement of the ESM framework for assessment of bioregenerative life support technologies.

The following chapter can also found here: M.J. McNulty, <u>A.J. Berliner</u>, P. Negulescu, L. McKee, O. Hart, K. Yates, A.P. Arkin, S. Nandi, and K.A. McDonald. **Evaluating the cost of pharmaceutical purification for a long-duration space exploration medical foundry**. *Frontiers in Microbiology*. (2021).

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## 8.1 The need for a pharmaceutical foundry in space

Surveying missions to Mars, like the InSight lander (Overview | Mission – NASA's InSight Mars Lander) launched in 2018 and Perseverance rover in 2020, directly support the objectives of NASA's long-term Mars Exploration Program: an effort to explore the potential for life on Mars and prepare for human exploration of Mars. The maturation of the program requires redefining the risks to human health as mission architectures transition from the current 'Earth Reliant' paradigm used on the International Space Station (ISS) to the cislunar space 'Proving Grounds' and finally to deep-space 'Earth Independent' mission architectures, as defined in NASA's report titled, "Journey to Mars: Pioneering Next Steps in Space Exploration".

Human missions to Mars will be "Earth Independent", meaning there will be very limited emergency evacuation and re-supply capabilities along with substantially delayed communications with the Earth-based mission team. The NASA Human Research Roadmap currently rates most human health risks, which include 'risk of adverse health outcomes & decrements in performance due to inflight medical conditions' and 'risk of ineffective or toxic medications during long-duration exploration spaceflight', as either medium or high risk for a Mars planetary visit/habitat mission. Risk ratings are based on failure mode and effects analysis and on hazard analysis using dimensions of severity, occurrence, and detectability. A recent review highlights the current understanding of the primary hazards and health risks posed by deep space exploration as well as the six types of countermeasures: protective shielding, biological and environmental temporal monitoring, specialized workout equipment, cognition and psychological evaluations, autonomous health support, and personalized medicine[11].

Of these countermeasures, it could be argued that medicine is the most crucial and least advanced towards mitigating space health hazards. There is very limited information on, and few direct studies of, pharmaceutical usage, stability, and therapeutic efficacy (i.e., pharmacokinetics, pharmacodynamics) in spaceflight or in a Mars surface environment[53]. Furthermore, flown stores of pharmaceuticals face two additional barriers: (1) radiationaccelerated degradation[156], and (2) addressing a myriad of low occurrence and high impact health hazards without the ability to fly and maintain potency of therapeutics for all of them. In these circumstances, it is often more beneficial to build robustness to these low occurrence health hazards rather than to try to predict them. It is therefore imperative that on-planet and/or in-flight pharmaceutical production be developed to bridge this risk gap. These pharmaceutical foundry technologies will supplement, not replace, the flown pharmaceutical formulary designed to treat anticipated medical threats during space missions.

## 8.2 The bottleneck of space foundries: purification

Biopharmaceuticals must be purified after accumulation with the biological host organism, or cell-free transcription-translation reaction, in order to meet requirements for drug delivery and therapeutic effect [214]. The majority of commercial biopharmaceutical products are administered via intravenous and subcutaneous injection [493]. Biopharmaceutical formulations for injection requires high purity (>95%) product, as impurities introduced directly into the bloodstream can trigger significant immune responses and reduce efficacy [208].

Downstream processing of biopharmaceuticals is therefore usually a resource-intensive section of overall processing, being cited as high as 80% of production costs (and contributions of input mass) for monoclonal antibody (mAb) therapeutics produced using mammalian cell cultures [446, 64]. In addition to the processing burden for biopharmaceutical injectables, there are also often substantial storage costs involving complex supply chain and storage management with stability requirements for factors including temperature, time, humidity, light, and vibration [512]. There are several approaches being pursued to overcome the challenges and costs associated with downstream processing and formulation.

First are the tremendous efforts in process intensification [507]. While the highly sensitive nature of biopharmaceuticals to minor process changes has introduced barriers and complexities to innovation through process intensification that have not been realized in non-healthcare biotechnological industries, there have been significant strides made in the past decade in the areas of process integration [504], automation [433], and miniaturization [9, 121].

Another route that researchers are pursuing to reduce downstream processing costs and resources is a biological solution to processing technology. In the same vein that the biopharmaceutical industry sprung out of researchers leveraging the power of biology to produce therapeutically relevant molecules that were inaccessible or excessively costly by means of chemical synthesis, researchers are now also trying to apply that same principle to purifying therapeutically relevant molecules. The simplicity of production, reagents that can be produced using self-replicating organisms, and potential recyclability of spent consumables are significant advantages of biological purification technology for space or other limited resource applications. Examples of primary biological technologies include fusion tags[36, 36], stimuli-responsive biopolymers[488], hydrophobic nanoparticles[275], and plant virus nanoparticles[555, 528].

Lastly, there are vast efforts to establish alternative drug delivery modalities [18]. Other modalities that do not require injection and which might be more compatible to administration in limited resource environments, such as oral consumption, nasal spray, inhalation, and topical application, have long presented challenges in biopharmaceutical stability (e.g., denaturation in stomach acid) and delivery to the active site (e.g., passing the gut-blood barrier) that minimize product efficacy and necessitate costly advanced formulations and chemistries [381].

A particularly promising drug delivery technique to circumvent downstream processing burdens is to sequester the active pharmaceutical ingredient in the host cells of the upstream

production system as a protective encapsulation in order to facilitate bioavailability through oral delivery[297]. It represents an opportunity to greatly lower the cost of *in situ* production of human medicine for a space mission. This technique presumes that the host system is safe for human consumption, and so naturally lends itself to utility in systems such as yeast and plant production hosts. Oral delivery via host cell encapsulation has been recently established as commercial drug delivery modality with the US Food and Drug Administration approval of Palforzia as an oral peanut-protein immunotherapy[540]. However, this solution is not necessarily amenable to the diversity of pharmaceutical countermeasures that may be required, especially for unanticipated needs in which the product may not have been evaluated for oral bioavailability.

## 8.3 Space economics

In 2011, the space shuttle program was retired due to increasing costs, demonstrating that reduction of economic cost is critical for sustaining any campaign of human exploration[549]. Although recent efforts in reducing the launch cost to low earth orbit by commercial space companies have aided in the redefinition of the space economy[188], the barrier to longer term missions, such as a journey to Mars, is still limited by the extreme financial cost in transporting resources. Additionally, it has been shown that as the mission duration and complexity increases – as expected for a human mission to Mars – the quantity of supplies required to maintain crew health also increases[17]. In the case of meeting the demand for medication, biopharmaceutical synthesis has been proposed as an alternative to packaging a growing number of different medications[371, 367]. Assuming that both technologies can meet mission demand, selection of the production-based biotechnology platform will be dependent on its cost impact. It is therefore critical that the cost model of biopharmaceutical synthesis accounts for and minimizes the cost of any and all subprocesses, including those for purification.

The current terrestrial biopharmaceutical synthesis cost model does not align with the needs for space exploration environments. For example, the literature highlights the high cost of Protein A affinity chromatography resin (\$8,000 - \$15,000/L) and the need to reduce the price[357]. However, the purchase cost of chromatography resin is not nearly as critical in space environment applications where the major costs are more closely tied to the physical properties of the object (mass, volume, refrigeration requirements, etc.), as a result of fuel and payload limitations and the crew time required for operation[271]. The distinct cost models of space and terrestrial biopharmaceutical production may increase the burden of identifying space-relevant processing technologies and may also limit direct transferability of terrestrial technologies without attention given to these areas.

On the other hand, changing incentives structures relating to sustainability and the advent of new platform technologies are rapidly increasing alignment and the potential for technology crossover. For example, companies like On Demand Pharmaceuticals (ondemand-pharma.com), EQRx (eqrx.com), and the kenUP Foundation (kenup.eu), initiatives leading

to industry adoption of environmental footprint metrics such as E-factor[487] and Process Mass Intensity (PMI)[64], and diffusion from the adjacencies of green and white biotechnology[527] all promote development of accessible and sustainable technologies. As these trends pertain to space-relevant processes, these examples can also be viewed as driving more closed loop systems composed of simpler components.

#### **Reference mission architecture**

The evaluation of biopharmaceutical system cost for space applications requires the establishment of a reference mission architecture (RMA) as a means for describing the envelope of the mission scenario and distilling initial technology specifications which relate to the proposed subsystem in question[61]. This RMA can be used to orient and define the specific mission elements that meet the mission requirements and factor into the calculations of cost for deploying biopharmaceutical technologies. Ultimately, the RMA provides the means to determine and compare cost given specification of mission scenarios that utilize the technology in question. We envision developing and integrating biotechnological capabilities back-ended by purification and quality systems into standard methods composed of a series of unit procedures that maintain astronaut health via the Environmental Control and Life Support Systems (ECLSS)[221]. In this study, we begin to build towards this vision by proposing a high-level RMA that specifies a biopharmaceutical demand partially fulfilled through biomanufacturing over the course of a defined production window.

In planning for future human exploration missions, technology choices and life-support systems specifications are often evaluated through the metric of the equivalent system mass (ESM)[312]. Driven by the economic factor of cost in dollars required to transport mass into orbit, the ESM framework accounts for non-mass factors such as power, volume, and crewtime by relating them to mass through predetermined equivalency factors. ESM has been used to evaluate the mass of all of the resources of a larger system including water, shielding materials, agriculture and recycle loop closure. Currently, ESM remains the standard metric for evaluating advanced life support technology platforms [233, 581]. In the Space Systems Bioengineering context of realizing a biomanufactory on the surface of Mars<sup>[44]</sup>, recent advances in extending this metric have been proposed in the form of extended equivalent system mass which attempts to address complexities stemming from multiple transit and operations stages, as would be required to support a crewed mission to Mars 41. It also accounts for uncertainties inherent in mission planning such as technology failures and their downstream effects as propagated through a mission such as refrigeration failures in systems housing medicine that requires specific cooling. Such advances in the ESM framework aid in the assessment of biopharmaceutical technologies as elements in the context of proposed ECLSS given the inherent stochastic nature of human health, especially in a space environment [52]. Here, we calculate ESM at multiple mission segments across which biopharmaceutical purification is deployed.

# 8.4 Materials & Methods

#### Unit procedure selection

The medical significance of mAb therapies and the highly developed and specialized purification technology provide a fertile ground for techno-economic feasibility analysis of an ISRUbased pharmaceutical foundry for space. The first reason is that there are mAb therapies commercially approved or in development for multiple important disease states of spaceflight including osteoporosis[169], migraines/headaches[477], seizure[587], pneumonia[241], ocular herpes[294], otitis media[246], various oncological indications[582], and fungal infections[529]. A second reason is that degradation products of mAb therapies are known to result in, not just reduced efficacy, but also deleterious effects (e.g., harmful immune reactions in patients) that further compound concerns of pharmaceutical stability over a long-duration mission[303]. Thirdly is that a common manufacturing system can be used to produce treatments for a variety of indications which is highly advantageous in mass and volume savings for spaceflight. And fourthly, the economic incentive of research into mAb purification technology has resulted in a plethora of technologies, enabling this analysis to include head-to-head comparisons between multiple mAb capture steps of different origins

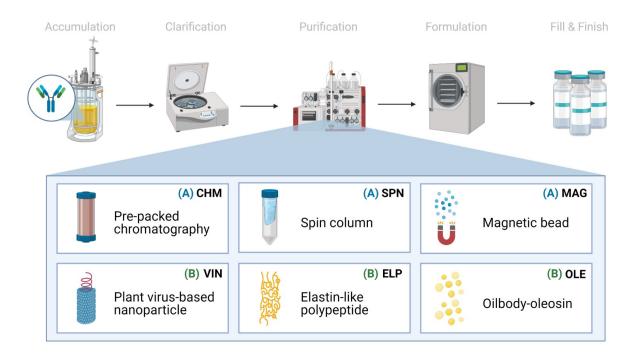


Figure 8.1: Monoclonal antibody production consists generically of product accumulation, clarification, initial purification, formulation, and fill & finish. Here we investigate six technologies for the capture step within the first purification step in a space mission context using extended equivalent system mass. The manufacturing origin of the capture reagent is denoted as either (A) abiotic or (B) biotic.

(e.g., biotic, abiotic) and different processing mechanisms (e.g., bind-and-elute mode liquid chromatography, precipitation). It is in comparing the differences between these technologies that we can uncover general insights into the desired components of a pharmaceutical foundry for space.

Monoclonal antibody therapy is a platform technology that supports human health across a diversity of medical indications with a generally maintained molecular structure, in large part due to the coupling of high target selectivity in the two small and highly variable complementarity-determining regions located in the antigen-binding fragments [195] and control of the biological action on that target (i.e., effector function) through the generally conserved fragment crystallizable (Fc) region [277]. This otherwise high structural fidelity conserved across mAb therapy products (which are primarily of the immunoglobulin G class) spans a wide variety of the apeutic indications and creates an opportunity for generic mAb production process flows, which include technologies devised specifically for mAb production[499]. This specialized manufacturing, which is most notable in the use of the affinity capture step targeting the Fc region of an antibody with the use of the protein-based ligands derived from the Staphylococcus aureus Protein A molecule, can be tuned for highly efficient purification of mAb and antibody-derived (e.g., Fc-fusion protein) class molecules [357]. Therefore, we have decided to investigate the Protein A-based affinity capture step in isolation as a starting point for understanding the costs of a potential pharmaceutical foundry in space.

It is worth noting that other similar protein ligands, such as Protein G and Protein L, are also widely used for their ability to capture different types of immunoglobulin classes and subclasses more efficiently[99].

We chose to analyze six Protein A-based capture step procedures: three commercially available abiotic technologies (pre-packed chromatography (CHM), spin column (SPN), magnetic bead (MAG)) and three development-stage biotic technologies (plant virus-based nanoparticle (VIN), elastin-like polypeptide (ELP), and oilbody-oleosin (OLE)) (Fig. 8.1). Commercial technology procedures are based on product handbooks while the procedures of developing technologies, which we would classify as Technology Readiness Level 2 per NASA's guidelines, are based on reports in literature. This set of procedures was selected to survey a wide range of operational modalities, technological chassis, and perceived advantages and disadvantages (Table 8.1).

All six of the unit procedures are operated in bind-and-elute mode, in which a clarified mAb-containing liquid stream is fed into a capture step containing Protein A-based ligand, which selectively binds the mAb and separates the mAb from the bulk feed stream. The mAb is eluted from the Protein A-based ligand and recovered using a low pH buffer to dissociate the mAb from the ligand. Finally, the low pH environment of the recovered mAb is pH neutralized for future processing or storage. The analysis does not consider differences in mAb processing upstream or downstream of the affinity capture step that may arise from differences in the unit procedure operations.

CHM is a chromatography system consisting of a liquid sample mobile phase which is pumped through a pre-packed bed of Protein A-fused resin beads housed in a column. SPN is

a similar system, in which a Protein A-fused resin bead bed has been pre-packed into a plastic tube housing and the mobile phase flow is controlled via centrifugation of the plastic tube. MAG is a slurry-based magnetic separation system that uses superparamagnetic particles coated with Protein A-fused resin mixed as a slurry with the feed mAb stream for capture and elution of the mAb by magnet. VIN is a sedimentation-based system that uses plant virion-based chassis fused with Protein A-based ligands in suspension for capture of the mAb and centrifugation, assisted by the sedimentation velocity contribution of the chassis, to isolate and elute the mAb. ELP is a precipitation-based system that uses stimuli-responsive biopolymers fused with Protein A-based ligands in suspension for capture of the mAb and external stimuli (e.g., temperature, salt) to precipitate the bound complex and elute the mAb. OLE is a liquid-liquid partitioning system that uses oil phase segregating oleosin proteins fused with Protein A-based ligands to capture mAb in the oil phase and then elute the mAb into a clean aqueous phase.

#### Techno-economic evaluation

Techno-economic evaluations are performed using the recently proposed equations for ESM that include calculation of costs at each mission segment [41]. Equivalent system mass (ESM)

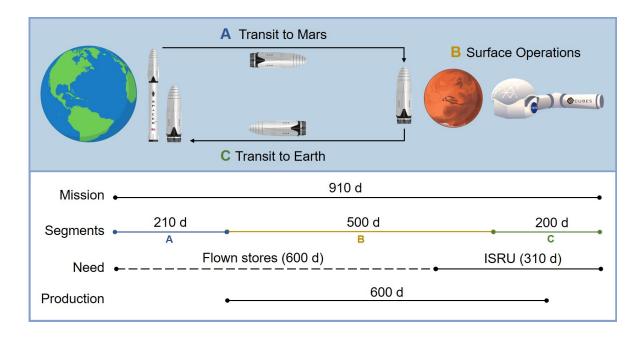


Figure 8.2: An illustration of the reference mission architecture in which  $(\mathbf{A})$  a crewed ship is launched from the surface of Earth and lands on Mars and  $(\mathbf{B})$  assembles a pre-deployed habitat on the Martian surface to perform operations before  $(\mathbf{C})$  a return transit to Earth on the same ship. Pharmaceutical needs are supported by flown stores until partway through surface operations, at which point needs are met by pharmaceuticals produced using *in situ* resource utilization. Production is initiated prior to the need window to ensure adequate stocks are generated by the time it is needed. Rocket artwork adapted from Musk, 2017[394]. Habitat artwork by Davian Ho.

for the mission  $M_0$  is defined as

ENTER LATER

The mission timeline depicted in Figure 8.2 provides insight into the proposed RMA and downstream crew needs and mAb production horizon. Here we assume a total mission duration of 910 days. First, a crew of 6 will travel from Earth to low Earth orbit, then board an interplanetary craft for a 210-day journey to Martian orbit, where the crew will descend to the surface in a separate craft, allowing the large transit vehicle to remain in orbit. Once on Mars, the crew will perform surface operations for 600 days. Following surface operations, the crew will leave Mars in a fueled ascent craft, board the interplanetary vehicle, and return to Earth orbit in 200 days. The mission timeline, crew size, and ESM equivalency factors are consistent with the recent RMA presented for inclusion of biomanufacturing elements[44].

The mission demand for mAb therapies is assumed to be 30,000 mg over the entirety of the mission (supporting logic detailed in Supplementary Information, Table S10). Pharmaceutical stores and production resources are assumed to be flown with the crew transit (no pre-deployment in order to maximize shelf-life). We assume that the production resources are stable throughout the mission duration. We conservatively assume (in the face of insufficient spaceflight stability data for biologics for a more refined estimate) that the first 600 days of pharmaceutical demand will be met through flown stores (20,000 mg), at which point pharmaceutical ISRU manufacturing is needed (10,000 mg) to alleviate the impact of accelerated pharmaceutical degradation and provide supplementary medication. The pharmaceutical production window opens prior to the ISRU demand timeframe and persists through a portion of the return transit (up to mission day 810) to reflect the expected life support advantage of maintaining capabilities to counter unanticipated needs or threats. We assume that the Protein A-based unit procedures consistently yield 98% recovery of mAb from the input stream.

#### **Unit Procedure Selection**

Deterministic models for each unit procedure were developed in Microsoft Excel using reference protocols cited in Table 8.1 as a series of executable operations, each containing a set of inputs defined by cost categories (labor, equipment, raw materials, consumables) that are correspondingly populated with characteristic ESM constituent (mass, volume, power, cooling, labor time) values (model composition illustrated in Supplementary Information, Figure S14). Unit procedures have been defined as the smallest single execution (i.e., unit) of the secondary purification capture step procedure according to the reference protocol. We define the unit capacity by volume according to the equipment and consumables used (e.g., 2 mL maximum working volume in a 2 mL tube) and by mAb quantity according to the binding capacity for the given method (e.g., 1 mg mAb/mL resin) (Supplementary Information, Table S11). Unit procedures with no explicit working volume constraints (i.e., the liquid solution volume for biotic technologies) have been defined with a maximum unit volume of 2 mL. ESM-relevant characteristics of individual inputs (e.g., equilibration buffer,

2 mL tube) are defined based on publicly available values, direct measurements taken, and assumptions (which are explicitly identified in the spreadsheet).

Unit Procedure ID	Method	Technology Used	Reference
Pre-packed chromatography <sup>A</sup>	Liquid chromatography	Pre-packed HiTrap MabSelect SuRe column of novel alkali-tolerant re- combinant Protein A-based ligand coupled with an agarose matrix	Vendor handbooks
Spin column <sup><math>A</math></sup>	Centrifuge-assisted liquid chromatography	Pre-packed Protein A HP SpinTrap spin column containing Protein A Sepharose High Performance	
Magnetic bead <sup><math>A</math></sup>	Magnetic separation	Protein A Mag Sepharose super- paramagnetic beads coupled with native Protein A ligands	
Plant virus-based nanoparticle <sup><math>B</math></sup>	Sedimentation complex	Plant virion, Turnip vein clearing virus, presenting a C-terminal coat protein fusion display of Protein A (domains D & E)	Werner <i>et al.</i> 2006[555]
Elastin-like polypeptide $^{B}$	Inverse transition cycle	Elastin-like polypeptides (78 pen- tapeptide (VPGVG) repeats) fused with Z domain, an engineered B do- main of Protein A	Sheth <i>et al.</i> 2014[488]
Oilbody-oleosin <sup>B</sup>	Liquid-liquid partition	Arabidopsis oleosin fused at the N-terminal with an engineered Protein $A(5)$	McLean <i>et al.</i> 2012[363]

**Table 8.1:** List of Protein A-based monoclonal antibody capture step unit procedures included for analysis.  $^{A}$  abiotictechnology;  $^{B}$  biotic technology

There are several model features that we have considered and decided not to include within the scope of analysis. Packing and containers for the inputs are not included for three reasons: 1) the contributions of the container are considered negligible as compared to the input itself (e.g., container holding 1 L buffer as compared to the 1 L of liquid buffer); 2) materials flown to space are often re-packaged with special considerations (Wotring, 2018); and 3) the selection of optimal container size is non-trivial and may risk obscuring more relevant ESM findings if not chosen carefully. We do not consider buffer preparation and assume the use of flown ready-to-use buffers and solutions. Furthermore, refrigeration costs of the input materials and costs that may be associated with establishing and maintaining a sterile operating environment (e.g., biosafety cabinet, 70% ethanol in spray bottles) are expected to be comparable between unit procedures and not considered. Impacts of microgravity on unit procedure execution are not considered for the return transit production. Refrigeration costs associated with low temperature equipment operation (e.g., centrifugation at 4°C) are included in the equipment power costs.

Inputs common across unit procedures are standardized (Supplementary Information, Table S11). One operational standardization is the inclusion of pH neutralization of the product stream following the low pH elution mechanism, which was explicitly stated in some procedures while not in others. Input quantities are scaled from a single unit to determine the

number of units required to meet the reference mission architecture specifications. The ESM constituent inputs (mass, volume, power, cooling, labor time) are converted into equivalent mass values using RMA equivalency factors (Supplementary Information, Table S13).

## 8.5 Results & Discussion

#### Standardization of manufacturing efficiency

Given the limited granularity of the presented reference mission architecture, which was scoped as such to reflect the lack of literature presenting an overarching and validated Concept of Operations for a Transit to Mars[19], we do not define strict manufacturing scheduling criteria for pharmaceutical production. Construction of a detailed pharmaceutical production RMA is hindered by uncertainty in the number and identity of mAb therapy products that would be included within mission scope, the decay rate of mAb therapy stores in the mission environments, and a reasonable basis for building robustness to unanticipated disease states. Rather, we choose to establish an objective comparison between unit procedures by normalizing for scheduling-associated manufacturing efficiencies. We accomplish this by first identifying the number of batches per mission (and thus batch size) needed to meet the mAb demand (base case of 10,204 mg mAb feed assuming 98% recovery) that minimizes the ESM output for a given unit procedure, and then running the simulation of pharmaceutical production at that number of mission batches, as shown in Figure 8.3a and tabulated in Supplementary Information, Table S14.

In Figure 8.3b - e, we visualize a deconstruction of ESM output, using the VIN unit procedure as an example, by key performance metrics that vary with a scheduling dependence in order to illustrate the significance of batch optimization in unit procedure comparison. The processing of a given batch volume and mAb quantity is allocated into a number of units, as determined by the volume and mAb quantity constraints of a given unit procedure, and a number of use cycles per batch, as determined by the capacity of the equipment specified in the given unit procedure. We show how the variation in ESM output over the number of mission batches maps to extent of unit vacancy or underutilization (Figure 8.3b), extent of operational equipment (e.g., centrifuge) vacancy or underutilization (Figure 8.3c), and number of required use cycles (Figure 8.3d). We also show an oscillatory behavior in the scheduling (i.e., total mAb purified per mission, % purified at surface operations) that quickly dampens as number of mission batches increases (Figure 8.3e). This behavior is a result of the assumption that the mAb feed stream is coming from a discrete upstream production batch (e.g., batch-mode bioreactor) that does not output partial batch quantities, as opposed to a continuous upstream production for which there are no defined batches. Accordingly, partial batch needs are met by the processing of a full batch.

CHAPTER 8. CASE STUDY 3: EVALUATING THE COST OF PHARMACEUTICAL PURIFICATION IN SPACE 96

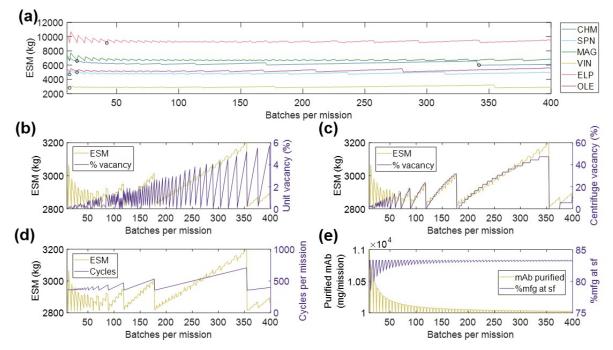


Figure 8.3: (A) Scheduling optimization for the establishment of base case scenarios for each unit procedure. The value for number of batches corresponding to the minimum equivalent system mass for each unit procedure, as indicated by black circle markers. Key operational parameters impacted by mission scheduling (shown using the VIN procedure) include (B) unit underutilization or vacancy, (C) equipment underutilization or vacancy, in this case represented by the centrifuge as the bottleneck, (D) the number of use cycles, and (E) the total quantity of monoclonal antibody (mAb) per mission and per surface operation (sf). CHM, pre-packed chromatography; SPN, spin column; MAG, magnetic bead; VIN, plant virus-based nanoparticle; ELP, elastin-like polypeptide; OLE, oilbody-oleosin.

#### Base case scenario

The ESM and output metrics of the base case scenario (10,000 mg mAb demand, 1 mg mAb/mL feed concentration, 98% recovery) for each of the six unit procedures are shown in Figure 8.4a-f. From this viewpoint of an ESM output for an isolated unit procedure outside the context of a full purification scheme, the ESM ranked from lowest to highest are VIN < SPN < OLE < CHM < MAG < OLE. However, we reason that it is more important to understand the model inputs that influence the ESM output rankings than to use the rankings in this isolated subsystem analysis to make technology selection choices, which requires the context of a full pharmaceutical foundry and of linkages to other mission elements.

We observe that mass costs are generally the primary contributor to ESM output, except for the MAG and ELP procedures in which labor time costs are larger. The mass costs are not closely associated to any given cost category across unit procedures, but rather the breakdown of mass costs varies widely by unit procedure.

Power costs (kW) are disproportionately high given that the static nature of ESM assumes constant usage, and thus energy (kWh) in this context (i.e., the power supply to the

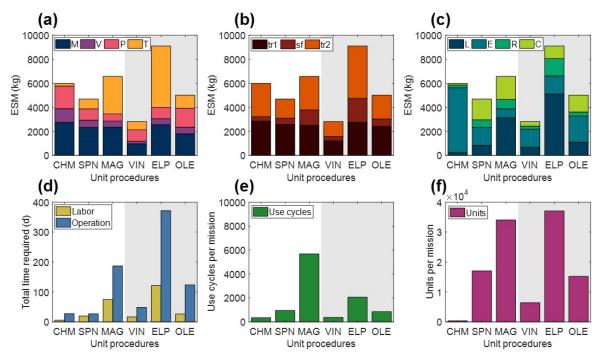


Figure 8.4: Base case equivalent system mass results broken down by (A) mass (M), volume (V), power (P), and labor time (T) constituents, (B) transit to Mars  $(tr_1)$ , surface operations (sf), and return transit  $(tr_2)$  mission segments, and (C) labor (L), equipment (E), raw materials (R), and consumables (C) cost category for the six tested Protein A-based monoclonal antibody affinity capture step unit procedures segregated by abiotic (white background) and biotic (grey background) technologies. Also shown are the (D) labor and operation times, (E) number of use cycles, and (F) number of units required for each unit procedure to meet the reference mission demand. CHM, pre-packed chromatography; SPN, spin column; MAG, magnetic bead; VIN, plant virus-based nanoparticle; ELP, elastin-like polypeptide; OLE, oilbody-oleosin.

equipment is not turned off in this analysis). These costs represent an upper bound assuming that the power supply system capacity is sized to support a maximal power consumption in which all power-drawing elements are simultaneously in operation. Time of power usage as a fraction of duration are as follows: CHM (99%) > MAG (78%) > ELP (48%) > SPN (45%) > OLE (42%) > VIN (30%). The lower use fraction unit procedures are therefore paying a relatively higher cost per unit power demand in this current method. The electrical needs of the equipment used by the unit procedures are within NASA-proposed Mars mission RMA bounds, with energy use across all unit procedures would peak at ~1% of a proposed Mars transfer vehicle electric capacity (50 kWe) or ~5% of the habitat capacity (12 kWe) of a reference stationary surface nuclear fission power reactor [147].

The mission segment breakdown of ESM illustrates the relatively high costs of pharmaceutical manufacturing capabilities for transit, even for the transit to Mars  $(tr_1)$  in which there is no actual production taking place. There is a strong economic incentive to limit the amount of supplies flown on  $tr_1$ . Alternatives such as the pre-deployment of reagents and consumables and limiting of production to surface operations on Mars (which has lower

RMA equivalency factors for mass and volume than transit operations) must be balanced against the risk to human health posed by removing pharmaceutical production capabilities from a mission segment and potentially exposing the supplies to longer storage times that could challenge shelf lives.

Labor and operation times are important parameters in the broader mission and pharmaceutical foundry context. These unit procedures represent a single step of pharmaceutical production, which if realized in a space mission context, would, in turn, need to be a small portion of a crew member's time allocation. Assuming 40-hour work weeks for crew members, the labor time spans a range of  $\sim 1\%$  (CHM) to  $\sim 14\%$  (ELP) of the available crew time over the 600-day production window. It is not feasible to operationalize with such high labor and operation times at this scale of production, particularly as they stand for MAG and ELP. While strategies such as batch staggering and concurrency can be used to reduce durations, advanced automation will almost certainly need to be built into the core of a pharmaceutical foundry.

A prevailing trend throughout the unit procedures is that the number of unit executions and use cycles required by a given unit procedure are positive correlated with the ESM output value, except for the equipment cost-dominant and higher unit capacity CHM procedure. The equipment modeled in the analysis for CHM and the other unit procedures are almost certainly not space-ready and could be further designed to reduce mass and volume and increase automation to reduce crew labor time. The increased equipment costs in the CHM procedure are primarily due to automation and monitoring hardware for running liquid chromatography, which is reflected in the minimal labor costs of the CHM procedure. Miniaturization efforts, such as those focusing on microfluidic systems [Millet et al., 2015; Rodríguez-Ruiz et al., 2018; Murphy et al., 2019], are emerging as a potential path towards mitigating the high equipment costs associated with highly automated and tightly controlled manufacturing, which are crucial for freeing up valuable crew time.

The number of unit executions is determined by the binding capacity of the technology and the nominal unit size. This indicates that the unit capacity for purification is an important consideration and influential factor. Unit sizing is an important consideration that is valuable to assess more holistically within the broader pharmaceutical production and mission context.

The number of use cycles is determined by the number of unit executions required and by the maximal unit capacity of the equipment items (e.g., if you presume that an 18-slot centrifuge is the equipment bottleneck then the effective number of batches is the number of units required divided by 18). Therefore, it can be understood that the equipment unit capacity is a critical parameter in tuning the number of use cycles and, by extension, the labor costs. For processes with lower labor costs, due to the intrinsic nature of the procedure or through automation of labor, equipment unit capacity will still influence the total duration and production throughout. The MAG and ELP procedures yield both high labor and duration times and are thus particularly sensitive to the equipment capacity.

#### Contextualizing ESM with supporting evaluations

Having acknowledged shortcomings of ESM as a decision-making tool for comparison of alternative approaches in isolated subsystems, we propose that supplementary evaluations can assist in contextualization. A primary gap of an isolated subsystem ESM analysis is a lack of information on the holistic usefulness or cost of a given employed resource, which could include its synergy with other mission subsystems and its extent of recyclability, or waste loop closure, within the mission context. For example, the isolated subsystem analysis does not capture information on the broad applicability that a centrifuge might have for use in other scientific endeavors, nor do the ESM outputs reflect the > 93% recyclability of water achieved by the recycler on the ISS (Steven Siceloff, 2008) that may be generalizable to future missions.

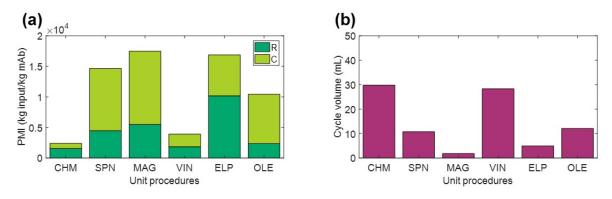


Figure 8.5: (A) Process mass intensity (PMI) evaluation of the unit procedures broken down by raw materials (R) and consumables (C) contributions. (B) Cycle volume for each unit procedure. CHM, pre-packed chromatography; SPN, spin column; MAG, magnetic bead; VIN, plant virus-based nanoparticle; ELP, elastin-like polypeptide; OLE, oilbody-oleosin.

The use of environmental footprint metrics, such as PMI, may be one valuable step towards capturing missed information on recyclability. PMI is a simple metric of material efficiency defined as the mass of raw materials and consumables required to produce 1 kg of active pharmaceutical ingredient. The study by Budzinski *et al.* introducing PMI for biopharmaceuticals presents data from 6 firms using small-scale (2,000 - 5,000 L reactor) and large-scale (12,000 - 20,000 L reactor) mAb manufacturing operations, finding an average 7,700 kg of input is required to produce 1 kg of mAb[64]. Figure 8.5a presents PMI evaluation for the six capture steps included in analysis, which result in PMI outputs as low as 2,390 kg of input (CHM) and as high as 17,450 kg of input (MAG) per 1 kg of mAb. A comparison of these outputs to those of Budzinski *et al.* indicates that we may be observing roughly similar values after accounting for the high cost of initial purification in the study, representing ~60% of the total PMI reported, the elevated feed mAb concentration (i.e., cell culture titer) of 1 - 5.5 g mAb/L, and adjustments for economies of scale when operating at such low cycle volumes (Figure 8.5b). Consumable costs appear to be the most sensitive to scale, which represents ~1% total PMI on average in the values reported by Budzinski *et al.* and ranges

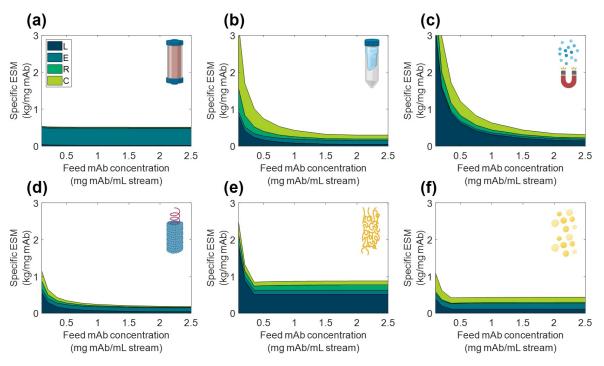


Figure 8.6: Specific equivalent system mass (per unit mass monoclonal antibody produced) broken down by labor (L), equipment (E), raw materials (R), and consumables (C) cost categories as a function of feed monoclonal antibody (mAb) concentration for (A) CHM, (B) SPN, (C) MAG, (D) VIN, (E) ELP, and (F) OLE. CHM, pre-packed chromatography; SPN, spin column; MAG, magnetic bead; VIN, plant virus-based nanoparticle; ELP, elastin-like polypeptide; OLE, oilbody-oleosin.

from 35% (CHM) to 77% (OLE) here. Budzinski *et al.* also go one step further to distinguish water as a separate category from raw materials and report that >90% of the mass is due to water use. Here we assume pre-made buffers and do not directly add water in this study, so we refrain from a similar calculation, but it is worth noting that the extent of water use may also serve as a reasonable starting surrogate for extent of achievable recyclability in a space mission context.

#### Scenario analysis

We analyzed the specific ESM output broken down by cost category for the six unit procedures over a range of input stream mAb concentrations (Figure 8.6) and mission demand for mAb (Figure 8.7). Specific ESM, termed cost of goods sold in traditional manufacturing analyses, is the ESM output required to produce 1 mg mAb. This is used in the scenario analyses to normalize ESM output across variation in mission demand for mAb. The optimal number of batches per mission was found and used for each unit procedure and scenario tested (Supplementary Information, Tables S16 – S17).

We observe the general and expected trends that specific ESM decreases with an in-

CHAPTER 8. CASE STUDY 3: EVALUATING THE COST OF PHARMACEUTICAL PURIFICATION IN SPACE 101

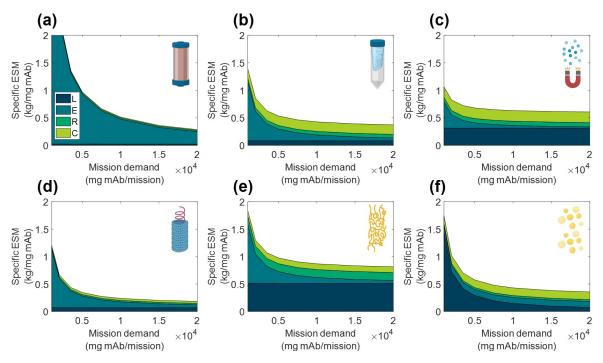


Figure 8.7: Specific equivalent system mass (per unit mass monoclonal antibody produced) broken down by labor (L), equipment (E), raw materials (R), and consumables (C) cost categories as a function of mission production demand for monoclonal antibody for (A) CHM, (B) SPN, (C) MAG, (D) VIN, (E) ELP, and (F) OLE. CHM, pre-packed chromatography; SPN, spin column; MAG, magnetic bead; VIN, plant virus-based nanoparticle; ELP, elastin-like polypeptide; OLE, oilbody-oleosin.

creasing feed stream mAb concentration and mission demand. The CHM procedure exhibits notably limited sensitivity to feed stream mAb concentration, which can be attributed to the equipment-dominated cost profile, fixed column size, and nature of the governing reference protocol that does not specify restrictions on sample load volume. Depending on the pre-treatment of the feed stream, it may be more reasonable to impose constraints on the sample load volume. In contrast, the specific ESM output of the CHM procedure is the most sensitive to mission mAb demand with higher demand increasingly offsetting the fixed capital costs. The CHM procedure is also the largest capacity unit modeled in the analysis (i.e., CHM capacity is 30 mg mAb/unit as compared to 2.7 mg mAb/unit for MAG, the next highest capacity unit) and is accordingly expected to scale well with demand.

The SPN, ELP, OLE procedures exhibit behaviors in which the specific ESM output abruptly plateaus with an increasing feed stream mAb concentration. This observation can be attributed to the unit procedure operating in a mAb binding capacity-limited regime (as opposed to volume-limited for more dilute feeds) which also then controls and maintains unit procedure throughput (e.g., the ELP number of units, 37,044, and use cycles per mission, 2,058, is constant at and above 0.35 mg mAb/mL input stream concentration). This can be de-bottlenecked via technology (e.g., improved chemistry of the capture step unit leading to

higher binding capacity) or methodology (e.g., increased concentration of the capture step unit leading to higher binding capacity) improvements.

Low demand scenarios are particularly relevant for examination in a space health context, as small capacity redundant and emergency utility is a likely proving ground for inclusion of a space pharmaceutical foundry. At the lower boundary of the tested range (1,000 mg mAb/mission), we see the ESM outputs from lowest to highest are re-ordered as MAG < VIN < SPN < OLE < ELP < CHM. Minimization of equipment costs are particularly important in this regime, and it is observed that, indeed, the ESM output near completely aligned with the ranking of equipment cost (MAG < VIN < SPN < ELP < OLE < CHM). It is likely that other non-ESM factors such as integration with other flown elements will understandably influence the design and composition of early and low capacity flown pharmaceutical foundries.

#### Alternate scenarios and mission configurations

We explored variations to the base case RMA for all six unit procedures including scenarios in which the pharmaceutical manufacturing resources are shipped prior to the crew in predeployment, (+)pd, the production window has been truncated to close with the end of surface operations,  $(-)tr_2$ , and a combination of the two prior modifications, (+)pd  $(-)tr_2$ (Figure 8.8). Costs of pre-deployment are included in the analyses and mission demand is kept constant regardless of the production window.

In all cases the ESM totals were reduced from the base case. Additionally, the general trend held that (-)tr2 scenario resulted in lower ESM totals than (+)pd scenario except for SPN, in which the increased raw material and consumable costs of (-)tr2 were sufficiently large to outweigh the reduction in equipment and labor costs of (+)pd. The combination (+)pd (-)tr2 scenario resulted in the lowest ESM totals at a fraction of the base case (as high as 39% reduction in SPN and as low as 21% reduction in ELP).

#### Equipment & unit throughput

Acknowledging the significance of the equipment capacity on ESM output, we further explored this contribution by comparing the base case ESM output of the centrifuge-utilizing procedures (SPN, VIN, ELP, OLE) to that resulting from the use of alternative centrifuge models (Supplementary Information, Table S18). This effectively results in a trade of equipment costs and batch throughput. The optimal number of batches per mission was found and used for each unit procedure and interval tested (Supplementary Information, Table S19).

We observe in Figure 8.9 that the ESM values increased with the size of the centrifuge model, 12-slot < 18-slot (base) < 48-slot. The labor and consumables savings of higher batch throughput were outweighed by the higher equipment costs (including higher power costs). Operation duration is an important metric relevant to a pharmaceutical foundry that is not well reflected in ESM that is also impacted by this alternative scenario. The exception to

CHAPTER 8. CASE STUDY 3: EVALUATING THE COST OF PHARMACEUTICAL PURIFICATION IN SPACE 103

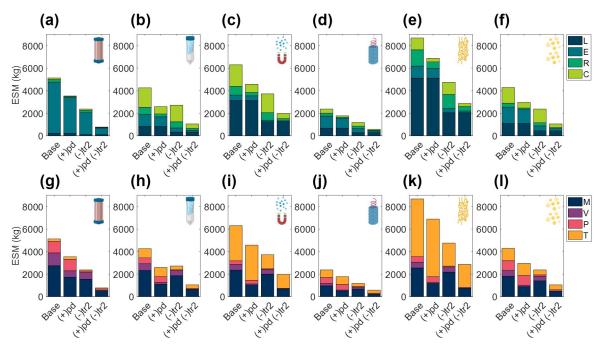


Figure 8.8: Evaluation of extended equivalent system mass values in various mission configurations broken down by labor (L), equipment (E), raw materials (R), and consumables (C) cost categories cost category and mass (M), volume (V), power (P), and labor time (T) constituents for CHM, (A, G), SPN, (B, H), MAG, (C, I), VIN, (D, J), ELP (E, K), and OLE, (F, L). Configurations include the base case scenario of manufacturing resources flown with the crew for pharmaceutical production on the surface and return transit (Base), and alternatives in which the manufacturing resources are flown prior to the crew in pre-deployment, (+)pd, the production window is limited to surface operations, (-)tr<sub>2</sub>, and a combination of the two previously stated alternatives, (+)pd (-)tr<sub>2</sub>. CHM, pre-packed chromatography; SPN, spin column; MAG, magnetic bead; VIN, plant virus-based nanoparticle; ELP, elastin-like polypeptide; OLE, oilbody-oleosin.

this trend is the 48-slot condition for the ELP procedure, in which a lower consumable cost related to the number of use cycles per mission (i.e., pipette tips, tubes, gloves) sufficiently lowered the total ESM below the 18-slot condition.

#### Technology reusability

The number of use cycles for liquid chromatography resins is an important economic parameter in commercial pharmaceutical manufacturing [425]. Here we explore the impact of use cycles on the CHM and ELP procedures in a space mission context, looking at no reuse nor regeneration operation of the purification technology, (-)Reuse, and at an increased number of use cycles, (+)Reuse (Figure 8.10).

We observe that the terrestrial importance of use cycles does not prevail in this isolated ESM evaluation in a space context. The high purchase costs of resin are not considered in ESM and the impact of the reuse cycles is reduced to the mass and volume savings of the pre-packed column consumable. There is a minor decrease in ESM of the (+)Reuse

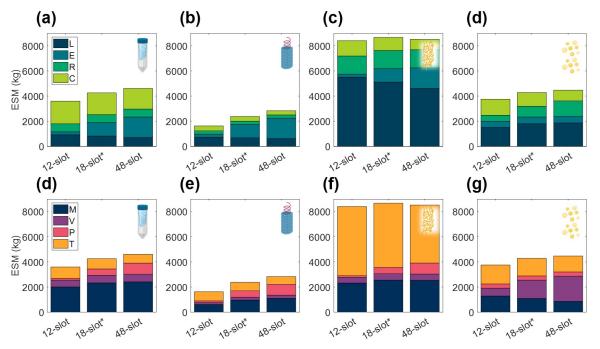


Figure 8.9: Changes in extended equivalent system mass values with different capacity centrifuge models broken down by labor (L), equipment (E), raw materials (R), and consumables (C) cost categories and mass (M), volume (V), power (P), and labor time (T) constituents for SPN (A, E), VIN (B, F), ELP (C, G), and OLE (D, H). SPN, spin column; VIN, plant virus-based nanoparticle; ELP, elastin-like polypeptide; OLE, oilbody-oleosin.

over the base case scenario, but both of these result in substantially higher ESM than the (-)Reuse scenario, particularly for the ELP procedure, in which the regeneration operation has been removed in addition to the reusability of the technology. These results echo the trend of single-use technology in commercial biotechnology in which manufacturers look to disposable plastic bioreactor and buffer bags as a means to reduce cleaning and validation costs (Shukla and Gottschalk, 2013). It would be valuable to further consider the utilization of single-use technology in a space pharmaceutical foundry, and in other space systems bioengineering applications, but it is important to point out the limited scope of this ESM analysis. Here we reiterate that the single unit procedure scope establishes a modular basis for pharmaceutical foundry ESM evaluation but does not realize the true circular economy advantages of reuse, which may be considerable for the regeneration step, and of biological systems for production of the purification reagent in general.

#### **Conclusion & Future Directions**

In this study, we have introduced and applied the ESM framework to biopharmaceutical processing as a first step towards modeling and understanding the costs of Space Systems Bioengineering and, more specifically, of a long-duration space exploration medical foundry,

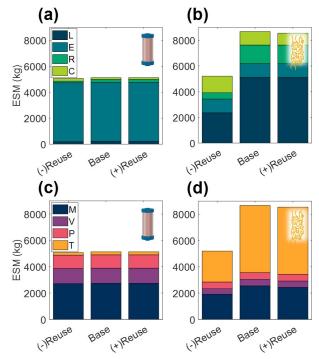


Figure 8.10: Changes in extended equivalent system mass values with reusability of purification technology broken down by labor (L), equipment (E), raw materials (R), and consumables (C) cost categories and mass (M), volume (V), power (P), and labor time (T) constituents for CHM (A, C), and ELP (B, D). (-)Reuse considers the technology as single-use and accordingly discards the unit procedure cleaning operations; (+) Reuse considers additional reuse cycles of the technology. CHM, pre-packed chromatography; ELP, elastin-like polypeptide.

which we believe may one day constitute a critical bioregenerative component of ECLSS for humans to be able to explore the surface of Mars. We have observed that the static behavior of ESM, while certainly maintaining usefulness in early-stage analyses, may stymie later-stage analyses of bioregenerative life support technologies, which tend to behavior more dynamically than traditional abiotic counterparts. In the future, higher fidelity analyses may be performed using tools such as HabNet[142], although the use of such dynamic mission design and modeling tools will require additional software engineering efforts. As it stands now, our techno-economic calculations both satisfy the three fundamental aspects for life support modeling[263, 267] and provide helpful directions for future efforts to incorporate purification processes in space systems bioengineering.

The mAb affinity capture step represented an ideal starting point for biopharmaceutical purification cost analysis given the breadth of the mAb treatments for space-important health indications, the fact that mAb purification is considered a platform technology, and the diversity of affinity capture technologies. However, there are additional processing categories, such as size exclusion, ion exchange, and hydrophobic interaction unit procedures, which could be similarly studied in isolation for their general relevance in biopharmaceutical manufacturing. Establishing a unit procedure knowledge base for space-relevant economics

of biopharmaceutical purification would provide additional benefit to the community.

We acknowledge that the ESM analysis performed in this study utilizes current Earthbased technologies, not Mars-designed processes, and that as technologies evolve and expand the analysis will need to be updated. The need to revisit and update ESM analyses periodically as technology develops is standard practice. This is well illustrated in a recent ESM analysis of plant lighting systems that compares solar fiber optics to photovoltaic-powered light emitting diode hybrid systems[213]. The study results reversed decade-old trade study outcomes in which solar fiber optics scored more favorably, citing rapid advances in solar photovoltaics and light emitting diode technologies.

Furthermore, the analysis presented does not encapsulate potentially significant characteristics of the unit procedures at the interfaces of the upstream and downstream biomanufacturing elements. For example, at the upstream interface the biotic unit procedures (VIN, ELP, OLE) have been reported in literature to be effective capture mechanisms in "dirtier" feed solutions, perhaps absolving the need for more complex pre-capture clarification steps by virtue of process integration. At the downstream end, the eluate of the CHM unit procedure can be directly fed to the subsequent processing step, which would be particularly amenable for other column-based unit procedures, resulting in lower labor time and manufacturing duration. We also do not account for the uncertainty in performance associated with the developmental state of the technology. There have been substantially lower research and development investments in the biotic technologies than in the commercially available abiotic technologies; one may reasonably assume that there is more potential for improvements through biotic unit procedure optimization, while also considering that a larger driving force in abiotic unit procedure optimization for commercial terrestrial operations may balance or outweigh this. Forecasting on the technology development dynamics in the context of these, and other, forces could provide significant additional insights.

Several overarching lessons on the development required for deployment of pharmaceutical purification technology to support human health in space can be gleaned from the cost breakdown of the ESM framework employed in this study. The high mass costs for the mAb capture technologies investigated suggest strong incentives to pursue efforts in miniaturization to reduce not only equipment mass, but also reagent mass, as preparation for pharmaceutical foundries in space. The high labor costs and duration of some of the technologies studied likewise suggests that automatization of biopharmaceutical purification would be impactful. Automatization could also conceivably be valuable in reducing mass costs associated with manual manipulation, such as pipette tips and gloves, and those associated with ensuring sterile operation. We also underline the importance of scheduling and equipment sizing optimization; for example, the ESM penalty for capturing the mission demand of mAb with the VIN unit procedure yielded up to 40% higher total ESM for nonoptimal scheduled manufacturing batches. Given the advantage of *in situ* manufacturing to respond to uncertainty in mission medicine demand, further research to explore scheduling and equipment sizing under uncertainty would provide valuable insight.

There are a series of challenges facing pharmaceutical foundries in space beyond processing. Perhaps the most daunting of these is the incompatibility of existing pharmaceutical reg-

ulatory compliance frameworks with the design constraints of *in situ* manufacturing. There are currently dozens to hundreds of analytical tests required to confirm process and product quality prior to release of the pharmaceutical for administration to human patients[389], which translates into a highly burdensome cost for *in situ* manufacturing of pharmaceuticals in space. Fortunately, there is a strong and parallel terrestrial need to reduce the burden of regulatory compliance while maintaining standards of quality assurance and control for personalized medicine, an individualized and patient-specific approach to medical care with widespread support. As mentioned earlier, trends of distributed and sustainable biomanufacturing on Earth provide additional support for reducing ESM-relevant costs.

The analyses presented in this study motivate future investigation into the ESM output of a complete pharmaceutical foundry for a more complete comparison to other ECLSS needs and subsequent formal evaluations of medical risk (i.e., loss of crew life, medical evacuation, crew health index, risk of radiation exposure-induced death from cancer) mitigation as a balance to the ESM costs. The Integrated Scalable Cyto-Technology system[121], reported in literature as capable of "end-to-end production of hundreds to thousands of doses of clinical-quality protein biologics in about 3 d[ays]," is an automated and multiproduct pharmaceutical manufacturing system that may serve well as a starting point for a complete pharmaceutical foundry evaluation. While downstream costs are typically a large proportion of terrestrial biopharmaceutical production costs, they may represent an even higher proportion of the overall ESM costs. ESM is more closely aligned to PMI as a metric than to cost of goods sold in dollars, suggesting that downstream contributions to ESM may similarly dominate. Budzinski and team found that downstream operations contributed 82% of the total PMI for commercial mAb production[64].

Assembly of a complete pharmaceutical foundry ESM model would also enable investigation of more nuanced RMA design considerations, such as those relating to the influence of a fixed set, or anticipated probability distribution, of pharmaceutical product diversity and batch size on optimal system composition to meet given medical risk thresholds. As stated in the original presentation of ESM theory and application, comparison of multiple approaches for a given subsystem with ESM, such as we are studying with the capture step of a mAb pharmaceutical foundry, should satisfy the same product quantity, product quality, reliability, and safety requirements [314]. Of these assumptions, the product quality and safety requirements prove challenging for implementation in pharmaceutical foundry comparisons. It is worth noting that reliability is not considered in the scope of this preliminary study, given the varying technology readiness levels of the unit procedures, but that it should be included in future analyses of full purification schemes. By extension, the impact of microgravity and reduced gravity on reliability and unit operation performance, while not investigated in this study, is an important and complex consideration, that requires significant research to address. Similarly, stability of the production resources over the course of a mission duration should be further considered in future works. High product sensitivity to process changes, and the large battery of testing sometimes required to observe them (the extent of which will also change with the processes employed), creates a situation where ESM comparisons of pharmaceutical foundries that serve as technology decision making tools will

absolutely need to meet this requirement, albeit at a considerable cost and/or complexity of execution.

The assessment of equivalent safety requirements, to the best of the knowledge of the authors, has been approached thus far in an ad hoc and qualitative manner, relying on extensive subject manner expertise and working process knowledge. One promising route to strengthening these critically important safety assessments would be to implement a formal assessment framework based on the environmental, health, and safety (EHS) assessment proposed by Biwer and Heinzle[51], in which process inputs/outputs are ranked based on a series of hazard impact categories (e.g., acute toxicity, raw material availability, global warming potential) and impact groups (e.g., resources, organism). The key to a systematic space health-centric safety assessment like this is to establish space-relevant EHS impact categories (e.g., planetary protection, crew and ship safety). An improvement of the EHS underpinnings has the potential to provide significant benefits to future ESM analyses in the increasingly complex mission architecture of longer-duration missions.

# Chapter 9

# Futures: Biomanufacturing for Space Exploration - What to Take, When to Make, How to Break Even

As renewed interest in human space-exploration intensifies, a coherent and modernized strategy for mission-design and planning has become increasingly crucial. Biotechnology has emerged as a promising approach to increase mission resilience, flexibility, and efficiency by virtue of its ability to efficiently utilize in situ resources and reclaim resources from waste streams. Since its infancy during the Apollo years, biotechnology, and specifically biomanufacturing, have witnessed significant expansions of scope and scale. Here we outline four primary mission classes, on Luna and Mars, that drive a staged and accretive biomanufacturing strategy. Each class requires a unique approach to integrate biomanufacturing into the existing mission architecture and so faces unique challenges in technology development. These challenges stem directly from the resources available in a given mission class—the degree to which feedstocks are derived from cargo and *in situ* resources—and the degree to which loop-closure is necessary. We see that as mission duration and distance from Earth increase, the benefits of specialized sustainable biomanufacturing processes increases. Here we present a strategic approach, guided by technoeconomics, to development, testing, and deployment of these technologies serves to nucleate the larger effort of supporting a sustained human presence in space. The processes needed for each scenario spans the technical breadth of synthetic biology to design engineering, from sophisticated genetic tailoring of chassis-organisms to building scalable, automated, easily operable bioreactors and processing systems. As space-related technology development often does, these advancements are likely to have profound implications for the creation of a stable, resilient bioeconomy on Earth.

The following chapter is under development for publication as <u>A.J. Berliner</u>, N.J.H. Averesch, S.N. Nangle, S. Zezulka, G.L. Vengerova, D. Ho, C.A. Casale, B.A.E. Lehner, J.E. Snyder, K.B. Clark, L.R. Dartnell, C.S. Criddle, A.P. Arkin. **Biomanufacturing for Space Exploration – What to Take and When to Make**. (In review, *Nature Communications*, Preprint: 10.20944/preprints202207.0329.v1).

With reinvigorated curiosity and enthusiasm for space-exploration and increasingly complex campaigns, humanity prepares to return to the Moon en route to Mars[497, 175, 119]. Efforts to modernize mission architectures[394]—combinations of inter-linked system elements that synergize to realize mission goals[557]—will need to leverage an array of enabling technologies including biomanufacturing towards the realization of such grand visions[385, 401, 17, 380]. Microbial biomanufacturing has the potential to provide integrated solutions for remote or austere locations, especially where supply chains for consumable and durable goods cannot operate reliably[44, 110]. Complementary to, but distinguished from merely remediative and extractive microbial functions, such as biomining[205, 468], off-world biomanufacturing corresponds to any deployable system that leverages biology as the primary driver in generating mission-critical inventory items of increased complexity, i.e., the *de novo* synthesis of components for the formulation of food, pharmaceuticals, and materials [375, 538, 164, 258, 219, 340, 453]. When integrated effectively into mission architectures, bio-based processes will significantly de-risk crewed operations through increased autonomy, sustainability, and resilience, freeing up valuable payload capacity[43].

Key to the efficacy of biotechnology as a support of human space-exploration is its efficiency in using *in situ* resources (*in situ* resource utilization, ISRU) and the ability to utilize waste streams from other mission elements and recycle its own products (loop-closure LC)[391, 320, 198]. As missions expand, progressive advancement and wider implementation of *in situ* (bio)manufacturing (ISM/bio-ISM) will lead to greater independence, enabling more complex mission-designs with extended goals, and may eventually enable a self-sufficient human presence across the solar system. Biomanufacturing is appropriate for that purpose, because high-volume resources, like fixed carbon and nitrogen (as well as as well as low-volume, but critical resources such as minerals) can be produced and recovered in compact autonomous systems that are analogous to Earth's biogeochemical cycles[375, 538, 164, 258, 219, 340, 453, 160]. Biochemistry also provides access to a plethora of organic compounds, often at unrivaled purity and selectivity, many of which are not accessible by other means [309, 12].

Biologically-driven ISM in support of space-exploration becomes more significant the deeper humans venture into space: As the support of supply chains becomes increasingly challenging the further humans travel, ISM is most feasible in locations where resources are available, accessible and abundant, such as the Moon but even more so Mars (Figure 9.1). The advantages and drawbacks of biotic and abiotic approaches for ISM, in particular for life-support but also auxiliary functions for extended human operations beyond Earth-orbit, have previously been discussed at length[371, 372, 401, 44] (qualitatively summarized in Table S4), but an actionable roadmap for deploying biomanufacturing-based systems within upcoming

campaigns has yet to be formulated. Here, we discuss the applicability of biologically driven ISRU and LC in different off-world cases and present a qualitative techno-economic analysis (TEA) to assess different space-travel scenarios. Pursuant, we lay out paths for readying bio-based technologies for inclusion into mission-design and deployment, to enable the next phase of roadmapping for crewed missions into deep-space.

## 9.1 Off-world Biomanufacturing Approaches

#### **Concepts-of-Operations: Differentiating ISM-Modes**

Given that biomanufacturing is uniquely suited to play significant roles in the specific realms of food, materials, and therapeutics, a key challenge in realizing its potential rests in the availability and abundance of feedstocks that are mobilizable by microbes—provided through logistic resupply (directly or from re- and up-cycling of mission products) or obtained from *in situ* resources. This abundance depends on the destination and mission class and leads to a qualitative discrimination of cases as shown in Figure 9.1a. The *in situ* resources that may provide useful feedstocks to drive biomanufacturing processes on the Moon and Mars are broken down in Figure 9.1b, which aids in comparing mission profiles. For each case, different concepts-of-operations (CONOPS) are applicable—these CONOPS conform to specific inventory needs as they relate to mission- and crew-requirements and depend on the resources availability for ISM. The environmental context informs the specification of feedstocks and processing pipelines (LC or ISRU), as shown in Figure 9.1c.

Each case comprises a unique set of inventory elements; such elements may include infrastructure components (e.g., habitat assemblies and furnishing, functional hardware/appliances as well as scientific equipment and tools), transported as either pre-deployment cargo or with the crew. These elements are used to assemble the larger integrated habitation and life-support systems as well as (bio-)ISM-based LC or ISRU systems and infrastructure related to mission-objectives[218]. While all such cases are distinct in terms of operations[147], they serve as exemplars to better understand biomanufacturing strategies in relationship to mission elements that might provide resources, crew count/needs, and logistical constraints.

#### Implementation of Bio-ISM Dependent on Off-World Case

Case 1 (Moon, stable logistics) considers Artemis-like Lunar operations[497], specifically short stay missions for small numbers of astronauts carrying out tight scientific and technical explorations and tests. Because of the short times and logistic accessibility, crew-needs for food, medicine and materials can be provided through carry-along and resupply from Earth[492, 250], rather than relying on the more complex, risky and time-intensive technologies of biomanufacturing. Also, due to the dearth of *in situ* resources on the Moon (Figure 9.1b)[118], the scale of biomanufacturing will be constrained by the supply chain and capability for recycling these elements[191]. However, because of the well-supported environment,

it is an ideal location to prove and improve technologies for biomanufacturing in space by testing automated and scaling operation of critical bioreactor systems for different bioprocess types (e.g., electro- and photo-autotrophic (gas) bioreactors for lithoautotrophic and/or saprotrophic fermentation of macronutrients[31]), all of which are likely to have physiological and operational challenges in a low-gravity, resource-poor environment[290, 242, 481]. To this end, systems that have achieved a Technology Readiness Level[339, 179] (TRL) of 5 are well suited to be implemented and evaluated. While these systems currently exist in isolation or partially integrated in laboratory and industrial contexts, building automated end-to-end, compact systems (advancement past TRL 7) will be a key requirement for case 1, so as to meaningfully scale to future, more constrained mission architectures.

Case 2 (Moon, disrupted logistics) considers advanced Lunar operation capabilities when

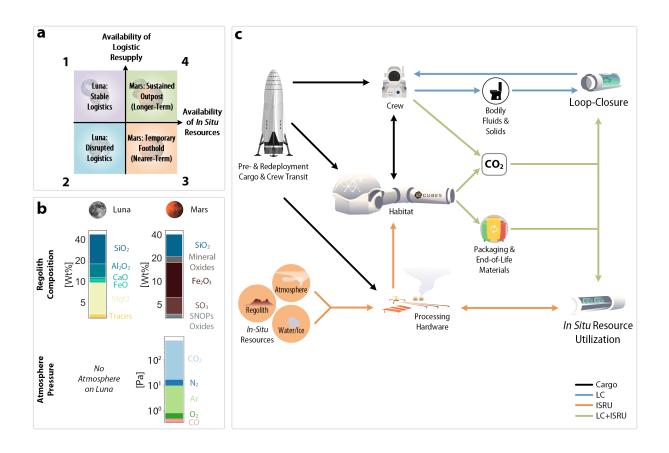


Figure 9.1: Approaches to in situ biomanufacturing dependent on off-world cases. The context-specific off-world cases 1-4 are defined in **a**, mapped as quadrants on qualitative spectra for the availability of *in situ* resources and logistic resupply. The surface-accessible *in situ* resources for the Moon and Mars are compared in **b** in form of gases and solids, broken down into elemental compositions (SNOPs: sulfur, nitrogen, oxygen, phosphorus). Biomanufacturing concepts-of-operations (CONOPS), outlined in **c**, are color-coded for the operational mode: outgoing from initial cargo (black lines), CONOPS can rely on either loop-closure (LC, blue lines), *in situ* resource utilization (ISRU, orange lines), or both (LC+ISRU, green lines).

extensive infrastructure has been deployed on the Moon. To increase the time for operations between resupply (and defending against unexpected resupply disruption), storage facilities will be increased and biomanufacturing become more attractive. Given the paucity of feedstock raw materials on the Moon, which do not provide the central resources necessary for bio-ISM (Figure 9.1b)[118], hyper-efficient use of stored supplies and efficient use of other available mission products and waste-streams via LC must be engineered. Derivatization of packaging materials, such as biodegradable plastics, and minimal processing systems for black and grey water could provide significant augmentations to expected feedstock and extend the operational times of biomanufacturing systems in the event of scheduled or unplanned disruption of the supply chain[17]. Under extreme conditions, being able to switch biomanufacturing operations from, for example, complex vegetable foods to faster and less resource-intense production of simple cellular foods becomes paramount to defray risk. These challenges require innovations in new alternative feedstock engineering in organisms; co-design of mission materials for biological consumption; development of basic waste-processing systems; and flexible re-configurable infrastructures for production to respond to changing resource conditions. Applicable technologies comprise systems that have been tested in the relevant environments and brought to TRL over 7 within operations of Case 1, and are ready for implementation into mission architecture.

Case 3 (Mars, rudimentary logistics) considers basic biomanufacturing systems deployed on Mars with poor logistic resupply due to increased interplanetary distance but with greater availability of *in situ* resources compared to the Moon. While mission-design is still characterized by small crews on round-trips, resource constraints carry different weight. Given the extent and degree of the unknowns involved, these missions are ideally designed to maximize safety and stability by preparing for diverse contingencies. Providing those redundancies is exceedingly challenging due to the remoteness of Mars [147]. Hence, meaningful bio-ISM is necessary—with substantial scaling of the systems brought to TRL 8 to 9 in cases 1 and 2. While a portion of the food, therapeutics and materials will still derive from cargo, significant ISRU of regolith, water, and atmosphere must be implemented in addition to LC, to ensure mission flexibility and resilience. For food, nutritional completeness and palatability, together with customization of texture, flavor, and format will be of central importance. To further safeguard crew-health, essential therapeutics that cannot be included in cargo due to restrictions such as shelf-life, are within scope. For maximum fidelity of mission operations, a range of multi-purpose (thermoplastic) materials is useful for additive manufacturing demand scales in correlation with mission duration with a greater factor than for food or pharmaceuticals. Enabling technologies include: modular fermentations and bioprocesses at scale, optimized genetically engineered microbial strains to efficiently produce intermediates (i.e., ingredients, agents, crude polymer), and formulation/processing systems to assemble the final products (i.e., meals, drugs, manufactured items)[44].

Case 4 (Mars, developed logistics) envisages a fully developed and integrated biomanufactory where essential logistic resupply is enabled by interplanetary networks and deep-space outposts[331, 84, 25], combined with extensive ISRU and LC. Specifically, this case would entail sustained human operations on Mars on the verge of permanent settlement. The

extensive infrastructure that must be deployed for this kind of mission-design enables production of complete and diverse foods with a spectrum of forms and nutrition, a holistic range of therapeutics, and different bulk as well as specialty materials (plastics, metals, composites) that allow not only the maintenance but also expansion of infrastructure, semior fully autonomously. Biomanufacturing technologies and auxiliary infrastructure need to be fully developed and matured to readily deploy tailored microbial cell factories that can potentially be engineered on-demand as the need arises. To this end, even the accommodation of a "space biofoundry" (i.e., automated infrastructure for engineering and analytics of biological systems[234]) in the mission architecture is within scope. Eventually, this will also entail the ISM of specialty chemicals and reagents like e.g., phosphoramidites for DNA synthesis, supporting on-site bioengineering[466], in addition to the total inventories of foods, therapeutics and materials.

#### **Off-World Mission-Scenarios and Bio-Available Inventories**

CONOPS for ISM—the flow of resources and integration of LC with ISRU—not only differ for the four considered off-world cases, but are dependent on and influenced by mission-design scenario. To assess the potential impact that biomanufacturing can have on mission-design more quantitatively, five distinct but comparable scenarios were established as per Figure S15a. The outlined scenarios were designed with the objective of greatest comparability among destinations (Moon or Mars), and are agnostic of the cases previously described in Figure 9.1 (which served to aide in grouping mission architectures by location and biomanufacturing strategies). Scenarios 'A' and 'B' correspond to single sorties to the Moon and Mars, respectively, using standard surface operation duration[17]. Meanwhile, scenarios 'C' to 'E' consider 5,400 days of surface operations either as multi-sortic campaigns (scenarios 'C' and 'D') or in a single sortie (scenario 'E'). Using NASA's 'Advanced Life Support Sizing Analysis Tool' (ALSSAT)[317], an analysis of cargo inventory broken down for each scenario and compared by means of Equivalent Systems Mass (ESM, see BOX)[314] was conducted (see SI for details on data aggregation). The bar-charts in Figure S15 decompose the scenario-cost by means of ESM, differentiated by components (mass, power, cooling, volume, crew-time; S15b), system elements (waste, food, water, air, thermal; S15c) and material composition (structural metal, plastic, water, biomass, electronics, etc; S15d), serving as *prima facie* estimates for mission-expense.

This preliminary TEA provides a primary step towards drawing a relationship from the availability of cargo resources to potential inventory elements that lend themselves to biomanufacturing. Apart from highlighting that longer duration Mars journeys have the highest ESM effort, the analysis also provides insight into inventory differences, which has implications for applicability of ISM among the scenarios. Figure S15b shows that across all scenarios the primary cost in terms of ESM will be mass itself, followed by volume. The biomanufactory schema breakdown in Figure 9.1 is supported by the data in Figure S15c, which shows that ESM for scenarios 'A' and 'C' (Moon) are dominated by air systems (~30% and 26%, respectively) while scenarios 'B' ,'D' and 'E' (Mars) are dominated by

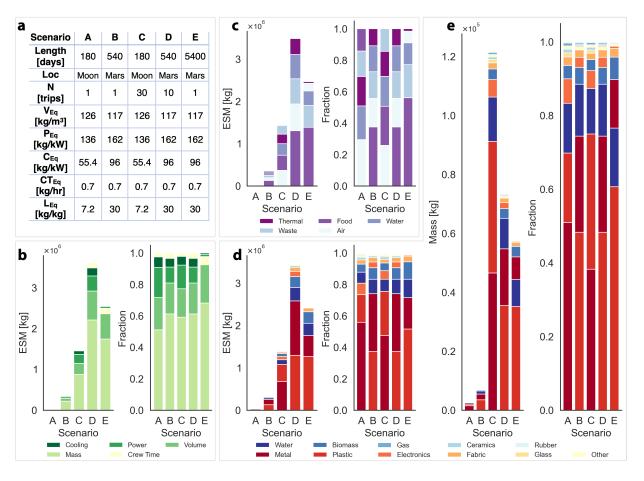


Figure 9.2: Breakdown of inventory elements dependent on mission scenario. Panel a provides an overview of parameters for exemplar mission-design scenarios: 'A' and 'B' correspond to single sorties (N) to the Moon and Mars respectively using standard surface operation duration[17], while 'C' and 'D' correspond to multi-sortie campaigns with the same 5,400 days of total surface operation as in 'E'. These parameters can be used to calculate the ESM cost and include equivalency factors for Volume  $(V_{eq})$ , Power  $(P_{eq})$ , Cooling  $(C_{eq})$ , Crew-Time  $(CT_{eq})$ , and Location  $(L_{eq})$ . Panels **b** – **e** visualize the inventory breakdown by component (**b**), system element (**c**), and material composition (**d** & **e**), respectively: the bar-charts in panels **b** – **d** show the breakdown in ESM units (on the left, in mass [kg]), and the fractional breakdown of each scenario (on the right, unit-less). The bar-charts in panel **e** visualize the absolute (left, in mass [kg]) and fractional (right, unit-less) inventory breakdown of material composition. ESM = Equivalent Systems Mass[314] – for more information see the BOX, as well as the SI.

food systems ( $\sim 38\%$ , 38% and 59%, respectively). Given the resources associated with each location, more air system supplies are required on the Moon, which does not lend itself to carbon dioxide fixation technologies as on Mars. In all scenarios the primary costs will be structural metals, plastics, water, and biomass. Most notably, Figure S15c shows that both, the mass and ESM for each scenario, is dominated by cargo composed of metal and plastics. Unfortunately, structural metal is likely to remain unsuitable for biomanufacturing for the foreseeable future. While biomanufacturing is usually conceived towards food production or therapeutics for sustaining astronauts, we note that plastic represents  $\sim 17\%$  of mass in

#### **BOX:** Assessment of Economics, Feasibility and Risk of Mission-Architecture

In-space biomanufacturing systems will need to demonstrate superiority over traditional systems in supporting crewed space-missions. To this end, traditional missiondesigns must be directly comparable to those augmented with biomanufacturing. One of the more widely used metric to quantify specific attributes of life-support systems is Equivalent Systems Mass (ESM)[314]. In brief, ESM allows mass, volume, power and crew-time to be converted into a single metric in kilograms-equivalent to predict the up-mass requirement [312]. ESM has become a standard metric also for comparing biomanufacturing systems [148, 39], however, it cannot account for aspects such as risk, sustainability, recyclability, complexity, modularity, reliability, robustness, resilience, readiness, scalability, or safety.

As a complement to ESM, the concept of payback time (PBT)[541] has been developed to assess some of these criteria – PBT reflects cost, recyclability, and economic sustainability. Specifically, the PBT is useful in assessing ISRU options, as it allows comparison of the cost to launch and deploy (bio)manufacturing capabilities with the cost of a continuous resupply from Earth over time. Adding statistical risk assessments to the PBT can also help to quantify risk, safeguarding robust and reliable systems. For example, the concept could determine the statistical risk of landing on Mars, with the risk reduction of reduced number of landings on one side but a loss of the payloads carrying ISM hardware being more critical than failure of resupplying missions on the other side. The statistical value of those risk-factors must be carefully assessed based on previous missions, the general technology development roadmap, and the expected learning rates on those factors. Through reliable and generalizable analyses like these, the biomanufacturing approaches which are most vital can be meaningfully assessed.

shorter duration scenarios 'A' and 'B' and from  $\sim 36\%$  up to 60% in longer duration scenarios 'C', 'D' and 'E'. This supports the emphasis on ISM of these materials with increasing mission-duration. Further, with an estimated  $\sim 12\%$  to 16% of the total cargo-mass being water, the associated systems contribute  $\sim 15\%$  to 20% of total ESM (Figure S15c). Because the mass contribution from water is higher for scenarios 'A' and 'B', any biomanufacturing strategy employed should be geared towards water recovery and reuse.

#### Integrating Biomanufacturing with Mission-Architecture 9.2

## **Rational Coupling of Biological Systems and Resources**

Selection of the specific feedstocks utilizable for different ISM purposes must be guided by critical consideration for recycling of resources at molecular and elemental level—any deadend, non-recyclable stream will eventually require a resupply from Earth. For auxiliary

functions (e.g., materials for additive manufacturing), production volume is more important than continuity and response time (as is critical in case of food and therapeutics), therefore requiring the adaptation of widely available resources (carbon dioxide and derivable single-carbon compounds or crude biomass), either directly (where available), or through (physico)chemical means (e.g., as secondary beneficiary of propellant production from *in situ* resources)[486]. Hence, the collective approach to more deeply developing synthetic biological tools for bio-ISM must begin with the feedstocks—sugars or other purified multi-carbon compounds (e.g., higher alcohols and fatty acids) will likely not be the prime substrates of biomanufacturing in space, but rather the products/intermediates in a manufacturing chain or loop that serves life-support (within LC elements such as regeneration of oxygen and waste reclamation)[479]. Critically, because in space savings on payload supersedes commercial relevance, adaptation of non-model microbes that save mass is much more valuable. The range of microbial taxa being proposed and investigated for in space-applications is, however, still narrow and often limited to the few model organisms (e.g., E. coli and S. cerevisiae) whose popularity in Earth-based applications is mostly rooted in legacy. Although a great deal of progress has been made to adapt these organisms to utilization of singlecarbon feedstocks [192, 184], they are still outclassed by organisms naturally capable of these functions [427, 465]. Therefore, species with nutritional modes and metabolism uniquely suited to leverage resources available through LC and ISRU must be considered for development of ISM systems, basing their selection on application (feedstock/product pairing, scale, continuity, and responsiveness of the respective process) and scenario-specific criteria (environmental parameters)[31, 419]. Specifically, organisms with the ability to assimilate single-carbon compounds alongside organics (mixotrophy) are most suitable. For this purpose, expansion of metabolic engineering efforts to create (synthetic) pathways that increase the carbon-efficiency of metabolism and/or allow the catabolism and subsequent up-cycling of non-natural feedstocks, like e.g., synthetic plastics, is also sensible 522, 115. To illustrate these considerations, a qualitative breakdown of possible production routes/flow of carbon through different biomanufacturing approaches for inventory items from case-dependent in situ resources is established in Figure 9.3.

#### **Production of Materials for Manufacturing**

For off-world ISM of materials and fabrication of mission objects a multitude of different approaches exist, many of which are still inhibited by the extent of initially required critical infrastructure [203, 104]. Biomanufacturing has the potential to surmount this limitation, by supporting the fabrication of consumable and durable goods made of plastics [29, 340, 282], metals [168, 554], and ceramics [279] ( $\sim$ 18% to 60%,  $\sim$ 13% to 50%, and  $\sim$ 1% of total mission ESM respectively, Figure S15d) with uses and sizes ranging from small replacement parts and functional tools to physical components of the life-supporting habitat [418, 335].

In combination with additive manufacturing[589], bioplastics could make up the majority of high-turnover items with regular demand, while also providing for contingencies, i.e., non-anticipated servicing and repairs of incidental nature. Such polymeric constructs can be

derived from basic (carbon) feedstocks in a more compact and integrated way in a one-step bioprocess than by chemical synthesis, especially in the case of comparatively (to Earthbased manufacturing industry) low-throughput products [44, 401]. Furthermore, especially high-performance polymer-fibers such as for example aramids and arylates have a range of applications in space technology, including ballistic protection. The building blocks for these, or even final polymeric materials of equivalence, can be obtained through biomanufacturing [29, 30]. Technologies for production of biomaterials, in particular bioplastics, from *in situ* resources like carbon dioxide are also immediately relevant to providing solutions for the most pressing challenges of humanity on Earth. This includes mitigation of greenhouse gas emissions through carbon-capture and carbon-neutrality (i.e., LC), as well as reduction of environmental pollution by non-biodegradable materials. Biomaterials production from inorganic carbon is therefore an enabling technology for the evolution of a circular economy and sustainable (bio)chemical industry on Earth [461].

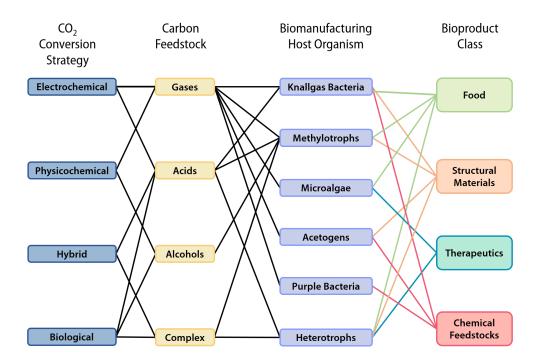


Figure 9.3: Breakdown of available routes for bioproduction of inventory elements from carbon dioxide—either as in situ or recovered resource. Connecting lines represent possible paths for carbon-compound conversion of intermediates to products. Usability of different feedstocks is tied to nutritional mode of the microbial host organism (more than one nutritional mode is possible for certain organisms). Classes of products are assigned to respective microbes in respect of their metabolism as well as not represented 'shadow-characteristics' of the chassis (e.g., aerobic/anaerobic, prokaryotic/eukaryotic, metabolic rate, robustness, etc.), rather than ability to (naturally) derive the respective compounds. While metabolic engineering theoretically allows almost any bio-available compound to be produced in any organism, the effort required for realization can be excessive. For example, oxygen-dependent pathways will hardly be functional in obligate anaerobes without extensive modifications. Likewise, correct folding of proteins with high post-translational modifications in prokaryotes is unlikely. Products may or may not comprise some of the initial feedstocks, hence consecutive runs through this chart to up-cycle carbon are conceivable.

#### CHAPTER 9. FUTURES: BIOMANUFACTURING FOR SPACE EXPLORATION -WHAT TO TAKE, WHEN TO MAKE, HOW TO BREAK EVEN 119

Use of soil and rock (Figure 9.1b), while likely large by volume for surface operations as components of buildings and structures, has a limited number of applications due to the poor mechanical properties of regolith (e.g. low flexibility and plasticity)[396, 585, 100]. Nevertheless, autonomous 3D-printing of infrastructure relying on regolith and composites thereof with (thermoplastic) binding resins has been proposed and prototyped (also see SI)[517, 248]. This requires significant up-mass of auxiliary equipment to allow for e.g., stripping and processing of topsoil, as well as the raw material for the binding resin. If, however, the binding agents (such as polyesters like polylactic acid) could also be derived or produced on-site from *in situ* resources, an additive manufacturing method may become immediately more feasible[315, 251].

Another possibility to overcome the low versatility of raw regolith and leverage it as an *in situ* resource is to extract certain elements of interest for further processing and application. Performed with microorganisms, this process, known as bioleaching, is already being applied on Earth (e.g., for 20% to 30% of global copper production[577]). For space applications, three classes of resources are distinguished: (1) metals and minerals like iron and sulfur oxides[83, 343], or silicates[109], all of which are common in various regolith types and can be extracted for construction purposes and other bulk applications[468]; (2) rare earth elements like lanthanides, scandium and yttrium, which can be extracted from specific regolith types[364]; (3) noble metals found in components of electronics brought from Earth (e.g., copper), which could be reused for new circuitry. While (1) and (2) are part of ISRU and (3) contributes to LC, all of these extraction processes can be combined and coupled with additive manufacturing for perpetual or on-demand ISM. For Earth, these technologies would further contribute to advancement of remediation techniques, contributing to the move towards a more sustainable and circular economy.

### 9.3 Paths to Realization of Emerging Technologies

#### **Readying Microbial Production Systems for off-world Bio-ISM**

While having gained significant traction over the last decade, the study of space biomanufacturing is still limited to small-scale microgravity experiments [523, 558, 237] (e.g., BioRock [111] or Rhodium Inflight Biomanufacturing [166]). More extensive R&D will be required to ready bio-ISM technologies for implementation in mission architectures, especially to scale and adapt synthetic biology and bioprocess engineering to the relevant (off-world) environments (specifically Moon and Mars) [43, 485]. To this end, the development of microbial cell factories must go hand-in-hand with the development of appropriate hardware for in-space bio-ISM. Specifically, standardized but versatile bioreactor systems that are scalable, automatable and capable of providing the environmental conditions for handling and cultivation of microbes in different off-world scenarios are required, combined with autonomous data acquisition for process and hardware performance characterization to monitor production outcomes (scalable yield, titer, and rate, as well as controlled quality).

#### Integration of Research and Development with Public and Private Sectors

To evolve the technological readiness in the described areas requires scientists and engineers from various fields spanning biology, chemistry, physics, and engineering to work together to advance microbial cell factories and build cross-compatible and scalable processing systems within the confines and stressors of space [43]. Biomolecular, bioprocess, and biosystems engineering must be integrated with pre-processing of resources and downstream processing of products, and tied in with mission-support infrastructure and logistics. Coordination mission specialists are critical to deploy tests in space under different constraints (scenarios) and build long-term partnerships and understanding between the public and private sectors. Such groundwork requires long-lived multidisciplinary centers that are secure from volatility of markets and swings of political agendas to perform the large-scale, long-term science necessary to succeed. A dedicated space-based R&D Hub as an associated 'field-station' could greatly streamline and facilitate the advancement of fundamental technology that increases TRLs. Service providers would dedicate and manage resources both on the ISS (near-term) and next-generation space station(s) (mid-term). This pipeline would ensure testing, prototyping, and maturation of technologies in space with assigned, predictable launches, hardware and support.

## 9.4 Outlook

The strategic application of biomanufacturing will de-risk and expand crewed space-exploration capabilities. The farther from Earth the more mission-critical biomanufacturing becomes – Lunar missions may be not sustained only supplemented with LC, recycling and repurposing of waste-streams, Mars missions will require ISRU. To take full advantage of mission supplies and *in situ* resources, advanced biomanufacturing technologies must be developed – given the austerity of the Moon and Mars, research efforts must be geared towards the most abundant resources to benefit future deep-space missions. Near-term Lunar missions will serve to build-out and stress-test LC technologies that will inform long-term ISM processes on Mars. Techno-economic analyses of mission scenarios direct the strategic development of hardware and can, as opposed to hardware, be readily implemented at trivial capital cost. Biomanufacturing technologies for both, LC as well as ISRU, have promise for dual-use applications on Earth for a circular-economy and in extreme or inaccessible environments.

## Chapter 10

## Futures: Space Bioprocess Engineering Drives Sustainability On- and Off-World

Although raison d'etre of Space Bioprocess Engineering is the design, realization, and management of biologically-driven technologies for supporting offworld human exploration, it has the potential to offer transformative solutions to the global community in pursuit of the United Nations Sustainable Development Goals. Here we address the growing sentiment that investment in spacefaring enterprises should be redirected towards sustainability programs. In outlining the Earth-benefits of dual-use Space Bioprocess Engineering technologies, we both show that continued investment is justified and offer insight into specific R&D strategies.

The following chapter is under development for publication as <u>A.J. Berliner</u>, I. Lipsky, G.L. Vengerova, A.P. Arkin. **Space Bioprocess Engineering Drives Sustainability On- and Off-World**. (In preparation, expected submission Summer 2022).

Less than a year after the triumph of NASA's 1969 Apollo moon landing, Gil Scott-Heron's spoken-word poem, Whitey on the Moon, struck a resounding chord amongst the American populace by calling out social and economic disparities in the allocation of public funds [478]. Now more than 50 years after the debut of Small Talk at 125 and Lenox – and with NASA preparing to revisit Luna via the Artemis Program [497], many have echoed Scott-Heron's concerns that the costs associated with spacefaring could better spent by addressing problems on Earth [333, 327]. With the latest Artemis launch system projected to cost \$4.1 billion/launch [177] and estimates of a human exploration campaign to Mars ranging from \$150 billion to \$1 trillion [54, 262, 217] (representing  $\sim 5\%$  of the U.S. GDP) – the need for equitable allocation and efficient management of taxpayer money is critical. Because this money could alternately be used to address political and sustainability challenges on Earth, minimizing the financial cost of the mission and maximizing societal benefit is necessary. Towards this end, space technologies developed via taxpayer dollars should offer both cross-cutting cost solutions and dual-use applications towards addressing Earth-based sus-

#### CHAPTER 10. FUTURES: SPACE BIOPROCESS ENGINEERING DRIVES SUSTAINABILITY ON- AND OFF-WORLD

tainability. From among the myriad of engineering platforms, bioengineering[401, 372, 371] and integrated biomanufacturing[44] technology paradigms have been shown to support human health, reduce costs, and increase operational resilience. Only recently codified, Space Bioprocess Engineering (SBE)[43] presents exciting possibilities for the future of climate change and sustainable development – with an emphasis on SBE innovations that potentiate solutions to planetside problems, education and workforce training towards sustainable and equitable economic futures, and the academic and economic co-benefits of a new promising field of study.

#### "Sen' these doctor bills – Airmail special."

SBE is the multi-disciplinary approach to design, realize, and manage a biologically-driven space mission as it relates to addressing the NASA's grand challenges for advancing technologies to support the nutritional, medical, and incidental material requirements that will sustain astronauts against the harsh conditions of interplanetary transit and habitation offworld [43]. SBE combines synthetic biology and bioprocess engineering under extreme conditions to enable and sustain a biological presence in space. In 2010, NASA's Space Technology Mission Directorate (STMD) released the Space Technology Grand Challenges, 13 calls for new technologies to address need-gaps across human presence, management of space resources, and scientific progress and exploration 514. SBE grew in part from those needs, and its main components have sought to address the challenges of space health and medicine [189,439, 105], settlement [75, 510], and a space way station [236, 55, 553, 455] with SBE thrusts towards biological in situ resource utilization (ISRU) and in-space manufacturing, food and pharmaceutical synthesis, and loop closure all as measures to increase settlement health and self-sufficiency [371, 44, 43]. But beyond space, NASA technologies have often found terrestrial applications [400, 491, 278], and SBE principles of sustainability make for direct extensibility towards climate and environmental challenges too[133]. The STMD exists as a framework to precipitate, vet, and fund promising technologies, and its technology transfer program works to secure funding for dual-use industry applications of promising technologies [157]. Engineered exoelectrogens for  $CH_4$  generation and wastewater treatment [66], yeast that can turn  $CH_4$  into usable biomass for in-space manufacturing (ISM)[182], fungal bioremediation for targeted metal recapture [530], and more STMD biotechnologies have recently found homes outside of human spaceflight [325]. Minimum viability for integrated space biomanufacturing systems requires a degree of autonomy and adaptability that might offer applications towards climate change adaptation and natural disaster response. A modular biomanufactory on Earth could stay more independent from resource lines in case of disaster — drought resistant crops in optimal controlled-growth environments could sustain better against typical agricultural hazards, or molecular pharming, which allows astronauts [366] and terrestrial citizens<sup>[393]</sup> to quickly respond to sudden changes in medical needs. SBE as a field works to address end product recycling, loop closure, maximal utilization of available resources, and optimization for mission sustainability and long-term settlement, traits that will continue to dovetail well with environmental challenges. Technological maturation or ef-

# CHAPTER 10. FUTURES: SPACE BIOPROCESS ENGINEERING DRIVES SUSTAINABILITY ON- AND OFF-WORLD

ficiency breakthroughs in bio-additive manufacturing[90, 189], engineered high-performance crops[390], nutritional victuals[410], medicines[366], biological air purification[548], fuel manufacturing[288, 123, 412], and electrical generation[4] may offer new dual-use futures for Earthbound sustainability targets.

#### "No hot water, no toilets, no lights."

In 2015, the same year the Paris Agreement on Climate Change was signed, all 193 members of the United Nations adopted the Sustainable Development Goals (Fig. 10.1): 17 challenges across human, economic, and natural systems for the modern era[114, 306]. Within this framework, both the technological deliverables and the ideas explored by SBE might offer new avenues towards sustainable development. Preliminary NASA STMD technologies

United Nation Sustainal	NASA Space Technology Grand Challenges bility Development Goals		MANAGE IN-SPACE RESOURCES	ENABLE TRANSFORMATIONAL SPACE EXPLORATION AND SCIENTIFIC DISCOVERY
2 ZERO HUNGER	3 GOOD HEALTH AND WELL-BEING	Molecular pharming views plants as chemical factories, efficiently synthesizing desirable compounds with minimal inputs. In space as terrestrially, it would allow people to quickly respond to unanticipated disease states.	Space agriculture has led to advances in the practice of vertical farming, which minimizes the amount of inputs needed to grow crops. Vertical farming also allows crops to be grown anywhere a controlled environment can be established, including in densely populated urban areas.	The Photobioreactor on the ISS cultivates microalgae to create hybrid life support systems which can grow nutrient-rich microalga. Advances in the chamber have made it feasible for use in advanced wastewater treatment and cultivation of nutrient-laden biomass over marine water.
	6 CLEAN WATER AND SANITATION	The Microbial Check Valve developed for the Space Shuttle passively kills viable microorganisms within water to prevent cross-contamination. Water tanks using this technology have been installed in cities with a scarcity of clean water.	Projections of a hypothetical urine-diversion system show that communities could lower their greenhouse gas emissions, energy consumption, and freshwater usage. On the ISS, a Urine Processor Assembly collects urine and processes it to potable standards while the remaining brine can be used as fertilizer, and in Europe, urine recovery systems are being implemented throughout wastewater systems.	Aquaporin-based filtration, inspired by aquaporins found across organisms, is highly efficient and specific to filtering out water, and is included in the Extravehicular Mobility Unit space suit design. As clean freshwater resources are increasingly strained, aquaporins are eyed for their ability to filter water through non-energy intensive means.
	512	The Urea Biochemical Reactor unit (UBR) is being studied as a way to combine wastewater treatment to separate urea from urine and convert it into energy. The UBR would work in any wastewater treatment containing urine and/or ammonia, providing a non- energy or -resource intensive method for producing energy on and off Earth.	The algae studied in NASA's OMEGA project cleaned wastewater and produced biomass that could be used as fuel. Coupled with advances made in using urine as a wastewater source for algae, this could provide a way for astronaut so produce in situ fuel. The project developed protocols for harvesting algae and demonstrated that NASA has the motivation and resources to study technology applicable both to rocketry and the search for renewable energy.	Advances in bio-crude oil manufacturing by pre- treating microalgae with NaOH and urea would mean that astronauts on the ISS would be able to conserve the amount of propellant brought and resupplied. As the environment is destroyed to mine natural oil, this technology presents an alternative way to manufacture crude oil and make it closer to becoming a renewable resource.
8 DECENT WORK AND ECONOMIC GROWTH	9 INDUSTRY, INNOVATION AND INFRASTRUCTURE	NASA has studied closed-system applications of phytoremediation (i.e. the use of plants for remediation of contaminants) to create a healthy environment for astronauts off-world. This knowledge has been used to develop living walls, which have natural insulation and promote social and physical health using minimal inputs.	Long-term human settlement on Mars or the Moon vill necessitate large amounts of concrete, but shipping tons of it is not feasible, and traditional methods of production are energy-intensive. To solve this, environmental engineers developed a method to harvest the binder needed for concrete from organisms that could be shipped to other planets relatively cheaply and used in place of boiled limestone on Earth, lowering carbon emissions from concrete production.	The original purpose of Biosphere 2 (B2), a miniaturized version of Earth's ecological environments, was to establish a baseline for structures for long-term human habituation in space. The B2 experiment informed other initiatives to simulate what life on the Moon and Mars could look like. Today, experiments in B2 focus on improving ecology and eco-technology on Earth.
11 SUSTAINABLE CITIES	12 RESPONSIBLE CONSUMPTION AND PRODUCTION	One goal of MELiSSA is to create a closed-loop system in deep space which supplies astronauts with fresh air, water, and food using microbial recycling of human waste, and it offers a blueprint for human- centered and sustainability-minded cities.	Polyhydroxyalkanoate (PHA) polymers produced by microorganisms can be used as biodegradable plastics and have been tapped by NASA for long-term extraterestrial missions because they make production of materials possible in space. Because the requirements for production in space include producing minimal waste and meeting the high standards of a top-of-the-line lab, perfecting the technology for NASA would mean that terrestrially, citizens would have access to plastics that are degradable but still safe for use in laboratory or medical environments.	NASA has funded experiments which showed that houseplants in conjunction with activated charcoal efficiently clean indoor air pollutants, and this research may be used to design space stations and terrestrial buildings which are conducive to the good health of their occupants.
	13 CLIMATE	NASA has developed enzyme structures which could facilitate access to biomass and biofuels from cellulose, and on Earth, researchers are studying potentially carbon-negative biofuel production utilizing cellulosic feedstocks which could benefit from these enzymes.	The Haber-Bosch process which produces ammonia requires large energy inputs and releases carbon dioxide. Alternatives such as bacterial nitrogen fixation and urine ammonia extraction have been studied for use as low-energy in situ methods for ammonia production, and these provide industrial chemical synthesizers strategies for ammonia production with a much smaller carbon footprint.	Microalgae can grow in extreme environments to produce essential consumables and biofuels, and can be used for efficient CO2 scrubbing. NASA's Surface Adhering BioReactor provides a method for cultivating microalgae with low energy and water inputs on- and off-world.

Figure 10.1: Space Bioprocess Engineering technologies in the context of NASA's Space Technology Grand Challenges (STGCs) and United Nations Sustainability Development Goals (SDGs). Specific exemplar technologies developed in service to the STGCs (shades of grey) are described in relationship to corresponding SDGs (shades of pink). More more information and references, see Table S1 in the SI.

#### CHAPTER 10. FUTURES: SPACE BIOPROCESS ENGINEERING DRIVES SUSTAINABILITY ON- AND OFF-WORLD

towards bioremediation and filtration could ameliorate water and air quality, helping towards sustainable cities and communities (SDG 11), health and well-being (SDG 3), and clean water and sanitation (SDG 6). Successful bio-additive manufacturing and bioprocesses to reduce material footprints in the name of a sustainable mission would also be levers towards decent work and economic growth (SDG 8), industry innovation and infrastructure (SDG 9), and responsible consumption and production (SDG 12), as would bio-recapture of waste products and loop closure. Space research and development has consistently generated returns, and SBE is still fledgling as a body of research. Tight mission constraints and the push for optimization and metrification in space architecture can establish more about key mechanisms, best practices, and new concepts entirely. SBE developments in crop LED lighting 502, 65, 426], acetate production for bioplastics[88, 323, 89, 90], biomining and bioremediation[111, 468], all have potential to optimize existing processes and reduce reliance on fossil fuels. Synthetic biology breakthroughs that have been democratized in the public forum through the literature could breed other breakthroughs in environmental bioprocess engineering [178]. And because bioengineering and synthetic biology represent such a huge promise to the problem of climate change [133]: crop modification for sequestration [252], rumen engineering[235], RuBisCO modification for CO<sub>2</sub> fixation[81, 318], bio-geoengineering[498], and much more – the greater we understand the solution sphere, the better we can meet our goals for sustainable development (SDG 13)[498, 513].

#### "Was all that money I made las' year?"

Totaling \$5.8 trillion, the recently released U.S. 2023 Fiscal Budget by the Biden White House allocates 44.9 billion (0.7%) in discretionary budget authority to address the climate crisis<sup>[46]</sup>. Despite this increase of 16.7 billion (59%) from 2022, some worry that this is just not enough [454]. The Intergovernmental Panel on Climate Change (IPCC) has reported that global model pathways limiting global warming to  $1.5^{\circ}$ C are projected to require an investment in just energy sustainability amounting to \$2.4 trillion between 2016 and 2035 – representing  $\sim 2.5\%$  of the world GDP[524]. In the U.S. this would amount to an additional \$101 billion and some have argued that meeting this financial target can be reach in part by raiding the \$26 billion slated for NASA. With only an 8% yearly increase in its budget from 2022, 2023 NASA has directed primarily to-

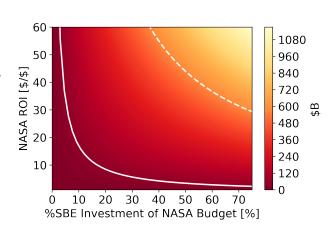


Figure 10.2: NASA-funded SBE Technology Return on Investment. A contour plot is provided showing the financial return on investment (ROI) in \$Billions as a function of the NASA ROI \$:\$ and the SBE fraction of the NASA budget of current \$26B. The solid white line corresponds sustainability budget of \$44B and the dashed white line corresponds the the ROI of sustainability investments at 13:1 [\$:\$].

#### CHAPTER 10. FUTURES: SPACE BIOPROCESS ENGINEERING DRIVES SUSTAINABILITY ON- AND OFF-WORLD

wards enabling missions on and around the Moon through Artemis while preparing for Mars exploration to the tune of \$7.6 billion for deep space exploration and \$4.7 billion for Common Exploration Systems Development to support lunar missions includes funding for the Orion spacecraft and Space Launch System (SLS) – compared to the \$2.4 billion for Earth-observing satellites and related research will enhance NASA's ability to improve our understanding of climate change. NASA has recently allocated anywhere from  $\sim 0.5$ -2.5% of their yearly budget towards SBE and SBE-adjacent programs: \$115.0 million to its Human Research Program, \$79.1 million towards biological and physical sciences, and a fraction of the \$145 million for early stage innovation and partnerships and \$287 million for small business innovation research and technology transfer[46]. If SBE technologies are considered as sustainability technologies, then we can consider the return-on-investment (ROI) on NASAfunded SBE as a contribution to the gap in funding towards sustainability. With estimates of NASA ROIs ranging from 7-21:1[200, 223] (and in some cases 40:1[193]) \$/\$ compared to the DOE's ROI of 13:1 for something like its Clean Coal Technology Program \$/\$[134], we estimate the total possible financial contribution to sustainability from NASA investment in SBE as arbitrage between the SBE fraction of the NASA budget and the ROI (Fig. 10.2).

#### "How come there ain't no money here?"

The primary factors predicted to govern the success of biomanufacturing are the availability of *in situ* resources and the availability of logistic resupply of cargo in the form of feedstocks. NASA's Artemis mission aims to land the first woman and person of color on the lunar surface, deepen the scientific understanding of the Moon, and test technologies that will prepare for human exploration of Mars. Due to the lack of carbon (C) and nitrogen (N) on Luna[118], the scale of any biomanufacturing-driven product will be constrained by cargo deployed from Earth and the ability to recycle these elements at each phase in their life-cycle [191]. A critical source of C and N on Luna will be waste-stream recycling. This process will leverage biological wastes produced by crews and the waste products of biomanufacturing itself are recaptured and utilized in successive rounds of biomanufacturing. Reuse of waste streams will thereby increase the sustainability of lunar missions and decrease the need for new raw materials to be shipped from Earth. In the context of Artemis, specific SBE technologies that contribute to recycling and reusing scarce cargo materials also serve as Earth-based sustainability platforms which contribute to STG 6. For instance, aquaporin-based filtration and NASA's Microbial Check Valve have been integrated in space missions already and provide passive, efficient water filtration methods for use on Earth[224] (Fig. 10.1). More broadly, closed-loop life support systems, like the Environmental Control and Life Support System (ECLSS) and Micro-Ecological Life Support System Alternative (MELiSSA) provide a blueprint for sustainably designed environments on Earth (Fig. 10.1).

As with Artemis, the specific technologies deployed as mission cargo are still the subject of much speculation and scrutiny [147]. Recent studies in mission architectures with surface operations longer than 500 days have shown that biotechnology offers mass, power, and volume advantages over traditional abiotic approaches – and the amalgamation of SBE

#### BOX 1: "Hm! Whitey's on the moon"

The technology for human colonization of space must operate so well that crews can survive their missions safely both mentally and physically, and quickly recover from unanticipated emergencies. The standards for astronaut life are high [460], but the same has not been always true of the standards for ordinary civilians on Earth. A history of scientific racism has led to mistrust of science and engineering within marginalized communities [238, 354, 35, 22]. Meanwhile, climate change has been shown to impact those same communities earlier and more seriously than in others [475]. While technology is likely the path to mitigating climate change, it is important that that technology is both effective and thoughtfully distributed, so it is able to reach those most impacted by climate change. Focusing on sustainability in the context of space exploration forces new technology to first be proven safe and effective for astronauts, then used terrestrially. This change may begin repairing the divide between experts and laypersons, increasing public support of and allowing technology to be adopted more broadly, as well as provide useful tools in the battle of climate change. These factors combined would pave the way for effectively minimizing the damage climate change will otherwise cause, in the communities it affects the most.

elements in the form of an integration Martian biomanufactory has been proposed [44]. Unlike Artemis, human exploration on Mars will be governed by poor logistic resupply and more availability of useful *in situ* resources. As a result, biomanufacturing strategies will be driven by more by ISRU and ISM – in particular, C and N fixation. Although the average surface pressure on Mars is <1% compared to Earth, there exists sufficient CO<sub>2</sub> (~95\%) and  $N_2(\sim 3\%)$  to entertain a number of C and N fixation strategies. With many mission architectures calling for *in situ* production of ascent propellant, the abiotic conversion of  $CO_2$  to  $CH_4$  via the Sabatier reaction has been proposed and is being tested on board the International Space Station. Requiring extreme pressure and heat, this process is energy intensive. SBE alternatives such as cellulosic biofuel production [288], the Urea Biochemical Reactor unit [409], or bio-crude oil harvested from pre-treated microalgae [245] require less energy compared to traditional methods for propellant production and are potential dual-use technologies for addressing climate action (STG 13) via greenhouse sequestration. The ample  $CO_2$  inventory of Mars also serves as the primary feedstock for agriculture. SBE-driven platforms for hydroponic crop cultivation have been shown to reduce mission costs for sustaining astronauts. Advances in space agriculture have already led to advances in terrestrial agriculture (SDG 2), and advances in creatively using wastewater (e.g. efficient ammonia extraction from urine) provide a means for safely supplying crops with needed nutrients by recycling waste (Fig. 10.1). The Urine Processor Assembly on the ISS collects urine and processes it to potable standards 543, recovering much of the water available. However, urine can theoretically supply over 60% of the crew's water demand and the brine can be used

#### CHAPTER 10. FUTURES: SPACE BIOPROCESS ENGINEERING DRIVES SUSTAINABILITY ON- AND OFF-WORLD

as fertilizer, so researchers continue to study how this system can be improved [543]. Urine recovery systems are being implemented throughout wastewater systems in Europe. Projections of a hypothetical urine-diversion system show that communities could lower their greenhouse gas emissions by up to 47%, energy consumption by up to 41%, and approximately halve their freshwater usage [225]. The Haber-Bosch process produces ammonia for use in fertilizers and pharmaceuticals but requires large energy inputs [78] and releases 1.2% of global anthropogenic carbon emissions. Low-energy ammonia production or extraction processes are being developed for use in space, and these alternatives (Fig. 10.1) provide chemical synthesizers strategies for producing ammonia with a smaller carbon footprint.

#### "The man jus' upped my rent las' night."

Beyond mission savings, SBE as a venture may offer co-benefits towards education, diversity and a more inclusive economy. The United Nations identified science and technology as a key lever in their 2019 Global Sustainable Development Report, and SBE could contribute to that public sector research push with sustainable technology investment [588]. NASA, and the burgeoning SBE field, train and employ high-skilled workers to stable civil servant, engineering, and scientific careers<sup>[222]</sup>: over 312,000 strong. NASA induces \$19.3 billion in contracting activity [584]. To its workforce, space technology relies on significant outreach, academic partnerships, and on-the-job training that both fill the ranks of the next generation and lower barriers to entry. SBE could enable more women, cultural minorities, and the economically disadvantaged to enter the space sciences. SBE's multi-disciplinary approach could help bridge the gap between the scant 14.6% of aerospace engineering graduates that are women and the 50.6%, 42.1%, and 35.4% of women graduating towards environmental, biological and agricultural, and chemical engineering, respectively [463]. NASA's \$127.0 million STEM engagement fund and a unified call for SBE workers would promote engagement across cultural and scholarly backgrounds [46]. A young field with foundational work still to be done offers early career scientists and engineers facing down other entrenched industries a new set of opportunities. Across Space Technology Research Institutes (STRIs), individual Early Stage Innovation (ESI) projects, NASA Innovative Advanced Concepts (NIAC), and all of its solicitations, the STMD boasts more than 800 active projects — all containing the necessary agency framework to promote the participation of women and underserved communities and businesses, and of historically black colleges and minority serving institutions[518]. In fact, effectively prioritizing sustainability in space exploration necessitates involving and uplifting marginalized communities. The most immediate and devastating impacts of climate change will be felt primarily by marginalized communities [37, 330], so input from underserved demographics will be crucial to fighting the looming ecological crisis, including in space exploration efforts. Furthermore, NASA partners are beholden to the extensive agency standards of diversity, equity, and workforce inclusion, which would push the lever towards gender equality and quality education (SDGs 4 and 5).

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#### "Ten years from now I'll be payin' still."

In our pursuit of a spacefaring future, we must also give pause and remember the words of Scott-Heron. If "ten years from now I'll be payin' still," we must ensure that the investment offworld offers benefits on Earth. A central tenet of a more sustainable world is a sustainable economy. Space Bioprocess Engineering promises the powerful returns of NASA work and fundamental research as a whole, but also its own slew of sustainable development prospects. Both as a field and an economic venture, SBE grapples with a crystallized set of the same challenges that face most sustainable development. Returns are not immediate, upfront investment is hefty and comes often from the taxpayer, and SBE is uniquely positioned to meet them.

# Chapter 11

# Appendix

## 11.1 SI: xESM

			Case 0		
$\mathbf{xESM}$	M (kg)	V (m^3)	P(kW)	C (kW)	T (MMH/ Duration)
Transit to Mars		28.23	9483.77	8440.16	143.92
Return Transit	5741.17	19.16	9476.05	8432.44	126.66
Total	14357.49	47.39	18959.82	16872.59	270.58
$\mathbf{ESM}$	M (kg)		( )	C (kW)	T (MMH/ Duration)
Transit to Mars	5538.48	17.99	9458.54	8417.79	253.27
Return Transit	5538.48		9458.54	8417.79	253.27
Total	11076.96	35.97	18917.09	16835.59	506.53
			C 1		
	3.5.(1)	TT ( to)	Case 1		
xESM	M (kg)	V (m^3)	P(kW)	C (kW)	T (MMH/ Duration)
Transit to Mars	15290.76	47.14	9515.68	8472.30	220.76
Mars Orbit	12415.60	42.03	9488.40	8445.03	551.54
Return Transit	5918.73	21.35	9489.58	8446.20	220.76
Total	28092.95	89.55	19018.57	16931.82	772.30
ESM	M (kg)	V (m^3)	P (kW)	C (kW)	T (MMH/ Duration)
Transit to Mars	5538.48	17.99	9458.54	8417.79	253.27
Mars Orbit	9370.25	31.09	9490.69	8446.62	603.02
Return Transit	5538.48		9458.54	8417.79	253.27
Total	15295.32	49.45	18963.73	16878.90	856.28
			Case 2		
xESM	M (kg)	V (m^3)	P (kW)	C (kW)	T (MMH/ Duration)
Transit to Mars		60.15	16942.22	15198.38	220.76
Mars Orbit	8318.85	29.07	5454.67	5097.82	551.54
Descent	22884.79	22.66	7426.54	6726.08	0.00
Surface Ops	0.00	22.66	7426.54	6726.08	603.02
Acsent	8000.00	0.00	0.00	0.00	0.00
Return Transit	5918.73	21.35	9489.58	8446.20	220.76
Total	63021.09	155.89	46739.56	42194.54	1596.08
ESM	M (kg)	V (m <sup>3</sup> )	40739.30 P (kW)	C (kW)	T (MMH/ Duration)
Transit to Mars	5538.48	<b>v</b> (III <b>3</b> ) 17.99	9458.54	8417.79	253.27
Mars Orbit	4402.39	14.23	5454.67	5097.82	603.02
Descent	4402.39 8000.00	0.00	0.00	0.00	0.00
Surface Ops	6884.79	22.66	7426.54	6726.08	603.02
Ascent	8000.00	0.00	0.00	0.00	0.00
Return Transit	5538.48	17.99	9458.54	8417.79	253.27
Total	38364.14	72.86	31798.31	28659.48	1712.57
rotai	00004.14	12.00	01190.01	20009.40	1114.01

			Case 3		
$\mathbf{xESM}$	M (kg)	V (m^3)	P(kW)	C (kW)	T (MMH/ Duration)
Predeployment	14884.79	22.66	7426.54	6726.08	0.00
Transit to Mars	19194.01	38.13	9515.68	8472.30	220.76
Mars Orbit	8318.85	29.07	5454.67	5097.82	551.54
Descent	8000.00	0.00	0.00	0.00	0.00
Surface Ops	0.00	22.66	7426.54	6726.08	603.02
Ascent	8000.00	0.00	0.00	0.00	0.00
Return Transit	5918.73	21.35	9489.58	8446.20	220.76
Total	48316.37	133.87	39313.01	35468.47	1596.08
$\mathbf{ESM}$	M (kg)	V (m^3)	P(kW)	C (kW)	T (MMH/ Duration)
Predeployment	6884.79	22.66	7426.542163	6726.076876	0
Transit to Mars	5538.48	17.99	9458.54	8417.79	253.27
Mars Orbit	4402.39	14.23	5454.67	5097.82	603.02
Descent	8000.00	0.00	0.00	0.00	0.00
Surface Ops	0.00	22.66	7426.54	6726.08	603.02
Ascent	8000.00	0.00	0.00	0.00	0.00
Return Transit	5538.48	17.99	9458.54	8417.79	253.27
Total	22364.14	95.51	39224.85	35385.56	1712.57

 Table S1: xESM Parameters

## 11.2 SI: Case Study 1

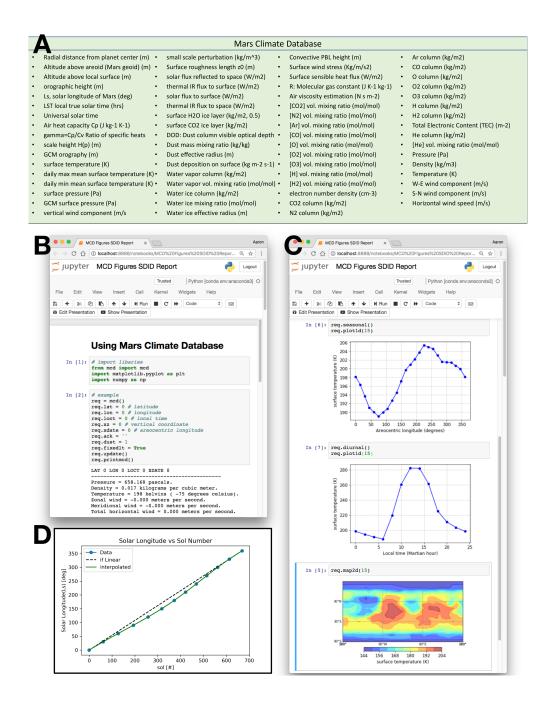


Figure S1: (A) all parameters available for query in the MCD; (B.) example query to MCD; (C.) i. plot of surface temperature vs areocentric longitude for local time t = 9:00; ii. plot of surface temperature vs local time for LATITUDE = LONGITUDE = 0; iii. cylindrical projection of surface temperature; (D.) Plot of solar longitude vs sol number, demonstrating the eccentricity of Mars's orbit and the approximate season, with northern summer solstice occurring when Ls = 90 and northern winter solstice when Ls = 270.

A central question surrounding possible settlement of Mars is whether human life can be supported by available technologies using *in situ* resources. Here we present a detailed analysis showing that photovoltaic and photoelectrochemical devices would be adequate and practical to sustain a crewed outpost for an extended period over a large fraction of the planet's surface. Climate data were integrated with a radiative transfer model to predict spectrally-resolved solar flux across the Martian surface, which informed detailed balance calculations for solar cell devices supporting power systems, agriculture, and manufacturing. Optimal design and the corresponding production capacity over a Martian year revealed the size and mass of a solar cell array required to support a six-person mission, which represents less than 10% of the anticipated payload.

The following SI describes the redSun software created as an integration of available software and custom code written in Python 3.6 with UNIX and Fortran backends. It can be found at https://github.com/cubes-space/redSun.

#### **Environmental Data Aggregation**

#### Mars Climate Database

Downstream radiative transfer calculations require a number of input streams describing the Martian environment. We make use of the Mars Climate Database (MCD) [48] developed by Le Laboratoire de Meteorologie Dynamique (LMD) in Paris, queried via the mcd-python package, to model most climate and environmental constraints, including photon flux and power spectra over time and location. The software engineering processes for building and using MCD somewhat efficiently are illustrated in Figure S1, along with input parameter profiles and sample output plots.

#### **Initial Geotemporalspatial Grid**

We began by first initializing the geotemporal spatial grid from which all downstream radiative transfer and PV/PEC calculations would be based. The grid was composed as a .netCDF file with dimensions of 19 points of 10° latitude  $\times$  37 points of 10° longitude  $\times$  25 points of 15° areocentric longitude  $\times$  13 points of 2 (Martian) hours. Additionally, we included the dimension of altitude above the Martian datum in 20 points ranging from 0 to 120 km. The dimensions for the initial grid are shown in Table S2.

#### **Atmospheric Variables**

Through a combination of custom code in redSun and modifications to the Python-based extension of MCD, we then looped through Lat, Lon, Hr, and Ls dimensions to initialize the data variables in Table S3.

Dimension	Units	Initial	Final	Step	Number
Latitude	degrees north	-90	90	15	19
Longitude	degrees east	-180	180	15	37
Wavelength	nm	300.5	4000	N/A	1340
Level	$\mathrm{km}$	0	120	6.32	20
Aerocentric Longitude	$\deg$	0	360	15	25
Hour	hr	0	24	2	13

 Table S2:
 Initial grid dimensions.

Variable	Units	Dimensions	Dimension Number
Air Density	$\mathrm{cm}^{-3}$	lat,lon,level,ls,hr	5
Datum Altitude	km	lat,lon,level	3
$CO_2$ Partial Pressure	$\mathrm{cm}^{-3}$	lat,lon,level,ls,hr	5
$H_2O$ Partial Pressure	$\mathrm{cm}^{-3}$	lat,lon,level,ls,hr	5
$O_2$ Partial Pressure	$\mathrm{cm}^{-3}$	lat,lon,level,ls,hr	5
$O_3$ Partial Pressure	$\mathrm{cm}^{-3}$	lat,lon,level,ls,hr	5
$NO_2$ Partial Pressure	$\mathrm{cm}^{-3}$	lat,lon,level,ls,hr	5
Pressure	hPa	lat,lon,level,ls,hr	5
Temperature	Κ	lat,lon,level,ls,hr	5
Ice Content	$ m g/m^3$	lat,lon,level,ls,hr	5
Ice Effective Radius	um	lat,lon,level,ls,hr	5
Dust Content	$ m g/m^3$	lat,lon,level,ls,hr	5
Dust Effective Radius	$\mu \mathrm{m}$	lat,lon,level,ls,hr	5
Long Wave Downward Flux	$W/m^2$	lat, lon, ls, hr	4
Short Wave Downward Flux	$W/m^2$	lat, lon, ls, hr	4
Long Wave Upward Flux	$W/m^2$	lat, lon, ls, hr	4
Short Wave Upward Flux	$W/m^2$	lat,lon,ls,hr	4
Top of Atmosphere Irradiance	$ m W/(nm.m^2)$	lat,ls,hr,wl	5

 Table S3: Initial atmospheric grid variables sourced from MCD.

i

#### **Planetary Variables**

While most of the required environmental variables could be sourced from MCD, additional efforts were made to add data on the planetary albedo and zMOL as shown in Figure S2 and in Table S4.

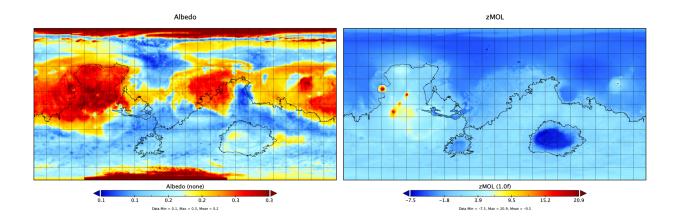


Figure S2: Albedo and zMOL (height above the Martian datum) maps.

Variable	Units	Dimensions	Dimension Number
Albedo		,	2
zMOL	none	lat,1011	Ζ

#### Solar Variables

In addition to atmospheric and planetary variables, our initial environmental data for downstream radioactive transfer required that we calculate the solar flux at the top of the atmosphere (TOA). Downstream radiative transfer calculations required as input the spectral flux in W/(m<sup>2</sup>·nm) whereas MCD only provided an integrated solar flux in W/(m<sup>2</sup>). For a given Lat, Lon, Hr, and Ls, we were able to calculate the spectral flux  $F_0$  via[424]

$$F_0 = \mu F_{1.52} \left(\frac{d^2}{r^2}\right)$$
(11.1)

$$F_0 = F_{1.52} \left( \sin \theta \sin \epsilon \sin L_s + \cos \theta \cos \left(\frac{2\pi t}{P}\right) \left(1 - \sin^2 \epsilon \sin^2 L_s\right)^{1/2} \right) \left(\frac{1 + e \cos(L_s - L_{s,p})}{1 - e^2}\right)^2$$
(11.2)

where r is the Sun-Mars distance along its orbit, d is the mean Sun-Mars distance of 1.52 AU,  $\mu$  is the cosine of the solar zenith angle z, e is the Martian eccentricity (e = 0.0934),  $L_s$  is the aerocentric longitude,  $L_{s,p}$  is the aerocentric longitude of perihelion (250°),  $\theta$  is the latitude,  $\epsilon$  is the Martian obliquity (25.2°), P is the duration of the Martian solar day (88775 s), t is any time measured from local noon, and  $F_{1.52}$  is the flux at the average Sun-Mars distance[Vicente-Retortillo2015ASurface].

While the separation of the aerocentric longitude and hourly time dimensions was helpful in indexing our grid, these two dimensions are related. For any aerocentric longitude index, there are 13 time points, and as these times correspond to movement of Mars around the sun, so does the aerocentric longitude. Therefore, when computing the TOA flux  $F_0$ , we updated  $L_s$  to correspond to the change in time t using the build in functions Ls2Sol and Sol2Ls from the MCD package. These functions relate  $L_s$  and t through Kepler's Problem via

$$L_{s} = \left(\nu \frac{180}{\pi} + L_{s,p}\right) (mod360)$$
(11.3)

$$\nu = 2 \arctan\left[\sqrt{\frac{1+e}{1-e}} \tan\left(\frac{E}{2}\right)\right] \tag{11.4}$$

$$M = E - e \sin E = 2\pi \frac{D_s - t_p}{N_s}$$
(11.5)

where  $D_s$  is the sol number,  $t_{peri}$  is the time at perihelion,  $N_s$  is the number of sols in a Martian year,  $\nu$  is the true anomaly, E is the eccentric anomaly, M is the mean anomaly, and  $N_s$  is the number of sols in a Martian year.

The data variables shown in Figure S3 were then added to the grid for downstream use as shown in Table S5.

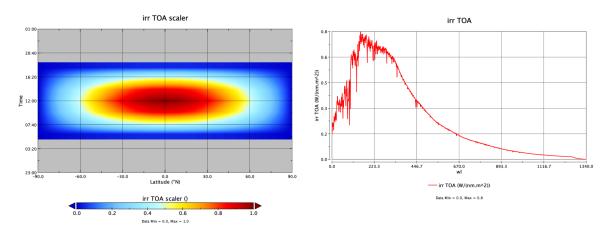


Figure S3: Left shows the calculated mu parameter as a scalar across geospace for  $L_s = 0$ . Right shows the spectral flux for lat=0, t=12 noon, and  $L_s = 0$ .

As a sanity check, we calculated the integrated standard solar flux at TOA at 1.52 AU (average Sun-Mars distance) at 576.92 W/m<sup>2</sup>. Given a solar constant for Mars is 490 W/m<sup>2</sup>, the equatorial annual-mean flux at the top of the atmosphere (TOA) should be  $\sim 156 \text{ W/m^2}$ . Our calculated equatorial annual-mean TOA flux was found to be 159.43 W/m<sup>2</sup> which differs by  $\sim 1.5\%$  from the theoretical value. We extended this calculation across all latitudes as shown in Figure S4 to confirm our methods.

Variable	Units	Dimensions	Dimension Number
Solar Zenith Angle	$\deg$	lat, ls, hr	3
Solar Correction	None	lat, ls, hr	3
Top of Atmosphere Irradiance	$\mathrm{W}/(\mathrm{nm.m^2})$	lat, ls, hr, wl	5

Table S5: Initial solar grid variables.

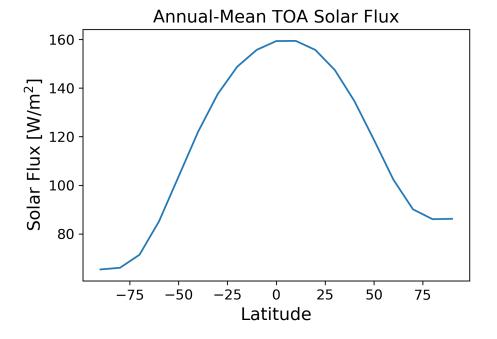


Figure S4: Calculated Annual-Mean TOA Solar Flux distributed across Latitude

#### **Radiative Transfer Calculations**

#### libRadtran

The radiative transfer calculations were carried out using the libRadtran library (version 2.0.4)[358, 161]. libRadtran is a collection of C and Fortran functions and programs for calculation of solar and thermal radiation in the Earth's atmosphere and is freely available under the GNU General Public License at http://www.libradtran.org/doku.php.

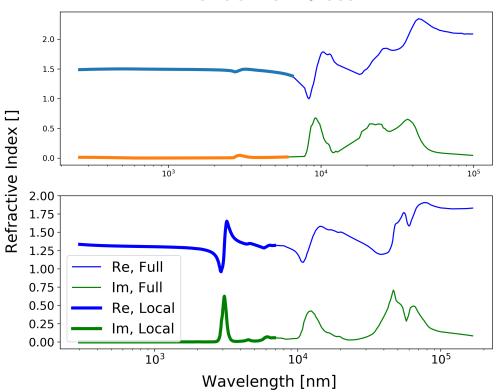
#### **Mie Scattering Calculations**

The presence of dust and cloud particles in the Martian atmosphere affect the propagation of sunlight. The size of such dust and cloud particles falls within the Mie scattering range. The libRadtran package was used for Mie scattering calculations of the scattering phase matrices and corresponding Legendre polynomials [568]. Input files for both dust and ice were constructed (Listing 11.1) and fed to the MIEVO tool.

```
1 mie_program MIEVO # Select Mie code by Wiscombe
2 basename cloud.
3 refrac file MieCloudRefrac.DAT# Use refractive index file
4 r_eff 0.00322766 100.1 10.0 # Specify effective radius grid
5 distribution lognormal 1.8903 # Specify lognormal size distribution
6 nstokes 1 # Calculate all phase matrix elements
7 nmom 6000 # Number of Legendre terms to be computed
8 nthetamax 2000 # Maximum number of scattering angles to be
9 output_user netcdf # Write output to netcdf file
10 verbose # Print verbose output
```

Listing 11.1: Input file for Mie calculations of cloud aerosols

Refractive indices for dust and ice were sourced from NASA Ames Legacy Mars Global Climate Model[207] (available at https://github.com/nasa/legacy-mars-global-climate-model) and fed as input (Figure S5).



**Refractive Indices** 

Figure S5: Refractive Indices for Dust (top) and Clouds (Bottom).

For clouds, an effective radius  $r_{\rm eff}$  grid was set between 0.00322766 and 100.1  $\mu$ m in steps of 10  $\mu$ m and with a lognormal distribution with standard deviation  $\sigma = 1.8903$  described as

$$n(r) = \frac{a}{r} \exp\left(-\frac{1}{2} \left(\frac{\ln(r)\ln(r_0)}{\ln\sigma}\right)^2\right)$$
(11.6)

where  $r_0$  is the logarithmic mode of the distribution, calculated from  $r_{\text{eff}}$ . Through a series of trial-and-error attempts, we specified additional parameters for clouds such as the number of phase matrix elements set at 1, the number of Legendre terms to be computed set at 6000, the maximum number of scattering angles set to 2000. The resulting output from MIEVO was a .netCDF file of ~100 MB.

For dust, an effective radius  $r_{\rm eff}$  grid was set between 0.00310352 and 10.1  $\mu$ m in steps of 1.0  $\mu$ m and with a lognormal distribution with standard deviation  $\sigma = 1.3616$ . Again, through a series of trial-and-error attempts, we specified additional parameters for dust such as the number of phase matrix elements set at 1, the number of Legendre terms to be computed set at 2500, the maximum number of scattering angles set to 2000. The dust calculations provided more computationally expensive than those for clouds due to the smaller  $r_{\rm eff}$  grid size. The resulting output from MIEVO was a .netCDF file of ~10 MB.

The output .netCDF files include the dimensions and variables in Table S6 and a sample of the output variables are shown in Figure S6.

#### uvspec

The uvspec program was designed to calculate the radiation field of the atmosphere for Earth. Modifications were carried out such that uvspec could be leveraged for similar calculations of the Martian radiative transfer. Input to the model are the constituents of the atmosphere including various molecules, aerosols and clouds. The absorption and scattering properties of these constituents were calculated via the MIEVO tool. Boundary conditions are the solar spectrum at the top of the atmosphere and the reflecting surface at the bottom[359]. The uvspec program was called for each point in the geotemporal grid and provided with a custom, programmatically generated input file – an example of which is shown in Listing 11.2.

```
1 # libRadtran Calc test
2 wavelength 300.5 4000 # choose wavelength range for computation
3 atmosphere_file __2WKSII17KGatmos.DAT # load atmosphere profile
4 mixing_ratio CH4 0.0 # update null mixing ratios
5 mixing_ratio N20 0.0
6 mixing_ratio F11 0.0
7 mixing_ratio F12 0.0
8 mixing_ratio F22 0.0
9 altitude -0.48425 # specify altitude above datum
10 source solar __2WKSII17KGflux.DAT # load solar profile
11 # corrected for Sun-Mars Distance
```

Name	Description	Dim/Var	Unit
nlam	Wavelength Number	Dim	-
nmommax	Legendre Polynomial Number	Dim	-
nphamat	Phase Matrix Element Number	Dim	-
nreff	Refractive Index Number	Dim	-
nthetamax	Theta Max Number	Dim	-
nrho	Density Number	Dim	-
wavelen	Wavelength	Var	micrometer
reff	Effective radius	Var	micrometer
ntheta	Number of scattering angles	Var	-
theta	Theta Max Number	Var	degrees
phase	phase	Var	-
nmom	number of Legendre polynomials	Var	-
pmom	Legendre polynomials	Var	including factor $2^{l+1}$
ext	extinction coefficient	Var	$km^{-1}/(g/m^{3})$
ssa	single scattering albedo	Var	-
gg	Asymmetry factor	Var	-
refre	refractive index (real)	Var	-
refim	refractive index (imaginary)	Var	-
rho	density of medium	Var	$ m g/cm^3$

Table S6: Dimensions and variables in .netCDF Mie output file.

Listing 11.2: Sample input file for uvspec calculation

Due to the peculiar way uvspec must be called, input for atmosphere, solar flux, dust conditions, and cloud conditions are required in the form of text-based .DAT files. Because multiple uvspec calls were carried out in parallel, a random string was generated ("2WKSII17KG" in the case of Listing 11.2) and used to identify specific .DAT files. For each point of the grid, an

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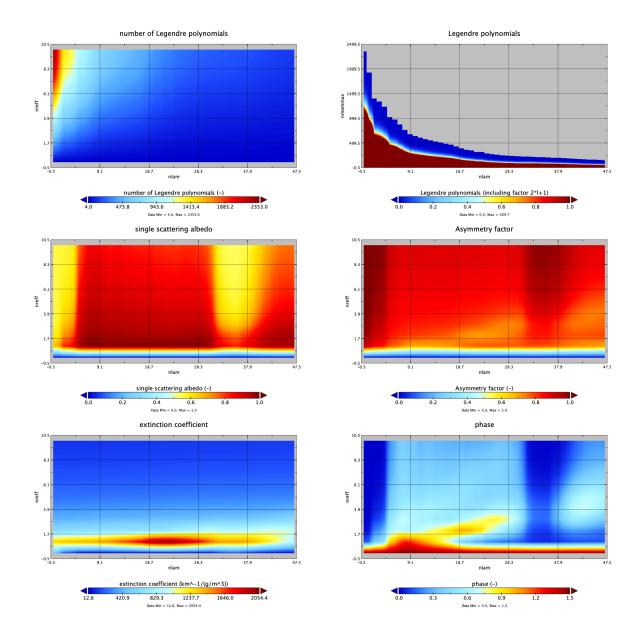


Figure S6: Sample Visualization of variables in .netCDF Mie output file for dust.

input .INP file was created along with correspond .DAT files for atmosphere, solar flux, dust conditions, and cloud conditions. The atmosphere file contained the altitude above sea level in km, pressure in hPa, temperature in K, air density in cm<sup>-3</sup>, ozone density in cm<sup>-3</sup>, Oxygen density in cm<sup>-3</sup>, water vapor density in cm<sup>-3</sup>, CO<sub>2</sub> density in cm<sup>-3</sup>, and NO<sub>2</sub> density in cm<sup>-3</sup>. The dust and cloud aerosol files contained altitude above sea level in km, dust/cloud content in kg/kg, and effective radius in  $\mu$ m. The solar flux file contains the wavelength in nm and the spectral flux for that wavelength in mW/(m<sup>2</sup>nm). Data for each of these files

was sourced from the MCD data organized in the Stupidgrid.nc file and converted to the appropriate units using functions in the redSun codebase.

The wavelength range was set from 300.5 to 4000 nm. This range was selected to match available data for solar flux and significance to downstream photovoltaic calculations. Wavelengths outside these bounds were found to have negligible impact on bandgap calculations or to require substantial computational efforts, and were thus ignored. The mixing ratios for atmospheric  $CH_4$ , N<sub>2</sub>O, and greenhouse gases (GHG) F11, F12, and F22 were set to 0.0 to reflect the change from Earth to Mars conditions. The altitude for the location was also programmatically added to the input file to specify the exact position of the surface in relationship to the Martian datum. The filenames from the Mie scattering calculations for dust and cloud aerosols were passed as well. The radius of the planet was changed to the Martian value of 3389.5 km. The albedo of the grid-point was also provided programmatically.

We selected the DIScrete ORdinate Radiative Transfer solvers (pseudospherical disort) radiative transfer solver for our calculations using 6 streams. The discrete ordinate method was first developed in 1960 with significant updates in 1988 and 2000 and offer 1D calculations of radiance, irradiance, and actinic flux. We opted for pseudo-spherical methods to offset any spherical effects associated with using the smaller Martian geometry. In pseudo-spherical calculations, the monochromatic radiative transfer equation in 1D can be formulated as

$$\mu \frac{dI(\tau,\mu,\phi)}{\beta^{\text{ext}}d\tau} = I(\tau,\mu,\phi) - \frac{\omega(r)}{4\pi} \int_0^{2\pi} d\phi' \int_{-1}^1 d\mu' p(\tau,\mu,\phi;\mu',\phi') I(\tau,\mu',\phi') - (1-\omega(r))B[T(r)] - \frac{\omega(\tau)I^0}{4\pi} p(\tau,\mu',\phi') I(\tau,\mu',\phi') - (1-\omega(r))B[T(r)] - \frac{\omega(\tau)I^0}{4\pi} p(\tau,\mu',\phi') I(\tau,\mu',\phi') - (1-\omega(r))B[T(r)] - \frac{\omega(\tau,\mu',\phi')}{4\pi} p(\tau,\mu',\phi') I(\tau,\mu',\phi') - (1-\omega(r))B[T(r)] - (1-\omega$$

where B[T(r)] is the Planck function,  $\beta$  is an extinction coefficient,  $\mu_0$  is the solar zenith angle,  $\phi_0$  is the azimuth angle, p is the phase function, and the single scattering albedo  $\omega(r)$ is

$$\omega(r) = \omega(r, \nu) = \frac{\beta^{\text{sca}}(r, \nu)}{\beta^{\text{ext}}(r, \nu)}$$
(11.8)

Additionally,  $f_{ch}$  is the Chapman function[451, 131] for describing the extinction path in a spherical atmosphere and is formulated as

$$f_{ch}(r_0,\mu_0) = \int_{r_0}^{\infty} \frac{\beta^{\text{ext}}(r,\nu)dr}{\sqrt{1 - \left(\frac{R+r_0}{R+r}\right)^2 (1 - \mu_0^2)}}$$
(11.9)

where R is the planet radius and  $r_0$  is the distance above the atmosphere.

The output of each uvspec call was a text-like file that was indexed with a matching random string identifier. Each file consisted of the direct, global, diffuse downward, diffuse upward, net and sum irradiance in  $mW/(m^2nm)$  for each nm in the input flux file. The output file was then read back with additional functions from redSun for use in downstream calculations.

#### Photovoltaic Power and Photoelectrochemical Commodity Calculations

We use the detailed balance model to calculate the energy efficiency of one-, two-, and threebandgap photovoltaic solar cells and one- and two-bandgap photoelectrochemical devices. This model has been used to calculate the limiting efficiency of ideal photovoltaic and photoelectrochemical devices for single and multiple bandgap architectures previously[211, 146, 239].

The current density (J)-voltage (V) dependence  $J(V, E_g)$  for a single bandgap is given by

$$J(V, E_g) = J_G(E_g) + J_R(V, E_g)$$
(11.10)

where  $J_G$  is the photogeneration current,  $J_R$  is the recombination current due to radiative recombination, and  $E_g$  is the bandgap of the absorber material. The generation current  $J_G$ is calculated according to

$$J_G(E_g) = q \int_{E_g}^{E_{\max}} \Gamma(E) dE$$
(11.11)

where q is the electronic charge,  $\Gamma(E)$  is the photon flux at a given photon energy E, and  $E_{\text{max}}$  is maximum photon energy in the solar spectrum. We used a minimum wavelength of 300 nm in our calculations, corresponding to a maximum photon energy of ~4.14 eV because photons above 4 eV contribute negligibly to the photon flux[211]. The recombination current density  $J_R$  is calculated according to

$$J_R(V, E_g) = \frac{2\pi q}{c^2 h^3} \int_{E_g}^{\infty} \frac{E^2}{\exp\left(\frac{E - qV}{kT}\right) - 1} dE$$
(11.12)

where c is the speed of light in vacuum, h is Planck's constant, k is Boltzmann's constant, and T is the temperature of the device (we assume the local surface temperature in these calculations).

The photovoltaic energy efficiency  $\eta_{PV}$  at a given operating voltage is written as

$$\eta_{\rm PV}(V, E_g) = \frac{V}{F} J(V, E_g) \tag{11.13}$$

where F is the calculated total power flux at the Martian surface. The operating voltage can then be selected to maximize the efficiency for a given bandgap. In technoeconomic calculations (see below), we assume the device efficiency is 80% of the calculated detailed balance limit to account for absorber material and device inefficiencies (i.e., nonradiative recombination losses not captured by the detailed balance limit).

The photoelectrochemical device energy efficiency  $\eta_{\text{PEC}}$  is given by

$$\eta_{\text{PEC}}(V, E_g) = \frac{E^0}{F} J(V, E_g)$$
 (11.14)

where  $E^0$  is the minimum thermodynamic potential required to drive the electrochemical reaction (1.23 V for H<sub>2</sub> generation from water splitting). In practical devices, the operating voltage of the photoelectrochemical device will be larger than  $E^0$  to account for anode and cathode overpotentials and resistive potential drop in the electrolyte and electrodes. Hence, for these devices the operating voltage is

$$V = E^0 + V_o (11.15)$$

where  $V_o$  is the overpotential associated with the above-mentioned losses. In all technoeconomic calculations (see below) we assume the overvoltage is 700 mV, corresponding to a practical minimum that also accounts for absorber material inefficiencies (*i.e.*, nonradiative recombination losses not captured by the detailed balance limit)[146].

For two- and three-bandgap tandem devices, we assume the absorber layers are connected optically and electronically in series. Generation and recombination currents are calculated as described above, with the modification that  $E_{\max}$  is substituted with  $E_{g,n-1}$  for absorber n (counted sequentially starting with the top absorber) to reflect the assumption that each absorber layer is optically thick (i.e., absorbs all the above-bandgap light incident on its surface). In tandem devices, the total current density must be equal in each absorber layer, while the total operating voltage is given by the sum of the voltages developed across each cell. For example, for a three-absorber photovoltaic device

$$J(V) = J_1(V_1, E_{g,1}) = J_2(V_2, E_{g,2}) = J_3(V_3, E_{g,3})$$
(11.16)

$$V = V_1 + V_2 + V_3 \tag{11.17}$$

For tandem devices, the efficiency is calculated analogously to the single-junction devices but as a function of each absorber bandgap.

#### Grid Calculations via Parallel Computing

#### SinglePoint Calculation

The calculation of a single gridpoint's spectral flux (via libRadtran) and the corresponding photovoltaic and photoelectrochemical production quantities ran for  $\sim 5$  minutes. Given the grid of 228475 geotemporalspatial points composed of 19 points of 10° latitude × 37 points of 10° longitude × 25 points of 15° areocentric longitude × 13 points of 2 (Martian) hours, a serial calculation would require 2.17 years. Wanting to avoid that lengthy calculation, we opted for an "embarrassingly parallel" computing method shown in Figure S7. Since our computations require some initial or final communication (generally in the distribution and collection of data, then we call it nearly embarrassingly parallel. In parallel computing, an embarrassingly parallel workload or problem is one where little or no effort is needed to separate the problem into a number of parallel tasks. This is often the case where there is little or no dependency or need for communication between those parallel tasks, or for results between them. In the ideal case, all the sub-problems or tasks are defined before

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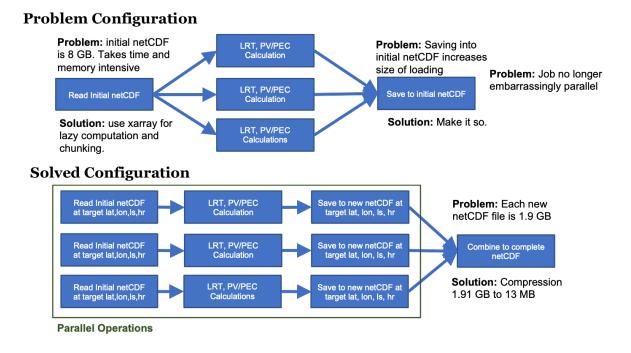


Figure S7: Initial (problem) and final (solution) configurations for the RedSun software on the UC Berkeley cluster.

the computations begin and all the sub-solutions are stored in independent memory locations (variables, array elements). Thus, the computation of the sub-solutions is completely independent<sup>1</sup>.

Files were not constructed for grid-points that did not receive sunlight, and so the result was the storage of  $\sim 150$ k .netCDF files, each with a size of  $\sim 4-5$  MB.

#### Stitching

The  $\sim 150$ k singlepoint .netCDF files were initially stitched across time dimensions of hours and areocentric longitude to produce  $\sim 700$  time series .netCDF files, each for a different pair of latitudes and longitudes using the tcsh scripts provided in Listing 11.3 and 11.4.

Listing 11.3: Stitching Algorithm Part 1: Create Dynamic Links

```
1 #!/bin/tcsh -f
2 set lat = minimum_lat_value
3 set lon = minimum_lon_value
4 while ($lat <= maximum_lat_value)</pre>
      set latv = 'echo $lat | awk '{printf("%02d\n",$1)}''
5
6
      while ($lon <= maximum_lon_value)</pre>
              set lonv = 'echo $lon | awk '{printf("%02d\n",$1)}''
\overline{7}
              ncecat ttlrecall_*_{$lonv}_{$latv}.nc redsun_timeseries_{$lonv}
8
      _{$latv}.nc
9
              echo "Done: " $lonv $latv
10 @ lon++
       end
11
12 @ lat++
13 end
```

Listing 11.4: Stitching Algorithm Part 2: Assemble into Time Series

#### **Production Mapping**

The resultant timeseries .netCDF files were then used for constructing the final maps of PV and PEC production. For each time series .netCDF file, we began by calculating PV power P and PEC production rate  $\dot{m}$  via

$$P = \Gamma \eta_{\rm pv} \tag{11.18}$$

$$\dot{m_c} = \epsilon_c \Gamma \eta_{\rm pec} = \frac{Z_c}{n_c V_c F} \Gamma \eta_{\rm pec}$$
(11.19)

where  $\Gamma$  is the solar flux in W/m<sup>2</sup> sourced from the MCD data in StupidGrid.nc,  $\epsilon$  is the electrochemical equivalency factor,  $\eta$  is the calculated PV/PEC efficiency, Z is the molar mass, n is the number of moles of electrons required to make one mole of the product, F is the Faraday constant, and V is the voltage. The c term corresponds to the chemical of interest in the set of H<sub>2</sub>, NH<sub>3</sub>, and AA. The values used to produce the  $\epsilon$  for each chemical is given in Table S7.

Chemical	n	Ζ	V
$H_2$	2	2.016	1.23
$NH_3$	6	17.031	1.17
AA	8	60.052	1.09

 Table S7: Electrochemical equivalency factor parameters.

We calculated the optimal sol-averaged 3-junction PV  $P_{opt}$  and 2-junction PEC  $\dot{m}_{copt}$ 

across all bandgap combinations given the form

$$P_{\text{opt}} = \max\left(\frac{1}{N} \int_{t_2} \int_{t_1} P_{ijk} dt_1 dt_2 : \forall i, j, k \in B_1, B_2, B_3\right)$$
(11.20)

$$\dot{m}_{c,opt} = \max\left(\frac{1}{N} \int_{t_2} \int_{t_1} \dot{m}_{c,ij} dt_1 dt_2 : \forall i, j \in B_1, B_2\right)$$
(11.21)

where i, j, k are indices of bandgaps  $B_1, B_2, B_3, t_1$  is the time variable across a sol (~24.616 hrs/sol), and  $t_2$  is the time variable across a Martian year given as N = 688 sols/year.

Computationally, we began by converting our  $L_s$  values to the sol number using an inverted Kepler problem with a function 1s2sol shown in Listing 11.5.

```
1 def ls2sol(ls):
      N_s = 668.6
\mathbf{2}
       ls_peri = 250.99
3
       t_{peri} = 485.35
4
      a = 1.52368
5
6
      e = 0.09340
7
       epsilon = 25.1919
      if (ls == 0).any():
8
           ls = .01
9
      nu = np.radians(ls) + 1.90258
10
11
      E = np.arctan((np.tan(nu/2))/(np.sqrt((1+e)/(1-e))))*2
      M = E - e*np.sin(E)
12
      Ds = (M/(2*np.pi))*N_s + t_peri
13
       if (Ds < 0).any():
14
           Ds = Ds + N_s
15
16
      if (Ds > N_s).any():
17
           Ds = Ds - N_s
      return(Ds)
18
```

**Listing 11.5:** Function for converting  $L_s$  to sol number

The computational instance of calculations for  $2J H_2$  production is provided in Listing 11.6.

```
1 def point_loop(file):
      sg = xr.open_dataset('StupidGridFull.nc', group='flux')
2
3
      ds = xr.open_dataset(file)
      lat = ds['lat'][0]
4
      lon = ds['lon'][0]
5
      G = np.zeros(len(ds['lon']))
6
7
      for ri in range(0,len(ds['lon'])):
          ls = ds['ls'][ri]
8
9
          hr = ds['hr'][ri]
          G[ri] = sg['flux_dw_sw'][lat,lon,ls,hr]
10
      lss = np.unique(ds['ls'])
11
12
      Z = 2.016
      n = 2
13
      F = 96485.33212
14
```

```
V = 1.23
15
       sg = 0
16
       sols = np.zeros(len(lss))
17
18
       for i in range(0,len(lss)):
           sols[i] = ls2sol(lss[i]*15)
19
      hrs = np.arange(0, 25, 2)
20
21
      vals = np.zeros(13)
       try:
22
           P = G[:, np.newaxis, np.newaxis] * ds['j2_etaPEC_H2_2bg'] * 0.01 *
23
       Z/(n*F*V)
24
           zz = np.zeros((len(lss), len(ds['j2-bg1']), len(ds['j2-bg2'])))
           for i in range(0,len(lss)):
25
               hr_int = np.where(ds['ls']==lss[i])
26
               inds = np.array(ds['hr'][hr_int])
27
28
               for j in range(0,len(ds['j2-bg1'])):
                   for k in range(0,len(ds['j2-bg2'])):
29
                        y = P[:,j,k][hr_int]
30
                        for m in range(0,len(inds)):
31
                            vals[inds[m]] = y[m]
32
33
                        z = np.trapz(vals*60*60,x=hrs*1.02569)
                        zz[i,j,k] = z
34
           z = np.zeros((len(ds['j2-bg1']), len(ds['j2-bg2'])))
35
36
           for j in range(0,len(ds['j2-bg1'])):
               for k in range(0,len(ds['j2-bg2'])):
37
                   y = zz[:,j,k]
38
                   z[j,k] = np.trapz(y,x=sols)
39
           j2h2 = np.max(z)
40
           j2h2i = np.unravel_index(np.argmax(z),np.shape(z), order='C')
41
           h2 = j2h2 * (1/688)
42
           bg1 = ds['j2-bg1'][j2h2i[0]]
43
           bg2 = ds['j2-bg2'][j2h2i[1]]
44
           return([[lat,lon,0],[h2,bg1,bg2]])
45
```

Listing 11.6: Function for calculating the optimal H<sub>2</sub> production rate

The results from the calculation of the optimal sol-averaged 3-junction PV  $P_{opt}$  and 2-junction PEC  $\dot{m}_{copt}$  and their corresponding bandgap combination were again saved as .netCDF files with dimensions of latitude and longitude.

The resulting PV power and PEC production for  $H_2$  is provided in Figure S8-S10 with the corresponding Bandgaps distributions over the Martian grid. The distribution of bandgaps are provided in Figure S11.

#### **Missing Location Values**

We were able to complete the calculations for  $\sim 97\%$  of the 228475 geospatial points across the Martian grid. We found that  $\sim 6000$  of these points could not be completed due to a number of issues our method of using libRadtran for Mars-based calculations. Upon inspection, we found that the missing values were generally concentrated in areas with very low elevation below the Martian datum. Further inspection confirmed that the issues in

Commodity	Best efficiency at averaged solar noon	Best production over a year
	Top: 1.77 eV	Top: 1.83 eV
Power (PV, 3-junction)	Middle: 1.16 eV	Middle: 1.16 eV
	Bottom: 0.72 eV	Bottom: 0. 67 eV $\mid$
$H_2$ (PEC, 2-junction)	Top: 1.64 eV	Top: 1.77 eV
	Bottom: $0.95 \text{ eV}$	Bottom: $0.83 \text{ eV}$

Table S8: Comparison of optimal bandgaps for different optimization strategies

resolving the radiative transfer were caused by errors in interpolation by the solver for the gas concentrations below the datum. However, these  $\sim 2\%$  of missing values do not prevent us from offering a meaningful analysis.

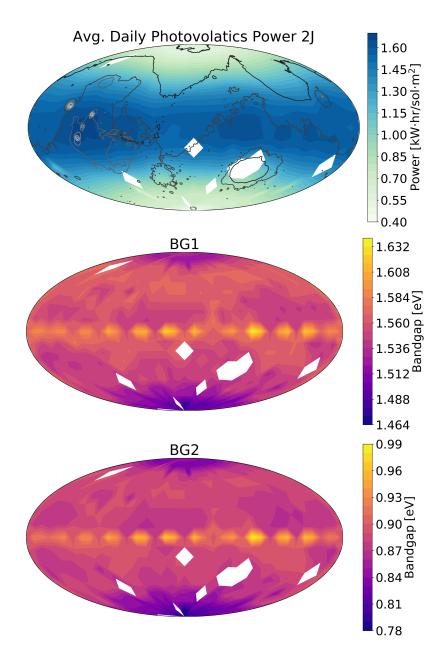


Figure S8: Two Junction Photovoltaic Power Production and Optimal Bandgaps distributed over the Martian Grid

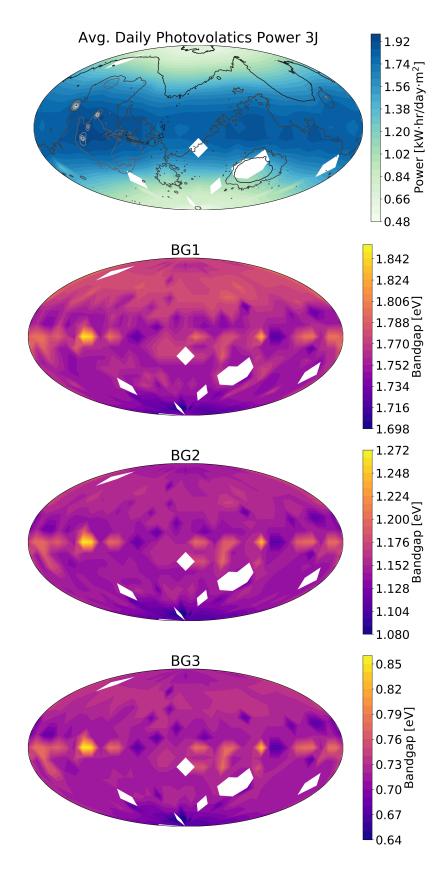


Figure S9: Three Junction Photovoltaic Power Production and Optimal Bandgaps distributed over the Martian Grid

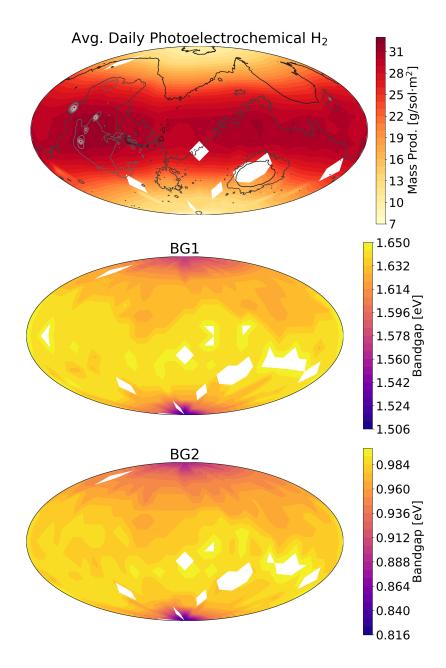


Figure S10: Two Junction Photoelectrochemical  $H_2$  Production and Optimal Bandgaps distributed over the Martian Grid

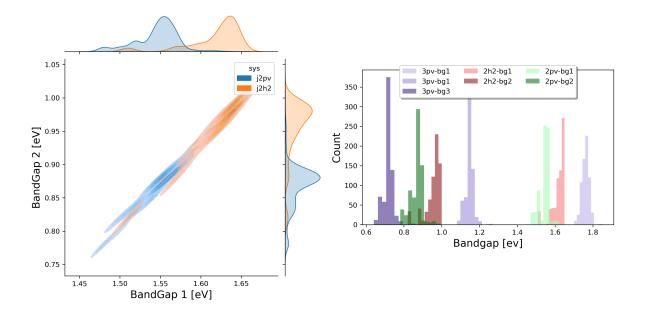


Figure S11: Optimal Bandgap Distributions.

#### **Technoeconomic Calculations**

#### **Primary Power and Energy Demands**

We consider four different power production and energy storage scenarios for comparison (Fig. S12): (1) Nuclear power generation with the Kilopower system; (2) Photovoltaic power generation with battery energy storage; (3) Photovoltaic power generation with compressed  $H_2$  energy storage, and (4) Photoelectrochemical  $H_2$  generation with compressed  $H_2$  energy storage.

In all cases, power and/or energy demand is driven by continuous power required for habitat operations, including lighting, heating/cooling, pressurization, power draw for ISRU processes, and power draw for rover travel, and by materials demand for ISRU manufacturing. We assume that ammonia, methane, and plastics are produced using  $H_2$  as the starting material (along with N<sub>2</sub> and CO<sub>2</sub> sourced from the atmosphere), which we use to calculate power demands based on water electrolysis to produce  $H_2$ . We note that methane could be diverted for bioprocess production (dashed lines in Fig. S12), although we don't explicitly consider this scenario here since it would not change the relative mass requirements of the four systems we consider.

To compare the carry-along mass necessary for each system, we include the mass of elements unique to or uniquely sized for a given energy supply scenario. For example, we consider the mass of photovoltaic cells because the area of cells necessary to power the habitat and ISRU manufacturing will be different depending on the strategy for energy storage. However, we don't include the mass of the Sabatier reactor for methane production, since this mass will be equivalent regardless of the upstream processes producing  $H_2$  and

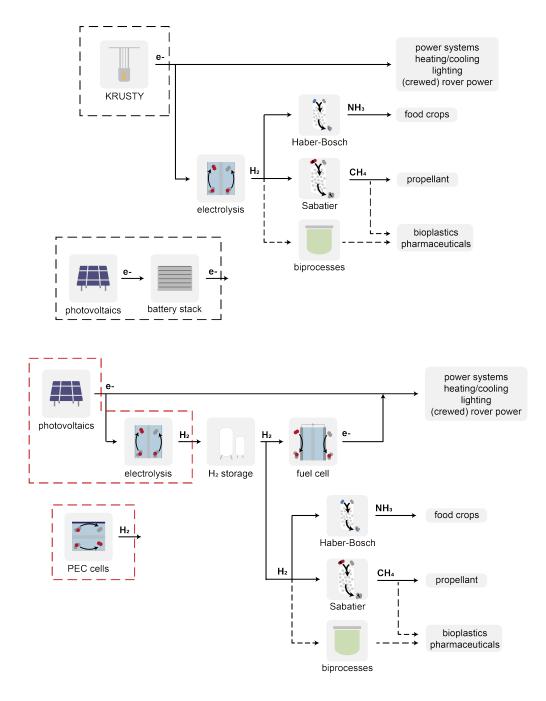


Figure S12: Power generation systems options. Habitat power systems and ammonia, propellant, and bioplastics production can be powered by nuclear power generation (KRUSTY), photovoltaics with battery storage (PV+B), photovoltaics with H2 energy storage from hydrolysis (PV+E), or photoelectrochemical H2 generation and storage (PEC).

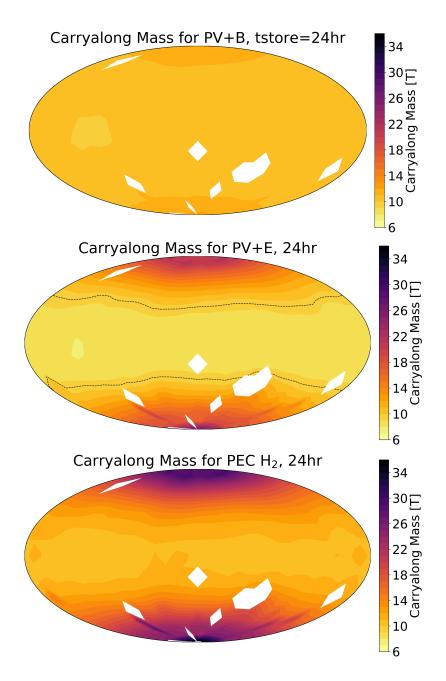


Figure S13: Carry-along mass for different power generation scenarios. Carry-along mass across the Martian surface for PV+B, PV+E, and PEC power generation systems. PV+B and PEC systems cannot reach parity with nuclear power generation in terms of carry along mass (no locations at which the projected mass of the PV+B or PEC systems is less than the projected mass of the nuclear system).

collecting  $CO_2$  from the atmosphere. In this way, we can determine the mass contributions only of the uniquely necessary components for each energy supply scenario. The carry along masses are provided in Figure S13.

#### **Nuclear Power**

Power derived from the Kilopower nuclear reactor system is fed directly to habitat power systems and to an electrolyzer producing  $H_2$  for ISRU manufacturing. Hence, the power draw is given by:

$$P_{\rm K} = P_{\rm Hab} + \alpha_{\rm E} \left( \dot{N} \alpha_{\rm HB} + \dot{M} \alpha_{\rm S} + \dot{B} \alpha_{\rm HB} \right) \tag{11.22}$$

$$P_{\rm K} = P_{\rm Hab} + \alpha_{\rm E}\Lambda \tag{11.23}$$

where  $P_{\rm K}$  is the total power draw for Kilopower nuclear reactor system,  $P_{\rm Hab}$  is the power draw for the habitat,  $\alpha_{\rm E}$  is the energy demand per unit of H<sub>2</sub> produced for the electrolyzer,  $\dot{N}$  is the ammonia demand rate,  $\dot{M}$  is the methane demand rate,  $\dot{B}$  is the bioplastic demand rate, and  $\alpha_i$  is the conversion factor between, e.g., the ammonia demand rate and the H<sub>2</sub> demand rate for the Haber-Bosch process. We also define  $\Lambda = \dot{N}\alpha_{\rm HB} + \dot{M}\alpha_{\rm S} + \dot{B}\alpha_{\rm HB}$ .

The carry-along mass requirements for this scenario is given by

$$M_{\rm K} = \frac{P_{\rm K}}{p_{\rm K}} + \frac{\Lambda}{p_{\rm E}} \tag{11.24}$$

where  $p_{\rm K}$  is the specific power of the Kilopower reactor (6.25 W/kg) and  $p_{\rm E}$  is the specific productivity of the electrolyzer (kg H<sub>2</sub>/h/kg).

#### Photovoltaic power with battery energy storage (PV+B)

Power generated by photovoltaic cells can be transferred either directly to power-drawing systems (habitat systems, water electrolysis) or diverted to battery stacks for storage to enable continuous operation either at night or during low-sunlight days (due to high dust conditions). We define the fraction of power supplied directly to power systems as  $\chi$ , which, for photovoltaic systems, can be thought of as the fraction of the day that solar cells produce equal or more power than what is consumed by power-drawing systems. Unless otherwise stated, we assume in our calculations  $\chi = 1/3$ . Hence, the total power draw for the PV+B system is given by:

$$P_{\rm PV+B} = \chi P_{\rm Hab} + \frac{1-\chi}{\eta_{\rm B}} P_{\rm Hab} + \chi \alpha_{\rm E} \Lambda + \frac{1-\chi}{\eta_{\rm B}} \alpha_{\rm E} \Lambda$$
(11.25)

where  $P_{PV+B}$  is the total power draw for the PV+B system and  $\eta_B$  is the energy efficiency of the battery storage system. More compactly,

$$P_{\rm PV+B} = \left(\chi + \frac{1-\chi}{\eta_{\rm B}}\right) \left(P_{\rm Hab} + \alpha_{\rm E}\Lambda\right) \tag{11.26}$$

The carry-along mass required for the PV+B scenario is given by

$$M_{\rm PV+B} = \frac{P_{\rm PV+B}}{p_{\rm PV}} + \frac{(P_{\rm Hab} + \alpha_{\rm E}\Lambda)}{e_{\rm B}} t_{\rm store} + \frac{\Lambda}{p_{\rm E}}$$
(11.27)

where  $p_{\rm PV}$  is the specific power of photovoltaic cells,  $t_{\rm store}$  is the desired back-up power availability time, and  $e_{\rm B}$  is the specific energy of the battery stack (units of energy per mass).

Parameter	Value	Unit	Reference
Power and	Material De	emands	
$P_{\mathrm{Hab}}$	40	kW	Note 11.2
$\dot{N}$	$8.33 \times 10^{-3}$	$\rm kg \ h^{-1}$	Note <b>11.2</b>
$\dot{M}$	0.61	$\rm kg \ h^{-1}$	Note 11.2
<i>B</i>	0.1	$\rm kg~h^{-1}$	Note 11.2
Conversion	1 Factors		
$\alpha_{ m HB}$	0.196	$kgH_2 kgNH_3^{-1}$	Note 11.2
$\alpha_{ m S}$	0.554	$kgH_2 kgCH_4^{-1}$	Note <b>11.2</b>
$\alpha_{ m BP}$	0.155	$kgH_2 kgAA^{-1}$	Note <b>11.2</b>
$lpha_{ m E}$	54.13	kWh $kgH_2^{-1}$	Note 11.2
$lpha_{ m FC}$	0.064	$kgH_2 kWh^{-1}$	Note 11.2
$lpha_{ m HS}$	3.39	kWh $kgH_2^{-1}$	Note 11.2
Power[212]	and Energy	Density[159]	
$p_{\rm K}$	$6.25 \times 10^{-3}$	$kW kg^{-1}$	Note 11.2
$\eta_{ m B}$	80	%	Note 11.2
$p_{ m E}$	$1.14 \times 10^{-2}$	$kgH_2 h^{-1} kg^{-1}$	Note 11.2
$e_{\rm B}$	0.16	kWh $kg^{-1}$	Note 11.2
$p_{ m FC}$	0.365	$\rm kW~kg^{-1}$	Note 11.2
$e_{\mathrm{HS}}$	$7.18 \times 10^{-2}$	$kgH_2 kg^{-1}$	Note 11.2
Solar Cell	Array Mess		
$\overline{M_{\rm PV}}$	2	$\rm kg \ m^{-2}$	Note 11.2
$M_{\rm PEC}$	2.4	$ m kg~m^{-2}$	Note 11.2
	Other 1	Parameters	
$\overline{\chi}$	0.33	_	Assumed
$t_{\rm store}$	24.6	h	Assumed

Table S9: Additional  $\mathrm{PV}/\mathrm{Power}$  Parameters and Conversion Factors.

#### Photovoltaic power with $H_2$ energy storage

In this scenario, power generated by photovoltaic cells can either be directly fed to habitat systems or to an electrolyzer, which produces  $H_2$  for consumption in ISRU manufacturing and for consumption by fuel cells the supply power to the habitat and other demands when direct power cannot (e.g., at night). Here, the total power demand for the system is given by

$$P_{\rm PV+E} = \chi P_{\rm Hab} + \alpha_{\rm E} \dot{m}_{\rm H_2} \tag{11.28}$$

where  $P_{\text{PV+E}}$  is the total power draw for the PV+E system and  $\dot{m}_{\text{H}_2}$  is the flow rate of H<sub>2</sub> necessary to support the remaining system requirements. This flow rate is written as

$$\dot{m}_{\rm H_2} = \frac{(1-\chi)P_{\rm Hab}\alpha_{\rm FC} + \Lambda}{1-\alpha_{\rm HS}\alpha_{\rm FC}}$$
(11.29)

where  $\alpha_{FC}$  is the H<sub>2</sub> consumed per unit of energy produced by the fuel cell and  $\alpha_{HS}$  is the energy consumed per unit of H<sub>2</sub> stored by the H<sub>2</sub> storage tanks (driven by compression of H<sub>2</sub>).

The carry-along mass required for the PV+E scenario is given by

$$M_{\rm PV+E} = \frac{P_{\rm PV+E}}{p_{\rm PV}} + \frac{\dot{m}_{\rm H_2}}{p_{\rm E}} + \frac{P_{\rm Hab} + \alpha_{\rm HS} \dot{m}_{\rm H_2}}{p_{\rm FC}} + \frac{(P_{\rm Hab} \alpha_{\rm FC} + \Lambda) t_{\rm store}}{e_{\rm HS}}$$
(11.30)

where  $p_{\rm FC}$  is the specific power of the fuel cell and  $e_{\rm HS}$  is the specific mass of the H<sub>2</sub> storage tanks (in units kgH<sub>2</sub>/kg<sub>tank</sub>).

#### Photoelectrochemical (PEC) $H_2$ generation with $H_2$ energy storage

This scenario uses an  $H_2$  demand as opposed to a power demand to size the PEC array. The total  $H_2$  demand rate is given by

$$\dot{m}_{\rm H_2} = \frac{P_{\rm Hab}\alpha_{\rm FC} + \Lambda}{1 - \alpha_{\rm HS}\alpha_{\rm FC}} \tag{11.31}$$

The carry-along mass required for the PEC scenario is given by

$$M_{\rm PEC} = \frac{\dot{m}_{\rm H_2}}{m_{\rm PEC}} + \frac{P_{\rm Hab} + \alpha_{\rm HS} \dot{m}_{\rm H_2}}{p_{\rm FC}} + \frac{(P_{\rm Hab} \alpha_{\rm FC} + \Lambda) t_{\rm store}}{e_{\rm HS}}$$
(11.32)

where  $m_{\text{PEC}}$  is the specific productivity (kgH<sub>2</sub>/h/kg) of PEC cells. All parameters for these calculations are compiled in Table S9.

#### Secondary Power and Energy Demands

#### Habitat Power Demand

Continuous power demand estimates for a Martian habitat range between 4 and ~100 kW. We use 40 kW as a baseline value following the NASA Baseline Values and Assumptions Document (BVAD)[16]. This value includes ISRU power demands, including for crop growth, so we only calculated additional power demands for H<sub>2</sub> production for the ISRU processes considered.

#### **Ammonia Demand**

To calculate an upper-bound ammonia demand, we followed the optimization strategy by Do *et al.* assuming no recycling of nitrogen via urea recovery [143]. Briefly, we assumed that the metabolic demands for six crew members would be met entirely by food crops grown in hydroponic chambers. We used values from the BVAD and related literature to calculate nitrogen demand per nutrient availability for a given crop [16, 562]. The optimization function was defined to balance minimization of area necessary for crop growth with maximization of crop variability for human morale as

$$f = w_1 \sum_{i} A_i + w_2 \sigma(\mathbf{A}) \tag{11.33}$$

$$s.t.: \sum_{i} A_i r_i x_{i,j} > X_j \tag{11.34}$$

where f is the optimization function,  $A_i$  is the growth area for crop i,  $\sigma$  is the standard deviation of the vector of crop areas  $(\mathbf{A})$ ,  $r_i$  is the static growth rate,  $x_{i,j}$  is the nutritional content of crop i for nutrient j, and  $X_j$  is the crew member demand for nutrient j. The relative weights  $w_1$  and  $w_2$  are related by

$$w_2 = 1 - w_1 \tag{11.35}$$

and  $w_1$  was varied between 0 and 1. Using  $w_1 = 0.25$ , all 5 crops we considered (soybeans, wheat, lettuce, potatoes, peanuts) were included, resulting in a total crop growth area of  $\sim 421 \text{ m}^2$  and an ammonia demand of  $\sim 205 \text{ g/sol}$ , which we converted to 8.33 g/h for consistent units in Table S9. The nitrogen demand ranged between  $\sim 285 \text{ g/sol}$  and  $\sim 194 \text{ g/sol}$  for  $0 < w_1 < 1$ .

We assume ammonia is produced via the Haber-Bosch process with the characteristic reaction

$$N_2 + 3H_2 \rightarrow 2NH_3 \tag{11.36}$$

Hence, the H<sub>2</sub>:NH<sub>3</sub> conversion factor is  $0.196 \text{ kgH}_2/\text{kgNH}_3$  assuming 90% conversion of H<sub>2</sub>.

#### Methane Demand

Resupply and crew member return to Earth from Mars will require that interplanetary transit vehicles can be refueled on Mars. We use the estimate by Kleinhenz and Paz[291] that such refueling requires 6978 kgCH<sub>4</sub> produced every 480 sols, corresponding to a CH<sub>4</sub> production rate of 0.61 kg/h. We assume this methane is produced via the Sabatier reaction:

$$\mathrm{CO}_2 + 4\mathrm{H}_2 \to \mathrm{CH}_4 + 2\mathrm{H}_2\mathrm{O} \tag{11.37}$$

resulting in an H<sub>2</sub>:CH<sub>4</sub> conversion factor of 0.554 kg H<sub>2</sub>/kgCH<sub>4</sub> assuming 90% conversion efficiency.

#### **Bioplastics and Biopharmaceutical Demand**

Bioplastics and pharmaceutical demands for a Martian habitat are not well-defined in the literature. For a system where 50% of spare parts necessary for a habitat are generated via additive manufacturing based on ISRU, Owens *et al.* estimated that 9800 kg of spare parts mass would be necessary over 260 months (an extremely long duration with multiple resupplies and crew member exchanges)[418] Assuming these spares are generated from bioplastics, which are in turn produced from acetic acid at 50% yield by C<sub>2</sub> feedstock-utilizing microorganisms[44], this corresponds to ~0.1 kg/h acetic acid demand. We assume acetic acid is produced by acetogens with a molar ratio of 4.2:1 (corresponding to 95% of H<sub>2</sub> reducing power diversion to acetic acid production, a common value for acetogens), this corresponds to an H<sub>2</sub>:CH<sub>3</sub>COOH ratio of 0.155 kgH<sub>2</sub>/kg CH<sub>3</sub>COOH assuming 90% conversion.

Pharmaceutical demand is not expected to exceed 1 g/sol, so we neglect this amount for the purposes of our calculations here.

### Water electrolyzer, $H_2$ fuel cell, and $H_2$ storage systems

Water electrolysis and H<sub>2</sub> fuel cell power demands are based on commercially available, low-weight fuel cell systems designed for transportation vehicles<sup>2</sup>. The electrolyzer requires  $54.13 \text{ kWh/kgH}_2$ , while the fuel cell requires  $0.064 \text{ kgH}_2/\text{kWh}$ . We assume H<sub>2</sub> storage is accomplished with Type IV compression chambers at 350 bar, which stores H<sub>2</sub> at 20.77 kgH<sub>2</sub>/m<sup>3</sup> with a tank mass of 289.23 kg/m<sup>3</sup>, corresponding to a H<sub>2</sub> storage density of 0.0718 kgH<sub>2</sub>/kg[141, 34]. For these systems,  $3.39 \text{ kWh/kgH}_2$  is required to compress H<sub>2</sub> to 350 bar, which we account for in the total power demand[141].

#### Solar Cell Array Mass

Commercial low-weight, flexible solar cell arrays have an installed mass of 2.0 kg/m<sup>23</sup>. We are not aware of similarly commercial PEC arrays, so we assume that the installed mass is

<sup>&</sup>lt;sup>2</sup>G-HFCS-6kW Hydrogen Fuel Cell Power Generator (Fuel Cell Store, Product Code: 1035012)

<sup>&</sup>lt;sup>3</sup>MiaSolé Flex-03W Series Module with adhesive

driven primarily by the absorber material as opposed to the catalyst layers or ion exchange membrane. We therefore estimate an installed mass of 2.4 kg/m<sup>2</sup> by assuming the absorber and housing components comprise 80% of the installed mass.

## 11.3 SI: Case Study 3

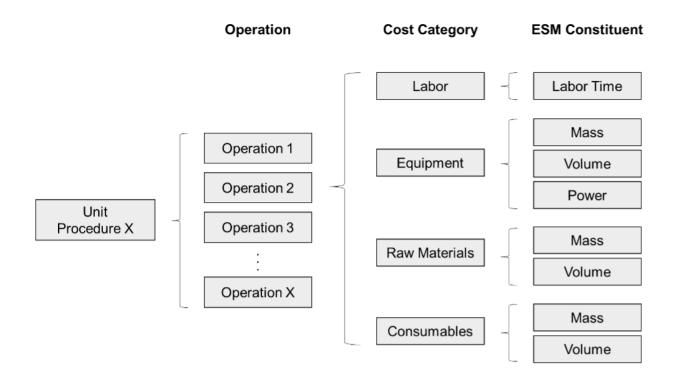


Figure S14: Schematic of deterministic unit procedure model construction grouped by operation, cost category, and equivalent system mass (ESM) constituent.

mAb	Indication	Dose	Need Basis
Erenumab-aooe (FDA La- bel)	Migraine headache prevention	70  mg (or  140  mg)	1  dose/month
Romosozumab (FDA La- bel)	Bone regeneration	210 mg	1  dose/month
Gemtuzumab ozogamicin*	Acute myeloid leukemia	$\frac{6 \ mg/m2; \ 3 \ mg/m^2; \ 2}{mg/m^2}$	day 1/day 8/every 4 weeks; 1 course/year

**Table S10:** Example commercially approved monoclonal antibody (mAb) therapies of relevance to human health in space that have been considered in the determination of the reference mission pharmaceutical demand. Need basis is defined per the listed indication and FDA label. Demand estimates are derived by multiplying the FDA-approved need basis by the crew size and the duration of the demand. Asterisk (\*) denotes an antibody drug conjugate.

Unit Procedure	Code	mAb Binding Capac- ity	Maximal Feed Stream Volume
Pre-packed chromatogra- phy	СНМ	30  mg/mL resin	N/A
Spin column	SPN	1  mg/column	0.6  mL
Magnetic bead	MAG	27 mg/mL bead slurry	$0.3 \mathrm{mL}$
Plant virus-based nanopar- ticle	VIN	4  mg/mL stock solution	$2 \text{ mL}^*$
Elastin-like polypeptide	ELP	0.42  mg/mL stock solution	$0.8~{\rm mL^{*,\alpha}}$
Oilbody-oleosin	OLE	6.74  mg/mL stock solution	$0.1~\mathrm{mL}^{*,\gamma}$

**Table S11:** Unit procedure assumptions for maximal feed stream volume and monoclonal antibody (mAb) binding capacity. \* based on 2 mL unit volume; actual feed stream volume added is based on the amount of stock solution required and thus mAb quantity in the feed stream.  $\alpha$  reduced from 2 mL maximal to account for volume needed for salt solution addition (0.4 mL) and required 1:1 volume ratio of ELP:mAb.  $\gamma$  reduced from 2 mL maximal to account for maximal to account for required 1:20 volume ratio of OLE:mAb.

Operation	Value	Unit
Monitoring	0.05	labor hour/hour
$\label{eq:preparation} Preparation \ (incubation + centrifugation)$	1	$\min/effective batch$
Pipetting liquid	0.5	$\min$ /solution type
I ipetting inquid	0.1	$\min/additional unit/effective batch$
Resuspending pellet	1	min/unit

Table S12: Labor time standardizations applied to common operations across unit procedures.

Segment	Leq (kg/kg)	${f Meq}\ (kg/kg)$	${f Veq}\ ({f kg}/{f m}^3)$	Peq (kg/kW)	Ceq (kg/kW)	Teq (kg/CM- h)
Pre-deployment (Pd)	2.77	1	9.16	237	40	0.7
Transit to Mars (Tr1)	10	1	133.8	136	50	0.7
Surface Operation (Su)	1	1	9.16	228	145	0.7
Return Transit (Tr2)	10	1	133.8	136	50	0.7

Table S13: Equivalency factor values used to generate equivalent system mass values from constituents of mass, volume, power, cooling, and labor.

Unit procedure	Optimal number of batches per mission
CHM	342
SPN	948
MAG	5670
VIN	360
ELP	2058
OLE	846

Table S14: Optimal number of batches per mission in the base case scenario for each unit procedure, as determined via minimization of equivalent system mass.

Segment	Meq (kg/kg)	Veq (kg/m $^3$ )	Peq (kg/kW)	Ceq (kg/kW)	Teq (kg/CM- h)
Surface Operation (Su)	1	215.5	87	146	0.465

Table S15: Mars surface mission equivalency factor values used by Zabel[581] of a space greenhouse.

mg/mL	0.1	0.2	0.35	0.5	75	1	1.5	2	5
CHM	342	342	342	342	342	342	342	342	342
SPN	9450	4728	2700	1896	1260	948	630	568	568
MAG	56694	28350	16200	11340	7560	5670	3780	2838	1134
VIN	2910	1494	882	639	450	360	264	216	132
ELP	7092	3546	2058	2058	2058	2058	2058	2058	2058
OLE	2988	1494	854	846	846	846	846	846	846

Table S16: Optimal number of effective batches per mission in the mAb stream composition scenario analysis conditions for each unit procedure, as determined via minimization of equivalent system mass.

Demand $ imes 10^3$	1	2	3.5	5	7.5	10	15	20	30
(mg mAb/mission)	1	2	5.5	5	1.5	10	10	20	50
CHM	36	70	120	172	257	342	512	682	1022
SPN	96	192	336	474	714	948	1422	1890	2844
MAG	568	1134	1988	2838	4260	5670	8508	11340	17010
VIN	36	72	126	180	270	360	533	714	1068
ELP	210	414	726	1032	1548	2058	3090	4116	6174
OLE	86	170	300	422	632	846	1264	1692	2532

Table S17: Optimal number of batches per mission in the mAb demand scenario analysis conditions for each unit procedure, as determined via minimization of equivalent system mass.

Model	Vendor	Capacity	Mass (kg)	Dimensions (cm)	Power (kW)
MiniSpin	Eppendorf	12	3.7	$22.5 \times 23.0 \times 13.0$	0.085
5418R	Eppendorf	18	22	0.0345	0.32
5427R	Eppendorf	48	30	$31.9 \times 54.0 \times 25.4$	0.55

Table S18: List of centrifuge models used in the alternative centrifuge scenario.

Centrifuge model	MiniSpin	5418R	$5427 \mathrm{R}$
SPN	1422	948	360
VIN	533	360	137
ELP	3090	2058	774
OLE	1264	846	317

**Table S19:** Optimal number of effective batches per mission in the centrifuge model alternative scenario conditionsfor each analyzed unit procedure, as determined via minimization of equivalent system mass.

## 11.4 SI: Space Biomanufacturing

## Assumptions and Methodology of Inventory Analysis

In order to construct a set of comparable mission profile scenarios for preliminary technoeconomic analysis, we leveraged the NASA 'Advanced Life Support Sizing Analysis Tool' (ALSSAT)[317]; an analysis of cargo inventory broken down for each scenario and compared by means of Equivalent Systems Mass (ESM)[314] was conducted. In its current form[312], the total ESM M is defined only for the operations at a specific location as the sum over the set of all systems as:

$$M = L_{\rm eq} \sum_{i=1}^{\mathcal{A}} \left[ \underbrace{(M_i \cdot M_{\rm eq}) + (V_i \cdot V_{\rm eq}) + (P_i \cdot P_{\rm eq}) + (C_i \cdot C_{\rm eq})}_{M_{\rm NCT}} + \underbrace{(CT_i \cdot D \cdot CT_{eq})}_{M_{\rm CT}} \right]$$
(11.38)

for subsystem  $i \in \mathcal{A}$  of the ESM excluding crew-time  $M_{\rm NCT}$  and the ESM including crew-time  $M_{\rm CT}$  where  $M_i$ ,  $V_i$ ,  $P_i$ ,  $C_i$  are the initial mass [kg], volume [m<sup>3</sup>], power requirement [kW<sub>e</sub>], and cooling requirement [kg/kW<sub>th</sub>], D is the duration of the mission segment [sol],  $T_i$  is the crew-time requirement based on an astronaut crew-member (CM) [CM-h/sol],  $M_{\rm eq}$  is the stowage factor accounting for additional structural masses for a subsystem such as shelving [kg/kg],  $V_{\rm eq}$  is the mass equivalency factor for the pressurized volume support infrastructure [kg/m<sup>3</sup>],  $P_{\rm eq}$  is the mass equivalency factor for the power generation support infrastructure [kg/kW<sub>e</sub>],  $C_{eq}$  is the mass equivalency factor for the cooling infrastructure [kg/kW<sub>th</sub>],  $CT_{\rm eq}$  is the mass equivalency factor for the cooling infrastructure [kg/kW<sub>th</sub>],  $CT_{\rm eq}$  is the mass equivalency factor for the cooling infrastructure [kg/kW<sub>th</sub>],  $CT_{\rm eq}$  is the mass equivalency factor for the cooling infrastructure [kg/kW<sub>th</sub>],  $CT_{\rm eq}$  is the mass equivalency factor for the cooling infrastructure [kg/kW<sub>th</sub>],  $CT_{\rm eq}$  is the mass equivalency factor for the cooling infrastructure [kg/kW<sub>th</sub>],  $CT_{\rm eq}$  is the mass equivalency factor for the cooling infrastructure [kg/kW<sub>th</sub>],  $CT_{\rm eq}$  is the mass equivalency factor for the cost to transport mass from one location in space to another (such as Earth-orbit to Mars-orbit). Mass equivalency factors ( $V_{\rm eq}$ ,  $P_{\rm eq}$ ,  $C_{\rm eq}$ ,  $CT_{\rm eq}$ ) are used to convert the non-mass parameters to mass.

### Inventory Analysis by Equivalent Systems Mass

Using values sourced from literature, the ALSSAT, and the NASA 'Baseline Values and Assumptions Documentation'[17], we constructed our scenario definitions and parameters as outlined in Table S20. Table 1 includes the Scenario Identifier (A-E), duration of surface mission operations in days, primary surface operation destination (Moon or Mars), and sortie number  $S_{\text{num}}$ . The sortie number corresponds to the number of "trips" for a given scenario. Also included are the equivalency factors ( $M_{\text{eq}}$ ,  $V_{\text{eq}}$ ,  $P_{\text{eq}}$ ,  $C_{\text{eq}}$ ,  $CT_{\text{eq}}$ ) and location factor  $L_{\text{eq}}$ , which allow for the comparable calculation of ESM M.

The ALSSAT was then used to generate an exemplar set of inventory elements for all systems and subsystems  $(i \in \mathcal{A})$  as shown in Table S21. Table S21 includes a uniformized breakdown for all inventory elements by system, subsystem, and item name – as well as the ESM terms (M, V, P, C, CT) for each element in each scenario. Using the data from Tables S20 and S21, we calculated the total ESM  $M_t$  for each scenario using the form  $M_t = S_{\text{num}}M_{S_{\text{num}}=1}$ .

**Table S20:** Parameter description of exemplar scenarios—scenarios 'A' and 'B' correspond to single sorties (N = 1) to Moon and Mars respectively using standard surface operation duration[17], while scenarios 'C' and 'D' correspond to multi-sortie campaigns with the same 5,400 days of surface operation as the single-sortie scenario 'E'. All scenarios consider a crew-strength of four astronauts. These parameters can be used to calculate the ESM cost and include equivalency factors for volume  $(V_{eq})$ , power  $(P_{eq})$ , cooling  $(C_{eq})$ , crew-time  $(CT_{eq})$ , and location  $(L_{eq})$ .

Scenario	Duration	Destination	$S_{\mathbf{num}}$	$V_{\mathbf{eq}}$	$P_{\rm eq}$	$C_{\mathbf{eq}}$	$CT_{\mathbf{eq}}$	$L_{\mathbf{eq}}$
A	180	Moon	1	126	136	55.4	0.7	7.2
В	540	Mars	1	117.7	162	96	0.7	30
С	180	Moon	30	126	136	55.4	0.7	7.2
D	540	Mars	10	117.7	162	96	0.7	30
Ε	$5,\!400$	Mars	1	117.7	162	96	0.7	30

### **Inventory Analysis by Elemental Composition**

The inventory element composition analysis was carried out by first creating a set of composition classes: Structural Metal, Plastic, Electronics, Fabric, Glass, Rubber, Ceramics, Gas, Biomass, Water, Other. These classes were created as *prima facie* estimates. Next, we estimated the fractional composition for each inventory element as shown in Table S22. We note that these estimates were carried out as approximations and based on a number of factors such as literature and other official NASA resources. However, we acknowledge that often our estimates amount to assumptions and educated guestimations, due to the lack of exact data. That being said, we argue that exact values are not required in these calculations which should be considered an important first step in defining the order of magnitude envelope for a mission inventory's elemental composition.

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					$\mathbf{C}$					D					Е				
Sys-	Sub-	Item																									
tem	$\mathbf{system}$		$\mathbf{M}$	$\mathbf{V}$	Р	$\mathbf{C}$	$\mathbf{CT}$	$\mathbf{M}$	$\mathbf{V}$	Р	С	$\mathbf{CT}$	$\mathbf{M}$	$\mathbf{V}$	Р	$\mathbf{C}$	СТ	$\mathbf{M}$	V	Р	$\mathbf{C}$	$\mathbf{CT}$	$\mathbf{M}$	$\mathbf{V}$	Р	С	СТ
Air	APC	Vent/Relief Valve																									
A	APC	Pressure Control Panel	5.4	0 0.0	1 0.00	0.0	0 0.00	5.4	0 0.0	10.0	0 0.0	0 0.00	5.40	0.01	L 0.00	0 0.00	0.00	5.40	0.0	10.0	0.00	0 0.00	5.4	0 0.0	1 0.00	0.00	) 0.0
Air	APC	Pressure Control Panel	11	ാത വ	2180	9 D C	വത വവ	11	ാത വ	2 1 8	ou s	00.00	11.5	റത്ത വട	2 1 8 (	na s n	പത വവ	11.5	തെ വ	218	a na	റത ററ	11	ാത വ	2 1 8 (	nu s r	പത്ത വ
Air	APC	Manual Pressure Equal-	11.	20.0	5 10.0	Juo.	0.00	11.	20.0	5 10.	0u.o.	00.00	11.2	200.0	, 10.0	000.0	10.00	11.2		5 10.	Juo.	0.00	11.	20.0.	J 10.0	<b>u</b> o.u	J.W.O
		ization Valve	9.6	0.0.0	1 0.00	0.0	0 0.00	9.6	0.0.0	10.0	0.00	0 0.00	9.60	0.01	L 0.00	0 0.00	0.00	9.60	0.0	10.0	0.00	0 0.00	9.6	0.0.0	1 0.00	0.00	0.0
Air	APC	Positive Pressure Relief																									
		Valve	1.8	0.00	0.00	0.0	0 0.00	1.8	0.00	0.00	0.00	0 0.00	1.80	0.00	0.00	0.00	0.00	1.80	0.0	0.00	0.00	0 0.00	1.8	0.00	0.00	0.00	0.0
Air	APC	Negative Pressure Relief																									
		Valve	3.0	0.00	10.00	0.00	0 0.00	3.0	0.00	10.0	0 0.0	0 0.00	3.00	0.01	L 0.00	0 0.00	0.00	3.00	0.0	10.0	0.00	0 0.00	3.0	0 0.0	1 0.00	0.00	) 0.0
Air	APC	Nitrogen Interface As-		0.0.0	1		0 0 00			1	0 5 5	0 0 00		20.01		0 5 50				1				0.0.0			
Air	APC	sembly Vacuum Access Jumper	7.5	00.0	1 5.50	5.5	0.00	7.5	0.0.0	1 5.5	0 5.5	0 0.00	7.50	0.01	1 5.50	0 5.50	0.00	7.50	0.0	15.5	05.5	0 0.00	7.5	0 0.0	1 5.50	5.50	0.0
AII	AFU	5-ft	0.7		ດ ດ	0.00	0 0 00	07	0 0 0	0.0.0	000	0 0.00	0.70	າດດ	າດດ	0.0.00	0.00	0.70	000	0.0.0	0.00	0 0 00	07		<u>) 0 00</u>	າ ດ ດດ	100
Air	APC	Vacuum Access Jumper	0.1	0 0.0	0.00	50.0	0 0.00	0.1	0 0.0	0 0.0	0 0.0	0.00	0.10	50.00	0.00	0 0.00	0.00	0.10	, 0.0	00.0	0.0	0 0.00	0.1	0 0.00		0.00	,0.0
		35-ft	3.2	0.00	0.00	0.0	0 0.00	3.2	0.00	0.00	0.00	0 0.00	3.20	0.00	0.00	0 0.00	0.00	3.20	0.0	0.00	0.00	0 0.00	3.2	0 0.0	0.00	0.00	0.0
Air	ACMA	Verification Gas Assem-																									
		bly	5.4	0.00	10.10	0.1	00.00	5.4	0.00	10.1	00.1	00.00	5.40	0.01	L 0.10	00.10	0.00	5.40	0.0	10.1	00.1	00.00	5.4	0.0.0	1 0.10	0.10	0.0
Air	ACMA	Mass Spectrometer																									
			13.	90.0	2 31.8	3031.	80.00	13.	90.0	231.	8031.	80.00	13.9	90.02	231.8	8031.8	30.00	13.9	0.0	231.	8031.	80.00	13.	90.05	2 31.8	3031.8	30.0
Air	ACMA	Sample Pump	9.4	0.0.0	0 4 00		0 0 00		000	0.4.0		0 0 00	9.40			0 4 00		9.40		0 1 0			<b>0</b> 4	0 0 0		1.00	
Air	ACMA	Sample Distributor	3.4	0 0.0	04.00	94.0	0.00	3.4	00.0	04.0	04.0	0 0.00	3.40	0.00	) 4.00	04.00	0.00	3.40	0.0	04.0	04.0	0 0.00	3.4	0 0.00	J 4.00	) 4.0U	0.0
AIr	ACMA	Sample Distributor	2.1		0.0.10	0.1	0.0.00	21	000	0.0.1	0.0.1	0 0.00	2 10	າ ດ ດເ	0.10	0.0.1(	0.00	2.10	000	0.0.1	0.0.1	0 0 00	21		0.10	0.0.10	100
Air	ACMA	Data + Control	2.1	0 0.0	00.10	50.1	0.00	2.1	00.0	00.1	00.1	0.00	2.10	50.00	0.10	0 0.10	0.00	2.10	0.0	00.1	00.1	0 0.00	2.1	0.0.0	0.10	0.10	,0.0
			8.0	0.00	1 34.9	9334.	90.00	8.0	0.0.0	134.	9334.	90.00	8.00	0.01	1 34.9	934.9	90.00	8.00	0.0	134.	9334.	90.00	8.0	0.0.0	1 34.9	034.9	<b>€</b>
Air	ACMA	Low Voltage Power																									
		Supply	5.7	0.00	130.8	3 <b>B</b> 0.	80.00	5.7	0.00	130.	8030.	80.00	5.70	0.01	L 30.8	8 <b>B</b> 0.8	30.00	5.70	0.0	130.	8 <b>B</b> 0.	80.00	5.7	0.0.0	1 30.8	3030.8	30.0
Air	ACMA	Chassis																									
			15.	80.0	20.00	0.0	0 0.00	15.	80.0	20.0	0 0.0	0 0.00	15.8	80.02	20.00	0 0.00	0.00	15.8	30.0	20.0	0.00	0 0.00	15.	80.0	2 0.00	0.00	) 0.0
Air	ACMA	Inlet Valve Assembly	0.0	0 0 0			0 0 00	0.0					0.00			0 0 0		0.00					0.0	0.0.0			
Air	ACMA	EMI Filter	0.0	0.00	0.00	0.0	0.00	0.0	0.00	0.00	0 0.0	0 0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.0	00.0	0.00	0 0.00	0.0	0 0.00	0.00	0.00	0.0
AIr	ACMA	EMI Fliter	0.0		0.1.80	118	0.0.00	0.0	000	018	018	0 0.00	0.00	າ ດ ດເ	1 1 80	0 1 80	0.00	0.00	000	018	018	0 0 00	0.0		1 1 80	1 80	100
Air	SDS	3-way Solenoid Valves	0.0	0 0.0	0 1.00	,1.0	0.00	0.0	00.0	01.0	0 1.0	0.00	0.00	50.00	, 1.00	0 1.00	0.00	0.00	0.0	01.0	01.0	0 0.00	0.0	0.00	1.00	1.00	,0.0
	~_~		31.	50.0	3 0.00	0.0	0 0.00	31.	500.0	30.0	0.00	0 0.00	31.5	50.03	3 0.00	0 0.00	00.00	31.5	5 <b>0</b> .0	30.0	0.00	0 0.00	31.	500.03	3 0.00	0.00	0.0 (
Air	SDS	Manual Valves																					-				
			2.5	30.0	1 0.00	0.0	0 0.00	2.5	30.0	10.0	0.00	0 0.00	2.53	3 0.01	L 0.00	0.00	00.00	2.53	30.0	10.0	0.00	0 0.00	2.5	30.0	1 0.00	0.00	0.0

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					$\mathbf{C}$					D					Е				
Sys- tem	Sub- system	Item	м	v	Р	С	СТ	м	v	Р	С	СТ	м	v	Р	С	СТ	м	v	Р	С	СТ	м	v	Р	С	Ст
Air	SDS	Sample probes		-	_	-				_	-	0 0.00			_	-			•	-	-				-	C	
Air	$\rm CO_2$	Air Selector Valve																									
Air	$\rm CO_2$	Desiccant Bed										0 0.99															
Air	$\rm CO_2$	Adsorbent Bed										0 0.24															
Air	$\rm CO_2$	Air Check Valve	33.	130.0	0 578	8.4578	3.40B00	33.	130.0	0 578	8.4578	8. <b>4</b> B00	32.	830.00	573	3.1673	.1600	32.3	20.00	0 564	. <b>256</b> 4	.20800	32.	)60.00	) 559.	.75459	.7040
Air	$CO_2$	Heater Controller	0.1	60.0	0 0.0	0 0.0	0.00	0.1	60.0	0 0.0	0 0.0	0.00	0.1	6 0.0	0.0	0 0.00	0.00	0.16	0.0	0.00	0.00	0.00	0.1	6 0.00	0.00	0.00	) 0.0
Air	$CO_2$	Air Blower	6.6	0 0.0	0 38.	038.	00.01	6.6	0 0.0	0 38.	0038.	00.01	6.6	0 0.0	38.	038.0	00.01	6.60	0.0	0 38.0	0038.	00.03	6.6	0.00	38.0	038.0	)@.3
Air	$CO_2$	Pre-cooler	0.8	20.0	2 40.	7140.	7D.06	0.8	20.0	2 40.	7140.	7 <b>D</b> .06	0.8	2 0.03	2 40.	3410.3	340.06	0.81	0.0	2 39.'	7289.'	7 <b>2</b> 0.18	0.8	1 0.02	2 39.4	<b>(3</b> 9.4	40.9
Air	$CO_2$	Blower/Pre-cooler Motor	2.2	20.0	0 0.0	0 0.0	0 0.00	2.2	20.0	0 0.0	0 0.0	0.00	2.2	1 0.0	0.0	0 0.00	0.00	2.19	0.0	0.00	0.00	0.00	2.1	8 0.00	0.00	0.00	) 0.0
Air	$CO_2$	Controller CO <sub>2</sub> Pump	1.3	0 0.0	05.0	05.0	0 0.00	1.3	0 0.0	05.0	05.0	0.00	1.3	0 0.0	05.0	0 5.00	0.00	1.30	0.0	05.0	05.0	0 0.00	1.3	0.00	0 5.00	5.00	) 0.0
	-		6.7	30.0	013.	343.	<b>34</b> 0.04	6.7	30.0	0 13.	3413.	340.04	6.7	0 0.0	) 13.	2213.2	2 <b>2</b> 0.04	6.65	0.0	0 13.	0113.	010.11	6.6	2 0.00	0 12.9	112.9	€11.1
Air	$\rm CO_2$	CO <sub>2</sub> Pump Motor Con- troller	1.3	0 0.0	12.0	02.0	0 0.00	1.3	0 0.0	12.0	0 2.0	0.00	1.3	0.00	12.0	0 2.00	0.00	1.30	0.0	12.0	02.0	00.01	1.3	0.01	1 2.00	2.00	0.1
Air	$CO_2$	Temperature Sensor	0.4	0.00	01.0	01.0	0 0.00	0.4	0 0.0	01.0	01.0	0.00	0.4	0 0.0	01.0	0 1.00	0.00	0.40	0.0	01.0	01.0	0 0.00	0.4	0.00	0 1.00	1.00	0.0 0
Air	$CO_2$	Differential Pressure Sensor	0.2	0 0.0	01.0	01.0	0 0.00	0.2	0 0.0	01.0	01.0	0.00	0.2	0 0.0	01.0	0 1.00	0.00	0.20	0.0	01.0	01.0	0 0.00	0.2	0.00	0 1.00	1.00	0.0 0
Air	$\rm CO_2$	Absolute Pressure Sen- sor	0.2	0 0.0	01.0	01.0	0 0.00	0.2	0 0.0	01.0	01.0	0.00	0.2	0 0.0	01.0	0 1.00	0.00	0.20	0.0	01.0	01.0	0 0.00	0.2	0.00	0 1.00	1.00	0.0
Air	$\rm CO_2$	Electrical Harness	4.5	0.0.0	0.0.0	0.0.0	0.00	4.5	0.0.0	0.0.0	0.0.0	0.00	4.5	0.0.0	0.0	0.0.00	0.00	4.50	0.0	0.0.0	0.0	0.00	4.5	0.00	0.00	0.00	0.0
Air	$\rm CO_2$	Plumbing										0 0.00															
Air	$\rm CO_2$	Support Structure						-				0 0.00	-														
Air	$\rm CO_2$	Fluid Disconnects																									
Air	$\rm CO_2$	Electronics Cold-Plate										0 0.00															
Air	$\rm CO_2$	Electronics Interface Plate										00.00															

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					С					D					Е				_
Sys-	Sub-	Item																									
$\mathbf{em}$	$\mathbf{system}$		$\mathbf{M}$	$\mathbf{V}$	Р	$\mathbf{C}$	СТ	$\mathbf{M}$	V	Р	$\mathbf{C}$	$\mathbf{CT}$	$\mathbf{M}$	$\mathbf{V}$	Р	С	$\mathbf{CT}$	$\mathbf{M}$	V	Р	С	СТ	$\mathbf{M}$	$\mathbf{V}$	Р	$\mathbf{C}$	C'
Air	$N_2$	MD Shield Instl	0.0	0.0.0		0.0.0						0 0 00	0.00					0.00				0.0.00		0.0.0	0.0.00	0.00	
ir	$N_2$	Multilayer Insulation	0.0	0 0.0	0.0	00.0	0.00	0.0	JO 0.C	0.0	0.0.0	0 0.00	0.00	0.00	0.00	0 0.00	0.00	0.00	0.0	0 0.0	0 0.0	0 0.00	0.0	0 0.0	0.00	0.00	) ().(
111	112	Assembly-T $\#1$	0.0	0.0.0	0.0	0.0.0	0.00	) 0.0	0.0.0	0.0	0.0.0	0 0.00	0.00	0.00	0.0	0.00	0.00	0.00	0.0	0.0.0	0.0.0	0.0.00	0.0	0.0.0	0.00	0.00	0.0
Air	$N_2$	Multilayer Insulation																									
		Assembly-T $\#2$	0.0	0.00	0.00	0.0.0	0.00	0.0	0.0 0.0	0.00	0.00	0 0.00	0.00	0.00	0.0	0.00	0.00	0.00	0.0	0.00	0.00	0 0.00	0.0	0.00	0 0.00	0.00	) 0.
Air	$N_2$	Primary Structure																									
		Assembly-HPG ORU	0.0	0 0.0	0.00	0 0.0	0.00	0.0	0.0 0.0	0.00	0 0.0	0 0.00	0.00	0.00	0.0	0 0.00	0.00	0.00	0.0	0 0.0	0 0.0	0 0.00	0.0	0 0.0	0 0.00	0.00	)0.
Air	$N_2$	Tank ORU Assembly	0.0		200	000						0 0 00	0.00					0.00				0 0 00					0.0
Air	$N_2$	Utilities Installation -	0.0	0.00	0.0	00.0	0.00	0.0	JU U.U	0.00	0.0.0	0 0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.0	00.0	00.0	00.00	0.0	0.0.0	0.00	0.00	J U.
111	11/2	$O_2/N_2$ Tank	0.0	0.0.0	0.00	000	0 0 0	0.0	0 0 C	000	000	0 0.00	0.00	0 0 0	0.0	0.0.00	0 0 0	0.00	0.0	000	000	0.0.00	0 0 0	0.0.0	0.0.00		0.0
Air	$N_2$	$N_2$ Bare Tank	0.0	0 0.0		0 0.0	0.00	, 0.0	0.0	0 0.0	0 0.0	0 0.00	0.00	0.00	. 0.0	0 0.00	0.00	0.00	0.0	0 0.0	0 0.0	0 0.00	, 0.0	0 0.0	0.00	0.00	, 0.
	2	2	80.	370.00	0.0	0.0.0	0.00	80	.370.0	0.00	0.00	0 0.00	80.4	<b>13</b> 0.00	0.0	0 0.00	00.00	163.	<b>98</b> 0	0.00	0.00	0 0.00	) 144	13026	0 0.00	0.00	0.
lir	$N_2$	HPGA Fluid																									
			81.	740.0	0.00	0 0.0	0.00	) 81	.740.0	0.00	0.00	0 0.00	81.8	330.00	0.0	0.00	0.00	144.	<b>7</b> B0	0.00	0 0.0	0 0.00	) 11(	)7090	0 0.00	0.00	) 0.
ir	$N_2$	Handhold, top mounted																									
	N		0.2	20.0	0.0	00.0	0.00	0.2	22 0.0	0.00	0.00	0 0.00	0.22	2 0.00	0.00	0 0.00	0.00	0.38	0.0	0 0.0	0 0.0	0 0.00	) 2.9	20.0	0.00	0.00	) ().
Air	$N_2$	Handrail 21.941 in cus- tom	03	8 0 0	חחר	000		109	28 0 0	000	000	0 0.00	0.35	2 0 00			<u> </u>	0.67	0.0	000	000	0.0.00	) 5 1	200	0.0.00		201
Air	$N_2$	Handrail, top mounted	0.5	0.0	50.0	00.0	0.00	0.0	<b>JO U.</b> U	0.00	0 0.0	0 0.00	0.50	50.00	0.0	0.00	50.00	0.07	0.0	00.0	00.0	00.00	, 0.1	2 0.0	0.00	0.00	50.
	2	mananan, top mountou	0.4	0.00	0.0	0 0.0	0.00	0.4	40 0.0	0.00	0 0.0	0 0.00	0.40	0.00	0.0	0 0.00	00.00	0.70	0.0	0.00	0 0.0	0 0.00	) 5.3	6 0.0	0 0.00	0.00	0.
Air	$N_2$	Grapple Fixture, flt																									
		releasable	11.	1D.0	0.00	0 0.0	0.00	) 11	.1D.0	0.00	0.00	00.00	11.1	<b>B</b> .00	0.0	0.00	0.00	19.6	80.0	0.00	0.00	0.00	) 150	). <b>6</b> BO	0.00	0.00	0.0
Air	$N_2$	Accessories																									
	0		4.0	20.0	0.0	0 0.0	0.00	) 4.(	02 0.0	0.00	0 0.0	0 0.00	4.03	3 0.00	0.00	0 0.00	0.00	8.21	0.0	0 0.0	0 0.0	0 0.00	) 72.	240.0	0 0.00	0.00	) ().
Air	$O_2$	MD Shield Instl	0.0		<u></u>	000					000	0 0.00	0.00					0.00	0.0	000	000	0 0 00					0.0
Air	$O_2$	Multilayer Insulation	0.0	00.0	50.0	00.0	0.00	0.0	JU U.U	0.0	0.0	0 0.00	0.00	0.00	0.0	0.00	50.00	0.00	0.0	00.0	00.0	00.00	0.0	0.00	0.00	0.00	50.
111	02	Assembly-T $\#1$	0.0	0.00	0.0	0 0.0	0.00	0.0	0.0 0.0	0.00	0 0.0	0 0.00	0.00	0.00	0.0	0 0.00	0.00	0.00	0.0	0 0.0	0 0.0	0 0.00	0.0	0 0.0	0 0.00	0.00	0.
١ir	$O_2$	Multilayer Insulation																									
		Assembly-T $\#2$	0.0	0.00	0.0	0.0.0	0.00	0.0	0.0 0.0	0.00	0.00	0 0.00	0.00	0.00	0.0	0.00	0.00	0.00	0.0	0.00	0.00	0 0.00	0.0	0.00	0 0.00	0.00	0.
ir	$O_2$	Primary Structure																									
	_	Assembly-HPG ORU	0.0	0.00	0.00	0 0.0	0.00	0.0	0.0 0.0	0.00	0.00	0 0.00	0.00	0.00	0.0	0 0.00	0.00	0.00	0.0	0 0.0	0 0.0	0 0.00	0.0	0 0.0	0 0.00	0.00	)0.
ir	$O_2$	Tank ORU Assembly	0.0	0.0.0								0 0 00	0.00			0 0 0		0.00				0 0 00		0.0.0	0 0 00	0.00	~ ~
ir	$O_2$	Utilities Installation -	0.0	0.00	50.0	00.0	0.00	) 0.0	0.00.0	0.0	0.00	0 0.00	0.00	0.00	0.0	0.00	J 0.00	0.00	0.0	0.00	00.0	00.00	0.0	0.0	0.00	0.00	50.
11	$O_2$	$O_2/N_2$ Tank	0.0	0.0.0	חחר	000	0 0 0	) ) (	າດດດ	000	000	0 0.00	0.00	0 0 0	0.0	0.0.00	<u></u>	0.00	0.0	000	000	0.0.00	) 0 0	0.0.0	0 0 0C	0.00	0
ir	$O_2$	$O_2$ Bare Tank	0.0	0.0	.0.0	0.0.0		, 0.0		0.0	0.0	0.00	0.00	, 0.00	, 0.0	0.00	5 0.00	5.00	0.0	0.0	0.0.0	0.00	, 0.0	0.0	0.00	0.00	, 0.
-	~ 2		56	080.0	0.0	0.0.0	0.00	) 56	.080.0	0.0	0.0.0	0 0.00	53.F	530.00	0.0	0.0.0	0.00	112	190	0.0.0	0.0.0	0.0.00	) 101	0036	0.00	0.00	0.

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					$\mathbf{C}$					D					Е				
Sys-	Sub-	Item			_										_					_							
<b>tem</b> Air	$\mathbf{System}$ $O_2$	HPGA Fluid		V	-	C	CT				C					C			V	P	C				_	C	CT
Air	$O_2$	Handhold, top mounted										$0\ 0.00$ $0\ 0.00$															
Air	$O_2$	Handrail 21.941 in cus- tom										0 0.00															
Air	$O_2$	Handrail, top mounted										0 0.00															
Air	$O_2$	Grapple Fixture, flt releasable										0 0.00															
Air	$O_2$	Accessories	2.8	10.0	0.00	0.0	0 0.00	2.8	10.0	0.0 0.0	0 0.0	0 0.00	2.6	8 0.0	0.0 0.0	0.0 0.0	0.00	5.62	20.0	0.00	0.00	0 0.00	50.5	570.00	0.00	0.00	0.0
Air	Sabatier	Condensing Heat Ex- changer	1.4	70.0	0.00	0.0	0 0.00	) 1.4	70.0	0.0 0	0 0.0	0 0.00	1.4	9 0.0	0.000.0	0.0 0.0	0.00	1.48	30.0	0.00	0.00	0 0.00	1.48	3 0.00	0.00	0.00	) 0.0
Air	Sabatier	AAA Heat Exchanger	2.4	70.0	0.00	0.0	0 0.00	2.4	70.0	0.0 0.0	0 0.0	0 0.00	2.5	0 0.0	0.0 0.0	0.0 0.0	0.00	2.49	90.0	0.00	0.00	0 0.00	2.49	90.00	0.00	0.00	0.0
Air	Sabatier	ITCS Coolant Water Inlet QD	0.4	70.0	0.00	0.0	0 0.00	0.4	70.0	0.0 0.0	0 0.0	0 0.00	0.4	8 0.0	0.000.0	0.0 0.0	0.00	0.48	30.0	0.00	0.00	0 0.00	0.48	8 0.00	0.00	0.00	0.0
Air	Sabatier	ITCS Coolant Water Outlet QD	0.3	60.0	0.00	0.0	0 0.00	0.3	60.0	0.0 0.0	0 0.0	0 0.00	0.3	60.0	0.000.0	0.0 0.0	0.00	0.36	60.0	0 0.0	0.00	0 0.00	0.3	6 0.00	0.00	0.00	0.0
Air	Sabatier	Heat Exchanger Inlet Temp	0.3	60.0	0.00	0.0	0 0.00	0.3	60.0	0.0 0.0	0 0.0	0 0.00	0.3	6 0.0	0.000.0	0.0 0.0	0.00	0.36	60.0	0 0.0	0.00	0 0.00	0.3	6 0.00	0.00	0.00	0.00
Air Air	Sabatier	Heat Exchanger Outlet Temp Manifold, CO <sub>2</sub>	0.3	60.0	0.00	0.0	0 0.00	0.3	60.0	0.0 0.0	0 0.0	0 0.00	0.3	6 0.0	0.000.0	0.00	0.00	0.36	60.0	0 0.0	0.00	0 0.00	0.30	6 0.00	0.00	0.00	0.00
Air	Sabatier	$CO_2$ Inlet Check Valve	4.7	20.0	0.00	0.0	0 0.00	4.7	20.0	0.0 0.0	0 0.0	0 0.00	4.8	0 0.0	0.0 0.0	0.0 0.0	0.00	4.77	70.0	0 0.0	0.00	0 0.00	4.70	6 0.00	0.00	0.00	0.00
Air	Sabatier	$CO_2$ Inlet Filter	0.1	00.0	0.00	0.0	0 0.00	0.1	0 0.0	0.00	0 0.0	0 0.00	0.1	1 0.0	0.0 0.0	0.0 0.0	0.00	0.11	0.0	0 0.0	0.00	0 0.00	0.1	1 0.00	0.00	0.00	) 0.0(
Air	Sabatier	Pressure Sensor, $CO_2$	0.0	50.0	0.00	0.00	0 0.00	0.0	50.0	0.00	0 0.0	0 0.00	0.0	6 0.0	0.0 0.0	0.0 0.0	0.00	0.06	60.0	0 0.0	0.00	0 0.00	0.0	6 0.00	0.00	0.00	0.00
Air	Sabatier	Inlet $CO_2$ Inlet $QD$	0.4	10.0	0.00	0.00	0 0.00	0.4	10.0	0.0 0.0	0 0.0	0 0.00	0.4	10.0	0.000.0	0.00	0.00	0.41	0.0	0 0.0	0.00	0 0.00	0.4	1 0.00	0.00	0.00	0.00
Air	Sabatier	$CO_2$ Inlet $QD$	0.4	70.0	0.00	0.00	0 0.00	0.4	70.0	0.00	0 0.0	0 0.00	0.4	8 0.0	0.0 0.0	0.0 0.0	0.00	0.48	80.0	0 0.0	0.00	0 0.00	0.48	3 0.00	0.00	0.00	) 0.0(
Air	Sabatier	$CO_2$ Inlet NC Solenoid	0.9	20.0	0.00	0.0	0 0.00	0.9	20.0	0.00	0 0.0	0 0.00	0.9	3 0.0	0.0 0.0	0.0 0.0	0.00	0.93	30.0	0 0.0	0.00	0 0.00	0.93	3 0.00	0.00	0.00	) 0.0(
Air	Sabatier	$CO_2$ Inlet Flow Control	0.4	70.0	0.00	0.0	0 0.00	0.4	70.0	0.0 0.0	0 0.0	0 0.00	0.4	8 0.0	0.0 0.0	0.0 0.0	0.00	0.48	30.0	0 0.0	0.00	0 0.00	0.48	8 0.00	0.00	0.00	) 0.00
	Sabatier	-	2.1	50.0	0.00	0.0	0 0.00	2.1	50.0	0.0 0.0	0.00	0 0.00	2.1	8 0.0	0.0 0.0	0.0 0.0	0.00	2.17	70.0	00.0	0.00	0 0.00	2.1'	7 0.00	0.00	0.00	0.00

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					С					D					Е				
Sys-	Sub-	Item		37	n	a	CIT.			<b>_</b>	a	CTT.			ъ	a	CIT.			n	0	CT.		3.7	n	0	
<b>tem</b> Air	$\mathbf{system}$	CO <sub>2</sub> Flow Control Ori-	М	v	Р	С	СТ	м	v	Р	С	СТ	М	V	Р	С	СТ	М	v	Р	С	СТ	М	v	Р	С	СТ
AII	Sabatier	fice	0.0	50.0	0.0.0	00.0.0	0.00	0.0	050.0	0.0.0	0.0.0	0 0.00	0.0	50.0	00 O.C	0.0.0	0.0.00	0.05	50.0	0.0.0	0.0.0	0.0.0	0.0	50.00	0.00	0.0	0.0.0
Air	Suburior	Delta P Sensor, Flow	0.0	0 0.0	0.01	00010			00 0.0	0 0.0	0 0.0	0 0.00	0.0		00.010	,0 0.0	0 0.00	0.00	. 0.0	0 0.0	0 0.0	0 0.00	, 0.0	0.0.0		. 0.0	0.0.0
Air	Sabatier	Sensor $CO_2$ $CO_2$ Flow Meter Orifice	0.9	10.0	0.0	00 0.0	0.00	0.9	91 0.0	0.00	0.00	0 0.00	0.9	01 0.0	0.0 0.0	0.0 0.0	0 0.00	0.91	0.0	0.0 0.0	0 0.0	0.00	0.9	1 0.00	0.00	0.0	0 0.00
All	Sabatier	CO <sub>2</sub> Flow Meter Offlice	0.0	300	0.0	000	0 0 0	0	03.0.0	000	0 0 0	0 0.00	0.0	3.0.0		0.0.0	0 0 00	0.03	800	000	000	0 0 00	0.00	3.0.00	0.00	0.0	0.0.0/
Air	Suburior	Manifold, Hydrogen	0.0	00.0	0 0.	00 0.0	0.00	, 0	00 0.0	0 0.0	0 0.0	0 0.00	0.0	0.0	50 0.0	0.0	0 0.00	0.00	. 0.0	00.0	0 0.0	00.00	, 0.0	0 0.00	0.00	, 0.0	0.00
	Sabatier		4.3	8 0.0	0.0	0.0 0.0	0.00	) 4.3	38 0.0	0.00	0.00	0 0.00	4.4	50.0	0.0 0.0	0.0 0.0	0 0.00	4.43	80.0	0.00	0.00	0.00	) 4.4	2 0.00	0.00	0.0	0 0.0
Air		Water Outlet Quick																									
	Sabatier	Disconnect	0.4	70.0	0.0	0.0 0.0	0.00	0.4	470.0	0.00	0.00	0 0.00	0.4	8 0.0	0.0 0.0	0.0 0.0	0 0.00	0.48	80.0	0.00	0 0.0	0.00	0.4	8 0.00	0.00	0.0	0.00
Air	a	Hydrogen Inlet Check																									
A :	Sabatier	Valve	0.1	0 0.0	0.0.0	00 0.0	0.00	0.	10 0.0	0 0.0	0.0	0 0.00	0.1	10.0	00 0.0	0.0 0.0	0 0.00	0.11	0.0	0.00	0 0.0	0.00	0.1	1 0.00	0.00	0.0	0.00
Air	Sabatier	Hydrogen Inlet Filter	0.0	500	0.0			0	0500	000		0 0.00	0.0	6.0.0	<u></u>		0 0 00	0.06	:00		000			60.0		000	
Air	Sabatier	H <sub>2</sub> O Outlet Pressure	0.0	50.0	0.0.0	000.0	0.00	, 0.0	050.0	00.0	0.00	0 0.00	0.0	0.0	JU 0.0	0.0	0 0.00	0.00	0.0	0.0	0.0.0	0.00	0.0	0.00	0.00	0.0	0.00
1111	Sabatier	Sensor	0.8	20.0	0.0.0	00.0.0	0.00	0.8	820.0	0.0.0	0.0.0	0 0.00	0.8	32.0.0	0.0	0.0 0.0	0 0.00	0.82	20.0	0.0.0	0.0.0	0.00	0.8	20.00	0.00	0.0	0.0.0
Air		Hydrogen Inlet Quick																0.01									
	Sabatier	Disconnect	0.4	70.0	0.0	0.0 0.0	0.00	0.4	470.0	0.00	0.00	0 0.00	0.4	80.0	0.0 0.0	0.0 0.0	0 0.00	0.48	80.0	0.00	0.00	0.00	0.4	8 0.0	0.00	0.0	0.00
Air		Hydrogen Inlet NC																									
	Sabatier	Solenoid	0.9	40.0	0.00	00 0.0	0.00	0.9	940.0	0 0.0	0.00	0 0.00	0.9	6 0.0	0.0 0.0	0.0 0.0	0 0.00	0.95	60.0	0.00	0 0.0	0.00	0.9	50.00	0.00	0.0	0 0.00
Air	Colortion	Delta P Sensor, Flow	0.0	100	0.0				01.0.0			0 0 00		100			0 0 00	0.01	0.0					10.0			000
Air	Sabatier	Sensor $H_2$ $H_2$ Flow Meter Orifice	0.9	10.0	0.0.0	000.0	0.00	0.9	91 0.0	00.0	0.0	0 0.00	0.9	0.010	JU U.U	0.0	0 0.00	0.91	. 0.0	0.00	0.0.0	0.00	0.9	10.00	0.00	0.0	0.00
ЛП	Sabatier	II2 Flow Meter Office	0.0	300	0.0	000	0 0 0	0	03.0.0	000	0 0 0	0 0.00	0.0	3.0 (		0.0.0	0 0 00	0.03	800	000	000	0 0 00	0.00	3.0.00	0.00	0.0	0.0.04
Air	Suburior	Manifold, Vent	0.0	00.0	0 0.	00 0.0	0.00	, 0	00 0.0	0 0.0	0 0.0	0 0.00	0.0	0.0	50 0.0	0.0	0 0.00	0.00	. 0.0	0.0	0 0.0	00.00	, 0.0	0 0.00	0.00	, 0.0	0.00
	Sabatier	,	5.0	60.0	0.0	0.0 00	0.00	) 5.0	06 0.0	0.00	0.00	0 0.00	5.1	4 0.0	0.0 0.0	0.0 0.0	0 0.00	5.12	20.0	0.00	0.00	0.00	) 5.1	0.00	0.00	0.0	0 0.0
Air		Liquid Sensor																									
	Sabatier		1.0	90.0	0.0	00 0.0	0.00	) 1.(	090.0	0.00	0.00	0 0.00	1.0	9 0.0	0.0 0.0	0.0 0.0	0 0.00	1.09	0.0	0.00	0 0.0	0.00	) 1.0	9 0.0	0.00	0.0	0.00
Air	<b>G 1</b> ···	Vent Pressure Sensor										0 0 00						0.00						0.0.0			
Air	Sabatier	Vent Outlet Quick Dis-	0.8	20.0	0.0.0	00 0.0	0.00	0.8	82 0.0	00.0	0.0	0 0.00	0.8	52 0.0	JU U.C	0.0	0 0.00	0.82	20.0	0.00	0 0.0	0.00	0.8	20.00	0.00	0.0	0.00
Alf	Sabatier	connect	0.4	700	0.0			0.0	47.0.0	000		0 0.00	0.4	800			0 0 00	0.48	200		000		0.04	80.0		000	
Air	Sabatiei	Vent Regulator	0.4	1 0.0	00.	000.0	0.00	, 0.	11 0.0	0 0.0	0.0	0 0.00	0.4	0.0	JU U.C	0.00	0 0.00	0.40	, 0.0	0.0	0 0.0	0.00	, 0.4	0.00	0.00	0.0	0.00
	Sabatier	1005414001	0.9	20.0	0.00	0.0 0.0	0.00	0.9	920.0	0.00	0.0 0	0 0.00	0.9	3 0.0	0.0 0.0	0.0 0.0	0 0.00	0.93	<b>3</b> 0.0	0.0 0	0.00	0.00	0.9	3 0.0	0.00	0.0	0 0.0
Air		Vent Relief/Check $\#1$																									
	Sabatier		0.1	60.0	0.0	0.0 0.0	0.00	0.	160.0	0.00	0.00	0 0.00	0.1	6 0.0	0.0 0.0	0.0 0.0	00.00	0.16	50.0	0.00	0.00	0.00	0.1	6 0.0	0.00	0.0	0.00
Air	~	Vent Relief/Check $\#2$																									
Λ.	Sabatier	Vert Outlet NO	0.1	60.0	0.0	0.000.0	0.00	0.	160.0	0 0.0	0.0	0 0.00	0.1	.6 0.0	0.0 0.0	0.0 0.0	00.00	0.16	5 O.O	0.00	0 0.0	0.00	0.1	6 0.00	0.00	0.0	0.00
Air	Schotio	Vent Outlet NO Solenoid	0.0	100	0.0			0.04	04.0.0	000		0 0.00		604	<u></u>		0.0.00	0.05			000			50.04			0.0.0
	Sabatier	DIGITOTO	0.9	40.0	0.0.0	000.0	0.00	0.9	540.0	0.0.0	0.00	00.00	0.9	0.0.0	JU U.U	0.0 0.0	00.00	0.95	0.0	0.00	0.0.0	0.00	0.9	5 0.00	0.00	0.0	0.00

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					С					D					Е				
Sys-	Sub-	Item																									
tem	$\mathbf{system}$		Μ	v	Р	$\mathbf{C}$	СТ	Μ	v	Р	С	СТ	М	V	Р	С	СТ	м	V	Р	С	СТ	Μ	V	Р	С	СТ
Air	Sabatier	Water Pressure Sensor	0.0			000		0.6	200	000	000	0 0.00	0.94	<u>.</u>	0.0.0	000	0 0 00	0.00					0.0	<u>.</u>			
Air	Sabatier	Water Relief	0.0	2 0.00	0.0	00.0	00.00	0.0	20.0	00.0	0.0.0	0 0.00	0.8	2 0.00	0.0.0	00.0	0 0.00	0.82	20.0	00.0	0.0	0.00	0.8	2 0.00	0.00	J U.U	10.00
1 1 11	Sabatier	Water Rener	0.1	6 0.0	0.0	0.00	0 0.00	0.1	60.0	0.00	0.00	0 0.00	0.10	6 0.0	0.00	0 0.0	0 0.00	0.16	60.0	0.0 0.0	0.0 0.0	0.00	0.1	6 0.00	0.00	0.00	0.0
Air		Water Outlet NC																									
	Sabatier	Solenoid	0.4	70.00	0.0	0.00	0 0.00	0.4	70.0	0.00	0.00	0 0.00	0.48	8 0.0	0.00	0.00	0 0.00	0.48	80.0	0.0 0.0	0.0 0.0	0.00	0.4	8 0.00	0.00	0.00	) 0.0(
Air	~ • •	Rotary Water Separator																									
A :	Sabatier	Assembly Sabatier Reactor Assem-	4.0	40.00	) 22.	6622.	660.00	4.0	40.0	022.	6622.	660.00	4.10	0 0.0	022.	9322.	930.00	4.08	30.0	0 22	.8422.	840.00	4.0	7 0.00	) 22.8	3022.8	30.00
Air	Sabatier	Sabatier Reactor Assem- bly	2.5	20.00	130	122	4 O OC	25	200	032	129	40.00	2 50	6.0.0	032	839	8 0 00	2 5 5	500	10.3.5	639	0.00	25	1 0 00	13.06	3 3 96	300
Air	Sabatier	Structure (A/R)	2.0	20.00	, 0.2	40.2	40.00	2.0	2 0.0	0 0.2	40.2	40.00	2.0	0 0.0	0 0.2	0 0.2	0.00	2.00	0.0	0 0.2	00.2	00.00	2.0	+ 0.00	5.20	50.20	,0.00
	Sabatier	501400410 (11/10)	9.1	5 0.00	0.0	0.00	0 0.00	9.1	50.0	0.00	0 0.0	0 0.00	9.30	0 0.0	0.00	0.00	0 0.00	9.25	50.0	0.0 0.0	0.0 0	0.00	9.2	3 0.00	0.00	0.00	0.0
Air		Miscellaneous Hardware																									
	Sabatier	(clamps, bolts, etc.)	1.7	70.00	0.0	0 0.0	0 0.00	1.7	70.0	0.00	0 0.0	0 0.00	1.7'	70.00	0.00	0 0.0	0 0.00	1.77	70.0	0.0 0.0	0.0 00	0.00	1.7	70.00	0.00	0.00	) 0.0
		(A/R)																									
Air	Sabatier	Air Cooling NC Solenoid	0.0				0 0 00	0.0	200	000		0 0 00	0.0	10.00	000	000	0 0 00		100				0.0	20.00			
Air	Sabatier	Air Inlet Filter	0.6	3 0.00	0.0	0.00	00.00	0.0	30.0	00.0	0.0.0	0 0.00	0.64	4 0.00	0.0.0	0 0.0	0 0.00	0.64	£ 0.0	00.0	0.00.0	0.00	0.0	3 0.00	0.00	0.00	10.00
All	Sabatier	An inter i iter	0.1	1 0.00	0.0	0.0	0.0.00	0.1	10.0	0.0.0	0.0.0	0 0.00	$0.1^{-1}$	1 0.0	0.0.0	0.0	0 0.00	0.11	0.0	0.0	0.0 0	0.00	0.1	1 0.00	0.00	0.00	0.0
Air		Air Sabatier Orifice						0.12										0.111									
	Sabatier		0.0	50.00	0.0	0.00	0 0.00	0.0	50.0	0.00	0.00	00.00	0.0!	50.00	00.0	0.00	0 0.00	0.05	50.0	0.0 0.0	0.0 0	0.00	0.0	50.00	0.00	0.00	) 0.0(
Air		Heat Exchanger Inlet																									
	Sabatier	Duct	0.1	0.00	0.0	0.00	0 0.00	0.1	0.00	0 0.0	0 0.0	0 0.00	0.11	10.00	0 0.0	0 0.0	0 0.00	0.11	0.0	0.0 0.0	0.0 00	0.00	0.1	1 0.00	0.00	0.00	) 0.0
Air	Sabatier	Heat Exchanger Outlet Duct	0.1			000	0 0 00	0.1	000	000	000	0 0.00	0.1	100	000	000	0 0 00	0.11	0.0				0.1	1 0 00			
Air	Sabatier	Reactor Inlet Duct	0.1	0.00	0.0	0.0	00.00	0.1	0.0	0.0.0	0.0.0	0 0.00	0.1	1 0.00	00.0	00.0	0 0.00	0.11	0.0	00.0	0.0	0.00	0.1	1 0.00	0.00	50.00	10.00
	Sabatier	Redetor milet Duet	0.2	1 0.00	0.0	0.00	0 0.00	0.2	10.0	0.00	0 0.0	0 0.00	0.2	1 0.0	0.00	0 0.0	0 0.00	0.21	0.0	0.0 0.0	0.0 0	0.00	0.2	1 0.00	0.00	0.00	0.0
Air		Reactor Outlet Duct																									
	Sabatier		0.1	0.00	0.0	0.00	0 0.00	0.1	0.00	00.0	00.0	00.00	0.1	10.00	00.0	00.0	00.00	0.11	0.0	0.0 0.0	0.0 0	0.00	0.1	1 0.00	0.00	0.00	) 0.0(
Air	~ • •	Tubing $(A/R)$																									
<u>م</u> .	Sabatier		0.6	80.00	0.0	0.00	0 0.00	0.6	80.0	0 0.0	0 0.0	0 0.00	0.69	9 0.0	0 0.0	0 0.0	0 0.00	0.69	90.0	0.0 0.0	0.0 0.0	0.00	0.6	9 0.00	0.00	0.00	) 0.00
Air	Sabatier	Harnesses	11	460.00		000	0 0 00	11	450.0	000	000	0 0.00	11	450.0	0 0 0	000	0 0 00	11 /	1160 (				11	450.00			
Air	Sabatier	Valves + Sensors' total	11.	10.00	0.0	0.0	00.00	11.	4.0.0	0.0.0	0.0.0	0 0.00	11.	4.00	0.0.0	00.0	0 0.00	11.4	£.W.(	00.0	0.0	0.00	11.	10.00	0.00	50.00	10.00
	Sabatier	power	0.0	0.00	) 7.3	77.3	7 0.00	0.0	0.00	07.3	77.3	70.00	0.0	0 0.0	07.7	67.7	6 0.00	0.00	0.0	007.6	37.6	3 0.00	0.0	0 0.00	) 7.5′	7 7.57	70.0
Air		Mechanical Compressor																									
	Sabatier	ORU	18.	888.00	) 45.	3245.	3 <b>2</b> 0.00	18.	880.0	045.	3245.	3 <b>2</b> 0.00	19.	180.00	045.	8645.	86.00	19.0	9.0	0045	.6945.	690.00	19.	040.00	) 45.6	6045.6	30.00
Air		Compressor Manifold	1.0	20.01		000	0.0.00		0.0.0			0 0 0 0	1.0	0.0.0	0.0.0	000		4.67						- 0.01			
	Sabatier	Assembly	4.6	20.00	0.0	0.00	0.00	4.6	20.0	0.00	0.00	0 0.00	4.69	90.00	υ U.O	0.00	U U.UO	4.67	0.0	0.0 0.0	0.0 0.0	0.00	4.6	5 0.00	0.00	0.00	0.0

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					$\mathbf{C}$					D					Е				_
Sys-	Sub-	Item																									
tem	$\mathbf{system}$		Μ	v	Р	С	СТ	Μ	v	Р	С	СТ	м	v	Р	С	СТ	$\mathbf{M}$	V	Р	$\mathbf{C}$	СТ	м	V	Р	$\mathbf{C}$	СТ
Air		Controller Assembly							-																	~ ~ ~	
A :	Sabatier	CO. Assessments to a	28.	590.0	0 55	.0\$5.	.00.00	) 28	.590.0	0055.	055.	)@.00	28.5	590.0	0 55.	0\$5.	00.00	28.5	590.0	0 55.0	055.	00.00	28.5	599.00	) 55.0	055.0	)@.00
Air	Sabatier	$CO_2$ Accumulator	10	വമറ	100			10	വമറ	100	0.0.0		10	1 an n	100		0 0.00	10 1		10.0	000	0 0 00	10	1 10 01			10.0
Air	$O_2$ -gen	Deionizing Bed ORU	10.	0.0.0	10.0	00.0	0.00	) 10	.0	1 0.0	0.0	0.00	10.	130.0	1 0.0	0.0	00.00	10.1	140.0	10.0	0.0	0 0.00	10.	10.01	1 0.00	0.00	10.00
.111	O <sub>2</sub> -gen	(Inlet)	7.7	90.0	1.0.0	0.0.0	0.00	) 7.3	79.0.0	10.0	0.0.0	0.00	8.19	9.0.0	10.0	0.0.0	0 0.00	8.07	70.0	10.0	0.0	0.0.00	8.00	0.01	0.00	0.00	0.0
Air	O <sub>2</sub> -gen	Deionizing Bed ORU		0 0.0	1 0.0	0.0	00.00	,	0.0	1 0.0	0 0.0	0.00	0.1	0 0.0	1 0.0	0 0.0	0 0.00	0.01	0.0	10.0	0 0.0	0 0.00	0.00	0.01	. 0.00	. 0.00	/ 0.0
	02 801	(Recirculating)	7.7	90.0	10.0	0.0 0.0	0.00	) 7.1	79 0.0	010.0	0.00	0.00	8.1	90.0	10.0	0.00	0 0.00	8.07	70.0	10.0	0.00	0 0.00	8.00	0.01	L 0.00	0.00	) 0.0
Air	$O_2$ -gen	Oxygen/Water ORU											0.121														
	20	<i></i>	36.	40.0	2 0.0	0.0 0.0	0.00	) 36	.400.0	20.0	0.00	0.00	37.0	0D.0	30.0	0.00	0 0.00	36.8	320.0	30.0	0.00	0 0.00	36.'	720.02	20.00	0.00	0.0
Air	O <sub>2</sub> -gen	Pump ORU																									
	-	-	6.4	60.0	123	.3323.	330.00	0 6.4	46 0.0	123.	3323.	330.00	6.5	6 0.0	124.	5324.	530.00	6.53	30.0	124.	1524.	150.00	6.5	1 0.01	1 23.9	@3.9	96.00
Air	$O_2$ -gen	Oxygen Phase Separator																									
		ORU	21.	830.0	10.0	0.0 0.0	0.00	) 21	.830.0	010.0	0.00	0.00	22.2	20.0	10.0	0.00	00.00	22.0	080.0	10.0	0.00	00.00	22.0	020.01	L 0.00	0.00	) 0.0(
Air	$O_2$ -gen	Hydrogen ORU																									
			95.	460.0	530	.780.	780.00	) 95	.460.0	530.	7880.	780.00	97.0	070.0	532.	3732.	370.00	96.5	560.0	531.3	8731.	870.00	96.3	30.05	531.6	B1.6	5D.00
Air	$O_2$ -gen	Hydrogen Sensor ORU																									
	_		4.5	90.0	0 0.0	0.0 0.0	0.00	) 4.5	590.0	0.00	0.00	0.00	4.59	90.0	0 0.0	0.00	0 0.00	4.59	90.0	0.00	0.00	0 0.00	4.59	90.00	0.00	0.00	) 0.00
Air	$O_2$ -gen	Process Controller	10										10										10			<b>a</b> .a. a	-
<u>،</u> .	0		40.	090.1	4 1 4	8.0048	3.0000	) 40	.090.1	4 1 4 8	3.0048	.0000	40.0	090.1	4 1 4 8	3.0048	3. <b>@</b> 000	40.0	)90.1	4 1 4 8	.0048	s.@000	40.0	999.14	1 1 4 8.	.0048	.0000
Air	$O_2$ -gen	Power Supply Module	10	400.0	0.10	come		1 1 9	450.0	0 100	ഹനം		14	100	0 1 1 6	1 / <b>**</b> 7007	. mooo	19.0	തറ	0 1 1 0	CENT	<b>0</b> 700	19.6	om 06	100		ത്തവ
Air	Fire-	(PSM) Fire Detection Assembly	13.	40.0	2 10	09020	0.00	) 13	.400.0	2 100	9020	0.00	14.	140.0	2112	24300	2.1800	13.8	<i>1</i> <b>2</b> 0.0	2 1 1 0	0394	5.404.00	13.0	50.04	2 1098	SJ#9	.@200
AIr	det-sup	Fire Detection Assembly	15	000	01/	01/	80.05	> 1 1	5000	0 1 4	01/	2 0 02	1.50	000	014	011	80.03	1.50		014	<b>2</b> 1 /	0 0 00	150		1 1 1 9	1 15	200
Air	Fire-	Portable Fire Extin-	1.0	00.0	0 1.4	1.4	0.0.	) 1.0	50 0.C	01.4	0 1.4	50.05	1.00	0 0.0	0 1.4	01.4	00.05	1.00	0.0	01.4	51.4	00.00	1.50	50.00	) 1.4c	91.40	\$0.8
.111	det-sup	guisher	6.8	000	4.0.0	0.0.0		168	20.0	400	0 0 0	0 0 0	6.8	000	400	000	0 0.00	6.80	000	4 0 0	000	0 0 00	6.80	<u>.</u>	1 0 00	0.00	<u>ا م</u> م
Air	det-sup	Regenerator 1	0.0	00.0	10.0	00.0	0.00	, 0.0	0.0	- 0.0	0 0.0	0.00	0.00	0 0.0	10.0	00.0	0 0.00	0.00	, 0.0	10.0	0.0	0 0.00	0.00	50.0-	10.00	0.00	/ 0.00
	$ACO_2R$	regenerator i	45.	30.1	7 39	7.0309/	7.0000	) 45	.300.1	7397	7.0397	ത്നറ	45.3	30.1	7397	7.03097	7.00000	45.5	300.1	7397	.0097	.ത്നറ	45.3	300.17	7 397	<b>CR9</b> 7	ണറ
Air	1100210	Metox Canisters	101	00.1				, 10					101	00.1				1010	/00/12				101	500111			
	$ACO_2R$		136	5. <b>00</b> 0	6 0.0	0.0 0.0	0.00	) 13	6.0000	6 0.0	0.00	0.00	136	5. <b>000</b> 0	60.0	0.00	0 0.00	136	.0000	6 0.0	0.00	0 0.00	136	.00006	5 0.00	0.00	0.0
Air	TCCS-	Activated Charcoal Bed																									
	ISS		4.6	30.0	1 0.0	0.0 0.0	0.00	) 4.6	53 0.0	010.0	0.00	0.00	4.6	30.0	1 0.0	0.00	0 0.00	12.8	370.0	3 0.0	0.00	0 0.00	139	.@229	9 0.00	0.00	0.0
Air	TCCS-	Blower Assembly																									
	ISS		2.4	90.0	030	.3930	390.00	) 2.4	490.0	0 30.	3 <b>3</b> 0.	390.00	2.49	90.0	0 30.	<b>3%</b> 0.	390.00	2.49	90.0	0 30.3	<b>3%</b> 0.	390.00	2.49	90.00	30.3	<b>98</b> 0.3	390.00
Air	TCCS-	Flow Meter Assembly																									
	ISS		1.1	00.0	011	.501	50.00	) 1.	10 0.0	0 11.	501.	50.00	1.1	0 0.0	0 11.	501.	50.00	1.10	0.0	011.	5011.	50.00	1.1(	0.00	) 11.5	011.5	ó@.0
Air	TCCS-	Catalytic Oxidizer As-																									
	ISS	sembly	8.4	60.0	292	.1992.	190.00	) 8.4	160.0	92.92.	1992.	190.00	8.4	60.0	292.	1992.	190.00	8.46	50.0	2 92.	1992.	190.00	8.40	6 0.02	292.1	992.1	. <b>D</b> .0
Air	TCCS-	LiOH Sorbent Bed As-																									
	ISS	sembly	0.3	10.0	0.00	000.0	0.00	0.:	31 0.0	0.00	00.0	0.00	0.3	10.0	00.0	0.00	0 0.00	0.87	7 0.0	0.00	0.00	0 0.00	9.4	3 0.02	20.00	0.00	0.0

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					$\mathbf{C}$					D					Е				
Sys-	Sub-	Item																									
tem	$\mathbf{system}$		$\mathbf{M}$	V	Р	С	СТ	$\mathbf{M}$	V	Р	С	СТ	$\mathbf{M}$	V	Р	С	СТ	М	V	Р	С	СТ	М	v	Р	С	СТ
Air	TCCS-	Electrical Interface																									
	ISS	Assembly	4.50	0.00	07.60	07.6	0 0.00	4.5	00.0	0.7.6	0.7.6	50 0.00	4.5	0.00	007.6	07.6	50 0.00	4.50	0.00	07.6	07.6	00.00	4.50	0.00	07.6	07.60	0.00
		Aluminum Compaction																									
Waste	PMWC	Cylinder	9.40	0.02	20.00	0.00	0 180	.0 <b>9</b> .4	00.0	20.0	0.00	0 180	0 <b>9</b> .4	10.0	20.0	0.00	0 180.	09.4	10.0	20.0	0 0.0	0500.	0 <b>9</b> .4	0.05	20.00	0.00	) 5400.
		Band-type Heating Unit																									
Waste	PMWC		0.00	0.00	) 136	.3040	0 0.00	0.0	00.0	0136	<b>.30</b> 40	0.00	0.0	0 0.0	$00\ 162$	2.580	0.00	0.00	0.00	0162	2.3390	00.00	0.00	0.00	)162	. <b>2</b> 900	0.00
		Lightweight, Oil-Less,																									
Waste	PMWC	Compressor/Vacuum	0.00	0.00	2.7	10.0	0 0.00	0.0	00.0	02.7	10.0	0.00	0.0	0 0.0	003.2	30.0	0.00	0.00	0.00	03.2	20.0	0 0.00	0.00	0.00	3.22	20.00	0.00
		Pump																									
		Temperature Sensor																									
Waste	PMWC		0.22	20.00	0.00	0.00	0 0.00	0.2	20.0	0.00	0.00	0.00	0.2	20.0	0.0 0.0	0 0.0	0.00	0.22	20.0	0 0.0	0 0.0	0 0.00	0.22	2 0.00	0.00	0.00	0.00
	-	Pressure Sensor																									
Waste	PMWC		0.30	0.00	0.3	30.0	0 0.00	0.3	00.0	00.3	3 0.0	0.00	0.3	0 0.0	000.3	3 0.0	0.00	0.30	0.00	00.3	30.0	0 0.00	0.30	0.00	0.3	3 0.00	0.00
		Housing + Mounting																									
Waste	PMWC	Equipment	23.8	366.48	30.00	0.00	0 0.00	) 23.	860.4	8 0.0	0.00	0.00	23.	890.4	80.0	0 0.0	0.00	23.8	390.4	80.0	00.0	0 0.00	23.8	390.48	3 0.00	0.00	0.00
	-	Condensing Heat Ex-																									
Waste	PMWC	changer	1.91	0.00	0.00	0.00	0 0.00	) 1.9	10.0	0.00	0.00	0.00	2.8	60.0	010.0	0 0.0	0.00	2.86	50.0	10.0	0 0.0	0 0.00	2.8	6 0.0	0.00	0.00	0.00
		Cooling system																									
Waste	PMWC		0.00	0.00	0.00	0.00	0 0.00	0.0	00.0	0.00	0.00	0.00	0.0	0 0.0	0 145	5.1141	5.0400	0.00	0.00	0144	<b>.974</b> 4	.97.00	0.00	0.00	) 144	.8914	.&900
	Waste-	Low Density PolyEthy-	. – .										. –														
Waste	storage	lene Box	17.7	(@.49	0.00	0.0	0 0.00	) 17.	70.4	9 0.0	0.00	0.00	17.	70.4	90.0	0 0.0	0.00	49.	18.3	70.0	0 0.0	0 0.00	531	. 1154. '	(5).00	0.00	0.00
	Waste-	Commode/Urinal	-																								
Waste			58.4	10.30	0.00	0.0	0 29.5	958.	40.3	0.00	0.00	0 29.5	958.	4@.3	0.00	0 0.0	0 29.5	958.4	40.3	0 0.0	0 0.0	082.1	958.4	10.30	0.00	0.00	) 887.6
XX7 /	Waste-	Fan	0.00		100	വതര	. അററ		0.0.0	0 1 0 0	am	a <i>a</i> noo c			0 1 0 0	പത്ത	a <i>m</i> oor			0 1 0 0	പതം	. അററ			100	രതര	<i>അ</i> ററ
Waste	col Waste-		0.00	0.00	0 102	.0002	2.0000	0.0	0.0	0 102		2.0000	0.0	0 0.0	0 102	2.000	2.00000	0.00	0.0	0 102	2.0002	2.0000	0.00	0.00	) 102	.0002	.0000
<b>XX</b> 7 /		Urine Separator	0.00		105	0.00	. അറററ			0 105	CIGN	- 1000			0 10	പത	- 10000			0 1 0 5	വത	. അറററ			105	0.00 5	anno 0
Waste	col	TT • <b>X</b> 7 + <b>T</b> T +	0.00	0.00	) 120	.uuza		0.0	0.0	J 120		5.WUUU	0.0	0 0.0	0128	5.UU2	5.0000	0.00	0.0	0120	<b>.uu</b> za		0.00	0.00	) 120	.uuzo	.0000
XX7+ -	Waste-	Urine Vent Heater	0.00		. 1 / /		റത ററ		000	0144		റത ററ			0 1 4	0.01 4	റത ററ			014	0 0 4	റത്ത ററ			111		
Waste	col Waste-	Er er l. De me	0.00	0.00	) 14.0	JU4.	00.00	0.0	00.0	0 14.0	JU 4.	.00.00	0.0	0 0.0	0 14.	004	.00.00	0.00	0.0	014.	0 <b>u</b> 4.	00.00	0.00	0.00	) 14.0	JU14.(	JW.00
Waste		Fecal Bags	10.4	20.00				10	ഹോ		000		10	ഹോ	0.00			. E 4 1	En C	100	000		E 90	ത്രം			
waste	Waste-	Winner Dree	19.0	)4 <b>U</b> .Zz	20.00	50.0	00.00	19.	040.2	2 0.0	0.0	0.00	19.	040.2	2 0.0	00.0	0.00	04.0	ງສ.0	1 0.0	00.0	0.00	009	.0950	50.00	0.00	10.00
Waste	vvaste- col	Wipes, Dry	0.51	- 0.00					- 0.0				CF	- 0 0				10	പതറ	- 0 0		0 0 00	100	അവ	- 0.0		
waste		XX7: XX7-4	0.00	0.08	0.00	0.0	00.00	0.0	5 U.U	90.0	0.0	0.00	0.5	ə 0.0	90.0	0 0.U	0.00	18.	100.2	50.0	00.0	0.00	190	.3008	0.00	0.00	10.00
Waste	Waste- col	Wipes, Wet	10.6	തവ				10	ഹതവ		000		10	ഹതവ				00	110 1	F 0 0	000		206	995 (			
vvaste	COI Waste-	Wines Toilet Tissue	10.2	ະໜ.ປະ	0.00	50.0	00.00	, 10.	∠.ນ.0	5 0.0	0.0	0.00	10.	⊿ച.0	0.0	00.U	0.00	20.4	± IJ. I	50.0	0.0.0	0.00	500	.azə:	90.00	50.00	0.00
Waste		Wipes, Toilet Tissue	9 5	200			0.0.00	19 E	200	10.04	000		25	200	400		0.00	0.00	0 1	200	000	0 0 00	100	a19			
waste	coi Waste-	Gloves	3.55	<b>0.0</b> 4	E U.U	50.0	00.00	5.5	з U.U	± U.U	0.0	0.00	5.5	<u>ы 0.0</u>	4 0.0	0 U.U	0.00	9.82	4 U.I	20.0	0.0.0	0.00	100	.0423	0.00	50.00	10.00
Waste		Gioves	5.60	10.01			0.0.00	56	0.0.0	200	000		5.6	000	12 0 0		0.00	15	ະຄຸດ	700	000	0 0 00	167	ണൗ	30.0		
vvaste	001		5.00	0.03	0.00	50.0	0.00	0.0	0.0.0	50.0	0.0	0.00	0.0	0.0.0	ы U.U	0 U.U	0.00	19.6	ງສ.0	10.0	0.0.0	0.00	107	.@9/1	0.00	0.00	10.00

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					$\mathbf{C}$					D					Е				
Sys-	Sub-	Item																									
$\mathbf{tem}$	$\mathbf{system}$		$\mathbf{M}$	v	Р	С	СТ	Μ	v	Р	С	СТ	м	V	Р	С	СТ	$\mathbf{M}$	V	Р	С	СТ	М	V	Р	С	CI
	Waste-	Fecal Bags Odor Lids																									
Waste	col		29.	450.2	8 0.0	0.0 0.0	0.00	) 29	.450.2	280.0	0.0 0.0	0 0.00	29.	450.2	80.0	0.00	0.00	81.8	3 <b>D</b> .7	70.0	0 0.0	00.00	883	.68426	6 0.00	0.00	0.0
	Waste-	Fecal Collection Canis-																									
Waste		ters	35.	060.4	60.0	0.0 0.0	0.00	) 35	.060.4	60.0	0.0 0.0	0 0.00	35.	060.4	60.0	0.00	0.00	97.4	0.2	80.0	0 0.0	0 0.00	105	11957	70.00	0.00	0.0
	Waste-	Fecal collection Canis-		<b>- - - -</b>					<b>F m c</b>				1 8	<b>- - - -</b>				40.				0 0 00		(0 <del>) -</del> 1 -		0.00	0.0.0
Waste		ters lids	17.	530.0	70.0	0.000.0	0.00	) 17	.530.0	07 0.0	0.000.0	0 0.00	17.	530.0	70.0	0.00	0.00	48.7	W.2	0 0.0	0 0.0	0.00	525	.92/15	0.00	0.00	0.0
	Waste-	Urine Prefilters		0 00 1					0.00 1				80	0 00 1				0 <b>7</b> 0				0 0 00	0.00	<b>m</b> 0.1	0.00	0.00	
Waste			30.	680.1	70.0	0.000	0.00	) 30	.680.1	7 0.0	0.0	0 0.00	30.	680.1	7 0.0	0.00	0.00	85.2	30.4	60.0	0 0.0	0.00	920	.45001	0.00	0.00	J 0.0
<b>XX</b> 7 /	Waste-	Urine Filters	4.9		100								4.9		100			10.1	<i>a</i> ∩ 1				1.01	1000		0.00	
Waste			4.3	80.0	40.0	0.00.0	0.00	) 4.3	58 U.U	94 0.0	0.0.0	0 0.00	4.3	8 0.0	40.0	0.0	0.00	12.1	. 1	00.0	00.0	0.00	131	.41906	0.00	0.00	J U.C
<b>XX</b> 7 (	Waste-	Urine Funnels	0.0											<i>.</i>	1 0 0			1 10		100			1 1/	20.01	0.00	0.00	
Waste			0.0	0 0.0	00.0	0.00	0.00	0.0	000.C	0.00.0	0.00	0 0.00	1.1	6 0.0	1 0.0	0.00	0.00	1.10	0.0	10.0	0.0	0.00	1.10	0.01	0.00	0.00	J U.U
<b>X</b> <i>T</i> <sub>2</sub>	Waste-	Flush Water Transfer	F (	100	000				100				FC	100	000	000		15 5	തര		000	0 0 00	100	ണവല		0.00	000
Waste		Bags	5.6	10.0	80.0	0.00.0	0.00	5.6	o1 0.0	0.0 80	0.0.0	0 0.00	5.6	10.0	80.0	0.00	0.00	15.5	80.2	20.0	00.0	0.00	168	.32135	0.00	0.00	0.0
<b>T</b> 7 1	TCCS-	Activated charcoal bed	0.0	-								0 0 00	0.0	700				05 5		- 0 0			070	<i>(</i> 04 = =	- 0 00	0.00	
waste	ISS-x3 TCCS-		9.2	70.0	20.0	0.00	0.00	9.2	27 0.0	02 0.0	0.00	0 0.00	9.2	7 0.0	20.0	0.00	0.00	25.7	40.0	5 0.0	0.0	0.00	278	.00457	0.00	0.00	J U.(
<b>T</b> 7 1	ISS-x4	Blower Assembly	1.0	-	1 00	7000	700 00			1 00	7000	700 00	10	-	1 60	7000	-	4.05		1 00	7000	<del>7</del> 00 00	4.05	70.01	co 7	mo r	-
waste			4.9	10.0	1 00	. 7990.	199.00	) 4.8	97 U.U	01 60.	. 7990.	790.00	4.9	10.0	1 60.	7990.	199.00	4.97	0.0	1 60.	1900.	790.00	4.9	0.01	. 60.7	900.	790.0
XX7 /	TCCS- ISS-x5	Flow Meter Assembly				റതാ	000 00				റതാ	000 00			0.00	റതര	റത്ത ററ	0.00		0.00	റതാ	0 00 00				തറ	0 000 (
waste	TCCS-	Catalatia Osiliana As	2.2	00.0	023	.0023.	.00.00	) 2.2	20 0.0	0 23.	.0023.	00.00	2.2	0 0.0	0 23.	0023.0	JW.UU	2.20	0.0	0 23.	0023.	00.00	2.20	0.00	023.0	(23.0	ງໝ.ເ
XX7 /	ISS-x6	Catalytic Oxidizer As- sembly	10	010 0	4 1 0	പണംത	4 90000	. 10	010 0	4.10	പണം	4 90000	10	010 0	410	പതതം	അററ	10.0		4 1 0	പതതം	ഞ്ഞ	10.0		104	നതം 4	ഞ
waste			16.	90.0	4 18	4.3884	1.5500	) 16	.9D.0	184	4.3884	4.33800	16.	90.0	4 184	1.3884	.3800	16.9	0.U	4 184	1.31884	.3800	16.8	<b>9D.0</b> 4	184.	3884	
<b>XX</b> 7 /	TCCS-	LiOH Sorbent Bed As-	0.0									0 0 00	0.0					1 77					10.0	0		0.00	
waste	ISS-x7 TCCS-	sembly	0.6	30.0	00.0	0.00	0.00	0.6	53 U.U	0.0	0.00	0 0.00	0.6	30.0	0 0.0	0.00	0.00	1.75	0.0	00.0	0.0	0.00	18.8	50.04	£ 0.00	0.00	J 0.0
<b>X</b> 7	ISS-x8	Electrical Interface Assembly	0.0		1 1 5	005	റത വ			1 1 7	005	രത ററ	0.0		1 1 5	0.015	പത്ര വവ	0.00		1 1 5	0	റത ററ	0.00	0.0.01	150	ar (	ഹത
Waste		MLS Filter ORU	9.0	00.0	1 15	.20.5.	20.00	9.0	0.0	1 15.	.2u ə.	20.00	9.0	00.0	1 15.	2up.	20.00	9.00	0.0	1 15.	2 <b>u</b> 5.	20.00	9.00	0.01	115.2	uə	200.0
Wa-	$H_2O$ -	MLS Filter ORU										0 0 00		<i>~</i> ~ ~ ~	1 0 0			10.0					110	an 1 -	- 0 00	0.00	
ter Wa-	rec H <sub>2</sub> O-	Particulate Filter ORU	3.3	20.0	00.0	0.00.0	0.00	13.3	52 U.U	0.00.0	0.00.0	0 0.00	3.9	0.0	1 0.0	0.0	0.00	10.9	0.0	20.0	00.0	0.00	118	. 2011 (	0.00	0.00	J U.C
	-	Particulate Filter ORU	17	റതറ	100			17	റത്ര	400			20	<b>= 0</b> 0	= 0.0	000		EC O	oran 1	100	000		619	1050	20.00	0.00	000
ter Wa-	rec H <sub>2</sub> O-	Multifiltration Dod //1	17.	210.0	40.0	0.00.0	0.00	) 17	.240.0	4 0.0	0.00.0	0 0.00	20.	340.0	5 0.0	0.0	0.00	50.c	990.I	40.0	0.0.0	0.00	012	.4600	0.00	0.00	50.0
	-	Multifiltration Bed $\#1$ + $\#2$ ORUs	0.0		000								1.05	7 17040		000		4.6.4	താറ	000	000	0 0 00	500	10001	0.00	0.00	000
ter Wa-	rec H <sub>2</sub> O-	+ #2 ORUs Sensor ORU	0.0	00.0	00.0	00.0	0.00	0.0	JU U.U	0.0	0.0.0	0 0.00	107	. 042	20.0	0.00	0.00	404.	.080	00.0	00.0	0.00	500	10801	0.00	0.00	10.0
	-	Sensor ORU	9.0	100	101	201	20.00			101	201	3 0.00	20	100	101	201	20.00	9.04		101	9.0.1	20.00	20	10.01	0.10	0.14	200
ter	rec	Dining	3.0	40.0	1 2.1	.3 2.1	30.00	5.0	04 U.U	1 2.1	.3 2.1	3 0.00	3.0	40.0	1 2.1	3 2.1	3 0.00	3.04	0.0	1 2.1	3 2.1	3 0.00	3.04	£ 0.01	2.13	2.1.	3 0.0
Wa-	$H_2O$ -	Piping	F 0	700	100				700	100		0 0 00	07	100		0.0.0		0.74		000	000	0 0 00	07	10.00		0.04	0.0.4
ter W-	rec	Dama /MLC ODU	5.3	10.0	10.0	0.00.0	0.00	1 5.3	67 U.U	0.0 10	0.00.0	0 0.00	0.7	40.0	0.0	0.0	50.00	0.74	ŧ 0.0	0.0	0.00	0.00	0.74	± 0.00	0.00	0.00	J U.I
Wa-	$H_2O$ -	Pump/MLS ORU	20	റതറ	0 5 1	1/77 1	170.00		ഹത	0 51	1771	170.00	10	400 0	C 1 C	cae	തററ	10.4	തര	C 10	<b>F</b> /1 O	<b>- 0</b> 00	10 (	തറ	10 5	ao	- m
ter W-	rec	Catalatia Davatara	30.	⊿യ.0	951	.101.	10.00	5 30	.280.0	951.	.161.	170.00	18.	420.0	0 19.	029.	5 <b>£</b> 0.00	18.4	ŧ₩.0	0 19.	э419.	<b>34</b> J.UU	18.3	sa).06	0 19.5	u9.	ວພ.(
Wa-	$H_2O$ -	Catalytic Reactor +	0.0	000	0.0.0							0 0 00	0.0	000	0 1 0	7 നത –	ത്നററ	0.00		0.105	7 /11/70-	. <del>117</del> 00	0.04		107	ame	7 mm /
ter	rec	Preheeater ORU	0.0	00.0	0.0.0	0.0.0	0.00	0.0	0.0.0	0.0 0.0	0.0 0.0	0 0.00	0.0	0.0.0	0.10.	1.9007	.2000	0.00	0.0	0 107	.4107	.40%.00	0.00	10.00	J 107.	2307	.10

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			Α					В					$\mathbf{C}$					D					Е				
Sys-	Sub-	Item			_	_		_		_					_					_					_		
tem	system		м	v	Р	С	СТ	Μ	v	Р	С	СТ	Μ	V	Р	С	СТ	м	V	Р	С	СТ	Μ	v	Р	С	Cl
Wa-	$H_2O$ -	Oxygen Filter	0.0						0000									0.00					0.0				0.0.0
ter Wa-	rec H <sub>2</sub> O-	Microbial Check Valve	0.0	00.0	0.0.0	000.0	0.00	0.0	00 0.0	0.00	0 0.0	00.00	0.0	0 0.0	0.0	0.0	0 0.00	0.00	0.0	0.0.0	0 0.0	0 0.00	0.0	0.00	0.00	0.00	0.0.0
	-	Microbial Check Valve	0.0	000	0.0.0				00.0.0		00	00.00	1 5 1	600	100		0 0 00	5 19	0.0	100	000	0 0 00	5.1	20.01			0.0.0
ter Wa-	$_{H_2O}$ -	Gas Separator ORU	0.0	00.0	00.0	00.U	0.00	0.0	000.0	0.00	00.0	JU U.UL	0.1	0.0	1 0.0	0.0	0 0.00	0.15	0.0	10.0	00.0	0.00	5.1	2 0.01	1 0.00	0.00	0.0.0
ter	rec	Gas Separator ORU	13	110.0	013	<b>)</b>	2 30300	1 / 3	2 1 10 0	0 1 3 2	) 3132	2.33B00	26	240.0	6 50	7360	730.00	26.2	ത വ	6 50	5360	530.00	26	170 06	3 50 /	1360	430.0
Wa-	$H_2O-$	Hygiene H <sub>2</sub> O Tank	40.	10.0	915	(سان، ۷	2.30000	, 40	D.(	9 132	പോക	2.3000	20.	240.0	0.50.	1.00.	1.00	20.2	.w.u	0.50.	റഎറ.	0.00	20.	10.00	0.00.4	ta)().'	±
ter	$11_{2}O$ -rec	Hygiene H <sub>2</sub> O Tank	05	റത 1	870	570	5.0.00	05		870	570	05 0.00	58	3 <i>6</i> 0 1	147	947	<u>.</u>	58.0	1 170	147	147	1 0 00	58	ວງ ທີ່ 11	1 / 71	17	100
Wa-	$H_2O-$	Product H <sub>2</sub> O Tank	90.	90.1	51.0	57.0	0.00	50		.0 1.0	57.0	55 0.00	, 99.	50.1	1 4.1	24.1	2 0.00	56.2	0.1	14.1	14.1	1 0.00	56.	240.11	14.11	4.1.	1 0.0
ter	rec	1 loudet 1120 Tank	53	070 1	078	578	5.0.00	1 53		078	579	85 0.00	1 39	8/01	252	559	5.0.00	32.7	ത 1	252	159	4 0 00	32	760 11	059/	152	100
Wa-	H <sub>2</sub> O-	Process Controller	55.	50.1	91.0	JU 1.C	0.00	, 00		31.0	01.0	55 0.00	, 52.	040.1	2 0.2	00.2	0.00	02.1	<i>w</i> .1	20.2	40.2	40.00	52.	100.12	50.25	£ 0.2	± 0.0
ter	rec	r rocess controller	36	գո ո	815	6 1195	3 17800	1 36	anc	8 156	3 1195	6.1800	36	an n	8156	6 11856	3 17800	36.0	m n	8 1 5 6	3 11956	3 17800	36	om 09	3 1 5 6	1155.6	180
Wa-	$H_2O$ -	Reactor Health Sensor	50.	30.0	510	0.100	5.1600	, 00		0 100	л. що	0.1600	, 50.	30.0	010	<b>5. ш</b> ө(	. 1600	50.5	<b>D</b> .0	0 100	л. шөл	. 1600	50.	50.00	5 100	. 11690	. 100
ter	rec	Reactor Health Sensor	86	400	4 4 7	247	20.00	181	64 O C	447	24	72 0.00	86	400	447	247	2.0.00	8 64	0.0	447	247	2.0.00	86	4 0 0/	1475	0 4 7	200
Wa-	$H_2O$	H <sub>2</sub> O Delivery System	0.0	10.0	I I.I	4 1.1	20.00	, 0.	0-10.0		2 1.	12 0.00	0.0	10.0	- <b>-</b>	2 1.1	2 0.00	0.04	. 0.0	<b>1 1</b> .1	2 1.1	2 0.00	0.0	10.0-	1 1.12	- <b>T</b> .   1	2 0.0
ter	rec	1120 Denvery System	12	070 1	125	1828	8 0 00	1 12	0701	128	82	88 0.00	26	150.0	610	310	3.0.00	26.1	nο	610	310	3.0.00	26	റത വം	3 1 05	0104	200
Wa-	WRS	Ion Exchange Bed	42.	50.1	1 2.0	0 <b>2</b> .0	0.00	, 42		1 2.0	0 2.0	50 0.00	20.	1.00.0	0 1.3	01.5	0.00	20.1	<b>D</b> .0	01.5	0 1.9	0.00	20.	0.00	1.52	1.0	2 0.0
ter	WIG	fon Exchange Ded	27	800	n n n	000		12	78.0.0	000	0.0.0	0.00	027	800	000	000	0 0 00	7 70	000	100	000	0 0 00	83	ດອງ 1 1			n n c
Wa-	Urine-	Pressure Control $+$	2.1	00.0	0.0.0	00.0	0.00	, 2.	100.0	00.0	00.	0.00	, 2.1	0 0.0	0 0.0	0.0	0 0.00	1.10	0.0	1 0.0	0 0.0	0 0.00	00.	040.11	. 0.00	0.00	0.0.0
ter	proc	Pump (PCPA)	27	140.0	45.7	357	3.0.00	) 27	7 1 40 0	457	35'	73 0.00	33	730.0	598	398	3.0.00	33.6	40.0	597	797	7 0 00	33	തെ വ	5975	597	500
Wa-	Urine-	Fluid Control + Pump	21.	1-0.0	10.1	00.1	00.00	, 21	.1-10.0	10.1	00.	10 0.00	, 00.	100.0	0.0.0	00.0	0 0.00	00.0	- <b>D</b> .0	0 0.1	1 0.1	1 0.00	00.	00.00	5.10	0.10	50.0
ter	proc	(FCPA)	27	6300	483	083	0 0 00	) 27	7 630 C	483	08:	30 0.00	34	350 0	514	2614	260 00	34.2	അറ	5.14	1814	180.00	34	210.05	5141	44	140 (
Wa-	Urine-	Recycle Filter Tank	21.	0.0	1 O.C	00.0	0.00	, 21	.00.0	- 0.0	0 0.0	50 0.00	. 04.	00.0	011.	2u -	20.00	04.2	.w.o	014.	101-1.	10.00	01.	210.00	, 1-1-1		1-0.0
ter	proc	(RFTA)	11	5500	600	000	0 0 00	) 11	550 (	600	0.0.0	0.00	14	350 0	800	000	0 0 00	14.3	20 O	800	000	0 0 00	14	ദത വഴ	3 0 00	0.0	0.0.0
Wa-	Urine-	Wastewater Storage	11.	0.0	0 0.0	00.0	00.00	, 11		0.0	0 0.	50 0.00	, 11.	0.00.0	00.0	00.0	0 0.00	1 1.0		00.0	0 0.0	0 0.00	11.	500.00	0.00	.0.0	0.0.0
ter	proc	Tank Assembly (WSTA)	28.	950.0	2.0.0	8 0.0	0.08	) 28	.950.0	20.0	8.0.0	08 0.00	35.	980.0	3.0.1	40.1	4 0.00	35.8	90.0	3.0.1	40.1	4 0.00	35.	840.05	30.14	10.14	40.0
Wa-	Urine-	Distillation Assembly	-0.	0.00.00	- 0.0		0.00			- 0.0	0 0.	0.00		0.00.0	0 0.1	1011	10.00	00.0		0 0.1	1 0.1	1 0.00	00.	2.00	, 0.1		1 0.0
ter	proc	(DA)	45.	810.0	979	3579	350.00	) 45	5.8D.C	9 79.	3579	.350.00	56.	940.1	1 1 3 6	6.7286	5.20200	56.7	<b>9</b> 0.1	1 1 3	5.4635	5.4600	56.	720.11	135	.085	. @80
Wa-	Urine-	Separator Plumbing	10.	02.0			0.00	. 10		0.0.	04.0	.00.00		0 2.1	1 10				w.1	1 10		. 2000	00.		100		
ter	proc	Assembly (SPA)	9.8	70.0	2 0.0	0.0.0	0.00	9.8	87 0.0	20.0	0.0.0	0.00	) 12.	270.0	20.0	0.0 0	0.0.00	12.2	40.0	20.0	0.0.0	0.0.00	12.	220.02	2 0.00	0.0	0.0.0
Wa-	Urine-	Power Module (Included																									
ter	proc	in FCA)	0.0	0.00	0.0.0	0.0.0	0.00	0.0	00.0.0	0.0 0	0.0.0	0.00	0.0	0.0.0	0.0.0	0.0 0	0.0.00	0.00	0.0	0.0.0	0.0.0	0.0.00	0.0	0.00	0.00	0.0	0.0.0
Wa-	Urine-	Firmware Controller											0.0					0.00	0.0				0.0				
ter	proc	Assembly (Data Module, Power Module)	24.	090.0	3 1 5	0.05	0.0900	) 24	.090.0	3 150	).0195	0.0900	24.	090.0	3 1 5 (	0.01950	0.00900	24.0	9.0	3 1 5 (	).0195(	0.00900	24.	090.03	3 150	.01550	.090
Wa-	Urine-	Piping																									
ter	proc	1 0	7.5	50.0	10.0	0.0.0	0.00	) 7.	55 0.0	010.0	0.0.0	0.00	9.3	8 0.0	20.0	0.0 0	0 0.00	9.36	0.0	20.0	0.00	0 0.00	9.3	40.02	2 0.00	0.00	0.0
Wa-	1	Catalytic Reactor $+$				5 576							0.0					0.00					0.0	0.0	0.00		
ter	Volatile-	Preheater ORU	0.0	0.00	0 90	4890	480.00	0.0	00 0.0	0 90.	4890	.480.00	0.0	0.0.0	0 90.	4890.	480.00	0.00	0.0	0 90.	4890.	480.00	0.0	0.00	90.4	1890.4	480.0
	rem		0.0										0.0				2.50	0.00	0.0		- J.	2.50	0.0			200	

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					$\mathbf{C}$					D					Е				
Sys-	Sub-	Item																									
tem	$\mathbf{system}$		Μ	v	Р	С	СТ	Μ	1 V	Р	С	СТ	м	V	Р	$\mathbf{C}$	СТ	М	V	Р	С	СТ	м	v	Р	С	СТ
Wa- ter	Volatile-	Gas Separator ORU	94	= 0 0	E 19	E /10	E 0 0	0.9	4.540.0	E 49	E // O	<b>- 1</b> 0 00	94.	- 0 05	: 49	E // O E	<b>. .</b>	94 5		E 49	E /11 O	E 10 00	0.04	= 0 0	= 49 =	สาย	- 0 0
Jer	rem		24.	540.0	042	.3412	.540.00	0 24	4.540.0	5 42.	04 <b>1</b> 2.	540.00	24.0	<b>340.</b> 00	) 42.	0412.0	<b>40.00</b>	24.0	40.0	5 42.	04 <b>1</b> 2.	340.00	) 24.	340.0	942.0	04HZ.(	940.00
Wa-	rem	Oxygen Filter																									
er	Volatile-		0.0	0.00	0 0.0	0.0 0	0.0 0.0	0 0.	.00 0.0	0.00	0.00	0 0.00	0.00	0.00	0.0	0 0.00	0.00	0.00	0.0	0.00	0.00	0.00	0.0	0.00	0.00	0.00	0.0
	rem																										
Wa-		Piping																									
ter	Volatile-		1.2	60.0	0 0.0	0.0 0.0	0.0 0.0	0 1.	.26 0.0	0.00	0 0.0	0 0.00	1.26	6 0.00	0.0	0 0.00	0.00	1.26	60.0	0.00	0 0.0	0.00	) 1.2	6 0.0	0 0.00	0.00	) 0.00
Wa-	rem Tank	Product H <sub>2</sub> O Tank																									
ter	Talik	1 loduct 1120 Tank	101	1 103	613	653	650 0	0 10	01.123	613	653	650 00	84.9	<b>2</b> 70 30	11	6411.6	340.00	137	ന്തു4	918	078	0 <b>7</b> 0 00	037	7 <u>/</u> 833	3 1 1 6	41816	4080
Wa-	Tank	$H_2O$ Stored	101	1.120	010	.040	.00.0	0 10	01.020	0 10.	040.	000.00	04.0	540.00	, 11.	0-11.0	<b>-D</b> .00	101	.001	5 10.	010.	00.00	, 501	000	5 1 1 0	-11010	000
ter			256	5. <b>99</b> 0	0 0.	0.0 0.0	0.0 0.0	0 25	56. <b>9</b> 90	0.00	0.00	0 0.00	205	.3600	0.0	0 0.00	0.00	370	<b>3</b> 50	0.00	0.00	0.00	289	)700 <b>8</b>	0.00	0.00	0.0
Food	Food-	Packaging																									
	storage		0.0	0.00	0 0.0	0.0 0.0	0.0 0.0	0 0.	.00 0.0	0.00	0.00	00.00	990	.@000	0.0	0 0.00	0.00	270	7030	0.00	0.00	0.00	) 290	004.8	<b>5</b> 0.00	0.00	0.0
Food	Food-	Lockers/Storage																									
I	storage	Debudanting Unit and	218	3.860	5 0.0	0.0 0.0	0.00	0 2	18.860	5 0.0	0.00	0.00	242	.7639	0.0	0 0.00	0.00	663	.882	60.0	0.00	0.00	) 711	2998	240.00	0.00	) 0.00
Food	Food-	Rehydration Unit and g Conduction Oven	36	ദയ വ	0.06	റത്ത	റ ത്നവ	0.36	6. <b>30</b> .0	0.060	നങ്ങ	ത്നററ	36 9	2ത വ	10	ou o o	ന ന	36.5	തറ	0.10	ono	റത വ	1 36	ദത വ	0 10 0	nu o o	പത്ര വ
	CCAA	Inlet ORU	50.	50.0	3 30	0.000	0.000	0 50	0.30.0	9 900			50.0	50.08	910.	000.0	JW.00	JU.C	w.u	9 10.	outo.	0.00	, 30.	50.0	910.0	uu.	10.00
Ther-	001111	miller office	0.0	0.00	0.31	2.64	2.640	0 0.	.00 0.0	0.312	2.634.2	2.60400	0.00	0.00	) 299	). <b>23</b> 99	. <b>2</b> B00	0.00	0.0	0 299	.02899	9.0800	0.0	0.00	0 299	.02099	.@DO
mal																											
	CCAA	Condensing Heat Ex-																									
Ther-		changer	37.	690.0	70.0	0.0 0.0	0.0 0.0	0 37	7.690.0	70.0	0.00	0 0.00	34.9	9D.07	70.0	0 0.00	0.00	34.9	0.0	70.0	0.00	0.00	) 34.	890.0	7 0.00	0.00	) 0.0
mal	CCL A																										
Ther-	CCAA	Water Separator	6.4	100	4 1 0	100	1ത വ	06	.410.0	4 10	100	1 ത ററ	5.2	100/	199	0990		5 20		499	599	50.00	1 5 2	000	199	199/	100
mal			0.4	10.0	410	.1910	.130.00	0 0.	.41 0.0	4 10.	1910.	130.00	0.0.	1 0.04	± 0.0	00.00	50.00	0.50	0.0	40.0	00.0	50.00	) 0.0	0.0.0	± 0.04	10.04	10.00
mai	CCAA	Temp. $Control + Check$																									
Ther-		Valve	4.0	90.0	30.	0.0 0.0	0.0	0 4.	.09 0.0	3 0.0	6 0.0	6 0.00	3.89	90.03	30.0	6 0.06	60.00	3.89	0.0	30.0	60.0	6 0.00	3.8	9 0.0	3 0.06	6 0.06	3 0.0
mal																											
	CCAA	Electrical Interface Box																									
Ther-		(EIB)	4.1	0.00	18.0	00 8.0	0.0 0.0	0 4.	.10 0.0	18.0	08.0	0 0.00	4.10	0.01	18.0	08.00	0.00	4.10	0.0	18.0	08.0	0 0.00	) 4.1	0 0.0	18.00	08.00	) 0.0
mal	CCAA	There are free and																									
Ther-	CCAA	Temp. Sensor	0.2	400	001	11.0.0	11.0.0	0 0	.24 0.0		100	1 0 00	0.2/	1 0 00		1001		0.9/		000	100	10.00		400	0.0.01	0.01	
mal			0.2	± 0.0	00.	51 0.0	JI 0.0	0 0.	.240.0	0.00	10.0	1 0.00	0.24	± 0.00	, 0.0	1 0.01	10.00	0.24	E U.U	0.00	10.0	10.00	, 0.2	ч U.U	0.0.0	0.01	. 0.00
	CCAA	Liquid Sensor																									
Ther-		-	0.4	70.0	0 0.0	01 0.0	01 0.0	0 0.	.470.0	0.00	10.0	1 0.00	0.4'	7 0.00	0.0	1 0.01	0.00	0.47	0.0	0.00	10.0	10.00	0.4	70.0	0.00	0.01	L 0.0
$_{\mathrm{mal}}$																											

**Table S21:** ESM parameters for all inventory items broken down by system and subsystem for each scenario described in Table S20. Parameters included are mass M [kg], V [m<sup>3</sup>], power P [kW], cooling C [kW], and crew-time CT [hr][17, 317]. The ESM values correspond to a single sortie  $S_{\text{num}} = 1$ . (ORU = Orbital Replacement Unit)

			А					В					$\mathbf{C}$					D					Е				
Sys- tem	Sub- system	Item	м	v	Р	С	СТ	Μ	ı v	Р	С	СТ	м	v	Р	С	СТ	м	v	Р	С	СТ	м	v	Р	С	СТ
Ther-	ĊCAA	Fan Delta P Sensor	0.40	0.00	0.2	00.2	0 0.00	0.0.	40 0.	00 0.2	20 0.2	0 0.00	0.4	0 0.0	0 0.2	200.2	0 0.0	0.4	00.0	00 0.2	200.2	0 0.00	0.4	0 0.0	0 0.2	200.2	0 0.0
$_{\mathrm{mal}}$																											
Ther-	CCAA	Pressure Sensor	0.90		109	009	0 0 00		20.0		0009	0 0.00	0.0	000	0.0.9	000		109	000		000			000	0.0.6	0009	000
mal			0.50	0.00	0.2	00.2	00.00	, 0.	30 0.	00.2	20 0.2	0 0.00	0.5	0 0.0	00.2	00.2	0.00	0.5	00.0	000.2	00.2	00.00	0.5	0.0	00.2	20 0.2	0 0.0
	Atmos-	HEPA Filter Element																									
Ther-	$\operatorname{cont}$		49.2	20.19	90.0	0.00	0 0.99	9 49	9.2 <b>2</b> ).	19 0.0	0.0 0.0	0 0.99	49.	2 <b>2</b> 0.1	9 0.0	0.00	0 0.99	9 49.	2 <b>D</b> .	190.0	0.00	02.74	4 49.	2 <b>2</b> 0.1	9 0.0	0.0 0.0	0 29.
mal	Atmos-	Catalytic Filter Element																									
Ther-	cont	Cutary the Philton Element	54.0	0.00	30.0	0.00	0 0.00	) 54	4.0 <b>@</b> .	0.0 80.0	0.0 0.0	0 0.00	54.	00.0	8 0.0	0.00	0 0.0	) 54.	00.	0.080.0	0.00	0 0.00	) 54.	00.0	8 0.0	0.0 0.0	0 0.0
$\operatorname{mal}$																											
Ther-	Atmosph	IMV Fan	4 77	7 N N <sup>.</sup>	155	0645	റത ററ	1	77.0	11 55	005	00.00	17	700	11 55	005	റത വ	1 4 7	700	11 55	0055	റത്ര വ	1 4 7	700	1 5 5	0055	റത റ
mal	circ	lei e-	4.11	0.0.	1 00.	000.	00.00	, 4.	110.	1 00	.000	00.00	4.1	1 0.0	1 00.	.000.	0.00	9 4.7	10.0	11 00	.000.	0.00	9 4.1	1 0.0	1 00	.000.	00.0
		IMV Valve																									
Ther-	Atmosph	ere-	5.10	0.0	16.0	06.0	0 0.00	) 5.	100.	016.0	0.6.0	0 0.00	5.1	0 0.0	016.0	0.6.0	0 0.0	) 5.1	0 0.0	016.0	0.6.0	0 0.00	) 5.1	0 0.0	16.0	00 6.0	0 0.0
mal	circ AAA	Avionics Air Assembly																									
Ther-	11111	Twiomes The Assembly	12.4	0.0	3175	5.0075	5.00000	) 12	2.400.	03 17	5.007	5.0000	12.	400.0	317	5.0075	5. <b>000</b> 0	) 12.	40.0	03 17	5.0075	5.0000	) 12.	400.0	317	5.0078	5. <b>000</b> 0
$\operatorname{mal}$																											
Ther-	ITCS	ITCS	011	അവ	- <b>0</b> 5			0.01	പതാ	00.05	orora		011	അറ	COL	orora		0.010		00.05	orore	FOIA	0.017	7 തനറ	c 9c	com	ഫെര
mal			211	.8830	5 258	55260	SOLOC	121	11.88	50 258	85268	8501 <b>0</b> 0	211	ഷാാ	0 258	55260	5010	) 212	2.49	50 25	90 <b>2</b> 04	950400	) 21	1.1133	0 20	092004	99090

System	Subsys- tem	Item	Struc- tural Metal	Plas- tic	Elec- tron- ics	Fab- ric	Glass	Rub- ber	Ce- ram- ics	Gas	Bion	Wa- nasster	Other
Air	APC	Vent/Relief Valve	1	0	0	0	0	0	0	0	0	0	0
Air	APC	Pressure Control Panel	0.2	0.1	0.7	0	0	0	0	0	0	0	0
Air	APC	Manual Pressure Equalization Valve	1	0	0	0	0	0	0	0	0	0	0
Air	APC	Positive Pressure Relief Valve	1	0	0	0	0	0	0	0	0	0	0

System	Subsys- tem	Item	Struc- tural Metal	Plas- tic	Elec- tron- ics	Fab- ric	Glass	Rub- ber	Ce- ram- ics	Gas	Bion	Wa- nasster	Other
Air	APC	Negative Pressure Relief Valve	1	0	0	0	0	0	0	0	0	0	0
Air	APC	Nitrogen Interface Assembly	1	0	0	0	0	0	0	0	0	0	0
Air	APC	Vacuum Access Jumper 5-ft	0	0	1	0	0	0	0	0	0	0	0
Air	APC	Vacuum Access Jumper 35-ft	0	0	1	0	0	0	0	0	0	0	0
Air	ACMA	Verification Gas Assembly	0.5	0	0	0	0	0	0	0.5	0	0	0
Air	ACMA	Mass Spectrometer	0.5	0	0.5	0	0	0	0	0	0	0	0
Air	ACMA	Sample Pump	1	0	0	0	0	0	0	0	0	0	0
Air	ACMA	Sample Distributor	0.95	0	0	0.05	0	0	0	0	0	0	0
Air	ACMA	Data + Control	0.5	0	0.5	0	0	0	0	0	0	0	0
Air	ACMA	Low Volt. Power supply	0.7	0	0	0	0	0.1	0.1	0	0	0	0.1
Air	ACMA	Chassis	1	0	0	0	0	0	0	0	0	0	0
Air	ACMA	Inlet Valve Assembly	0.9	0	0	0.01	0	0	0	0	0	0.09	0
Air	ACMA	EMI Filter	0.98	0.02	0	0	0	0	0	0	0	0	0
Air	SDS	3-way Solenoid Valves	1	0	0	0	0	0	0	0	0	0	0
Air	SDS	Manual Valves	1	0	0	0	0	0	0	0	0	0	0
Air	SDS	Sample Probes	1	0	0	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Air Selector Valve	0.9	0	0	0	0	0	0	0.1	0	0	0
Air	$CO_2$ -rem	Desiccant Bed	0.4	0	0	0	0	0	0.6	0	0	0	0
Air	$CO_2$ -rem	Adsorbent Bed	0.5	0	0	0.2	0	0	0.3	0	0	0	0
Air	$CO_2$ -rem	Air Check Valve	1	0	0	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Heater Controller	0.8	0	0.2	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Air Blower	1	0	0	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Pre-cooler	1	0	0	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Blower/Pre-cooler Motor Controller	0.6	0	0.4	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	$CO_2$ Pump	0.99	0	0	0	0	0	0	0	0	0	0.01
Air	$CO_2$ -rem	$CO_2$ Pump Motor Controller	0.3	0	0.7	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Temperature Sensor	0	0	0.6	0	0.4	0	0	0	0	0	0
Air	$CO_2$ -rem	Differential Pressure Sensor	0.1	0.25	0.65	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Absolute Pressure Sensor	0.75	0	0	0	0	0	0.25	0	0	0	0
Air	$CO_2$ -rem	Electrical Harness	0.9	0.05	0	0.05	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Plumbing	1	0	0	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Support Structure	1	0	0	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Fluid Disconnects	1	0	0	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Electronics Cold-Plate	1	0	0	0	0	0	0	0	0	0	0
Air	$CO_2$ -rem	Electronics Interface Plate	1	0	0	0	0	0	0	0	0	0	0
Air	$N_2$	MD Shield Instl	1	0	0	0	0	0	0	0	0	0	0
Air	$N_2$	Multilayer Insulation Assembly-T $\#1$	1	0	0	0	0	0	0	0	0	0	0
Air	$N_2$	Multilayer Insulation Assembly-T $\#2$	1	0	0	0	0	0	0	0	0	0	0
Air	$N_2$	Primary Structure Assembly-HPG ORU	0.5	0	0	0	0	0	0	0.5	0	0	0

System	Subsys- tem	Item	Struc- tural Metal	Plas- tic	Elec- tron- ics	Fab- ric	Glass	Rub- ber	Ce- ram- ics	Gas	Bion	Wa- nasster	Other
Air	N <sub>2</sub>	Tank ORU Assembly	1	0	0	0	0	0	0	0	0	0	0
Air	$N_2$	Utilities Installation - $O_2/N_2$ Tank	0.5	0	0	0	0	0	0	0.5	0	0	0
Air	$N_2$	$N_2$ Bare Tank	0.9	0	0	0	0	0.05	0	0.05	0	0	0
Air	$N_2$	HPGA Fluid	0	0	0	0	0	0	0	0	0	1	0
Air	$N_2$	Handhold, top mounted	0	1	0	0	0	0	0	0	0	0	0
Air	$N_2$	Handrail 21.941 in custom	0	1	0	0	0	0	0	0	0	0	0
Air	$N_2$	Handrail, top mounted	0	1	0	0	0	0	0	0	0	0	0
Air	$N_2$	Grapple Fixture, flt releasable	0.5	0	0.5	0	0	0	0	0	0	0	0
Air	$N_2$	Accessories	0	0	0	0	0	0	0	0	0	0	0
Air	$O_2$	MD Shield Instl	1	0	0	0	0	0	0	0	0	0	0
Air	$O_2$	Multilayer Insulation Assembly-T $\#1$	1	0	0	0	0	0	0	0	0	0	0
Air	$\overline{O_2}$	Multilayer Insulation Assembly-T $#2$	1	0	0	0	0	0	0	0	0	0	0
Air	$O_2$	Primary Structure Assembly-HPG ORU	0.5	0	0	0	0	0	0	0.5	0	0	0
Air	$O_2$	Tank ORU Assembly	1	0	0	0	0	0	0	0	0	0	0
Air	$\tilde{O_2}$	Utilities Installation - $O_2/N_2$ Tank	0.5	0	0	0	0	0	0	0.5	0	0	0
Air	$O_2$	$O_2$ Bare Tank	0.95	0	0	0	0	0	0	0.05	0	0	0
Air	$\tilde{O_2}$	HPGA Fluid	0	0	0	0	0	0	0	0	0	1	0
Air	$\tilde{O_2}$	Handhold, top mounted	0	1	0	0	0	0	0	0	0	0	0
Air	$O_2$	Handrail 21.941 in custom	0	1	0	0	0	0	0	0	0	0	0
Air	$\overline{O_2}$	Handrail, top mounted	0	1	0	0	0	0	0	0	0	0	0
Air	$O_2$	Grapple Fixture, flt releasable	0.5	0	0.5	0	0	0	0	0	0	0	0
Air	$O_2$	Accessories	0	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Condensing Heat Exchanger	0.9	0	0.1	0	0	0	0	0	0	0	0
Air	Sabatier	AAA Heat Exchanger	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	ITCS Coolant Water Inlet QD	1	Õ	0	Ő	0	0	Õ	0	Õ	Õ	Ő
Air	Sabatier	ITCS Coolant Water Outlet QD	1	Õ	0	Ő	0	0	Õ	0	Õ	Õ	Ő
Air	Sabatier	Heat Exchanger Inlet Temp	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Heat Exchanger Outlet Temp	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Manifold, $CO_2$	0.95	0.05	0	0	0	0	Õ	0	Õ	Õ	Ő
Air	Sabatier	$CO_2$ Inlet Check Valve	0.9	0.1	õ	õ	Ő	õ	Õ	õ	Õ	Ő	õ
Air	Sabatier	$CO_2$ Inlet Filter	1	0	õ	õ	Ő	õ	Õ	õ	Õ	Ő	õ
Air	Sabatier	Pressure Sensor, CO <sub>2</sub> Inlet	0	0	0.6	0	0.4	0	0	0	0	0	0
Air	Sabatier	$CO_2$ Inlet QD	1	0	0.0	0	0.4	0	0	0	0	0	0
Air	Sabatier	$CO_2$ Inlet $QD$ $CO_2$ Inlet Regulator	0.9	0.05	0	0	0.05	0	0	0	0	0	0
Air	Sabatier	$CO_2$ Inlet NC Solenoid	1	0.00	0	0	0.00	0	0	0	0	0	0
Air	Sabatier	$CO_2$ Inlet Flow Control	0.85	0.05	0	0	0.1	0	0	0	0	0	0
Air	Sabatier	$CO_2$ Flow Control Orifice	1	0.05	0	0	0.1	0	0	0	0	0	0
Air	Sabatier	Delta P Sensor, Flow Sensor CO <sub>2</sub>	0	0	0.6	0	0.4	0	0	0	0	0	0

System	Subsys- tem	Item	Struc- tural Metal	Plas- tic	Elec- tron- ics	Fab- ric	Glass	Rub- ber	Ce- ram- ics	Gas	Bion	Wa- nasster	Other
Air	Sabatier	CO <sub>2</sub> Flow Meter Orifice	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Manifold, Hydrogen	0.95	0.05	0	0	0	0	0	0	0	0	0
Air	Sabatier	Water Outlet Quick Disconnect	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Hydrogen Inlet Check Valve	0.9	0.1	0	0	0	0	0	0	0	0	0
Air	Sabatier	Hydrogen Inlet Filter	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	H <sub>2</sub> O Outlet Pressure Sensor	0	0	0.6	0	0.4	0	0	0	0	0	0
Air	Sabatier	Hydrogen Inlet Quick Disconnect	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Hydrogen Inlet NC Solenoid	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Delta P Sensor, Flow Sensor H <sub>2</sub>	0	0	0.6	0	0.4	0	0	0	0	0	0
Air	Sabatier	H <sub>2</sub> Flow Meter Orifice	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Manifold, Vent	0.95	0.05	0	0	0	0	0	0	0	0	0
Air	Sabatier	Liquid Sensor	0	0.5	0.5	0	0	0	0	0	0	0	0
Air	Sabatier	Vent Pressure Sensor	0	0	0.6	0	0.4	0	0	0	0	0	0
Air	Sabatier	Vent Outlet Quick Disconnect	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Vent Regulator	0.9	0.05	0	0	0.05	0	0	0	0	0	0
Air	Sabatier	Vent Relief/Check #1	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Vent Relief/Check $\#2$	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Vent Outlet NO Solenoid	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Water Pressure Sensor	0	0	0.6	0	0.4	0	0	0	0	0	0
Air	Sabatier	Water Relief	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Water Outlet NC Solenoid	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Rotary Water Separator Assembly	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Sabatier Reactor Assembly	0.9	0	0.1	0	0	0	0	0	0	0	0
Air	Sabatier	Structure (A/R)	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Miscellaneous Hardware (clamps, bolts, etc.) (A/R)	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Air Cooling NC Solenoid	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Air Inlet Filter	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Air Sabatier Orifice	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Heat Exchanger Inlet Duct	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Heat Exchanger Outlet Duct	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Reactor Inlet Duct	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Reactor Outlet Duct	1	0	0	0	0	0	0	0	0	0	0
Air	Sabatier	Tubing $(A/R)$	1	0	0	Õ	Õ	Õ	Õ	Õ	0	Õ	Õ
Air	Sabatier	Harnesses	0.9	0.05	0	0.05	Õ	Õ	Õ	Õ	0	Õ	Õ
Air	Sabatier	Valves + Sensors' Total Power	0	0	1	0	Õ	Õ	Õ	Õ	0	Õ	0
Air	Sabatier	Mechanical Compressor ORU	0.9	0.1	0	0	0	Õ	Ő	Õ	Ő	Õ	-
Air	Sabatier	Compressor Manifold Assembly	0.95	0.05	0	0	0	0	0	0	0	0	$\begin{array}{c} 0.001 \\ 0 \end{array}$

**Table S22:** Estimation of inventory items into exemplar classes broken down by system and subsystem for each scenario described in Table S20. Classes include: Structural Metal, Plastic, Electronics, Fabric, Glass, Rubber, Ceramics, Gas, Biomass, Water, Other. (ORU = Orbital Replacement Unit)

System	Subsys- tem	Item	Struc- tural Metal	Plas- tic	Elec- tron- ics	Fab- ric	Glass	Rub- ber	Ce- ram- ics	Gas	Bion	Wa- nasster	Other
Air	Sabatier	Controller Assembly	0	0.2	0.8	0	0	0	0	0	0	0	0
Air	Sabatier	$CO_2$ Accumulator	1	0	0	0	0	0	0	0	0	0	0
Air	$O_2$ -gen	Deionizing Bed ORU (Inlet)	0.05	0.15	0	0	0	0	0	0	0	0	0.8
Air	$O_2$ -gen	Deionizing Bed ORU (Recirculating)	0.05	0.15	0	0	0	0	0	0	0	0	0.8
Air	$O_2$ -gen	Oxygen/Water ORU	0.33	0	0	0	0	0	0	0.33	0	0.33	0
Air	$O_2$ -gen	Pump ORU	1	0	0	0	0	0	0	0	0	0	0
Air	$O_2$ -gen	Oxygen Phase Separator ORU	1	0	0	0	0	0	0	0	0	0	0
Air	$O_2$ -gen	Hydrogen ORU	1	0	0	0	0	0	0	0	0	0	0
Air	$O_2$ -gen	Hydrogen Sensor ORU	1	0	0	0	0	0	0	0	0	0	0
Air	O <sub>2</sub> -gen	Process Controller	0.3	0.001	0.7	0	0	0	0	0	0	0	0
Air	O <sub>2</sub> -gen	Power Supply Module (PSM)	0.7	0	0	0	0	0.1	0.1	0	0	0	0.1
Air	Fire-det- sup	Fire Detection Assembly	0.05	0.9	0.05	0	0	0	0	0	0	0	0
Air	Fire-det- sup	Portable Fire Extinguisher	0.6	0	0	0	0	0	0	0.2	0	0	0.2
Air	$ACO_2R$	Regenerator 1	0.98	0.01	0	0	0.01	0	0	0	0	0	0
Air	$ACO_2R$	Metox Canisters	1	0	0	0	0	0	0	0	0	0	0
Air	TCCS- ISS	Activated Charcoal Bed	0	0.5	0	0	0	0	0.5	0	0	0	0
Air	TCCS- ISS	Blower Assembly	0.8	0	0.2	0	0	0	0	0	0	0	0
Air	TCCS- ISS	Flow Meter Assembly	0.7	0.1	0.1	0	0.1	0	0	0	0	0	0
Air	TCCS- ISS	Catalytic Oxidizer Assembly	1	0	0	0	0	0	0	0	0	0	0
Air	TCCS- ISS	LiOH Sorbent Bed Assembly	0.07	0.03	0	0	0	0	0.9	0	0	0	0
Air	TCCS- ISS	Electrical interface assembly	0	0	1	0	0	0	0	0	0	0	0
Waste	PMWC	Aluminum Compaction cylinder	1	0	0	0	0	0	0	0	0	0	0
Waste	PMWC	Band-type heating unit	0.9	õ	õ	õ	ů 0	Õ	0.1	Ő	Õ	Õ	Õ
Waste	PMWC	Lightweight, Oil-Less, Compressor/- Vacuum Pump	0.9	0	0.1	0	0	0	0	0	0	0	0
Waste	PMWC	Temperature Sensor	0	0	0.6	0	0.4	0	0	0	0	0	0
Waste	PMWC	Pressure Sensor	0.1	0.25	0.65	0	0	0	0	0	0	0	0
Waste	PMWC	Housing $+$ Mounting Equipment	1	0	0	0	0	0	0	0	0	0	0
Waste	PMWC	Condensing Heat Exchanger	1	0	0	0	0	0	0	0	0	0	0
Waste	PMWC	Cooling system	1	0	0	0	0	0	0	0	0	0	0

**Table S22:** Estimation of inventory items into exemplar classes broken down by system and subsystem for each scenario described in Table S20. Classes include: Structural Metal, Plastic, Electronics, Fabric, Glass, Rubber, Ceramics, Gas, Biomass, Water, Other. (ORU = Orbital Replacement Unit)

System	${f Subsys-}$ tem	Item	Struc- tural Metal	Plas- tic	Elec- tron- ics	Fab- ric	Glass	Rub- ber	Ce- ram- ics	Gas	Bion	Wa- nasster	Other
Waste	Waste-	Low Density PolyEthylene Box	0	1	0	0	0	0	0	0	0	0	0
	storage		0		0	0	0	0	0	0	0	0	0
Waste	Waste-col	Commode/Urinal	0	1	0	0	0	0	0	0	0	0	0
Waste	Waste-col	Fan	1	0	0	0	0	0	0	0	0	0	0
Waste	Waste-col	Urine Separator	0.9	0	0.09	0.01	0	0	0	0	0	0	0
Waste	Waste-col	Urine Vent Heater	1	0	0	0	0	0	0	0	0	0	0
Waste	Waste-col	Fecal Bags	0	0	0	1	0	0	0	0	0	0	0
Waste	Waste-col	Wipes, Dry	0	0	0	1	0	0	0	0	0	0	0
Waste	Waste-col	Wipes, Wet	0	0	0	0.6	0	0	0	0	0	0.4	0
Waste	Waste-col	Wipes, Toilet Tissue	0	0	0	0	0	0	0	0	0	0	1
Waste	Waste-col	Gloves	0	1	0	0	0	0	0	0	0	0	0
Waste	Waste-col	Fecal Bags Odor Lids	0	1	0	0	0	0	0	0	0	0	0
Waste	Waste-col	Fecal collection Canisters	0	0.9	0	0.1	0	0	0	0	0	0	0
Waste	Waste-col	Fecal collection Canisters lids	0	1	0	0	0	0	0	0	0	0	0
Waste	Waste-col	Urine Prefilters	1	0	0	0	0	0	0	0	0	0	0
Waste	Waste-col	Urine Filters	0	0	0	1	0	0	0	0	0	0	0
Waste	Waste-col	Urine Funnels	1	0	0	0	0	0	0	0	0	0	0
Waste	Waste-col	Flush Water Transfer Bags	0	0.3	0	0.7	0	0	0	0	0	0	0
Waste	TCCS- ISS-x3	Activated Charcoal Bed	0	0.5	0	0	0	0	0	0	0	0	0.5
Waste	TCCS- ISS-x4	Blower Assembly	0.8	0	0.2	0	0	0	0	0	0	0	0
Waste	TCCS- ISS-x5	Flow Meter Assembly	0.7	0.1	0.1	0	0.1	0	0	0	0	0	0
Waste	TCCS- ISS-x6	Catalytic Oxidizer Assembly	1	0	0	0	0	0	0	0	0	0	0
Waste	TCCS- ISS-x7	LiOH Sorbent Bed Assembly	0.07	0.03	0	0	0	0	0.9	0	0	0	0
Waste	TCCS- ISS-x8	Electrical Interface Assembly	0	0	1	0	0	0	0	0	0	0	0
Water	Water-rec	MLS Filter ORU	0.5	0	0.5	0	0	0	0	0	0	0	0
Water	Water-rec	Particulate Filter ORU	0.9	0	0	0	0	0	0	0	0	0	0.1
Water	Water-rec	Multifiltration Bed $\#1 + \#2$ ORUs	0.07	0.03	0	0	0	0	0	0	0	0.9	0
Water	Water-rec	Sensor ORU	0	0.6	0.2	Õ	0.2	Õ	0	Õ	Õ	0	Õ
Water	Water-rec	Piping	1	0	0	Õ	0	Ő	õ	Õ	Õ	õ	Õ
Water	Water-rec	Pump/MLS ORU	0.5	Ő	0.5	Õ	Ő	Ő	õ	Õ	Õ	õ	Õ
Water	Water-rec	Catalytic Reactor $+$ Preheater ORU	1	0	0	0	Ő	Ő	õ	Õ	Õ	õ	Õ
Water	Water-rec	Oxygen Filter	0.5	0.5	0	0	0	0	0	0	0	0	0
Water	Water-rec	Microbial Check Valve	0.99	0.0	0	0	0	0	0	0	0	0	0.01

System	Subsys- tem	Item	Struc- tural Metal	Plas- tic	Elec- tron- ics	Fab- ric	Glass	Rub- ber	Ce- ram- ics	Gas	Biom	Wa- asster	Other
Water	Water-rec	Gas Separator ORU	0.9	0.1	0	0	0	0	0	0	0	0	
													0.001
Water	Water-rec	Hygiene $H_2O$ Tank	0	1	0	0	0	0	0	0	0	0	0
Water	Water-rec	Product H <sub>2</sub> O Tank	0	1	0	0	0	0	0	0	0	0	0
Water	Water-rec	Process Controller	0.3	0.001	0.7	0	0	0	0	0	0	0	0
Water	Water-rec	Reactor Health Sensor	0.1	0.001 0.2	0.6	0	0	0	0.1	0	0	0	0
Water	Water-rec	$H_2O$ Delivery System	0.9	0	0	0	0	0.1	0	0	Õ	0	0
Water	Urine- proc	Pressure Control + Pump (PCPA)	0.7	0.2	0.1	0	0	0	0	0	0	0	0
Water	Urine- proc	Fluid Control + Pump (FCPA)	0.7	0.2	0.1	0	0	0	0	0	0	0	0
Water	Urine- proc	Recycle Filter Tank (RFTA)	0	1	0	0	0	0	0	0	0	0	0
Water	Urine- proc	Wastewater Storage Tank Assembly (WSTA)	1	0	0	0	0	0	0	0	0	0	0
Water	Urine- proc	Distillation Assembly (DA)	0.6	0	0.1	0	0.3	0	0	0	0	0	0
Water	Urine- proc	Separator Plumbing Assembly (SPA)	0.99	0.01	0	0	0	0	0	0	0	0	0
Water	Urine- proc	Power Module (Included in FCA)	0	0	0	0	0	0	0	0	0	0	0
Water	Urine- proc	Firmware Controller Assembly (Data Module, Power Module)	0.8	0	0.2	0	0	0	0	0	0	0	0
Water	Urine- proc	Piping	1	0	0	0	0	0	0	0	0	0	0
Water	Volatile- rem	Catalytic Reactor + Preheater ORU	1	0	0	0	0	0	0	0	0	0	0
Water	Volatile- rem	Gas Separator ORU	0.9	0.1	0	0	0	0	0	0	0	0	0.001
Water	Volatile- rem	Oxygen Filter	0.5	0.5	0	0	0	0	0	0	0	0	0
Water	Volatile- rem	Piping	1	0	0	0	0	0	0	0	0	0	0
Water	Tank	Product $H_2O$ Tank	0	1	0	0	0	0	0	0	0	0	0
Water	Tank	$H_2O$ Stored	0	0	0	0	0	0	0	0	0	1	0
Food	Food-stor	Lockers	0.25	0.25	0	0	0	0	0	0	0.5	0	0
Food	Food- proc	Rehydration Unit and Conduction Oven	0.7	0.05	0.25	0	0	0	0	0	0	0	0

System	Subsys- tem	Item	Struc- tural Metal	Plas- tic	Elec- tron- ics	Fab- ric	Glass	Rub- Glass ber		Gas	Bion	Wa- nasster	Other
Thermal	CCAA	Inlet ORU	1	0	0	0	0	0	0	0	0	0	0
Thermal	CCAA	Condensing Heat Exchanger	1	0	0	0	0	0	0	0	0	0	0
Thermal	CCAA	Water Separator	0.99	0	0	0	0	0	0	0	0	0	0.01
Thermal	CCAA	Temp Control $+$ Check Valve	0.8	0.15	0	0.05	0	0	0	0	0	0	0
Thermal	CCAA	Electrical Interface Box (EIB)	0.9	0	0.1	0	0	0	0	0	0	0	0
Thermal	CCAA	Temp Sensor	0	0	0.6	0	0.4	0	0	0	0	0	0
Thermal	CCAA	Liquid Sensor	0	0.5	0.5	0	0	0	0	0	0	0	0
Thermal	CCAA	Fan Delta P Sensor	0.9	0	0.1	0	0	0	0	0	0	0	0
Thermal	CCAA	Pressure Sensor	0.1	0.25	0.65	0	0	0	0	0	0	0	0
Thermal	Atmos- con	HEPA Filter Element	0.7	0	0	0	0.3	0	0	0	0	0	0
Thermal	Atmos- con	Catalytic Filter Element	0	0.7	0	0.3	0	0	0	0	0	0	0
Thermal	Atmos- circ	IMV Fan	0.9	0.05	0	0.05	0	0	0	0	0	0	0
Thermal	Atmos- circ	IMV Valve	1	0	0	0	0	0	0	0	0	0	0
Thermal	AAA	Avionics Air Assembly	0.8	0.1	0	0.1	0	0	0	0	0	0	0

## Opportunities for Biomanufacturing-based 3D- and bio-printing in Space

## **Bioprinting for Medical Applications**

Advancing manufacturing and application concepts now aim to enable non-terran medical therapeutics beyond conventional pharmacological and medical device design, production, and treatment strategies translated from Earth deployment [387]. Among these developments are *in vitro* biofabrication models being prepared and tested in Space for the reduction to practice of bioficial tissue and organ manufacturing capable of supporting on-demand personalized medicine through autologous organs and systems repair or replacement. Nearly two-decades of Earth-based demonstrations show that 3D bio-printing of live cells provides feasible physical healthcare solutions in nonsurgical and surgical settings [509, 571, 353]. The constraints of Space and extraterrestrial environments, however, demand specialized standards for bio-printing, bio-product utilization, and medical/surgical procedures that currently restrict the near-term state-of-art to high positive-outcome healthcare interventions, such as bone and skin repair, which are more easily performed by suitably trained spaceflight surgeons and assistive medical staff using portable biomedical technologies and additional infrastructure in microgravity [462, 566, 189].

Despite these constraints, existing in-Space manufacturing technologies and methods outpace the readiness to practice sophisticated Earth medical and surgical procedures in off-Earth scenarios. For example, the Russian Space Agency and partners printed the first live tissue, a mouse thyroid, aboard the ISS using self-assembly magnetic manipulation, eliminating the need for traditional bio-compatible scaffolding techniques to organize and support cell structure, proliferation, differentiation, and extracellular matrix production[101, 421]. Alternate scaffold-free preparations, such as those employing hydrogels and metallic needles or electrostatic, acoustic, and gravitational forces, also offer practical solutions for implementing tissue and organ bio-printing in Space. NASA's Centennial Vascular Tissue Challenge will evaluate two of these methods, gel- and gravity-directed organ assembly, using the ISS BioFabrication Facility (BFF). The BFF is a collaboration between private industry and NASA that was launched to study and perfect the printing of human cells and organ-like tissues in microgravity.

Although human joint menisci with simple vascular zones have been already constructed on the ISS, technical obstacles remain for the bio-printing of sustainably viable complex organs believed necessary to replace astronaut anatomy, which may become damaged or diseased from long-duration space-travel and habitation. Th winners of the Centennial Vascular Tissue Challenge will, for instance, focus on improving organotypic vascular engineering of artificial liver -- the building of vascular networks that perfuse cells with nutrients and oxygen while removing metabolic waste and other biological toxins and debris[210]. Achieving naturalistic blood supplies for artificial organ systems continues to be a major limitation for both Earth and Space science and such manufacturing endeavors will help realize celldifferentiated organ bio-printing for Space regenerative medicine, complementing a range of other envisioned off-Earth cell and tissue medical bio-printing applications, including the recent European Space Agency demonstration of skin-wound patching and accelerated healing with use of the hand-held Bioprint First Aid. Importantly, because 3D bio-printing presumably benefits from a near weightless manufacturing environment with atomic-level low mechanical stresses and viscosity[484], orbital facilities similar to the BFF may become significant supply-chain contributors to the Earth-based regenerative medicine industry, improving the health, wellness, and longevity of millions or more patients worldwide by catalyzing technology innovation and application [185].

### **Fabricating Finished Goods**

In 2014, the first three-dimensional (3-D) printed object in space was produced on the ISS Additive Manufacturing Facility (AMF). Since then, additive manufacturing is actively being explored and developed in LEO as proving-ground for various off-world scenarios, as also exemplified by fused filament fabrication (FFF) of ABS (acrylnitril-butadien-styrol), conducted on the ISS in 2016[438]. The tests showed that 3D-printing of synthetic polymers in microgravity is reliable, because of automation, which privileges new material exploration: public and private sector alike have 3D-printed hundreds of parts aboard the ISS made from polymers of various classes[589]. Also the Space-based additive manufacturing of non-polymeric materials is being explored: flight-demo technology has featured flexible electronics, including laser-sintering of copper, printed ceramic sensors, batteries, and antennas[127]. A build-to-print RF antenna was successfully produced through additive manufacturing, reducing up-mass and enabling in-Space design customization[187]. Private companies provide hardware and printing solutions for conductors and dielectrics through stand-alone R&D printers as well as OEM print-heads that can be integrated with other additive manufacturing tools and robotic arms, even enabling plasma jet printing.

Potential applications and benefits are manifold and range from ISM to commercialization of on-Orbit manufacturing techniques. The Redwire Regolith Print study, for example, optimized on-orbit construction of civil infrastructure with an adoption plan for the Artemis Program. Material sources are a hybrid of locally (on the Moon) available regolith and Earth-made binder whose performance holds promise to be matched by biologically-produced adhesives of macromolecular nature[163]. While theoretically an abundant resource for construction at destination Moon, Lunar regolith is characteristically unlike any Earth material. Without wind and rain, Lunar regolith particles stay sharp, instead of eroding smooth [422]. This unique topology in combination with small size not only poses significant respiratory risk to astronauts, as observed during the Apollo missions, but also causes frictional damage of mechanical equipment [74], which must be accounted for in hardware development.

Aside from applications in ISM, the partial gravity of Space is being explored as a potentially advantageous environment for additive manufacturing of premium goods, because of suspected benefits in crystallographic consistency, and therefore enhanced performance of certain products. The first step is to "space-optimize" material processing windows to account for gravity-mediated changes in sedimentation, rheology, crystallographic organization, and thermodynamics [544]. If successful, microgravity theoretically promotes the more uniform solidification of materials, which transforms the microstructure-dependent performance of space forged materials. However, the fabrication of high-fidelity optical ZBLAN fibers in 2017 [108], for example, found less crystallization, resulting in reduced optical performance of the microgravity-manufactured product [526]. Nevertheless, platforms like the Turbine Ceramics Manufacturing Module (Turbine CMM) and the Turbine Superalloy Casting Module (Turbine SCM) for microgravity-based production of ceramics and metal alloys build on this work and explore microgravity similarly, as means to increase the microhardness of Space-made parts. Overall, the exploration of material processing in Space does not only serve the advancement of ISM, but translates discoveries back to improve terrestrial applications[520].

# Supplementary Display Items

## CHAPTER 11. APPENDIX

**Table S23:** Qualitative comparison of biotic vs. abiotic *in situ* (bio)manufacturing approaches across different destinations in the Solar-system (excluding cis-Lunar, which can be considered as an in-between of Earth Orbit and destination Moon).

Destinations		abiotic	biological
Earth Orbit[191]	advantage	in certain cases manufacturing in microgravity may yield a premium product	bioprinting without structural sta- bilization and scaffold-free tissue engineering
		re-use/-purposing of infrastructure on-orbit for strategic reduction of up-mass	more extensive recycling allows for tighter loop-closure
	drawback	no <i>in situ</i> resource utilization possible	no <i>in situ</i> resource utilization possi- ble
		in many cases ability to re-supply outweighs infrastructure-investment	in many cases ability to re-supply outweighs infrastructure-investment
		microgravity makes certain pro- cesses more difficult	microgravity makes aqueous pro- cesses challenging
Lunar[495]	advantage	strategic outpost for infrastructure as stepping stone to the solar sys- tem	allows resources to be exploit that are not accessible otherwise
		gravity, may allow certain processes to be adopted more readily	$ \begin{array}{l} \mbox{gravity, allows gas/liquid separation} \\ \rightarrow \mbox{ operation of aqueous processes} \end{array} \end{array} $
		may in some cases save mass/cost of re-supply	may in some cases expand mission capabilities
	drawback	limited portfolio and amount/den- sity of available resources	resources are limited and processes are largely dependent on abiotic ISRU
		ability to re-supply and delivery may often outweigh infrastructure investment	ability to re-supply and delivery may outweigh infrastructure invest- ment
Interplanetary[558]	advantage	re-supply not feasible $\rightarrow$ recycling and loop-closure compulsory	increased redundancy through flex- ibility: can allow <i>ad hoc</i> solution of complex incidental problems
		systems proven in LEO are readily transferable/adaptable	may allow more complete loop- closure and recycling
	drawback	no <i>in situ</i> resources available (only recycling/production from stock)	no <i>in situ</i> resources available (only recycling/production from stock)
		microgravity makes certain pro- cesses more difficult	microgravity makes aqueous pro- cesses challenging
Martian[151]	advantage	no supply-chain, just-in-time re- sponse not feasible $\rightarrow$ ISRU, LC and ISM compulsory	especially suited to leverage the available <i>in situ</i> resources to ex- pand capabilities
			allows resources to be exploit that are not accessible otherwise
		gravity, may allow certain processes to be adopted more readily	gravity, allows gas/liquid separation $\rightarrow$ operation of aqueous processes
	drawback	high infrastructure investment	high maintenance
		not as resilient	more susceptible to drift

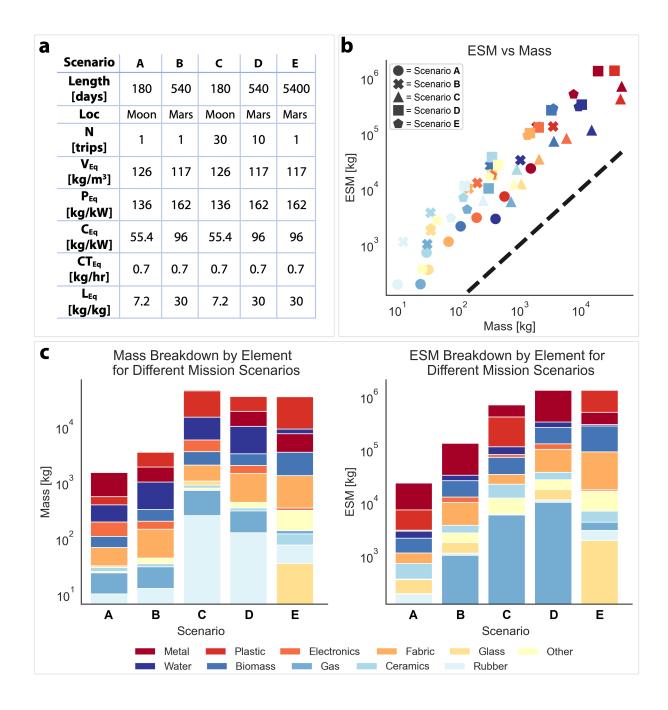


Figure S15: Alternate visualization of scenario-dependent inventory-breakdown. The parameter description of exemplar mission-design scenarios is given in panel **a**: scenarios 'A' and 'B' correspond to single sorties (N) to the Moon and Mars respectively using standard surface-operation duration[17], while scenarios 'C' and 'D' correspond to multi-sortie campaigns with the same (total) 5,400 days of surface operation as for scenario 'E'. These parameters can be used to calculate the ESM cost and include equivalency factors for Volume ( $V_{eq}$ ), Power ( $P_{eq}$ ), Cooling ( $C_{eq}$ ), Crew-Time ( $CT_{eq}$ ), and Location ( $L_{eq}$ ).

A comparison of ESM and carry-along mass (both in kg) is presented in the scatter-plot **b**; the dotted line represents a 1:1 correspondence between ESM and carry-along mass to show the trade-offs in systems grouped by element in terms of non-standard mass components (volume, power, etc.) contributing to cost as compared to only mass. Color-coding of **b** corresponds to the bar-charts in **c**, where the carry-along and ESM are broken down by material-composition. Note that the carry-along and/or ESM for each scenario are plotted on a log scale. The maximum visible edge of each bar in a stack represents the corresponding component's carry-along or ESM value.

## 11.5 SI: Sustainability

UN SDGs	NASA STGC: Expand Human Presence In Space	NASA STGC: Manage In-space Resources	NASA STGC: Enable Transfor- mational Space Exploration And Scientific Discovery
2,3	Molecular pharming is a perspec- tive wherein plants are viewed as chemical factories, synthesizing desirable compounds with min- imal inputs. In space, it would be used to allow astronauts to quickly respond to unantici- pated disease states and decrease the need to bring or resupply large stockpiles of medication for longer missions[366]. Terres- trially, advances in molecular pharming can create healthier communities with more robust responses to sudden changes in medical needs[393].	Space agriculture has led to advances in the practice of ver- tical farming, a system which minimizes the amount of water, fertilizer, and pesticides needed to grow crops[483]. Besides the efficient use of resources, ver- tical farming allows crops to grow anywhere a controlled en- vironment can be established, meaning that using vertical farm- ing would allow densely popu- lated urban areas to have readier access to locally grown fresh produce[45].	The Photobioreactor chamber on the ISS cultivates microal- gae in order to create hybrid life support systems, combining biological and physicochemical processes to, for instance, grow <i>Chlorella vulgaris</i> [410], a mi- croalgae rich in folate, iron, and vitamins D and B <sub>12</sub> , the latter of which are notably absent from many traditional plant-based foods[50]. Advances in the Pho- tobioreactor chamber have made it feasible to use it for advanced wastewater treatment and to cultivate nutrient-laden biomass over marine water instead of land[379].
6	The Microbial Check Valve de- veloped for the Space Shuttle passively kills viable microor- ganisms within water to pre- vent cross-contamination[27]. In 2012, a water tank based on the ECLSS Water Recovery System was installed in Kendala, Iraq, a city whose population dropped 85% due to a deep-water well failure, and this tank uses the Microbial Check Valve to keep the water clean[274].	The Urine Processor Assembly on the ISS collects urine and processes it to potable stan- dards[543], recovering much of the water available, but because urine can theoretically supply over 60% of the crew's water de- mand and the brine can be used as fertilizer, researchers continue to study how this system can be improved[543] Meanwhile on Earth, urine recovery systems are being implemented throughout wastewater systems in Europe, including by the European Space Agency[547], for use as fertilizer. Projections of a hypothetical urine-diversion system show that communities could lower their greenhouse gas emissions by up to 47%, energy consumption by up to 41%, and approximately halve their freshwater usage[225].	The ability to make ultra-pure water is extremely important for scientific research as well as for cooling the Extravehicu- lar Mobility Unit (EMU) space suit. Aquaporin-based filtra- tion, inspired by the aquaporin proteins found in almost every organism, is incredibly efficient and highly specific to filtering out water[224], and including it in the EMU design increases astronaut mobility. As clean freshwater resources are increas- ingly strained, there is a pressing need to improve filtration meth- ods through non-energy intensive means, and aquaporins are eyed for their ability to fulfill this need[196].

UN SDGs	NASA STGC: Expand Human Presence In Space	NASA STGC: Manage In-space Resources	NASA STGC: Enable Transfor- mational Space Exploration And Scientific Discovery
7	81.4% of human wastewater in space is urine, and transporting fresh water to space is expen- sive. Thus, the Urea Biochemical Reactor unit (UBR) is being studied as a way to combine wastewater treatment to sepa- rate urea from urine via forward osmosis, convert urea into am- monia in a bioreactor, and finally to convert that ammonia into energy, for use in space coloniza- tion. Results from studying the UBR show that it would work in any wastewater treatment containing urine and/or ammo- nia[409], potentially providing a new, non-energy or -resource intensive method for producing energy on Earth.	Using nutrients from wastewater, CO <sub>2</sub> , and solar power, the algae studied in the NASA OMEGA project cleaned the wastewater and produced biomass that could be used for aviation fuel[586]. Coupled with advances made in using urine as a wastewa- ter source for algae[245], with increased efficiency, this could provide a way for astronauts to produce <i>in situ</i> fuel rather than rely on resupply. The project renewed interest in using biomass as a fuel source, developed pro- tocols for harvesting algae, and demonstrated that NASA has the motivation and the resources to study technological systems that are applicable both to rocket science and the search for efficient, affordable, and re- newable energy.	At an optimal altitude for fuel conservation, the ISS expends about 8000 pounds of propel- lant a year[281]. Advances in bio-crude oil manufacturing by pre-treating microalgae with NaOH and urea[240] would mean that astronauts on the ISS would be able to conserve the amount of propellant brought and re- supplied. As the environment is destroyed to mine natural oil, this technology presents an al- ternative way to manufacture crude oil and make it closer to becoming a renewable resource.
8,9	Phytoremediation is defined as the use of plants for remedia- tion of contaminants[93]. In the 1980s, NASA studied closed- system applications of phytore- mediation to create a healthy environment for astronauts off- world, and studies afterwards validated the idea that phytore- mediation can effectively re- move particulate matter, volatile organic compounds, and inor- ganic pollutants with minimal inputs[206]. This knowledge has been used to develop living walls, which have increased insulation and promote social and physical health using fewer inputs than traditional methods of urban construction[490].	Concrete production, especially making the boiled limestone that acts as a binding agent, accounts for 5% of anthropogenic carbon emissions[378]. Due to radia- tion and micrometeorites on the Moon and Mars, long-term hu- man settlement on either will necessitate high amounts of con- crete[405], but shipping tons of concrete to either location is not feasible, and traditional meth- ods of making concrete are too energy-intensive, at least ini- tially, to use off-world. To solve this issue, environmental engi- neers developed a method to harvest the binder from organ- isms[14] that could be shipped to other planets relatively cheaply and used in place of boiled lime- stone on Earth, lowering carbon emissions from concrete produc- tion.	The original purpose of Bio- sphere 2 (B2), a miniaturized version of Earth's ecological en- vironments, was to establish a baseline for designing structures for long-term human habituation in space[14]. The B2 experiment informed other initiatives to sim- ulate what life on the Moon and Mars would look like, such as HI- SEAS or PISCES[459]. Today, experiments in B2 are focused on improving ecology and eco- technology on Earth[408].

UN SDGs	NASA STGC: Expand Human Presence In Space	NASA STGC: Manage In-space Resources	NASA STGC: Enable Transfor- mational Space Exploration And Scientific Discovery
11,12	One goal of MELiSSA is to cre- ate a closed-loop system in deep space which supplies astronauts with fresh air, water, and food using microbial recycling of hu- man waste[548]. As the pop- ulation grows and real estate becomes more limited, human- centered and sustainability- minded design philosophies are being used in cities. MELiSSA offers a potential blueprint for such design, by internalizing the complex relationships between humans and their environment while prioritizing sustainability.	Polyhydroxyalkanoate (PHA) polymers produced by bacteria and archaea are able to be used as biodegradable thermoplas- tics[432, 525], and have already tapped by NASA for use in long- term extraterrestrial missions precisely because they make production of needed materials possible even in space[90]. They have been studied for their use as a potential replacement for polyolefins in single-use plas- tics, in the hopes that in areas where single-use plastic is un- avoidable (e.g. in medicine or research), PHAs would create less non-degradable waste[432]. Considering that the require- ments for plastic production in space include producing minimal useless waste and that the plas- tics would have to meet the high standards of a top-of-the-line lab, perfecting the technology for NASA would mean that terres- trially, citizens would have access to plastics that are degradable but still safe enough for use in laboratory or medical environ- ments.	So-called 'sick building syn- drome' is a phenomenon wherein workers, especially if there are many of them, experience vari- ous health problems as a result of staying in a poorly ventilated building[450]. NASA has funded experiments which showed that houseplants in conjunction with activated charcoal efficiently cleaned indoor air pollutants[569, 570], and this research may be used to design space stations and terrestrial buildings which are conducive to the good health of their occupants.
13	Biofuels derived from cellulosic feedstocks (e.g. switchgrass, wood residues, etc.) have lower lifetime greenhouse gas emis- sions than those of petroleum fuels[288]. NASA has studied cel- lulosic biofuels for their potential as an <i>in situ</i> way of manufac- turing fuel off-world[496] and developed enzyme structures which could facilitate access to biomass and biofuels[382]. On Earth, researchers are study- ing potentially carbon-negative biofuel production utilizing cel- lulosic feedstocks[288], which would require highly efficient processes potentially aided by NASA's research in enzymes to improve biomass production.	The Haber-Bosch process, which produces ammonia to be used in fertilizers and pharmaceuti- cals, requires large energy in- puts[78] and releases 1.2% of global anthropogenic CO <sub>2</sub> emis- sions[494]. For space exploration, which thrusts astronauts into incredibly resource-limited en- vironments, alternatives such as bacterial nitrogen fixation and urine ammonia extraction have been studied[302]. Meth- ods which efficiently produce the ammonia astronauts need, us- ing minimal energy inputs and recycled materials as feedstock, provides industrial chemical syn- thesizers strategies for ammonia production with a much smaller carbon footprint.	NASA's Surface Adhering BioRe- actor has a low energy and water input for cultivating microalgae. Microalgae can grow in extreme environments including micro- gravity[550], high temperature, solar radiation[423], and high salinity[8], to produce essential consumables and biofuels[533], making cultivation even on Earth relatively simple. Microalgae can be used for efficient CO <sub>2</sub> scrub- bing, which would make signif- icant progress towards cleaning the roughly 75% of greenhouse gas emissions that is CO <sub>2</sub> [500, 413].

 Table S24: Space Bioprocess Engineering technologies in the context of NASA's Space Technology Grand Challenges (STGCs) and United Nations Sustainability Development Goals (SDGs).
 Extended Version.

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