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## Design principles of protein switches

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### Abstract

Protein switches perform essential roles in many biological processes and are exciting targets for *de novo* protein design, which aims to produce proteins of arbitrary shape and functionality. However, the biophysical requirements for switch function — multiple conformational states, fine-tuned energetics, and stimuli-responsiveness — pose a formidable challenge for design by computation (or intuition). A variety of methods have been developed towards tackling this challenge, usually taking inspiration from the wealth of sequence and structural information available for naturally occurring protein switches. More recently, modular switches have been designed computationally, and new methods have emerged for sampling unexplored structure space, providing promising new avenues towards the generation of purpose-built switches and *de novo* signaling systems for cellular engineering.

### Introduction

Protein switches are ubiquitous and essential facilitators of biological function that link input signals to output responses. Most broadly, signal transduction can be described as a conformational response to some input perturbation that leads to a functional output (Figure 1A). Inputs for biomolecular switches span diverse stimuli such as ligand binding, environmental changes (*e.g.*, temperature, pH), and post-translational modifications. Outputs can also be diverse, including changes in oligomeric state, affinity for binding partners, and the exposure or burial of functional sites. Structural responses range from subtle (*e.g.*, shifts in populations of conformational states, coupled rearrangements of sidechains) to striking (*e.g.*, involving large hinge-like motions of secondary structure elements or entire domains,

Declaration of interest

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and fold switching). The mechanisms underlying conformational coupling associated with switching are typically intricate, with fine-tuned energetics to regulate the kinetics, dynamic range, and specificity of the switch.

In nature, switches are employed as regulatory elements, mediators of energy conversion in molecular machines, and drivers of mechanical mobility. This broad utility (but also challenging functionality) of natural switches has rendered this class of proteins particularly attractive as targets for *de novo* design. *De novo* design could generate "idealized" and modular switches that can be more easily controlled and coupled to diverse in- and outputs. Conceptually, the design of new switches includes (1) defining a switch mechanism, (2) generating the desired endstates/conformational ensembles, (3) engineering an input to the switch, and (4) tuning the energy landscapes underpinning switch function (Figure 1B). We begin with a classification of switch mechanisms occurring in nature, then summarize switches that have been designed (often inspired by natural switches, Table 1), and end with a perspective for the future of designed switches, highlighting recent methodological advances and unsolved challenges.

#### Natural switches

#### Allostery and local changes in geometry

Perhaps the most common mechanism of switching in nature are residue-level conformational changes, often resulting in altered loop conformations or distinct spatial orientations of secondary structure elements, that change specific geometries important for function (Figure 2A). Although these changes are often subtle and relatively local, they can have drastic functional consequences, resulting in the activation or inactivation of enzymes, signaling domains, and receptors such as kinases [1], GTPases [2], and G-protein coupled receptors (GPCRs) [3]. Perhaps counterintuitively, while dramatic global topological changes have been designed successfully [4,5], bistable and more subtle local conformational changes have yet to be realized in *de novo* design of functional switches. It is precisely the level of subtlety that makes *de novo* switch design at this scale difficult to achieve, as it is challenging to accurately capture the relatively small energy differences between conformational states during computational design and structure prediction.

#### Fold switching

Metamorphic proteins undergo more dramatic structural changes, reversibly adopting two different native topologies (identity and connectivity of secondary structure elements) that have distinct biological functions (Figure 2B). Natural fold switch proteins such as lymphotactin [6], KaiB [7], or Mdm2 [8] often have binding interfaces specific to one fold, and are hence able to form favorable interactions in the presence of other proteins upon fold switching. It may be possible to use this principle to engineer controllable protein conformational switches by tuning the free energy difference between folds and their binding interactions. Structural studies combined with ancestral sequence reconstruction of lymphotactin have suggested how fold switching may have evolved through optimizing intra-chain interactions for desired interconversion rates without trapping the protein in either fold [9]. In contrast, there are also cases of irreversible fold switching driven by the

strain associated with local sequence-structure incompatibility. One prominent example of this mechanism is the conversion of influenza hemagglutinin from inactive to fusogenic form [10]. Further investigation into the requisite energetic and mechanical transformations of fold switching proteins should enable the design of new switches which either emulate [11] or deviate significantly from switch mechanisms in natural examples.

#### **Differential domain assembly**

A third type of switching mechanism occurring in nature involves the rearrangement of individual domains of larger multi-domain proteins (Figure 2C). Conformational changes at this scale, where the moving parts largely behave as rigid bodies, are common in the regulation of signaling proteins and often involve changes in interactions between catalytic and auto-inhibitory domains [12]. For instance, if the catalytic site is physically obstructed by a bound auto-inhibitory domain, activating inputs may cause conformational changes that allow access to the active site. An example is the regulation of the SH2-containing phosphatase 2 in which phosphorylation of the SH2 domain causes dissociation from the phosphatase active site [13]. The broader principle of regulation of multi-domain assemblies through domain rearrangements has been termed "modular allostery" [14] and has provided ample inspiration for synthetic signaling systems [15] and protein-based biosensors [16]. Modular switch mechanisms can also be coupled to within-domain allosteric changes in the catalytic domain conformation, as seen in Src family kinases [17], but this type of regulation has not yet been engineered *de novo*.

#### **Designed switches**

#### Computational methodologies applied to switch design

Modern de novo protein design methods typically start with the construction of a backbone structure with the desired topology/geometry [18]. Sidechain design is then performed on this backbone (fixed or flexible) to optimize sequences predicted to fold (*i.e.*, adopt its lowest energy conformation) into that structure in accordance with Anfinsen's principle. This approach is only partially transferable to the *de novo* design of protein switches, which instead must attempt to simultaneously design (1) multiple interconvertible geometries, (2) at different local energy minima, (3) whose relative populations shift in response to a stimulus, (4) with all of the requisite structural mechanics incorporated. These requirements place additional demands on sampling, scoring, and our ability to represent multi-state ensembles with controlled functionality and energetics. Thus, switch design requires sampling over both sequence and structure space seeking single sequences that simultaneously achieve all of the above properties, posing not only a formidable combinatorial problem but also requiring high accuracy. Consequently, most designed switches to date have borrowed heavily from nature, using the backbones of known proteins and/or information derived from multiple sequence alignments to guide design. This wealth of sequence and structural data, as well as particularly well-characterized natural switches, also provide important benchmarks for computational methods. However, current approaches for switch design remain limited in scope and number; methodological developments are needed to realize arbitrary structures and functions.

#### Sequence landscape-based design

Recapitulating conformational responses in engineered proteins can range from performing relatively small searches in sequence space between existing structures to designing completely *de novo* folds unseen in nature. At one end of the spectrum, the most conservative design strategy involves transitioning between two well-defined folds that are known to be designable via stepwise mutational trajectories. Some of the first switches designed were based on merging the well-known motifs of zinc finger and all-helical folds and testing hybrid designs for switching behavior [19,20]. The computational RosettaDesign algorithm was used later to achieve a similar switch behavior [4]. While the straightforward approach of threading single sequences onto multiple backbones and scoring all states simultaneously to evaluate fitness was successful, the design strategy was facilitated by the facts that the endstate backbones were well defined and that zinc fingers commonly undergo folding/unfolding transitions in response to  $Zn^{2+}$  ions (Figure 3A). Generalizing this approach to arbitrary backbones will be an important step forward to designing functional switches *de novo*, though the use of metals or cofactors to mediate folding/conformational changes is itself likely to be an important mechanism underlying many target functions.

Recently, the joint fitness landscape of the GA ( $3\alpha$ ) and GB ( $4\beta$ + $\alpha$ ) binding domains of streptococcal protein G [5] was characterized by using the observed sequence variation of protein homologues to identify mutational pathways bridging the two distinct folds via Monte Carlo simulations [21]. By applying stability requirements on transitional sequences, it may be possible to identify putative fold switches more generally. The REstrained CONvergence (RECON) multistate design algorithm likewise uses a restrained search over the sequence fitness landscape between states to find sequences compatible with multiple distinct design goals (*e.g.*, alternative conformations) by allowing each state to independently sample sequence space while driven to convergence through ramping restraints [22]. When applied to proteins known to be capable of large conformational changes, the sequence space sampled by RECON was found to indeed resemble the evolutionary sequence space of the starting structures [23]. An advantage to using RECON over explicitly incorporating evolutionary data is the possibility of targeting de novo structures as alternative conformational states. We note that these methods have been tested only in silico but provide exciting tools for experimental validation and future application. A recent experimental study using sequence alignment-based algorithms for fold switch design characterized proteins that adopted one fold in a truncated form (56 amino acids) and an alternative fold in a longer form (~90 amino acids). While the focus of the study was not on identifying a single bistable amino acid sequence for each fold pair, the authors do note possible spontaneous interconversion between folds for some expressed designs [24].

#### Integrative redesign

Currently, methods to engineer residue-level 'microswitches' capable of transducing signals rely on some combination of evolutionary information, experimental feedback, and molecular dynamics (MD) simulations to inform design. This integrative approach is needed to compensate for the difficulty of exerting fine control over protein geometry from first principles. For instance, to design new GPCR variants with altered conformational dynamics, Barth *et al.* first predicted residue-residue coupling by MD simulations before

systematically assessing all possible amino acid combinations *in silico* [25]. Similar approaches relying on mutation of key structural residues based on evolutionary data or manual inspection of starting structures have also been successful in creating switchable peptides and proteins [26,27]. Such methods do not define the precise conformation of alternative states and are highly dependent on the topology of the starting structure. A benefit of such designs, however, is the identification of sequence-structure relationships that may improve our understanding of native proteins and aid in future efforts to reprogram switching behavior.

#### Designing de novo switches

Computational protein design increasingly aims to design proteins entirely de novo, i.e. from structural principles without relying on a natural protein as a starting point. Helical bundles are particularly popular targets, as their highly predictable backbone geometries facilitate the design of alternate conformational states (Figure 3B-3D). Moreover, residue-level interactions are well characterized; tuning their strengths in different conformational states has proven to be a successful design strategy for design of helical bundle-based protein switches. The development of algorithms to design extensive hydrogen bond networks along helical interfaces-first employed for the design of mutually orthogonal oligomeric structures [28]—have been exploited to create new switchable architectures based on polar interactions, including pH-responsive oligomers with histidine-rich interfaces [29] and a Ca<sup>2+</sup>-dependent coiled-coil switch that mimics the conformational states of influenza hemagglutinin [11] (Figure 3B). One principal advantage of this approach is the inherent modularity of helical bundles and the differential strengths of hydrophobic interactions and polar networks, which are a central feature of 'latching orthogonal cage-key proteins' (LOCKR) [30]. Constructed from a trimer of helical hairpins, LOCKR proteins consist of a five-helix 'cage' with a sixth 'latch' helix bound via a polar interface. LOCKR switching follows the principle of domain displacements in modular allostery described above. Functional peptides can be threaded onto the latch such that they are sequestered within the helix until a helical 'key' peptide with cage-optimal interactions displaces the latch, causing the latch to unfold and expose the functional sequence(s) (Figure 3C). Originally shown to be capable of regulating protein degradation in vivo, variants of the LOCKR system designed by simply interchanging modular components have since been employed to create synthetic feedback circuits in cells [31], perform Boolean logic operations on the surfaces of live cells [32], and sense target proteins [16]. In an earlier example of functionally coupled geometry changes, a transmembrane four-helix bundle with engineered metal binding sites was designed to alternate between two degenerate states to yield a  $Zn^{2+}/H^+$  antiporter [33] (Figure 3D). These applications underscore the utility of purpose-built switches. Though modular displacement of helical elements in designed helical bundle assemblies has now been realized to yield functional proteins, the complete end-to-end design of conformational switches in which arbitrary end states can be specified (perhaps most tantalizing in the form of *de novo* folds) remains unachieved and would begin to demonstrate a mastery of *de novo* switch design.

#### Future directions

Designs of modular switchable systems have proven useful as sensors, regulators, and mediators of cell signaling; however, de novo designed switch mechanisms beyond modular displacements with hinge-like rigid body movements have yet to be achieved. To engineer the kinds of ordered, subtle conformational changes integral to natural enzymes, receptors, and other protein-based machines, we must be able to exercise greater control both spatially and temporally. For instance, switches often operate on characteristic time scales. However, kinetic considerations are often entirely neglected in current design approaches, as transient intermediates and the exact pathway for conformational exchange are difficult to model, and design algorithms typically seek to find low-energy structures representing thermodynamic sinks. One (challenging) approach to designing exchange pathways between conformational endstates is to generate an ensemble of microstates representing the intermediate structures and use these states in design simulations. This approach is the basis underlying the engineered DANCER proteins (Figure 3E, left), which spontaneously interconvert between a major and minor state via a predefined transition trajectory [34]. However, these endstates were defined by changes in a single rotamer, and explicit control over switching kinetics remains challenging. One possible approach to this problem is to employ MD simulations to evaluate mutations likely to accelerate switching kinetics by destabilizing the ground states relative to transition states, as utilized to enhance the response time of a calbindin-based switch by up to 32-fold [35].

A more comprehensive list of design strategies for engineering conformational switching can be found in Table 1. However, it should be noted that many of these methods rely on mutation of the native fold and subsequent characterization of structure-function relationships, leaving the alternative conformation(s) undefined prior to design. Moving forward, we envision that the design of protein switches will build upon recent advances in sampling methodologies to generate endstate structures (or ensembles) from which individual sequences can be evaluated for switchability *in silico*, analogous to earlier successes using known natural backbones. Recently, a method termed loop-helix-loop unit combinatorial sampling (LUCS) was shown to exhaustively sample the length, orientation, and position of alpha helices on predefined protein scaffolds (Figure 3E, right), creating geometric variability within a given topology exceeding that of known natural proteins [36]. Similarly, a method for systematic sampling of NTF2-like fold geometries was developed to generate diverse pocket structures [37]. These algorithms generate ensembles of alternative secondary structure element geometries that may be used to target specific geometries for switching.

Ultimately, a biophysically intuitive approach to protein design will likely entail the concept of "designing on a landscape" [38], where sequence design considers multiple stable conformations, or even multiple landscapes representing pre-/post-stimulus states. Deep learning methods for protein structure prediction [39,40] are thought to operate by "smoothing out" folding landscapes, suggesting that it may become possible to evaluate the conformational landscapes of structures (and ensembles) and couple deep learning-based structure prediction with design [41]. This level of detailed control could enable the design of coupled networks of residue interactions and more complex conformational changes

characteristic of evolved switches and machines. While many outstanding challenges remain, the ability to design *de novo* all of the components of switchable elements (Figure 1) would allow the design of new families of biological signaling systems with modular and tunable behavior. These systems could be interfaced with naturally occurring regulatory mechanisms to control existing biological processes or build up increasingly complex *de novo* machines with entirely new functions.

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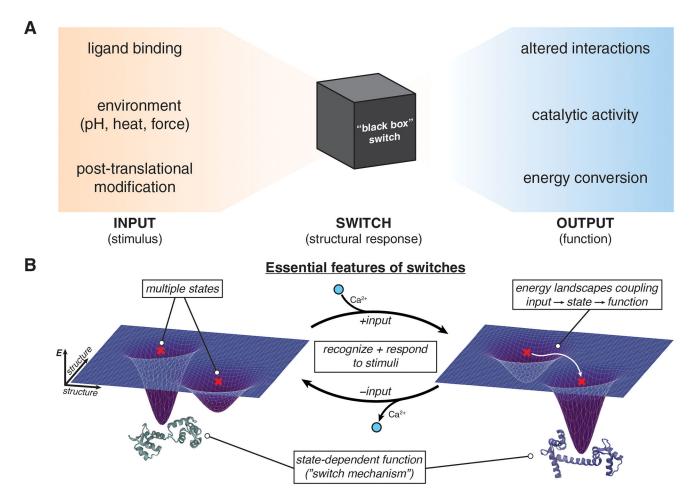
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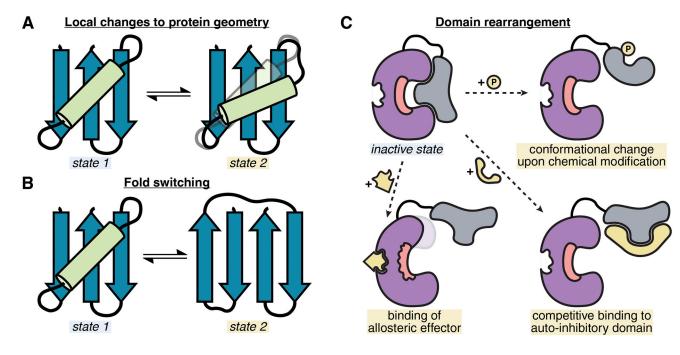
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#### Figure 1 |. What makes a protein switch?.

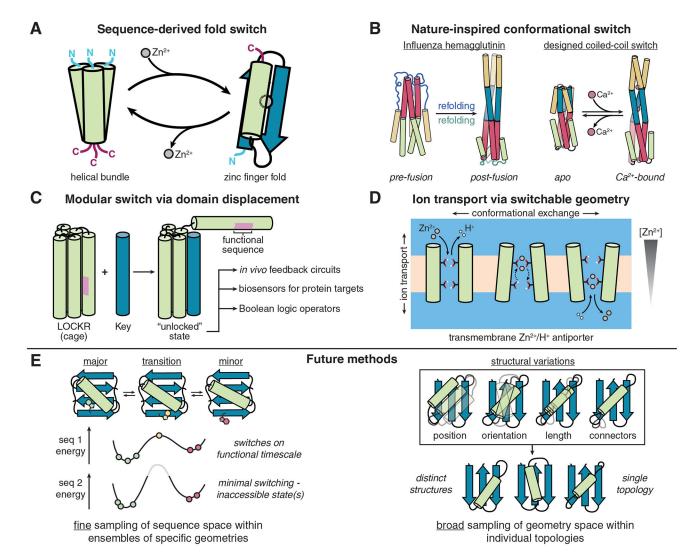
**A**, Protein switches couple inputs to functional outputs via structural responses. Due to the diversity of inputs and outputs, and the ability of variable structural responses to connect different stimuli and functions, protein switches are often envisioned as a "black box". In contrast, as illustrated in **B**, engineering controllable switches *de novo* requires a specific and "designable" structural definition of the switch mechanism. Protein switch function arises from four essential components: the presence of multiple structural states, with distinct functions, that are differentially populated in response to an input, owing to their suitable energy landscapes. We illustrate these components with the natural example of calmodulin, a  $Ca^{2+}$ -binding signaling protein.



#### Figure 2 |. Examples of switch mechanisms found in nature.

A, Local changes in geometry between two distinct conformations are commonly used as toggles for activity. B, Fold switching proteins involve exchange of entire secondary structure elements and can exhibit different functions specific for each state.
C, Rearrangement of entire domains can occur via various mechanisms and regulate activity by increasing access to the domain and/or active site.

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#### Figure 3 |. Designed protein switches.

**A**, Sequence-based switch design. These designs are heavily informed by homologous protein sequences to infer basic requirements for adopting one fold over another. This example [4] used sequence motifs of zinc finger proteins and helical bundles to design a  $Zn^{2+}$ -dependent fold switch. **B**, Nature-inspired conformational switches. Switches in this category typically aim to emulate specific conformational changes seen in nature. Here, we depict a coiled-coil switch designed to mimic hemagglutinin, using Ca<sup>2+</sup> binding as a trigger [11]. **C**, *De novo* designed modular protein switches. The LOCKR class of designed proteins [30] utilizes domain displacement as a switch mechanism and has been applied towards a number of different uses. **D**, Functionally coupled changes in geometry. By taking advantage of the knowledge of helical packing and metal binding motifs, the ROCKER protein [33] undergoes conformational exchange between different states, passing Zn<sup>2+</sup> ions in one direction while antiporting H<sup>+</sup> ions, much in the same way as some natural channels do. **E**, The future of switch design will necessitate the ability to widely sample geometry space, define energy landscapes, and explicitly incorporate kinetic considerations. The recent advances highlighted here (left: DANCER [34], right: LUCS [36]) have brought

us closer to these goals, but a greater number of methods with broader applicability are required to make advanced protein switch design routine.

### Table 1 |

#### Summary of designed protein switches inspired from natural examples

Scale of structural change	Natural examples	Design objective	Design methods
Allostery/local changes in geometry	Many receptors (e.g. GPCRs), enzymes (e.g. kinases), and signaling domains (e.g. GTPases)	Sequence compatible with multiple geometries (ranging from conformational changes of side chains to those of entire secondary structure elements)	Saturation mutagenesis of key structural residues and experimental screening [25]
			Design of mutually incompatible, conformationally frustrated states [26,33]
			Design on backbone ensemble approximating conformational landscape [34]
			Introduction of phosphorylation sites [42]
Fold switching	XCL1, KaiB, Mad2, CLIC1	Balance between multiple intrachain contact networks corresponding to distinct topologies	Computational modeling of the sequence fitness landscape [21,43] #
			Sequence hybridization [4,5,19,20,24]
			Rational mutation of key structural residues [27]
			Explicit design of distinct intrachain contact networks [11]
Differential domain assembly	SHP-2, Src family kinases	Stimulus-triggered formation or dissociation of interdomain contacts	Modular allostery [15]
			Tuning of intrachain contact vs. ligand binding strength [16,30]

 ${}^{\sharp}$ Purely *in silico* without experimental validation of switch designs