Title
Creating, Collaborating, and Celebrating the Diversity of Research Data

Author
Borgman, Christine L.

Publication Date
2015-10-26

October 26, 2015

Creating, Collaborating, and Celebrating the Diversity of Research Data

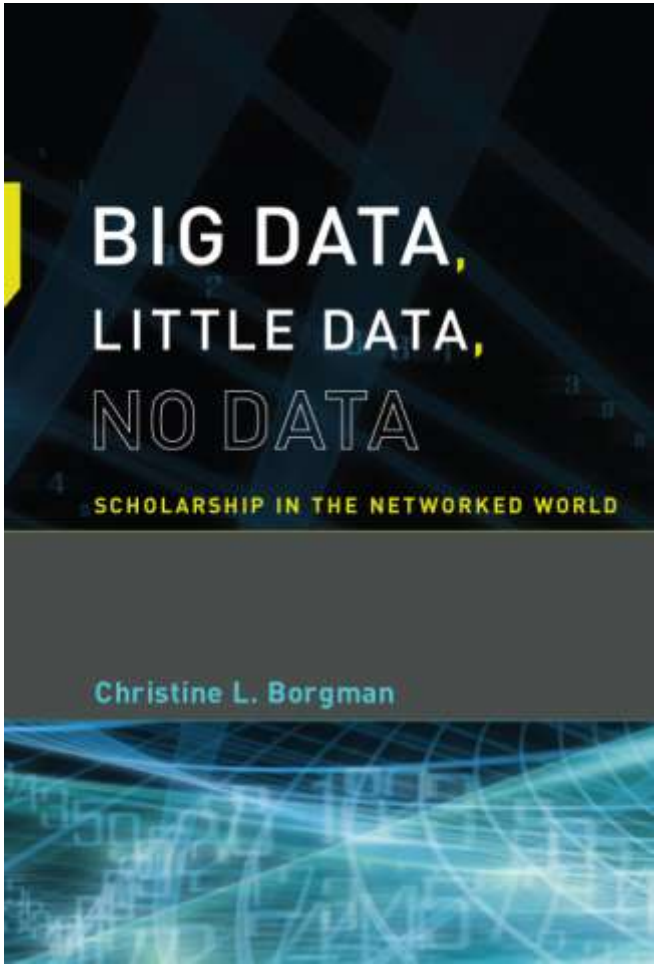
Christine L Borgman, *University of California, Los Angeles*

Creating, Collaborating, and Celebrating the Diversity of Research Data

Christine L. Borgman

Distinguished Professor
and Presidential Chair in Information Studies
University of California, Los Angeles
@SciTechProf

Seminar Presentation
Graduate School of Library, Information, and Media Studies
University of Tsukuba, Japan
October 26, 2015



PHILOSOPHICAL TRANSACTIONS:

GIVING SOME

ACCOMPT

OF THE PRESENT

Undertakings, Studies, and Labours

OF THE

INGENIOUS

IN MANY

CONSIDERABLE PARTS

OF THE

WORLD

Vol I.

For *Anno* 1665, and 1666.

In the *SAVOY*,
Printed by *T. N.* for *John Martyn* at the Bell, a little without *Temple-Bar*, and *James Allestry* in *Duck-Lane*,
Printers to the *Royal Society*.

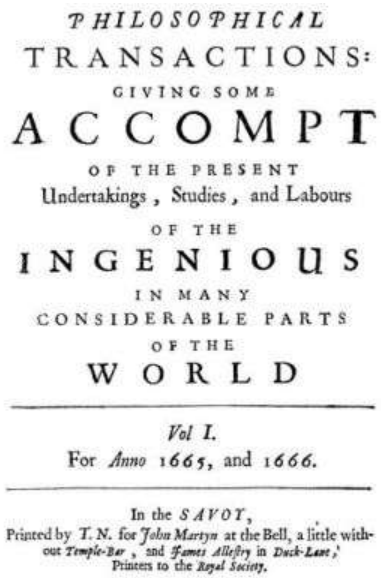
Big Data, Little Data, Open Data, and Libraries

Christine L. Borgman
Professor and Presidential Chair in Information Studies
University of California, Los Angeles

University of Göttingen
Inaugural Göttingen Lecture on Library Futures
23 March 2015

Data <–> Publications

Publications are arguments made by authors, and data are the evidence used to support the arguments.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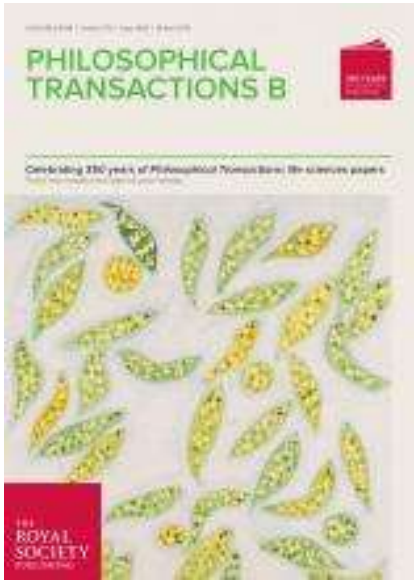


Theme issue 'Celebrating 350 years of Philosophical Transactions: life sciences papers' compiled and edited by Linda Partridge
19 April 2015; volume 370, issue 1666

Open access policies

- Australian Research Council
  - Code for the Responsible Conduct of Research
  - Data management plans
- National Science Foundation
  - Data sharing requirements
  - Data management plans
- U.S. Federal policy
  - Open access to publications
  - Open access to data
- European Union
  - European Open Data Challenge
  - OpenAIRE
- Research Councils of the UK
  - Open access publishing
  - Provisions for access to data

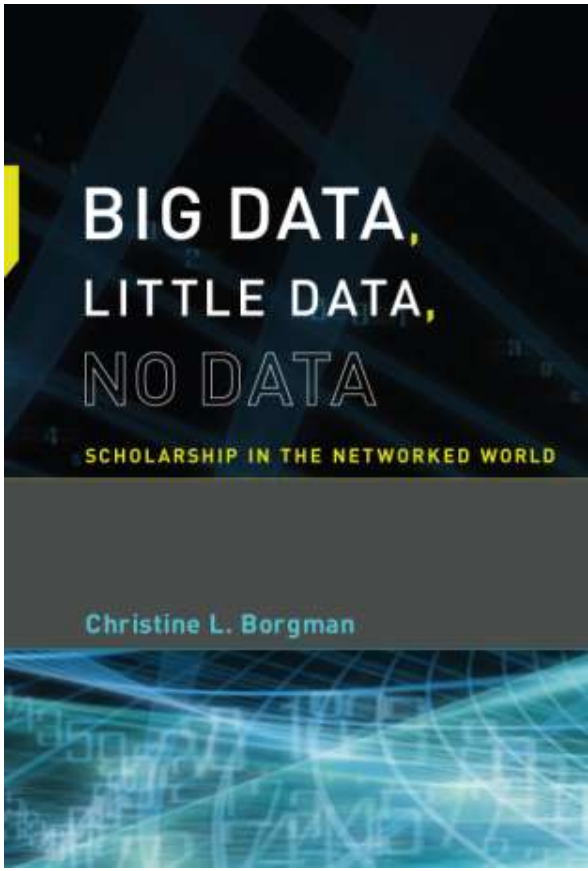
Australian Government
National Health and Medical Research Council

National Science Foundation
WHERE DISCOVERIES BEGIN

Supported by wellcome trust

Big Data, Little Data, No Data: Scholarship in the Networked World

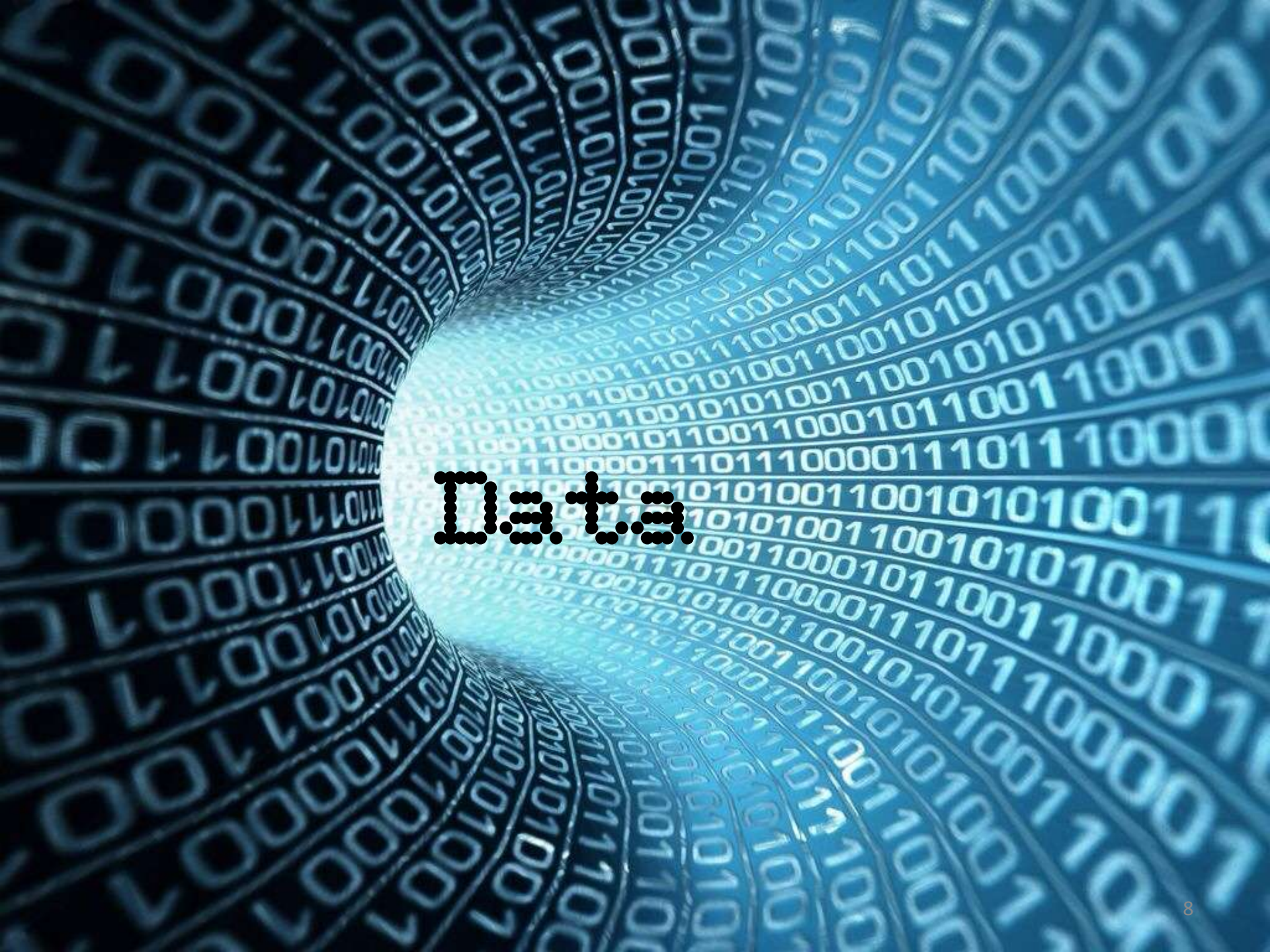
- Part I: Data and Scholarship
  - Ch 1: Provocations
  - Ch 2: What Are Data?
  - Ch 3: Data Scholarship
  - Ch 4: Data Diversity
- Part II: Case Studies in Data Scholarship
  - Ch 5: Data Scholarship in the Sciences
  - Ch 6: Data Scholarship in the Social Sciences
  - Ch 7: Data Scholarship in the Humanities
- Part III: Data Policy and Practice
  - Ch 8: Releasing, Sharing, and Reusing Data
  - Ch 9: Credit, Attribution, and Discovery
  - Ch 10: What to Keep and Why



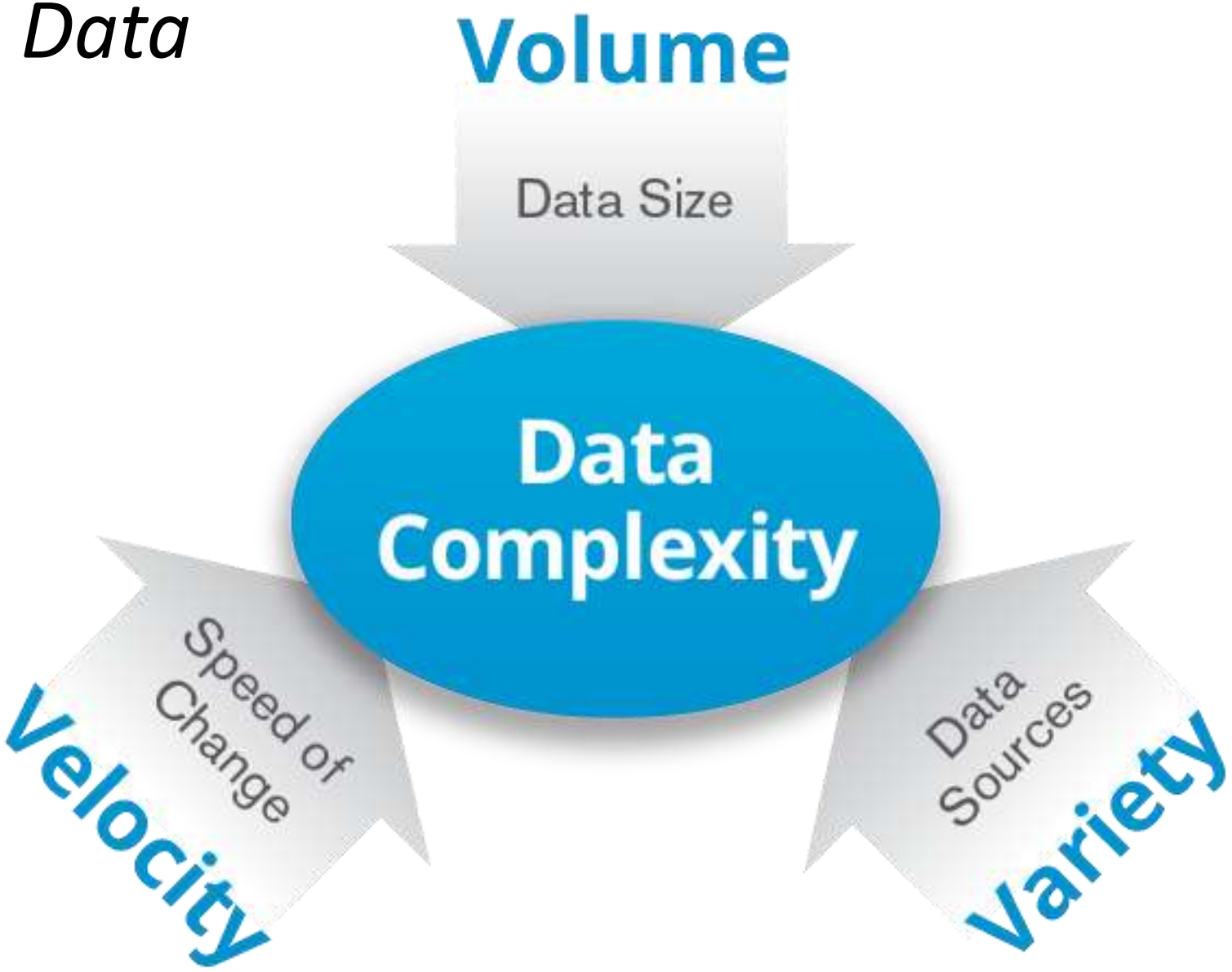
Celebrating the diversity of data

- Defining data
- Creating data
- Collaborating with data
- Consolidating data value

Persistent URL: photography.si.edu/SearchImage.aspx?id=5799
Repository: Smithsonian Institution Archives

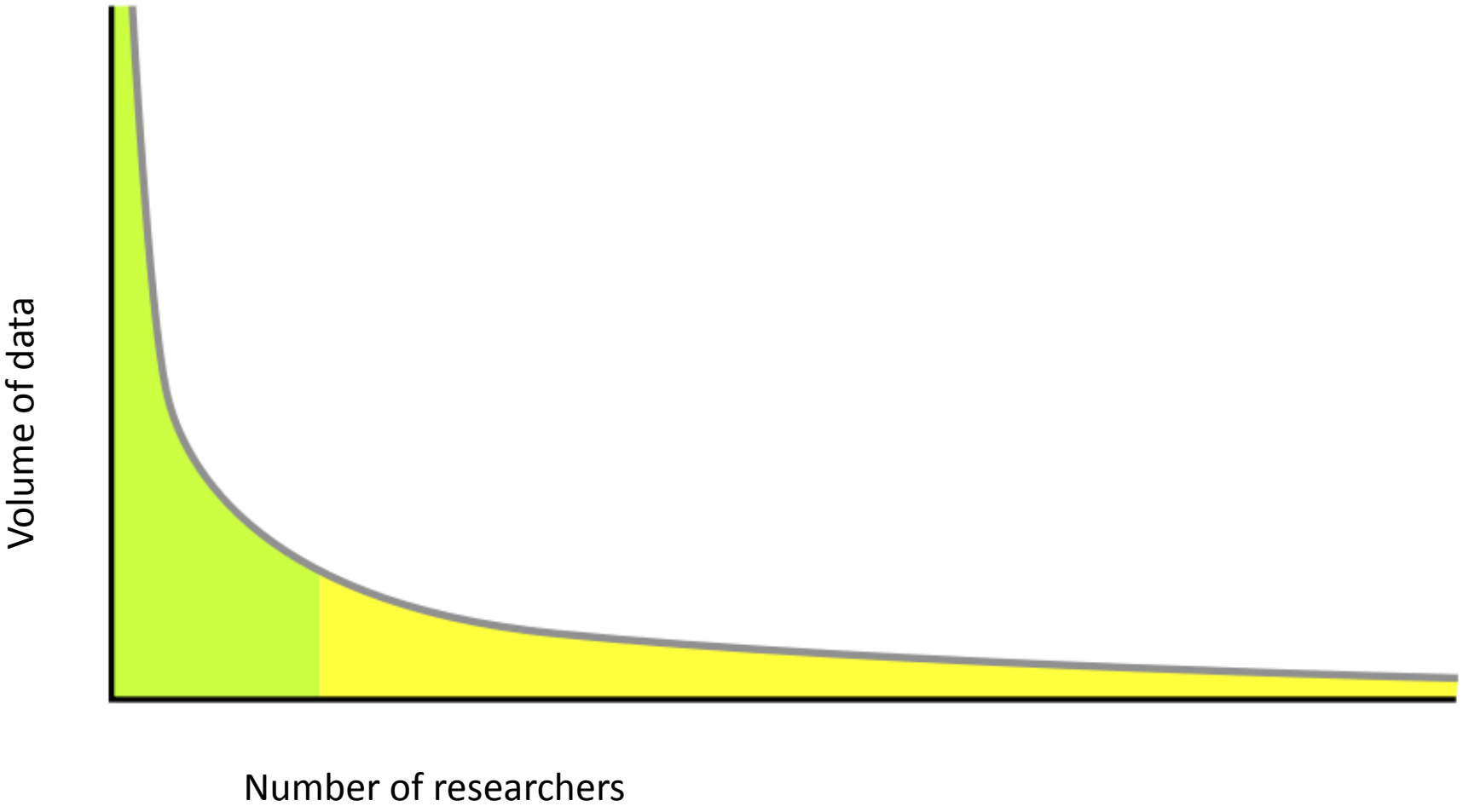

Data

Big Data



http://www.datameer.com/product/hadoop.html

Long tail of data



Slide: The Institute for Empowering Long Tail Research

Open Data: Free

- A piece of data or content is open if anyone is free to use, reuse, and redistribute it — subject only, at most, to the requirement to attribute and/or share-alike

State Library and Archives of Florida, 1922.
Flickr commons photo

Open Data Commons. (2013).

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                        /comma 2 def
                                    /period 3 def
                                                /W 4 def
                                                        /a 5 def
                                                                /b 6 def
                                                                        /c 7
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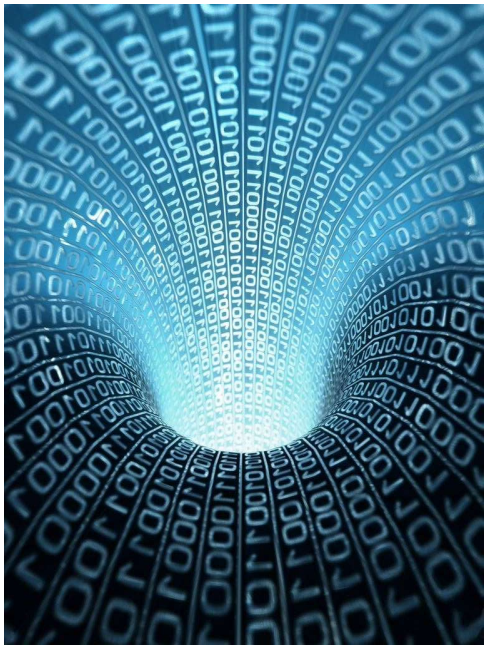
Open Data: Useful

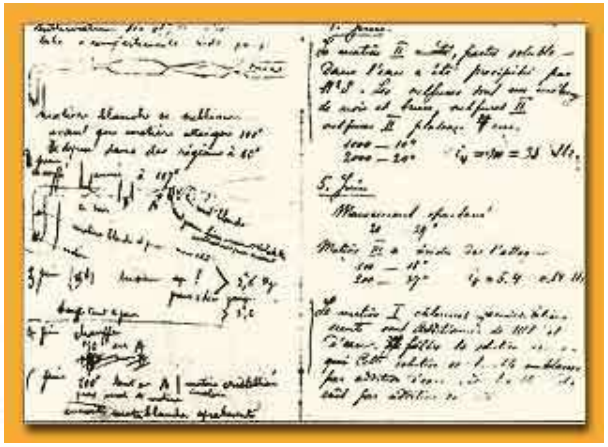
- Openness, flexibility, transparency, legal conformity, protection of intellectual property, formal responsibility, professionalism, interoperability, quality, security, efficiency, accountability, and sustainability.



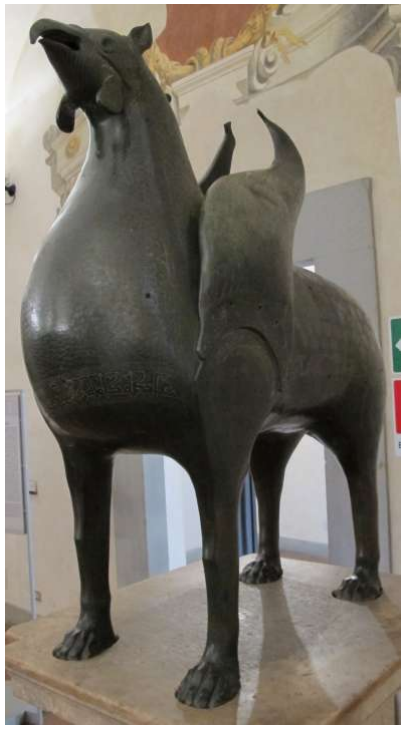
Organization for Economic Cooperation and Development. (2007).
OECD Principles and Guidelines for Access to Research Data from Public Funding.
http://www.oecd.org/dataoecd/9/61/38500813.pdf

What are data?

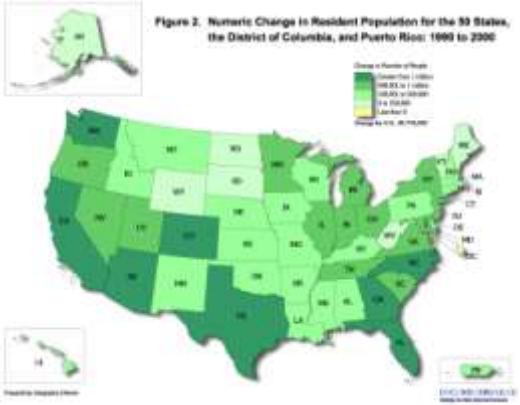
hudsonalpha.org



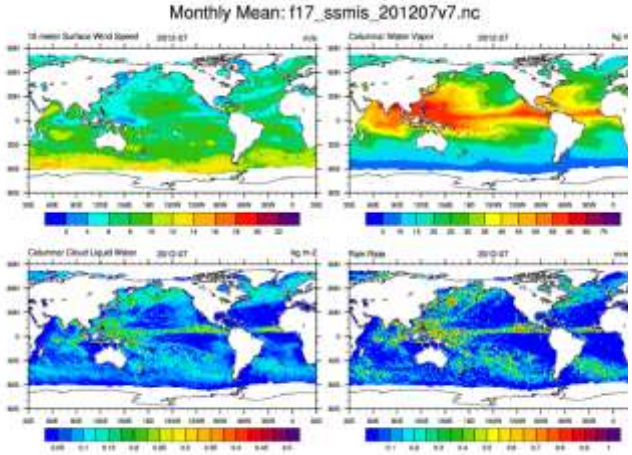
Marie Curie's notebook aip.org



Pisa Griffin



http://www.census.gov/population/cen2000/map02.gif



ncl.ucar.edu

Date:1/2.07.75 Place:Sakaltutan
Zafor
He will grow old in his present house; new house is for sons - 5 sons. Not sure they want to live in village. He will only build another if they want him to. eS came from Germany and did the plastering. He arranged the carpentry in Kayseri. Çok para gitti. {much money went} Has a tractor.

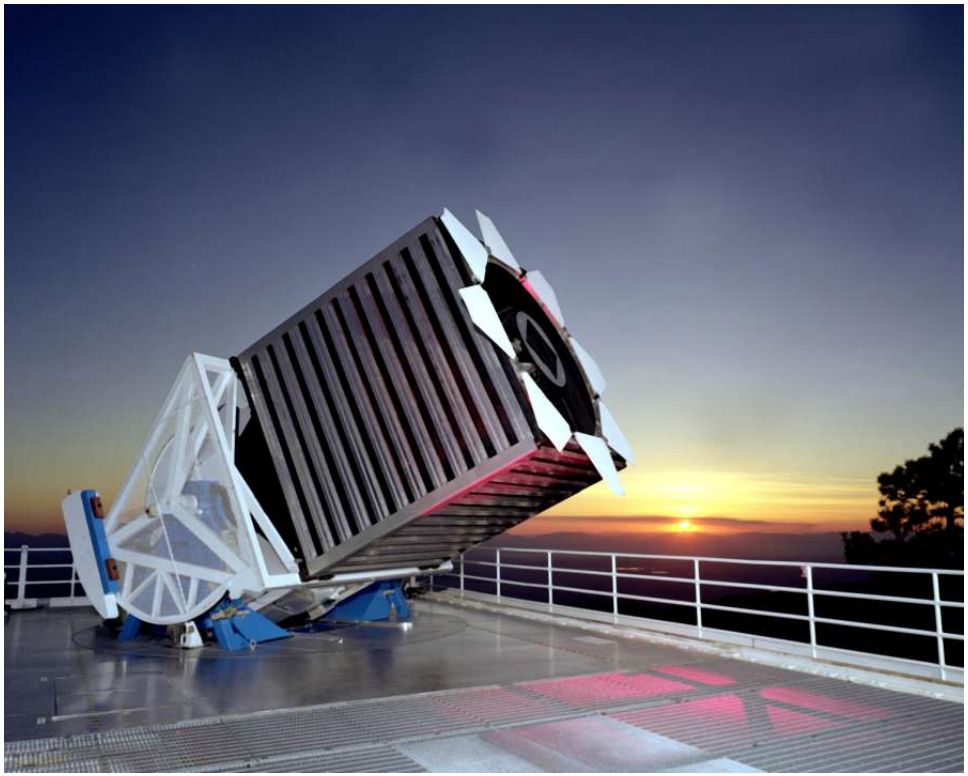
Date:July1980 Place:Sakaltutan
Zafor:
Household now Zafor and wife; Nazif Unal and wife and youngest son, still a boy. They run two dolmuß; one with a driver from Süleymanli. Goes in and out once a day. He gets 8,000 a month. Zafor then said, keskin de©il. { not sharp - i.e.? not profitable} I said he did very well on 8,000 TL with only two journeys a day. Nazif Unal has "bought" a Durak {dolmuß stop} from Belediye and works all day in Kayseri.

http://onlineqda.hud.ac.uk/Intro_QDA/Examples_of_Qualitative_Data.ph

Data are representations of observations, objects, or other entities used as evidence of phenomena for the purposes of research or scholarship.

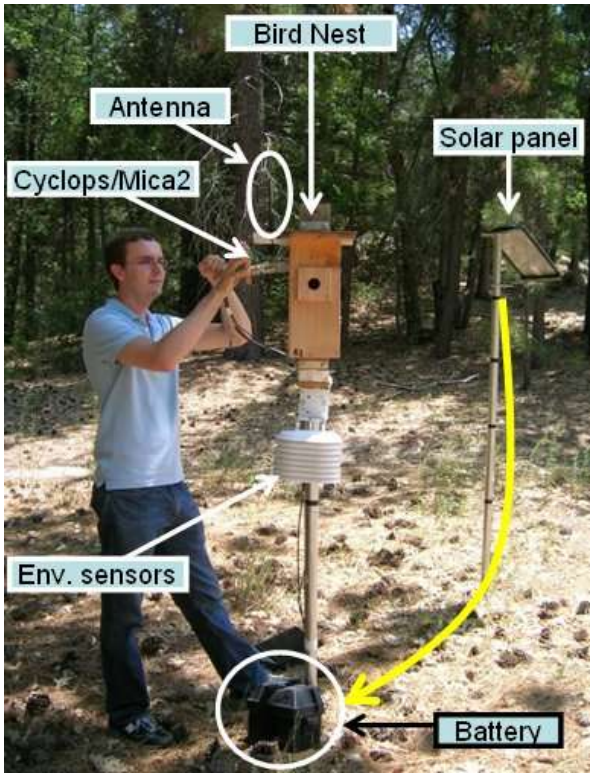
C.L. Borgman (2015). *Big Data, Little Data, No Data: Scholarship in the Networked World*. MIT Press

Creating research data



Sloan Digital Sky Survey Telescope,
Apache Point, New Mexico

http://astro.uchicago.edu/~frieman/SDSS-telescope-photos/



Sensor networks

http://enl.usc.edu/~jpaek/data/cyclops/bird_nest_2008/figures/nestbox2.jpg

WIRED MAGAZINE: 16.07

SCIENCE : DISCOVERIES

The End of Theory: The Data Deluge Makes the Scientific Method Obsolete

By Chris Anderson 06.23.08

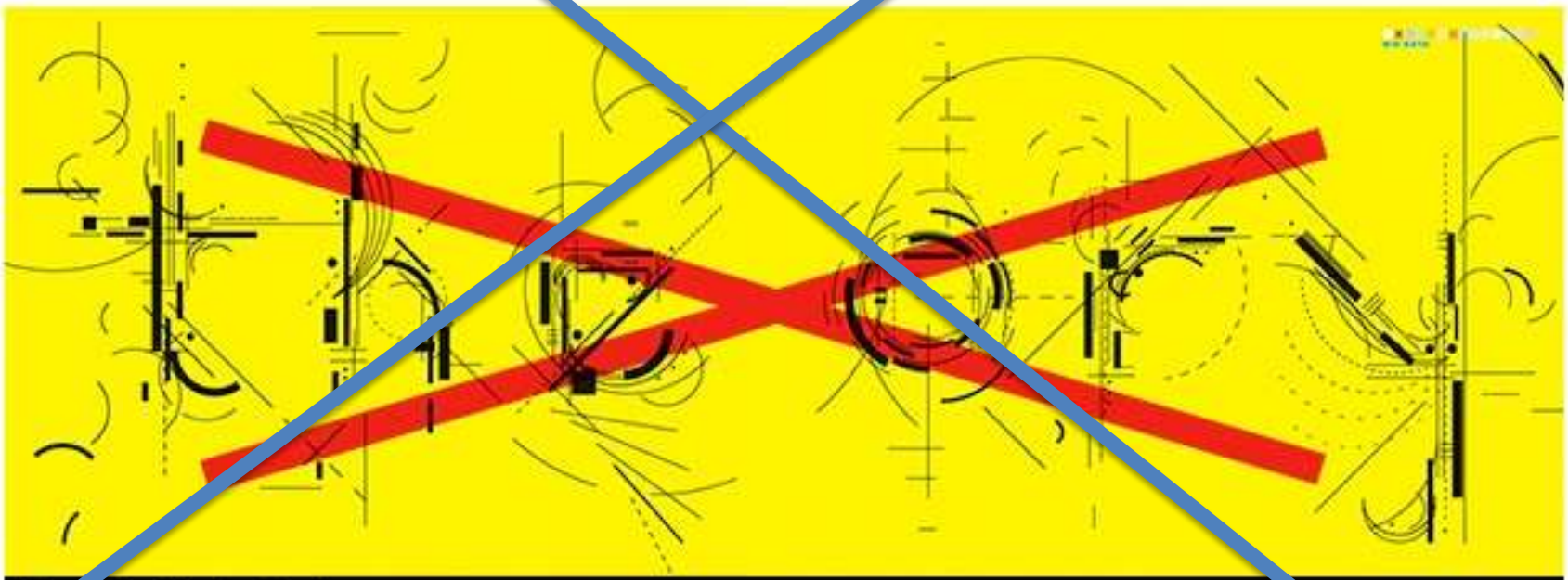
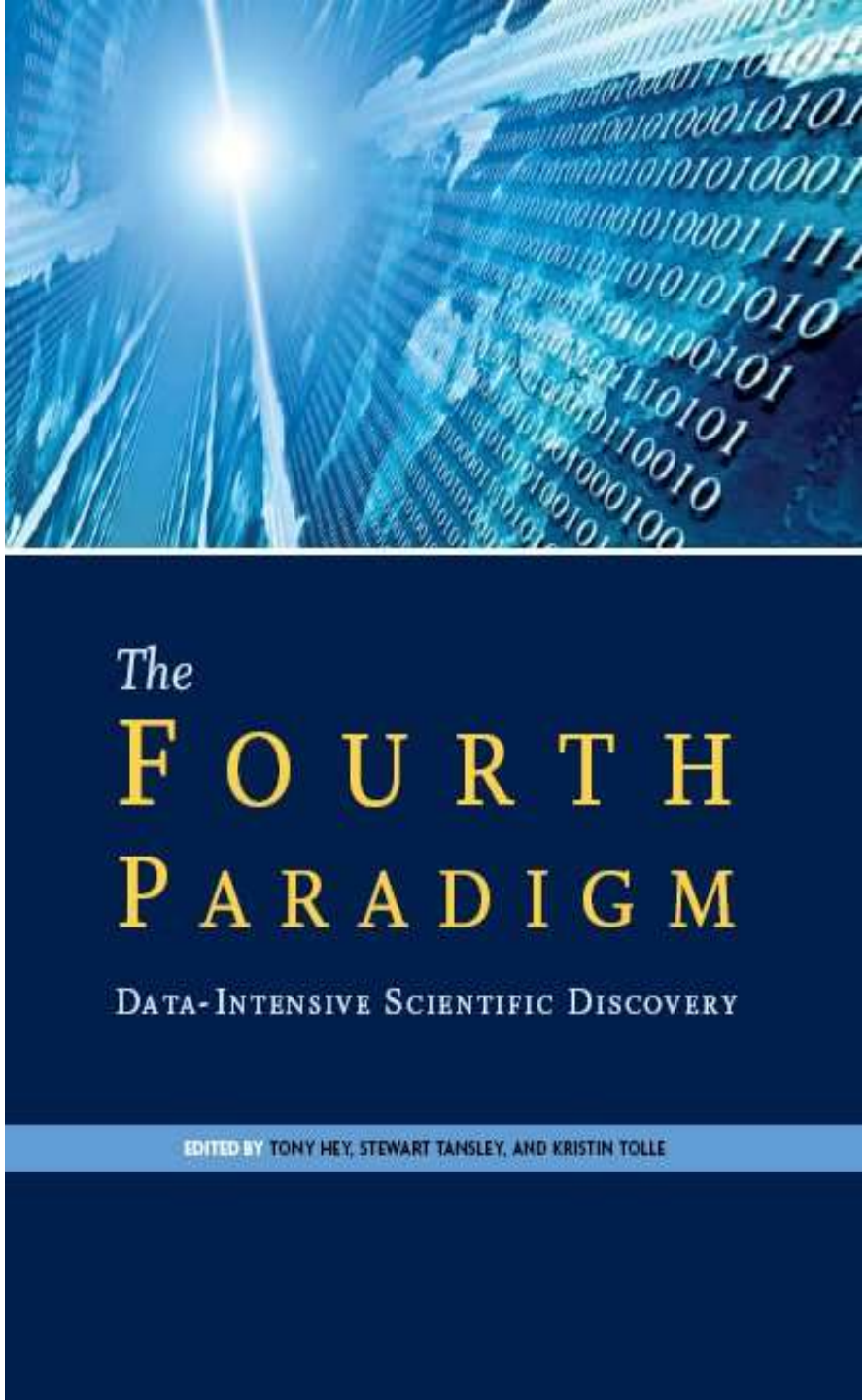


Illustration: Marian Bantjes



Hey, Tansley & Tolle (eds.) (2009)

Links:
Home
Program
Participants (129)

Scientific Organizing Committee:
Eric Feigelson (Penn State)
David Hogg (NYU)
John Kececioglu (Arizona)
Tod R. Lauer (NOAO, Chair)
Dara Norman (NOAO)
Chris Smith (NOAO)

Local Organizing Committee:
Tod R. Lauer (NOAO)
Shelley Weintraub (NOAO)

Current Weather for Tucson, AZ

62.0° F
Feels like: 62° F
Fair

Humidity: 70%
Wind: Southeast at 6.9 mph
19 March, 2015

SHARE

Tools for Astronomical Big Data
Tucson, Arizona, March 9-11, 2015

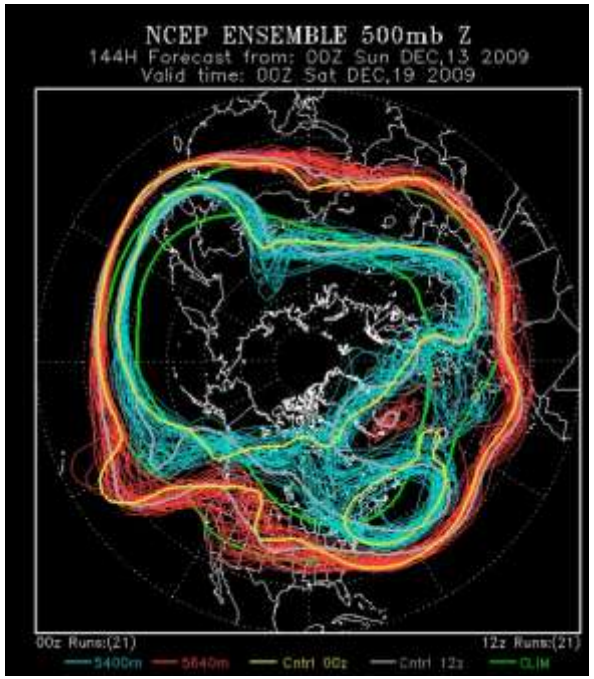
Program

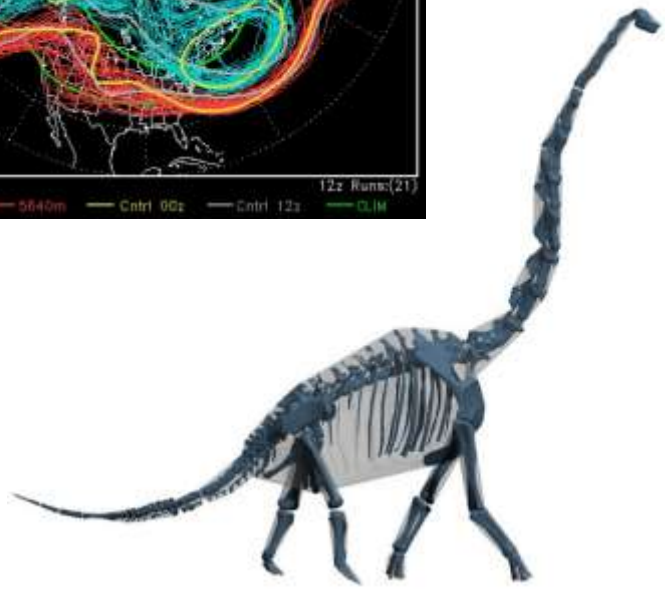
Invited speakers in **bold**.

Monday, March 9, 2015	
8:00-9:00	Registration/Continental Breakfast
9:00-9:15	Introductory Remarks
9:15-9:45	**Alyssa Goodman (Harvard)** *Wide Data vs. Big Data*
9:45-10:15	**Carlos Scheidegger (University of Arizona)** *How do you look at a billion data points? Exploratory Visualization for Big Data*
10:15-11:00	Break
11:00-11:20	Joshua Peek (STScI) *Machine Vision Methods for the Diffuse Universe*
11:50-2:00	Lunch
2:00-2:20	Elisabeth Mills (NRAO) *Visualization and Analysis of Rich Spectral-Line Datasets*
2:20-2:40	Brian Bue (JPL) *Leveraging Annotated Archival Data with Domain Adaptation to Improve Data Triage in Optical Astronomy*

Research process

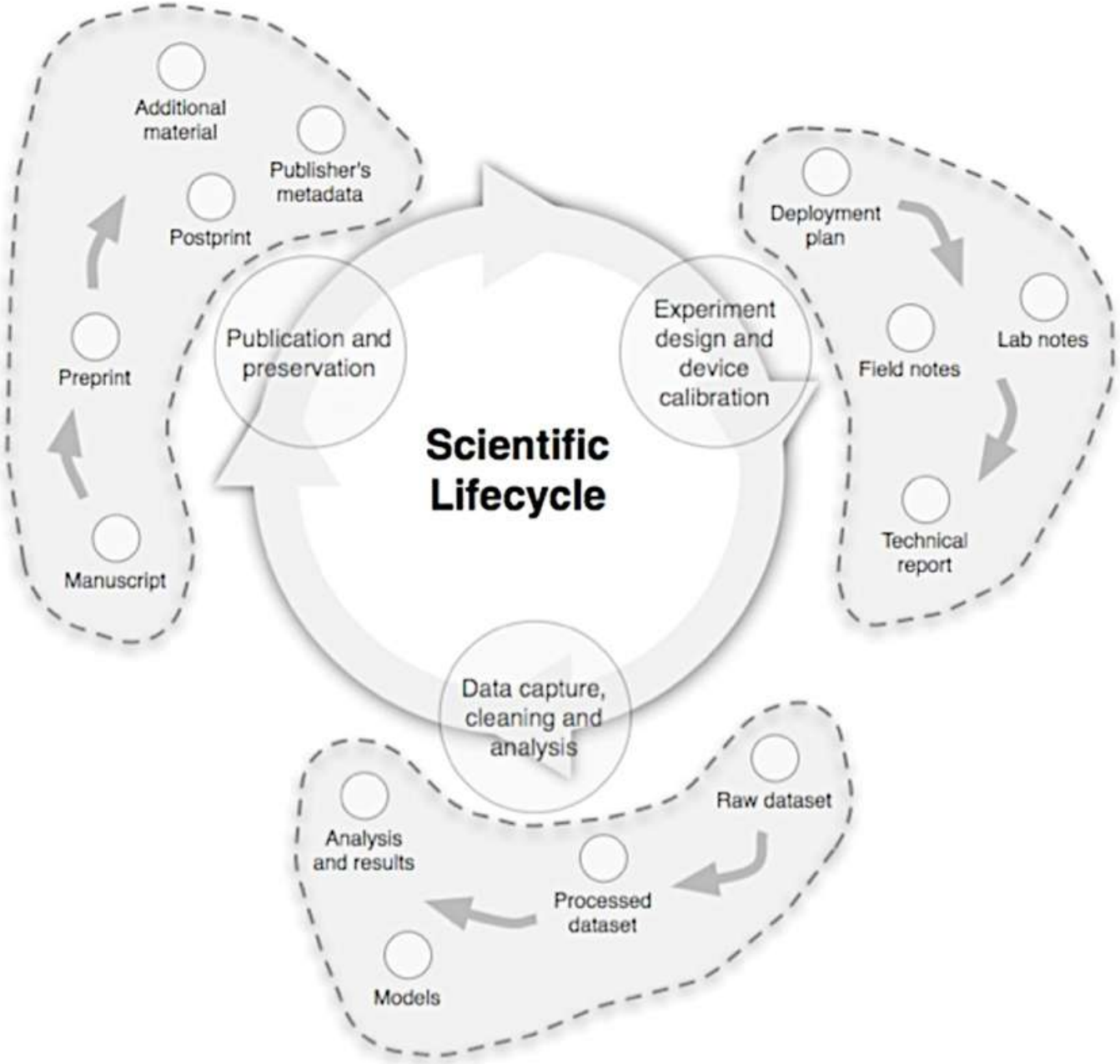
- Models and theories
- Research questions
- Methods
  - Practices
  - Data sources
  - Software
  - Instruments
  - Infrastructure
  - Domain expertise





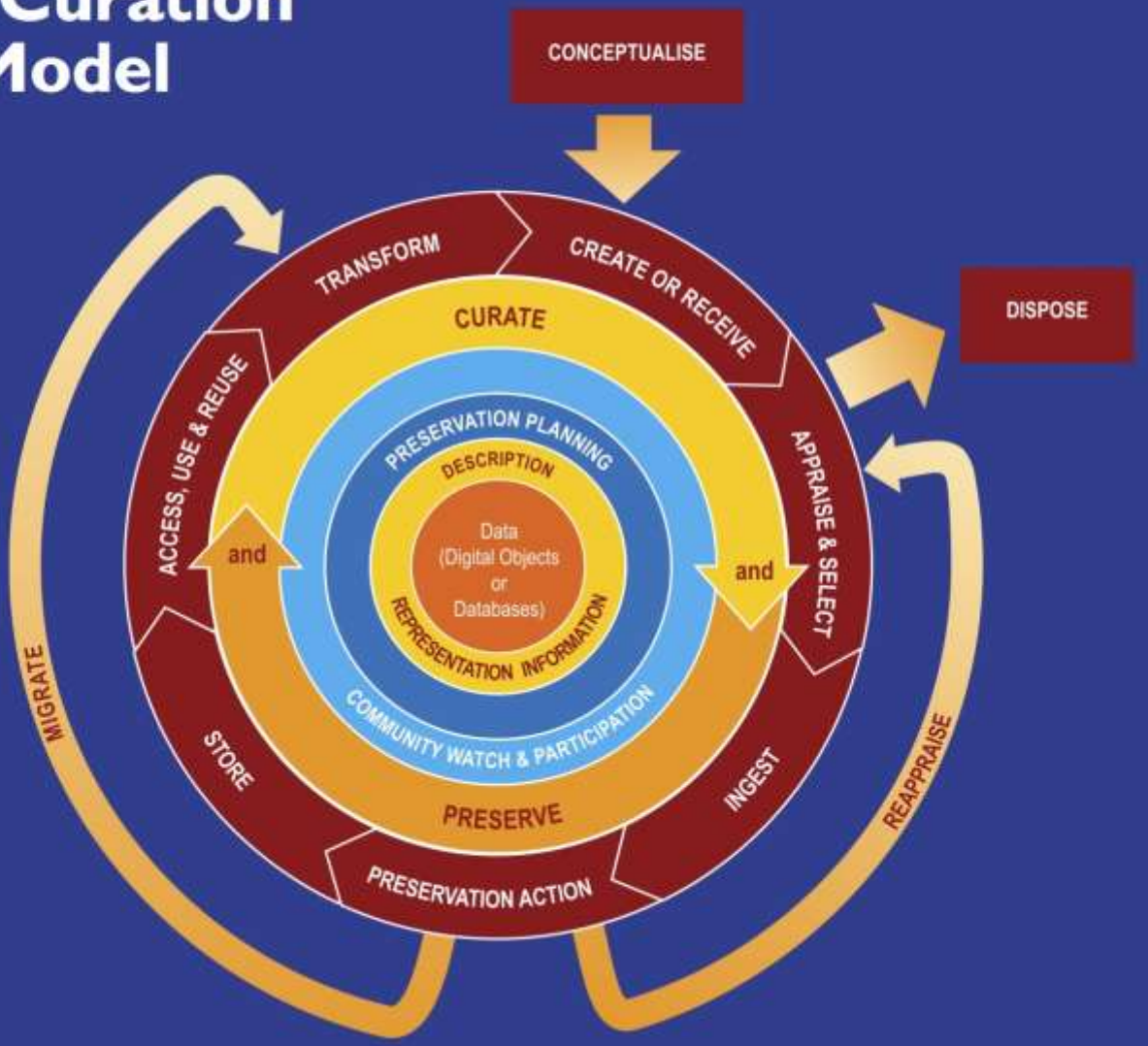
http://blogs.agu.org/wildwildscience/files/2009/12/Screen-shot-2009-12-13-at-04.10.146.jpg

http://www.livescience.com/20767-dinosaur-weight-estimates.html

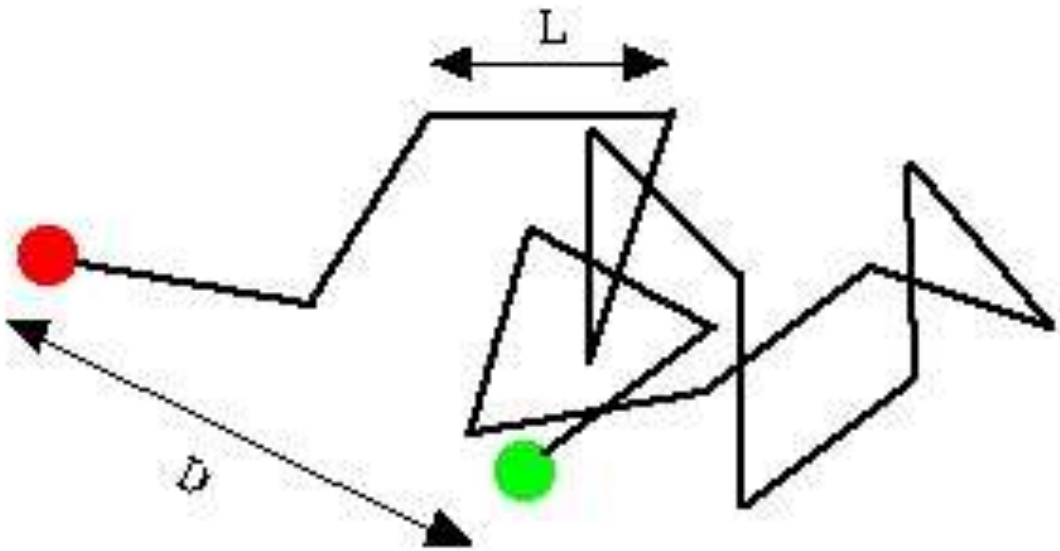


Pepe, A., Mayernik, M. S., Borgman, C. L. & Van de Sompel, H. (2010). From Artifacts to Aggregations: Modeling Scientific Life Cycles on the Semantic Web. Journal of the American Society for Information Science and Technology, 61(3): 567–582.

The DCC Curation Lifecycle Model



Random walk



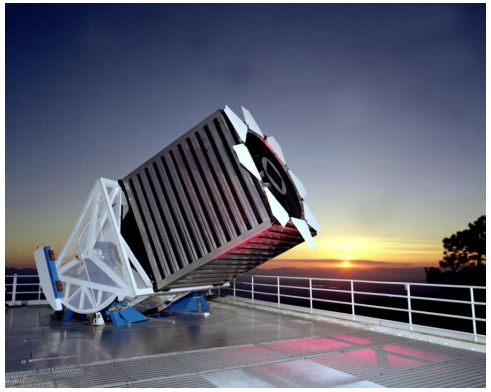
http://www2.ess.ucla.edu/~jewitt/oort2-random.html

Collaborating with data

http://digitalleaders.co.uk/wp-content/uploads/2014/09/collaboration.jpg

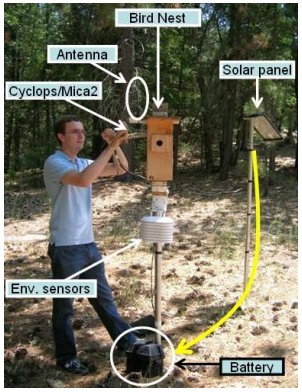
Big Science <–> Little Science

- Large instruments
- High cost
- Long duration
- Many collaborators
- Distributed work
- Domain expertise



Sloan Digital Sky Survey

- Small instruments
- Low cost
- Short duration
- Small teams
- Local work
- Domain expertise



Sensor networks for science

Telescope for the Sloan Digital Sky Survey, Apache Point, New Mexico

LETTERS

A role for self-gravity at multiple length scales in the process of star formation

Alyssa A. Goodman[1,2], Erik W. Rosolowsky[2,3], Michelle A. Borkin[1]†, Jonathan B. Foster[2], Michael Halle[1,4], Jens Kauffmann[1,2] & Jaime E. Pineda[2]

Self-gravity plays a decisive role in the final stages of star formation, where dense cores (size ~0.1 parsecs) inside molecular clouds collapse to form star-plus-disk systems[1]. But self-gravity's role at earlier times (and on larger length scales, such as ~1 parsec) is unclear; some molecular cloud simulations that do not include self-gravity suggest that 'turbulent fragmentation' alone is sufficient to create a mass distribution of dense cores that resembles, and sets, the stellar initial mass function[2]. Here we report a 'dendrogram' (hierarchical tree-diagram) analysis that reveals that self-gravity plays a significant role over the full range of possible scales traced by ^{13}CO observations in the L1448 molecular cloud, but not everywhere in the observed region. In particular, more than 90 per cent of the compact 'pre-stellar cores' traced by peaks of dust emission[3] are projected on the sky within one of the dendrogram's self-gravitating 'leaves'. As these peaks mark the locations of already-forming stars, or of those probably about to form, a self-gravitating cocoon seems a critical condition for their existence. Turbulent fragmentation simulations without self-gravity—even of unmagnetized isothermal material—can yield mass and velocity power spectra very similar to what is observed in clouds like L1448. But a dendrogram of such a simulation[4] shows that nearly all the gas in it (much more than in the observations) appears to be self-gravitating. A potentially significant role for gravity in 'non-self-gravitating' simulations suggests inconsistency in simulation assumptions and output, and that it is necessary to include self-gravity in any realistic simulation of the star-formation process on subparsec scales.

Spectral-line mapping shows whole molecular clouds (typically tens to hundreds of parsecs across, and surrounded by atomic gas) to be marginally self-gravitating[5]. When attempts are made to further break down clouds into pieces using 'segmentation' routines, some self-gravitating structures are always found on whatever scale is sampled[6,7]. But no observational study to date has successfully used one spectral-line data cube to study how the role of self-gravity varies as a function of scale and conditions, within an individual region.

Most past structure identification in molecular clouds has been explicitly non-hierarchical, which makes difficult the quantification of physical conditions on multiple scales using a single data set. Consider, for example, the often-used algorithm CLUMPFIND[7]. In three-dimensional (3D) spectral-line data cubes, CLUMPFIND operates as a watershed segmentation algorithm, identifying local maxima in the position–position–velocity (p–p–v) cube and assigning nearby emission to each local maximum. Figure 1 gives a two-dimensional (2D) view of L1448, our sample star-forming region, and Fig. 2 includes a CLUMPFIND decomposition of it based on ^{13}CO observations. As with any algorithm that does not offer hierchically nested or overlapping features as an option, significant emission found between prominent clumps is typically either appended to the nearest clump or turned into a small, usually 'pathological', feature needed to encompass all the emission being modelled. When applied to molecular-line

Figure 1 | Near-infrared image of the L1448 star-forming region with contours of molecular emission overlaid. The channels of the colour image correspond to the near-infrared bands J (blue), H (green) and K (red), and the contours of integrated intensity are from ^{13}CO(1–0) emission[8]. Integrated intensity is monotonically, but not quite linearly (see Supplementary Information), related to column density[14], and it gives a view of 'all' of the molecular gas along lines of sight, regardless of distance or velocity. The region within the yellow box immediately surrounding the protostars has been imaged more deeply in the near-infrared (using Calar Alto) than the remainder of the box (2MASS data only), revealing protostars as well as the scattered starlight known as 'Cloudshine'[11] and outflows (which appear orange in this colour scheme). The four billiard-ball labels indicate regions containing self-gravitating dense gas, as identified by the dendrogram analysis, and the leaves they identify are best shown in Fig. 2a. Asterisks show the locations of the four most prominent embedded young stars or compact stellar systems in the region (see Supplementary Table 1), and yellow circles show the millimetre-dust emission peaks identified as star-forming or 'pre-stellar' cores[3].

[1]Initiative in Innovative Computing at Harvard, Cambridge, Massachusetts 02138, USA. [2]Harvard-Smithsonian Center for Astrophysics, Cambridge, Massachusetts 02138, USA. [3]Department of Physics, University of British Columbia, Okanagan, Kelowna, British Columbia V1V 1V7, Canada. [4]Surgical Planning Laboratory and Department of Radiology, Brigham and Women's Hospital, Harvard Medical School, Boston, Massachusetts 02115, USA. †Present address: School of Engineering and Applied Sciences, Harvard University, Cambridge, Massachusetts 02138, USA.

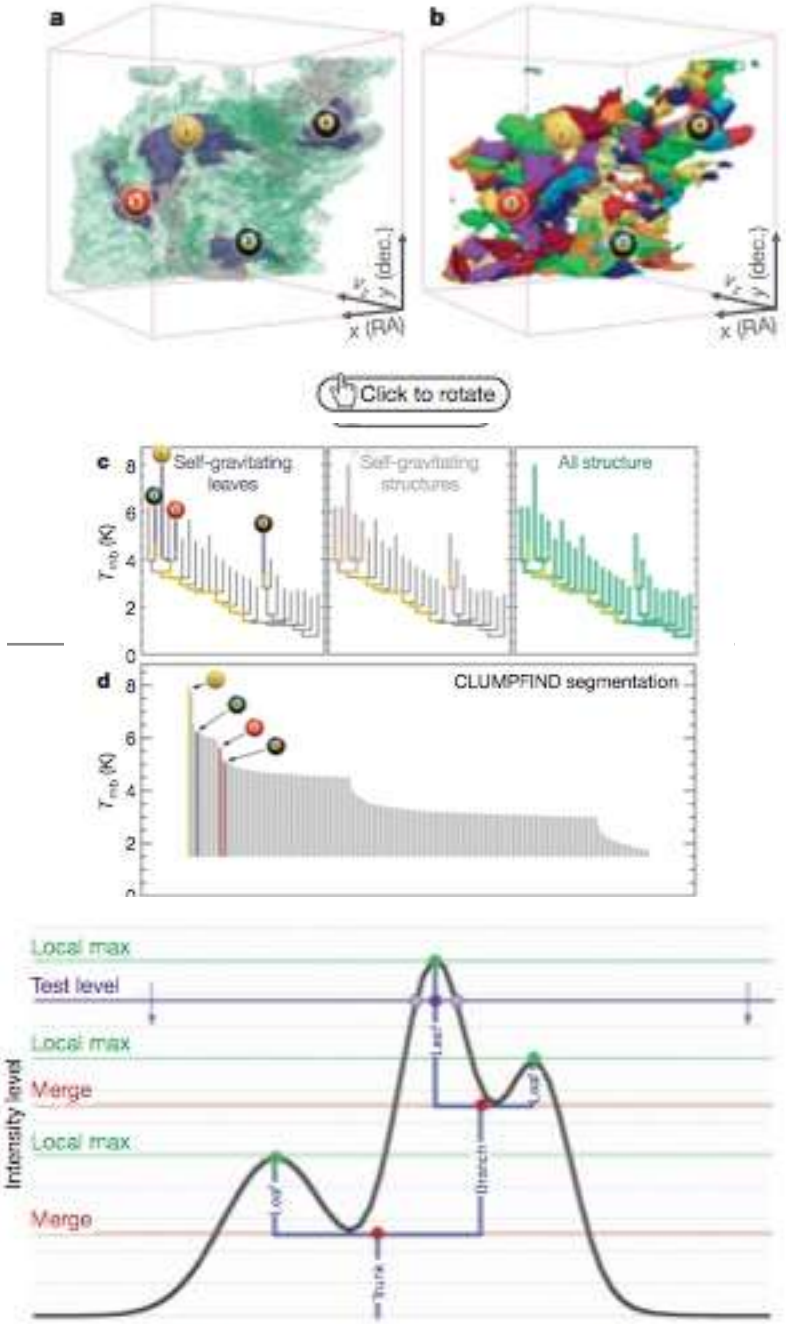
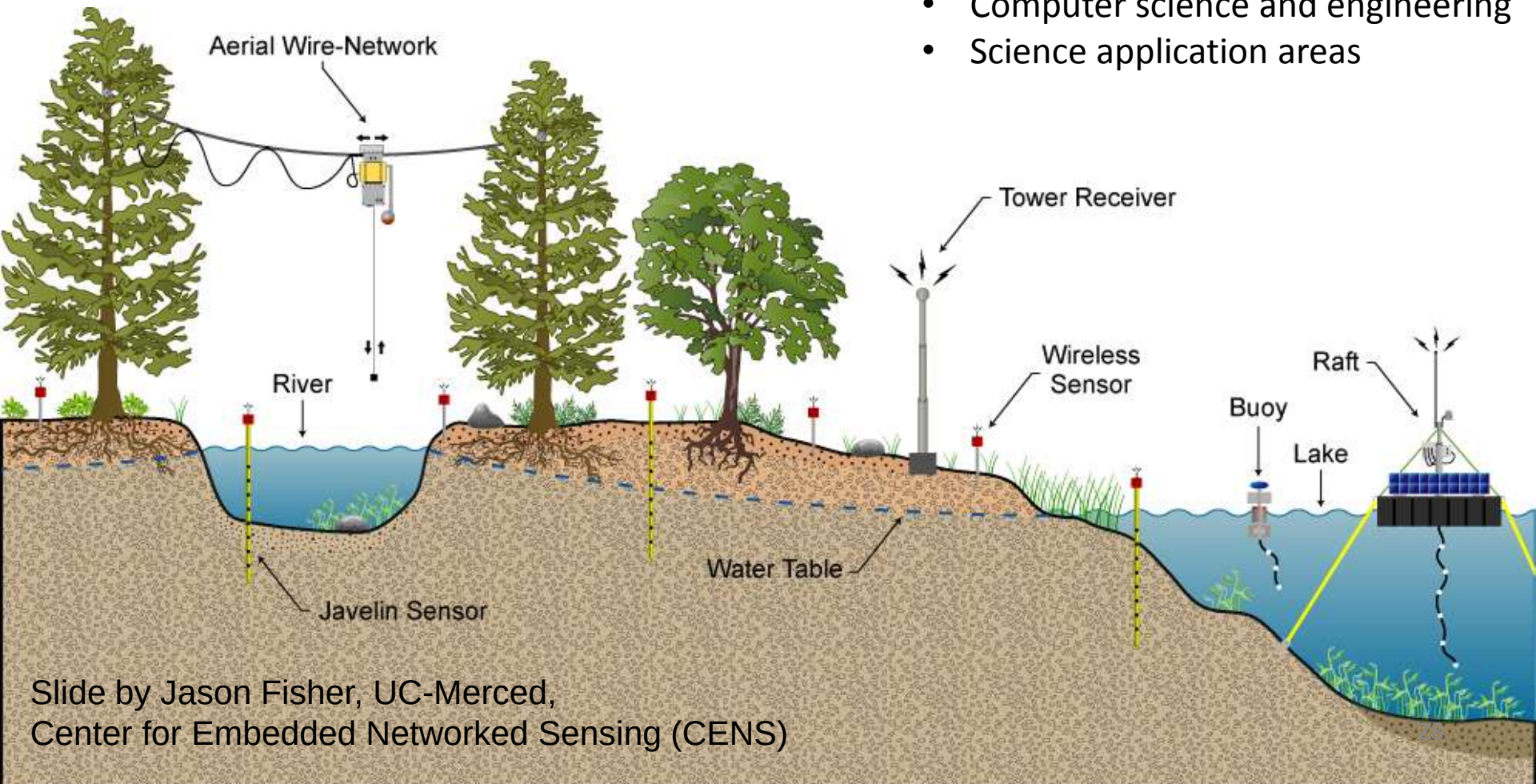


Figure 3 | Schematic illustration of the dendrogram process. Shown is the

Center for Embedded Networked Sensing

- NSF Science & Tech Ctr, 2002-2012
- 5 universities, plus partners
- 300 members
- Computer science and engineering
- Science application areas



Slide by Jason Fisher, UC-Merced,
Center for Embedded Networked Sensing (CENS)

Science <–> Data

Engineering researcher:
"Temperature is temperature."

CENS Robotics team

Biologist*:* ***"There are hundreds of ways to measure temperature.*** *'The temperature is 98' is low-value compared to, 'the temperature of the surface, measured by the infrared thermopile, model number XYZ, is 98.' That means it is measuring a proxy for a temperature, rather than being in contact with a probe, and it is measuring from a distance. The accuracy is plus or minus .05 of a degree. I [also] want to know that it was taken outside versus inside a controlled environment, how long it had been in place, and the last time it was calibrated, which might tell me whether it has drifted.."*

Center for Dark Energy Biosphere Investigations

International Ocean Discovery Program
iodp.tamu.org

- NSF Science & Tech Ctr, 2010-2020
- 20 universities, plus partners (35 institutions)
- 90 scientists
- Biological sciences
- Physical sciences

Repository for seafloor cores. Photo: Peter Darch

Self-descriptions C-DEBI scientists

Aquatic chemistry
Aquatic microbial ecology
Astrobiology
Biochemistry
Bioenergetics
Biogeochemistry
Biogeography
Bioinformatics
Biology
Chemical ecology
Chemical oceanography
Deep sea biogeochemistry
Deep sea microbiology
Ecology
Ecophysiology
Environmental chemistry
Environmental microbiology
Genomics
Geobiology
Geochemistry
Geomicrobiology
Geophysics
Hydrogeology
Hydrology
Hydrothermal microbiology
Inorganic chemistry
Marine ecology
Marine geology
Marine microbial biogeochemistry
Marine microbial ecology
Marine microbiology
Metabolomics
Metagenomics
Microbial biogeochemistry
Microbial biogeography
Microbial ecology
Microbial oceanography
Microbial physiology
Microbiology
Mineralogy
Molecular biogeochemistry
Molecular biology
Molecular microbial ecology
Molecular microbiology
Molecular physiology
Paleoceanography
Paleoclimatology
Paleogeomicrobiology
Petrology
Physiology
Plant biochemistry
Sedimentary biogeochemistry
Sedimentary geochemistry
Sedimentology

Peter Darch, UCLA

Peter Darch, UCLA

Conservatives report, but liberals display, greater happiness: Wojcik et al - Behavioral Happiness - Study 1 data

Principal Investigator(s) : Wojcik, Sean; Hovasapian, Arpine; Graham, Jesse; Motyl, Matt; Ditto, Peter;

wojcik-et-al-behavioral-happiness-study-1-data-26097.dta (application/x-stata) 55839

Extended Properties

Browse variables: sesladdercountry (Subjective SES)

sesladdercountry:Subjective SES

Category	N=1433
Valid Cases	**Valid N=1431**
0 : Lowest	408
1	←3
2	←24
3	←56
4	←122
5	←112
6	←180
7	219
8	←214
9	←70
10 : Highest	←23
Invalid Cases	**Invalid N=2**
System Missing	←2

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Citation: Wojcik, Sean; Hovasapian, Arpine; Graham, Jesse; Motyl, Matt; Ditto, Peter. Conservatives report, but liberals display, greater happiness: Wojcik et al - Behavioral Happiness - Study 1 data. Ann Arbor, MI: Inter-university Consortium for Political and Social Research [distributor], 2015-02-21. http://doi.org/10.3886/E26096V1

Persistent URL: http://doi.org/10.3886/E26096V1

http://vcg.isti.cnr.it/griffin/

Arte islamica, ippogrifo, XI sec 03, own work

6 BEASTS THAT ROARED: THE PISA GRIF AND THE NEW YORK LION

Anna Contadini, Richard Camber and Peter Northover

The Pisa Griffin

Anna Contadini

My interest in the Pisa Griffin (pl. 6.1) goes back to my childhood, when my parents took me to visit Pisa for the first time. I am still as impressed by the beast as I was then, but I am now equally intrigued by the mystery that

further substantiation, to be learnt about its one might call a great through the opening discovered that it had Griffin and attached with slightly everted the animal (pl. 6.3).

The Composition of the Lion a the Griffin

Peter Northover

The discussion of the compositions of the two sculp will be made in the order in which the analyses carried out, that is with the Lion first, followed b Griffin. All the analyses have been made by electron microanalysis (EPMA) using wavelength dispe spectrometry; this method has been well standar against other current techniques so the results w broadly comparable with those from other laborato

permission to take samples for analysis; my thanks, however, to the Archivio dell'Opera del Duomo, who assisted in the study of the documents and facilitated the photography; Mauro Martini Bonacchi of the Archivio Capitolare; and the staff of the Pisa

through Ralph has n he has followed our discussion various

Analysis of the Lion and Griffin

sample	Object	Part	Fe	Cu	Ni	Co	Zn	As	Sb	Sn	Ag	Bi	Pb	Au	S
R4915/1	Lion	body	0.08	0.01	0.05	97.96	0.02	2.57	0.01	0.94	0.26	0.07	0.05	0.02	0.00
R4915/2			0.03	0.00	0.06	65.70	0.00	0.00	0.00	16.99	0.39	0.03	0.28	0.24	0.00
R4915/3			0.04	0.00	0.03	89.66	0.07	0.00	0.02	9.80	0.23	0.00	0.06	0.02	0.00
R4916/1	Lion	right fore leg	0.00	0.00	0.04	87.41	0.07	0.00	0.00	11.71	0.51	0.00	0.20	0.00	0.07
R4916/2			0.01	0.00	0.07	81.71	0.04	0.00	0.00	16.14	0.89	0.17	0.95	0.02	0.00
R4916/3			0.01	0.00	0.00	89.30	0.06	0.00	0.00	10.01	0.40	0.04	0.18	0.00	0.02
R4917/1	Lion	massive wound	0.00	0.00	0.05	86.70	0.02	0.00	0.01	12.05	0.65	0.09	0.41	0.00	0.00
R4917/2			0.01	0.00	0.04	90.71	0.04	0.00	0.00	10.37	0.51	0.02	0.29	0.00	0.00
R4917/3			0.02	0.00	0.00	85.00	0.03	0.00	0.00	14.02	0.75	0.13	0.29	0.10	0.00
R3905/1	Lion	right hind leg	0.00	0.00	0.00	98.35	0.00	1.40	0.05	0.72	0.46	0.02	0.00	0.00	0.01
R3905/2			0.00	0.00	0.06	87.27	0.00	1.60	0.00	9.40	0.39	0.01	1.01	0.09	0.00
R3905/3			0.00	0.01	0.04	87.32	0.11	0.00	0.01	11.08	0.63	0.00	0.41	0.16	0.00
R3906/1	Lion	right fore leg	0.03	0.00	0.03	98.52	0.02	0.00	0.03	0.63	0.41	0.00	0.19	0.14	0.01
R3906/2			0.02	0.01	0.05	75.23	0.00	0.49	0.06	19.92	1.60	0.47	2.05	0.00	0.11
R3906/3			0.00	0.05	0.05	86.79	0.04	0.00	0.01	12.05	0.75	0.00	0.30	0.05	0.01
R3906/4			0.00	0.00	0.00	89.45	0.04	0.00	0.04	13.85	1.12	0.00	0.41	0.09	0.03
R3907/1	Lion	massive wound	0.01	0.01	0.06	79.95	0.12	0.00	0.00	16.05	1.30	0.02	0.84	0.01	2.16
R3907/2			0.04	0.00	0.00	86.25	0.11	0.38	0.00	12.43	0.98	0.03	0.32	0.01	0.00
R3907/3			0.02	0.01	0.00	90.15	0.03	0.00	0.00	9.31	0.46	0.00	0.00	0.00	0.00
R3908/1	Lion	flowing to tail	0.01	0.00	0.01	96.96	0.00	1.84	0.00	11.04	0.33	0.06	0.00	0.32	0.00
R3908/2			0.00	0.01	0.02	84.93	0.09	0.00	0.00	12.81	0.99	0.02	1.15	0.00	0.01
R3908/3			0.01	0.01	0.01	86.63	0.00	0.00	0.00	12.49	0.64	0.00	0.08	0.09	0.00
R3909/1	Lion	flowing to body	0.02	0.01	0.00	91.91	0.00	0.00	0.07	7.57	0.35	0.07	0.00	0.01	0.00
R3909/2			0.00	0.00	0.00	89.52	0.00	1.87	0.00	8.39	0.39	0.00	0.00	0.00	0.00
R3909/3			0.01	0.00	0.00	90.69	0.09	0.31	0.01	7.81	0.71	0.07	0.20	0.01	0.00
R3965/1	Griffin	left wing, drill hole	0.42	0.00	0.09	97.05	11.31	0.00	0.15	0.75	0.09	0.00	0.21	0.00	0.00
R3965/2			0.39	0.00	0.06	83.95	11.45	0.00	0.15	1.08	0.11	0.04	2.79	0.00	0.01
R3965/3			0.30	0.02	0.01	94.25	11.39	0.00	0.14	1.00	0.12	0.01	2.64	0.00	0.01
R3965/4			0.28	0.01	0.03	90.15	10.61	0.00	0.46	3.17	0.23	0.06	5.91	0.00	0.00
R3966/1	Griffin	right wing, drill hole	0.00	0.00	0.00	79.47	15.16	0.36	0.00	0.94	0.00	0.03	3.07	0.00	0.00
R3967/1	Griffin	body, flowing	0.10	0.01	0.04	90.21	6.48	0.00	0.22	2.31	0.11	0.00	0.27	0.00	0.00
R3967/2			0.09	0.00	0.00	87.41	8.36	0.04	0.00	3.23	0.18	0.04	1.65	0.00	0.01
R3967/3			0.11	0.02	0.04	89.36	6.90	0.00	0.28	2.31	0.09	0.00	0.49	0.00	0.00
R3969/1	Griffin	wound, upper	0.13	0.01	0.03	84.29	11.35	0.01	0.24	1.99	0.16	0.00	0.40	0.03	0.01
R3970/1	Griffin	wound, lower	0.15	0.04	0.05	85.23	9.09	0.00	0.35	2.80	0.19	0.00	1.81	0.07	0.03
R3970/2	Griffin		0.20	0.00	0.04	85.51	10.18	0.91	0.23	2.34	0.15	0.00	0.35	0.00	0.08
R4895	Lion	body	0.05	0.00	0.05	87.11	0.06	0.00	0.01	11.24	0.43	0.03	0.14	0.01	0.00
R4896	Lion	right fore leg	0.01	0.00	0.04	86.14	0.06	0.00	0.01	12.62	0.60	0.07	0.44	0.01	0.01
R4897	Lion	massive wound	0.03	0.00	0.04	86.63	0.09	0.41	0.01	11.95	0.52	0.05	0.29	0.01	0.21
R3901	Lion	right hind leg	0.00	0.00	0.03	87.71	0.00	1.34	0.01	9.36	0.49	0.01	0.00	0.09	0.00
R3904	Lion	right fore leg	0.01	0.01	0.03	85.34	0.03	0.12	0.05	14.12	0.90	0.12	0.20	0.06	0.05
R3902	Lion	massive wound	0.02	0.02	0.03	85.20	0.09	0.13	0.00	12.61	0.79	0.02	0.32	0.03	0.12
R3900	Lion	flowing to neck	0.01	0.01	0.01	85.97	0.05	0.55	0.00	12.12	0.72	0.03	0.40	0.14	0.01
R3899	Lion	flowing to body	0.01	0.00	0.00	90.70	0.04	0.23	0.03	7.86	0.48	0.05	0.07	0.02	0.01
R4913	Griffin	left wing, drill hole	0.36	0.01	0.05	83.84	11.19	0.00	0.22	1.25	0.14	0.04	2.89	0.00	0.01
R4914	Griffin	right wing, drill hole	0.00	0.00	0.05	79.47	15.16	0.36	0.00	0.94	0.00	0.03	3.07	0.00	0.00
R4917	Griffin	body, flowing	0.09	0.00	0.05	89.13	5.92	<0.10	0.49	3.28	0.19	0.01	0.79	0.03	0.00
R4918	Griffin	wound, upper	0.13	0.01	0.03	84.75	11.35	0.01	0.24	1.99	0.16	0.00	0.40	0.03	0.01
R4919	Griffin	wound, lower	0.17	0.02	0.05	85.37	9.61	0.45	0.31	2.62	0.17	0.00	1.11	0.03	0.07
R3955	Head on wound	weld metal	0.05	0.01	0.04	89.01	3.66	0.36	0.01	3.55	0.91	0.00	0.13	0.00	0.05
R3956	Head on wound	shaft	0.08	0.00	0.05	88.11	3.67	0.73	0.01	3.89	1.07	0.02	0.41	0.04	0.01
R3957	Head on wound	left hind hoof	0.03	0.00	0.04	89.62	3.93	0.45	0.00	3.12	1.28	0.00	0.22	0.04	0.16

Precondition:

Researchers share data

Lack of incentives to share data

- Labor to document data
- Benefits to unknown others
- Competition
- Control
- Confidentiality…

Image source: www.buildingsrus.co.uk/.../ target1.htm

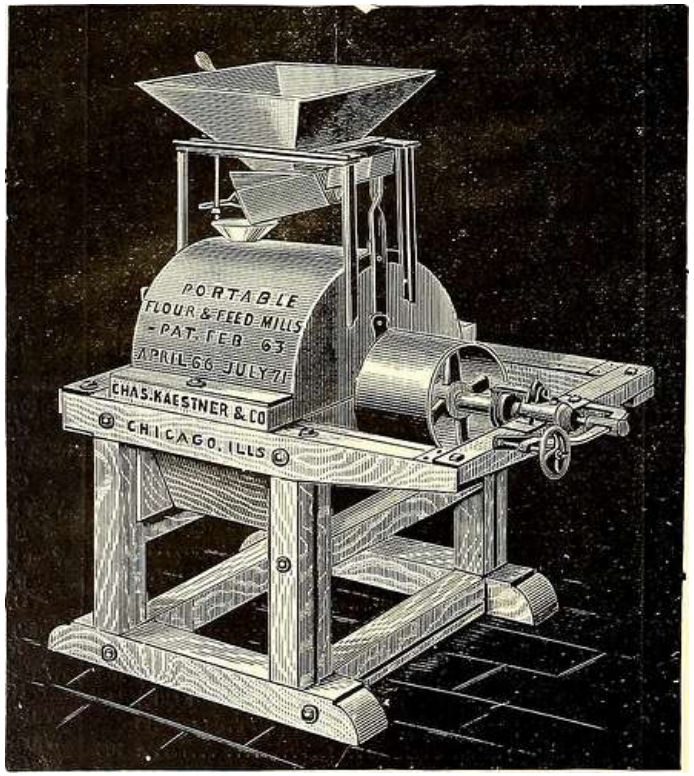
Lack of incentives to reuse data

- Identify useful data
  - Documentation
  - Interpretation
  - Software
- Cleaning
- Trust
- Credit
- Licensing…

http://fyi.uiowa.edu/wp-content/uploads/2011/10/utopia_in_four_movements_filmstill5_utopiasign.jpg

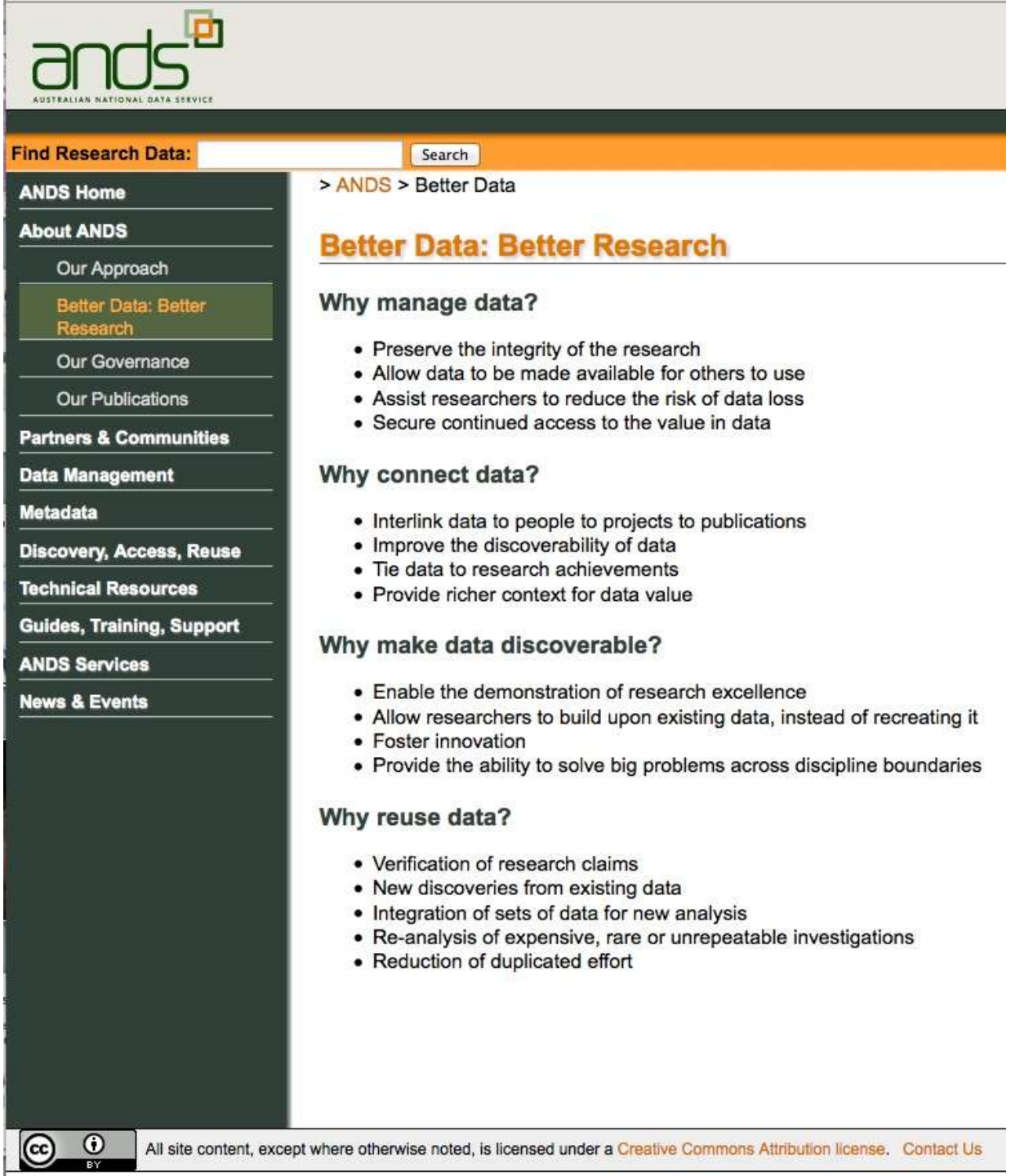
Consolidating value in data

July 19, 1922. State Library and Archives of Florida. Flickr commons



Page 105 of "The Street railway journal" (1884); Flickr Commons

Australian National Data Service



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Better Data: Better Research

Why manage data?

- Preserve the integrity of the research
- Allow data to be made available for others to use
- Assist researchers to reduce the risk of data loss
- Secure continued access to the value in data

Why connect data?

- Interlink data to people to projects to publications
- Improve the discoverability of data
- Tie data to research achievements
- Provide richer context for data value

Why make data discoverable?

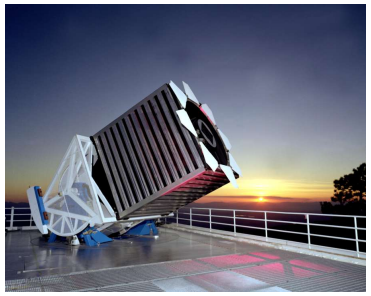
- Enable the demonstration of research excellence
- Allow researchers to build upon existing data, instead of recreating it
- Foster innovation
- Provide the ability to solve big problems across discipline boundaries

Why reuse data?

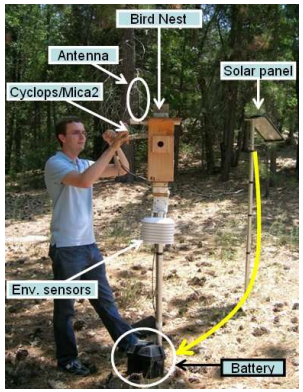
- Verification of research claims
- New discoveries from existing data
- Integration of sets of data for new analysis
- Re-analysis of expensive, rare or unrepeatable investigations
- Reduction of duplicated effort

Ways to pool data

- Centralized data production
  - Top down investments in data
  - Pooled data resources for the community



- Decentralized data production
  - Bottom up investments in data
  - Local data resources pooled later



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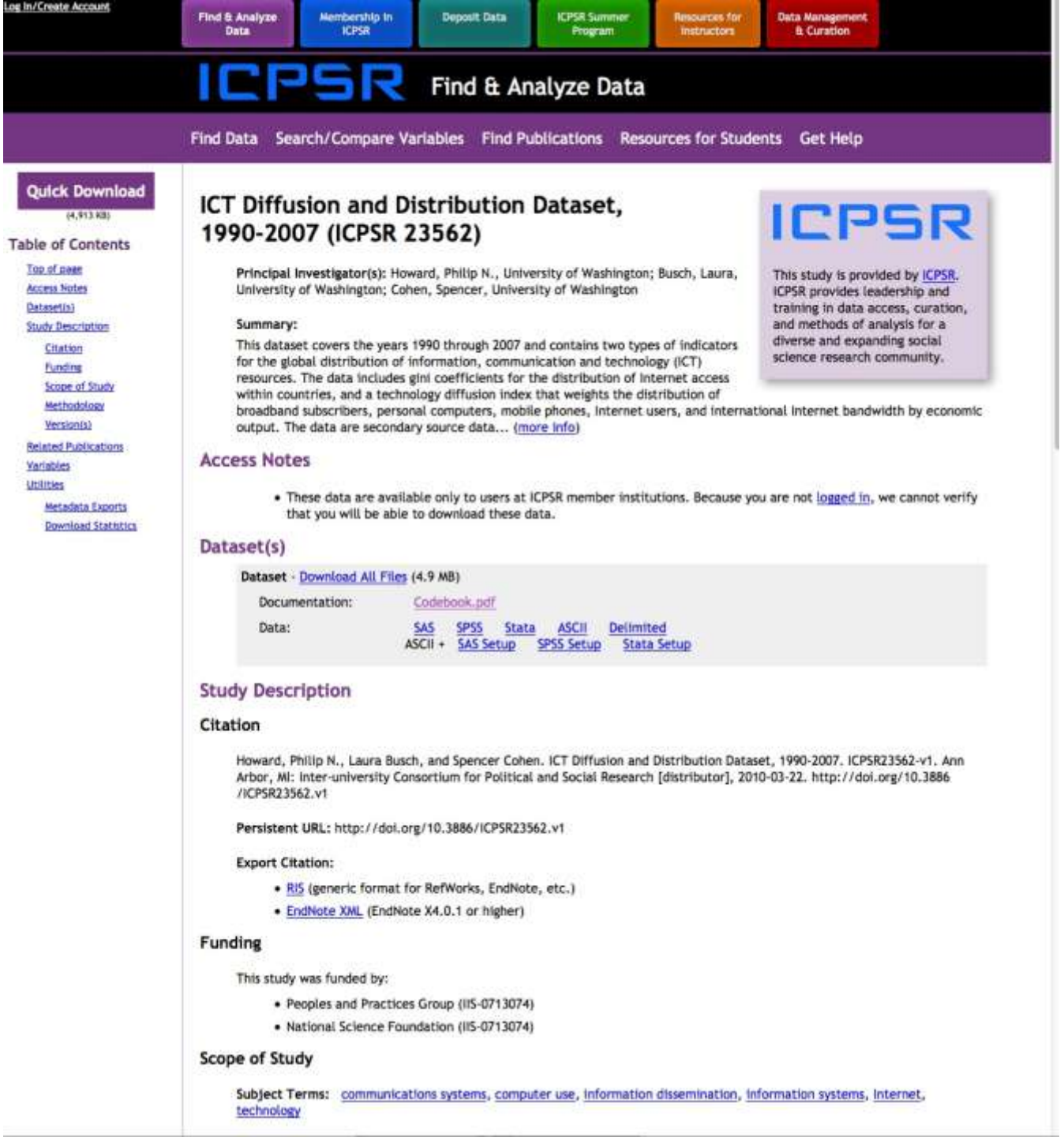

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Table of Contents

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- Access Notes
- Dataset(s)
- Study Description
  - Citation
  - Funding
  - Scope of Study
  - Methodology
  - Version(s)
- Related Publications
- Variables
- Utilities
  - Metadata Exports
  - Download Statistics

ICT Diffusion and Distribution Dataset, 1990-2007 (ICPSR 23562)

ICPSR

This study is provided by ICPSR. ICPSR provides leadership and training in data access, curation, and methods of analysis for a diverse and expanding social science research community.

Principal Investigator(s): Howard, Philip N., University of Washington; Busch, Laura, University of Washington; Cohen, Spencer, University of Washington

Summary:

This dataset covers the years 1990 through 2007 and contains two types of indicators for the global distribution of information, communication and technology (ICT) resources. The data includes gini coefficients for the distribution of Internet access within countries, and a technology diffusion index that weights the distribution of broadband subscribers, personal computers, mobile phones, Internet users, and international Internet bandwidth by economic output. The data are secondary source data... (more info)

Access Notes

- These data are available only to users at ICPSR member institutions. Because you are not logged in, we cannot verify that you will be able to download these data.

Dataset(s)

Dataset - Download All Files (4.9 MB)

Documentation: Codebook.pdf

Data: SAS SPSS Stata ASCII Delimited
ASCII + SAS Setup SPSS Setup Stata Setup

Study Description

Citation

Howard, Philip N., Laura Busch, and Spencer Cohen. ICT Diffusion and Distribution Dataset, 1990-2007. ICPSR23562-v1. Ann Arbor, MI: Inter-university Consortium for Political and Social Research [distributor], 2010-03-22. http://doi.org/10.3886/ICPSR23562.v1

Persistent URL: http://doi.org/10.3886/ICPSR23562.v1

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- EndNote XML (EndNote X4.0.1 or higher)

Funding

This study was funded by:

- Peoples and Practices Group (IIS-0713074)
- National Science Foundation (IIS-0713074)

Scope of Study

Subject Terms: communications systems, computer use, information dissemination, information systems, Internet, technology

Discovery and Interpretation

- Identify the form and content
- Identify related objects
- Interpret
- Evaluate
- Open
- Read
- Compute upon
- Reuse
- Combine
- Describe
- Annotate…

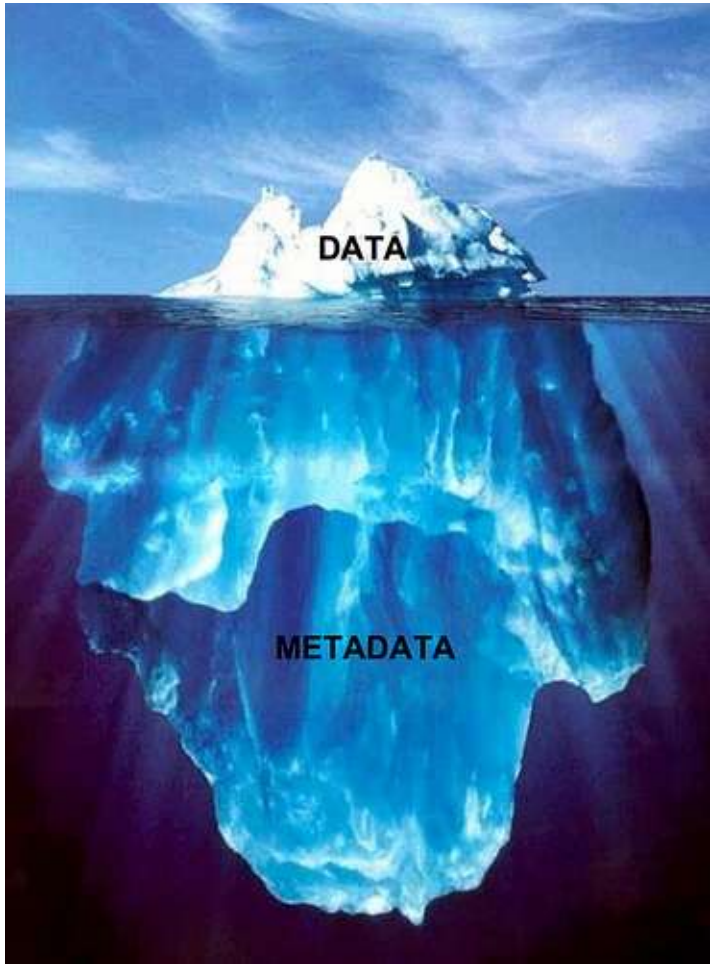
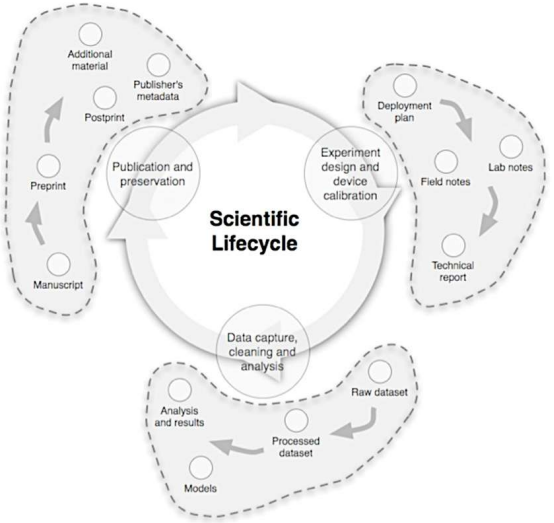


Image from Soumitri Varadarajan blog. Iceberg image © Ralph A. Clevenger. Flickr photo

Describing and attributing data

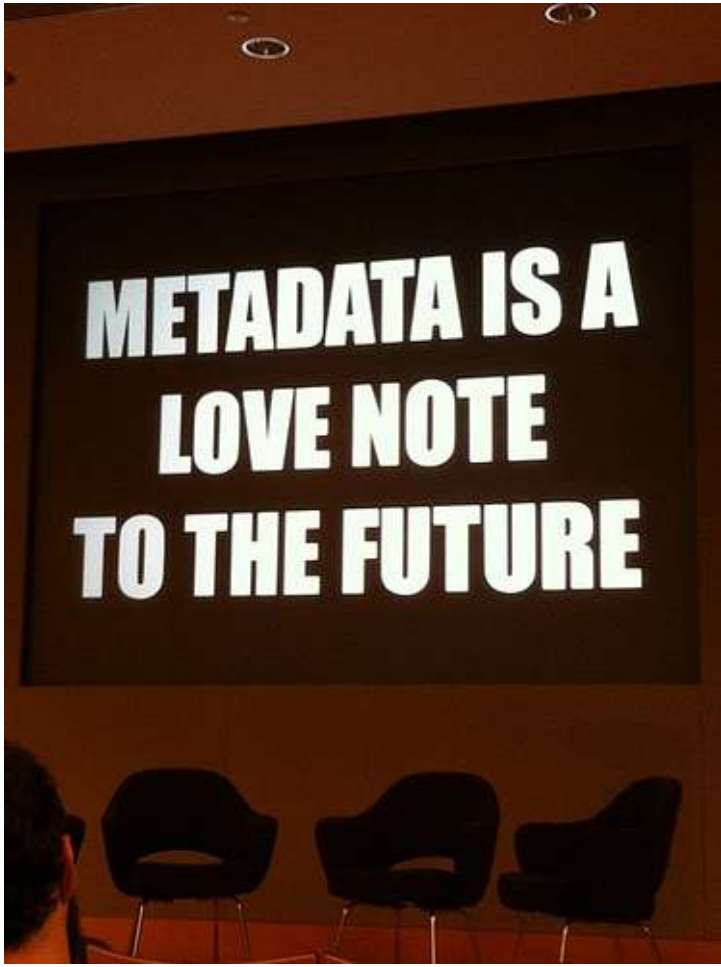
- Compound objects
  - Observations
  - Software
  - Protocols…
- Attribution
  - Investigators
  - Data collectors
  - Analysts…
- Ownership, responsibility



Mary Jane Rathbun (1860-1943), working with crab specimens

Metadata

- Metadata is structured information that describes, explains, locates, or otherwise makes it easier to retrieve, use, or manage an information resource.
  - descriptive
  - structural
  - administrative



National Information Standards Organization 2004

photo by @kissane

Provenance

- Libraries: Origin or source
- Museums: Chain of custody
- Internet: Provenance is information about entities, activities, and people involved in producing a piece of data or thing, which can be used to form assessments about its quality, reliability or trustworthiness. (World Wide Web Consortium (W3C) Provenance working group)

British Library, provenance record: Bestiary - caption: 'Owl mobbed by smaller birds'

Reuse across place and time

- Reuse by investigator
- Reuse by collaborators
- Reuse by colleagues
- Reuse by unaffiliated others
- Reuse at later times
  - Months
  - Years
  - Decades
  - Centuries

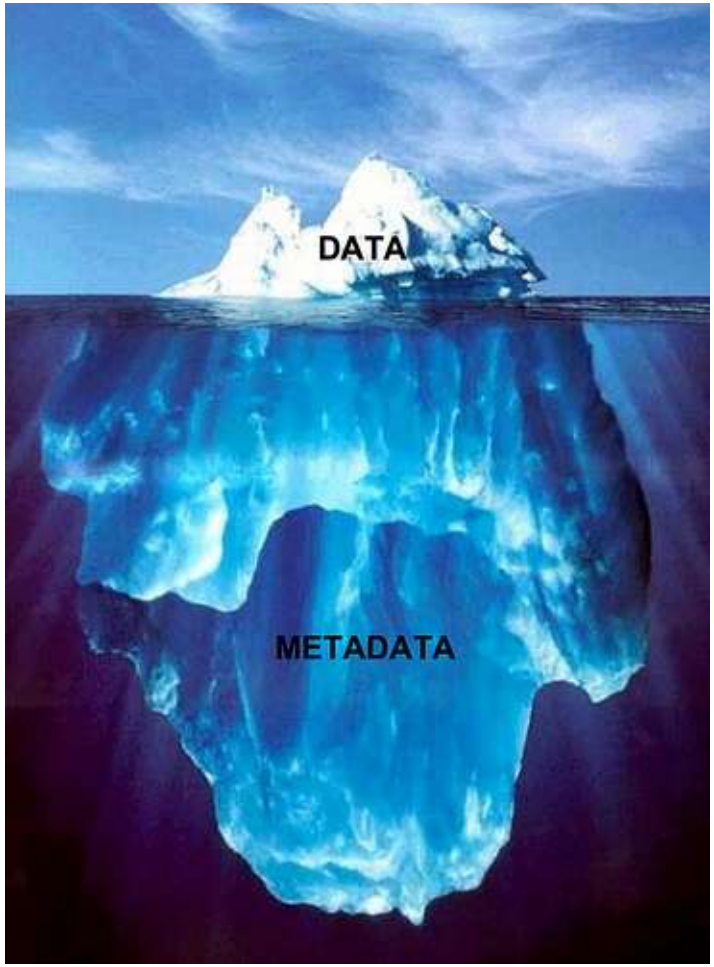


Image from Soumitri Varadarajan blog. Iceberg image © Ralph A. Clevenger. Flickr photo

MODERN DATA SCIENTIST

Data Scientist, the sexiest job of the 21th century, requires a mixture of multidisciplinary skills ranging from an intersection of mathematics, statistics, computer science, communication and business. Finding a data scientist is hard. Finding people who understand who a data scientist is, is equally hard. So here is a little cheat sheet on who the modern data scientist really is.

MATH & STATISTICS

- Machine learning
- Statistical modeling
- Experiment design
- Bayesian inference
- Supervised learning: decision trees, random forests, logistic regression
- Unsupervised learning: clustering, dimensionality reduction
- Optimization: gradient descent and variants

PROGRAMMING & DATABASE

- Computer science fundamentals
- Scripting language e.g. Python
- Statistical computing packages, e.g., R
- Databases: SQL and NoSQL
- Relational algebra
- Parallel databases and parallel query processing
- MapReduce concepts
- Hadoop and Hive/Pig
- Custom reducers
- Experience with xaaS like AWS

DOMAIN KNOWLEDGE & SOFT SKILLS

- Passionate about the business
- Curious about data
- Influence without authority
- Hacker mindset
- Problem solver
- Strategic, proactive, creative, innovative and collaborative

COMMUNICATION & VISUALIZATION

- Able to engage with senior management
- Story telling skills
- Translate data-driven insights into decisions and actions
- Visual art design
- R packages like ggplot or lattice
- Knowledge of any of visualization tools e.g. Flare, D3.js, Tableau

MarketingDistillery.com is a group of practitioners in the area of e-commerce marketing. Our fields of expertise include: marketing strategy and optimization; customer tracking and on-site analytics; predictive analytics and econometrics; data warehousing and big data systems; marketing channel insights in Paid Search, SEO, Social, CRM and brand.

Marketing DISTILLERY

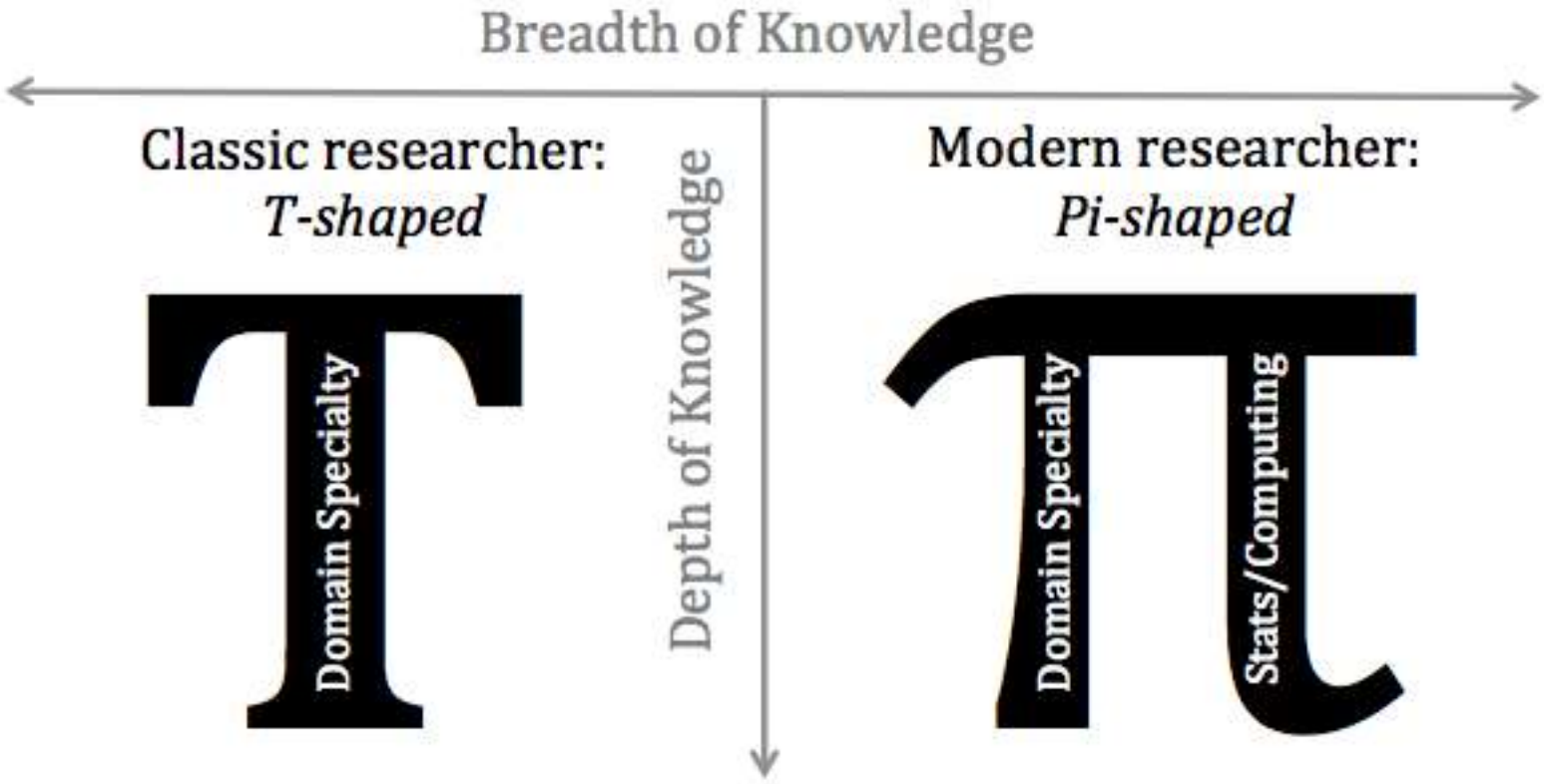
https://github.com/okulbilisim/awesome-datascience

Data Curation and Stewardship

- Services and tools
- Data management planning
- Selection and appraisal
- Metadata, provenance
- Migration
- Economics
- Infrastructure

http://www.librarygirl.net/2013/08/putting-your-best-foot-forward-tl.html

Research workforce



https://jakevdp.github.io/blog/2014/08/22/hacking-academia/

Knowledge Infrastructures

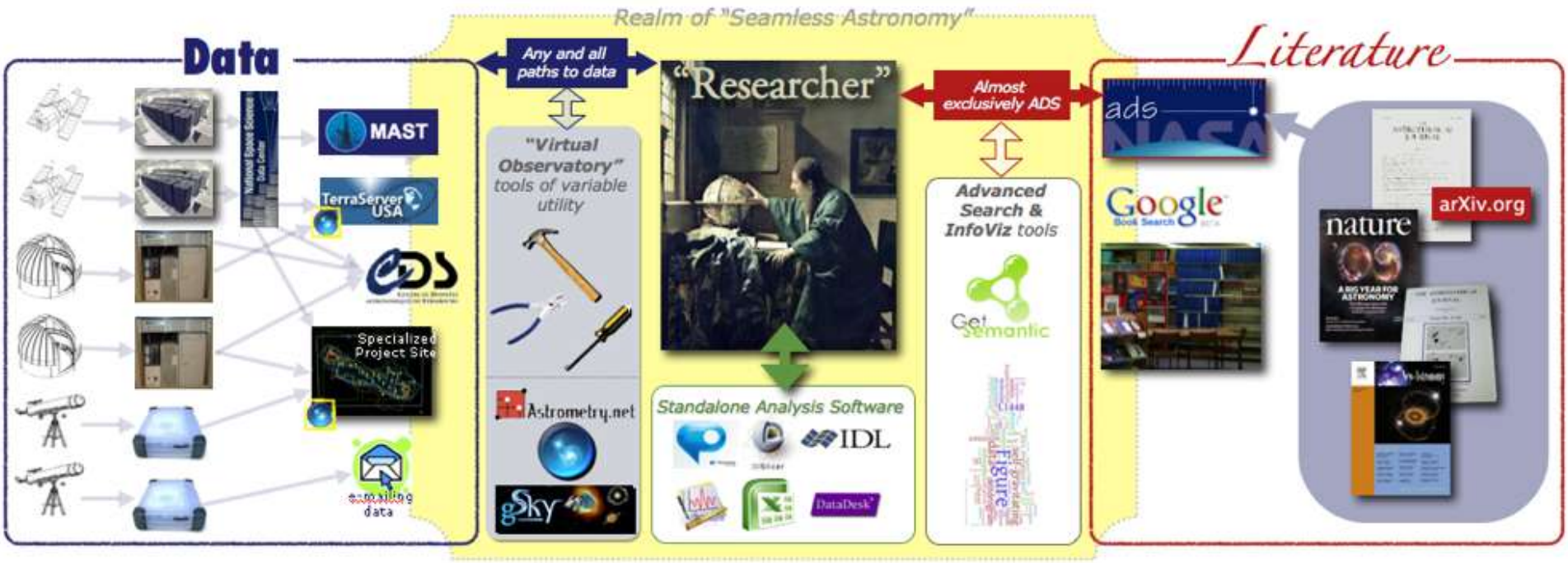


Image: Alyssa Goodman, Harvard Astronomy

http://knowledgeinfrastructures.org

Economics of the Knowledge Commons

		Subtractability / Rivalry	
		Low	High
Exclusion	Difficult	**Public Goods** General knowledge Public domain data	**Common-pool resources** Libraries Data archives
	Easy	**Toll or Club Goods** Subscription journals Subscription data	**Private Goods** Printed books Raw or competitive data

Adapted from C. Hess & E. Ostrom (Eds.), *Understanding knowledge as a commons: From theory to practice*. MIT Press.

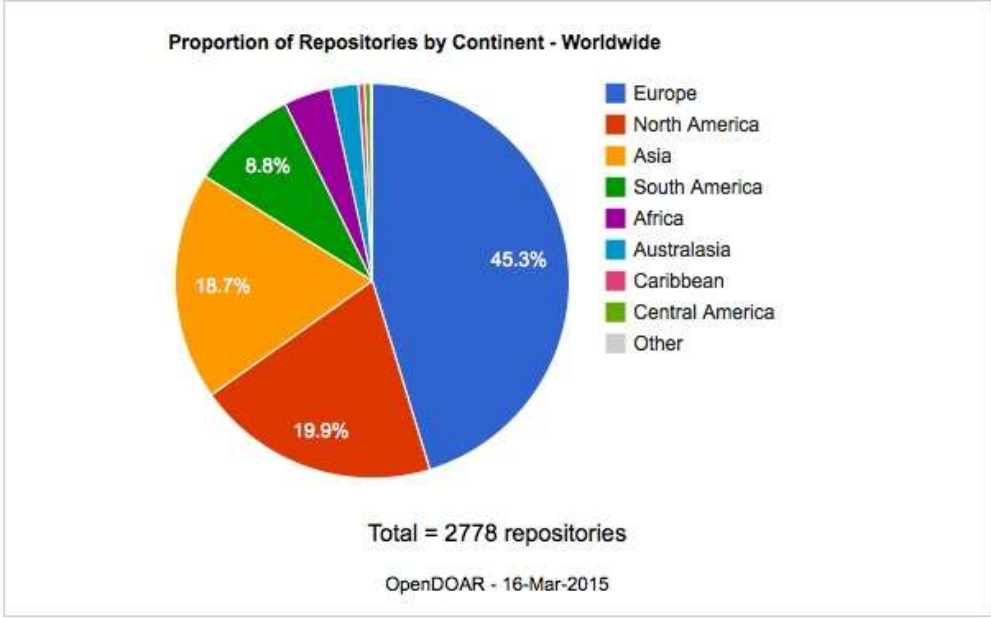
Data Repositories

OpenDOAR

Directory of Open Access Repositories

Home | Find | Suggest | Tools | FAQ | About | Contact Us

Proportion of Repositories by Continent - Worldwide



This chart is based on the number of repositories in each Continent. However, some organisations have two or more repositories - over 20 in some cases - and this arguably skews the results.

For a different viewpoint, please see the equivalent chart for Repository Organisations, in which each organisation only counts once, regardless of how many repositories it hosts.

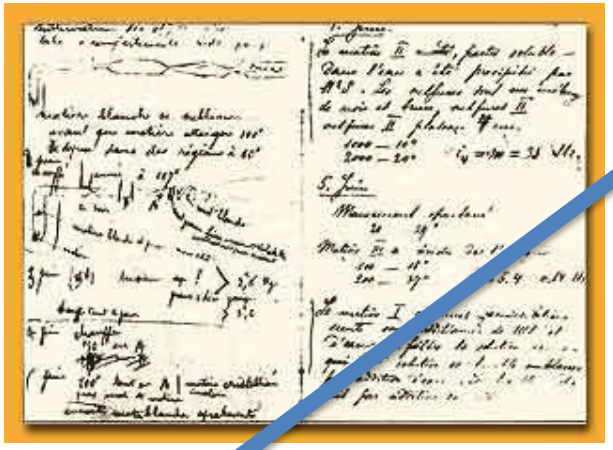
For further data, please see the corresponding table of repositories sorted by country.

Show embedding code

Show legacy chart and embedding code

No Data

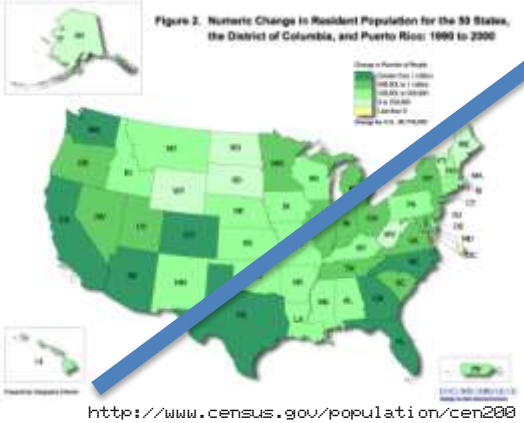
- Data not available
- Data not released
- Data not usable



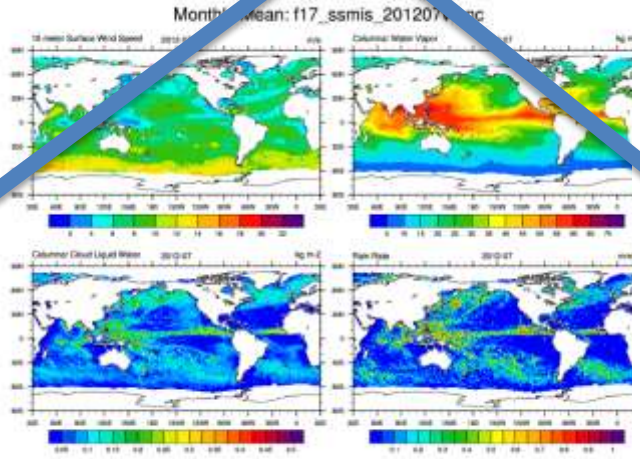
Marie Curie's notebook aip.org

Pisa Griffin

hudsonalpha.org



http://www.census.gov/population/cen2000/map02.gif



ncl.ucar.edu

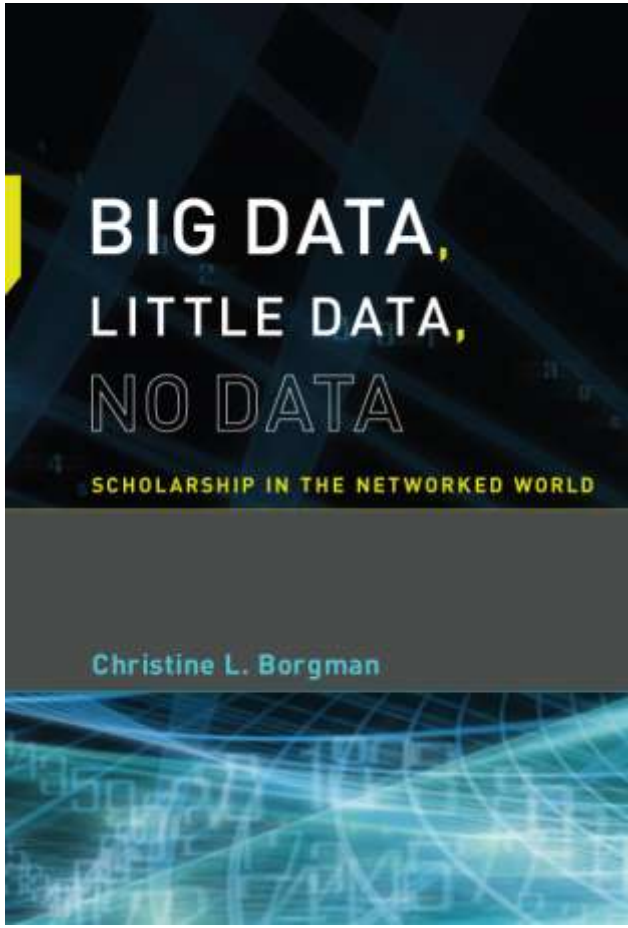
Date:1/2.07.75 Place:Sakaltutan
Zafor
He will grow old in his present house; new house is for sons - 5 sons. Not sure they want to live in village. He will only build another if they want him to. eS came from Germany and did the plastering. He arranged the carpentry in Kayseri. Çok para gitti. {much money went} Has a tractor.

Date:Jul 1980 Place:Sakaltutan
Zafor:
Household now Zafor and wife; Nazif Unal and wife and youngest son still a boy. They run two dolmuß; one with a driver from Süleymanli. Goes in and out once a day. He gets 8,000 a month. Zafor then said, keskin değil. {not sharp - e.? not profitable} I said he did very well on 8,000 TL with only two journeys a day. Nazif Unal has "bought" a durak {dolmuß stop} from Belediye and works all day in Kayseri.

http://onlineqda.hud.ac.uk/Intro_QDA/Examples_of_Qualitative_Data.ph

Conclusions

- Defining data
  - Representations used as evidence
  - One person's signal is another's noise
- Creating data
  - Models, questions, methods
  - Domain expertise
  - Data science expertise
- Collaborating with data
  - Documentation, description, identity, linking
  - Incentives for release and reuse
  - Curation and stewardship expertise
- Consolidating data value
  - Infrastructure and workforce investments
  - Value propositions
  - Trust fabric



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