

Alteration of enzyme specificity by computational loop remodeling and design

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Altering the specificity of an enzyme requires precise positioning of side-chain functional groups that interact with the modified groups of the new substrate. This requires not only sequence changes that introduce the new functional groups but also sequence changes that remodel the structure of the protein backbone so that the functional groups are properly positioned. We describe a computational design method for introducing specific enzyme–substrate interactions by directed remodeling of loops near the active site. Benchmark tests on 8 native protein–ligand complexes show that the method can recover native loop lengths and, often, native loop conformations. We then use the method to redesign a critical loop in human guanine deaminase such that a key side-chain interaction is made with the substrate ammelide. The redesigned enzyme is 100-fold more active on ammelide and 2.5e4-fold less active on guanine than wild-type enzyme: The net change in specificity is 2.5e6-fold. The structure of the designed protein was confirmed by X-ray crystallographic analysis: The remodeled loop adopts a conformation that is within 1-Å C α RMSD of the computational model.

computational protein design | loop modeling

Computational protein design methodology has been used to optimize properties such as protein stability (1, 2) and to introduce functions such as binding of small molecules (3), proteins (4), and nucleic acids (5), as well as enzymatic activity (6, 7). In most of these studies, the implicit assumption that the structure of the polypeptide backbone would remain largely fixed despite mutations of amino acid side chains was made for the sake of computational tractability.

Explicit remodeling of the polypeptide backbone makes possible further optimization of these and other structural or functional properties. The set of combinations of protein sequences and structures is considerably larger when backbone flexibility is allowed and is likely to contain conformations that optimize a desired property to a greater degree than the original scaffold. This is illustrated by the backbone shifts that accompany functional divergence in natural protein evolution. Previous studies have achieved functional changes by backbone alteration, but relied on grafting methods that are restricted to sequences of known structure and function (8–10), which may be suboptimal with respect to the desired property.

De novo protein structure prediction methods are well suited for sampling novel backbone conformations (11). These methods have recently been extended to focus sampling on conformations that satisfy specific positional constraints (12, 13). Computational design algorithms that iterate between sequence design and backbone optimization using structure-prediction methods have been used to design previously unobserved protein fold and loop conformations (2, 14), but have not yet been applied to achieving functional changes such as alteration of an enzyme's substrate specificity.

We have developed a computational design algorithm that uses constrained backbone sampling to remodel a flexible loop subject to functional constraints. This constrained loop-remodeling protocol allows the identification of novel substitutions, insertions, and deletions that alter backbone structure so that specified functional groups satisfy precise positional constraints. This protocol can be

used for the redesign of enzyme specificity by positioning side-chain groups in favorable interactions with a new substrate. In this article we first describe the algorithm, then validate the method computationally by using a benchmark set of loop structures in native enzymes. Finally, we apply the method to redesigning the specificity of human guanine deaminase (hGDA) and characterize the activity and structure of the designed enzyme experimentally.

Results and Discussion

Computational Methodology. We developed a constrained loop-remodeling method for enzyme specificity alteration. A model of the enzyme in complex with the hypothetical transition state structure for a new substrate is created. New “anchor” residues are placed in the model in positions at which their side-chain functional groups make ideal interactions with the transition state. Backbone conformations capable of hosting these residues in the appropriate locations are identified by using techniques for modeling backbone flexibility from de novo protein structure prediction. Subsequently, sequence optimization is carried out to stabilize the novel backbone configurations, and thus stabilize the reaction transition state via interactions with the anchor residues. De novo loop modeling methods (15) are used to corroborate that designed sequences computationally fold to the desired structure when the constraint between the substrate and side chain is removed. The final designs differ from the scaffold structure in length, conformation, and sequence.

Native Structure Recapitulation. To evaluate the method, we first benchmarked its performance in native structure recapitulation experiments. Eight protein–ligand complexes in which an anchor residue makes a strong interaction with the ligand were chosen from the Protein Data Bank (PDB). A 7-residue window centered on the anchor residue was excised from a model of the complex. The PDB ID codes, anchor residues, and excised regions are given in [supporting information \(SI\) Table S1](#). To fill the excised region, loops of 9 different lengths were generated by using the protocol described in *Materials and Methods*. The native loop has 3 residues before and 3 residues after the anchor residue; this was replaced by loops having 2, 3, or 4 residues before and after the anchor residue. The rigid-body interaction observed in the native complex was used to position the terminal side-chain moiety of the anchor residue. No other knowledge of the native configuration of the anchor side chain and the excised backbone was used during the course of the protocol. The native sequence of the loop was also not used, except

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Data deposition: The atomic coordinates have been deposited in the Protein Data Bank, www.pdb.org (PDB ID code 3E0L).

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for the identity of the anchor residue. For each loop length, 100 models were generated.

The energy of the 5 lowest-energy structures for each complex and loop length are shown in Fig. 1A. In 6 of 8 cases, the lowest-energy structure corresponds to the native loop length. This indicates that the energy of structures generated with this protocol can be used to discriminate between native and nonnative loop lengths. Furthermore, low-energy structures of the correct loop length are often quite close to the native in conformation (Table S1 and Fig. S1). The lowest-energy structures for 2 cases are shown in Fig. S2. Inadequate sampling of near-native structures contributed to the failure of correct loop length discrimination in the case of PDB ID code 2IO2, because none of the structures generated for any length were as low in energy as the crystal structure conformation. Therefore, sampling a larger number of structures would likely improve performance in loop-length discrimination.

Redesign of hGDA Specificity. Encouraged by the promising results on the benchmark, we sought to use our method to redesign enzyme specificity. We applied the method to altering the specificity of human guanine deaminase (hGDA) with the long-term goal of introducing cytosine deaminase activity into a human protein scaffold. A designed cytosine deaminase with a sequence close to that of a human protein would solve an important problem in suicide gene therapy (16–18) by providing prodrug-activating ability (19–22) while retaining low immunogenicity, as described in the *SI Text*. We consider hGDA to be the best starting point for such an effort based on the complement of deaminases that exist in the human genome (23, 24). A comparison of the active sites of hGDA (25) and the distantly related bacterial cytosine deaminase (26) (bCD, Fig. 2) suggests that key interactions with cytosine may be introduced into hGDA by loop modeling with design while preserving the residues directly involved in catalysis. In this article, we sought to redesign guanine deaminase for activity toward the

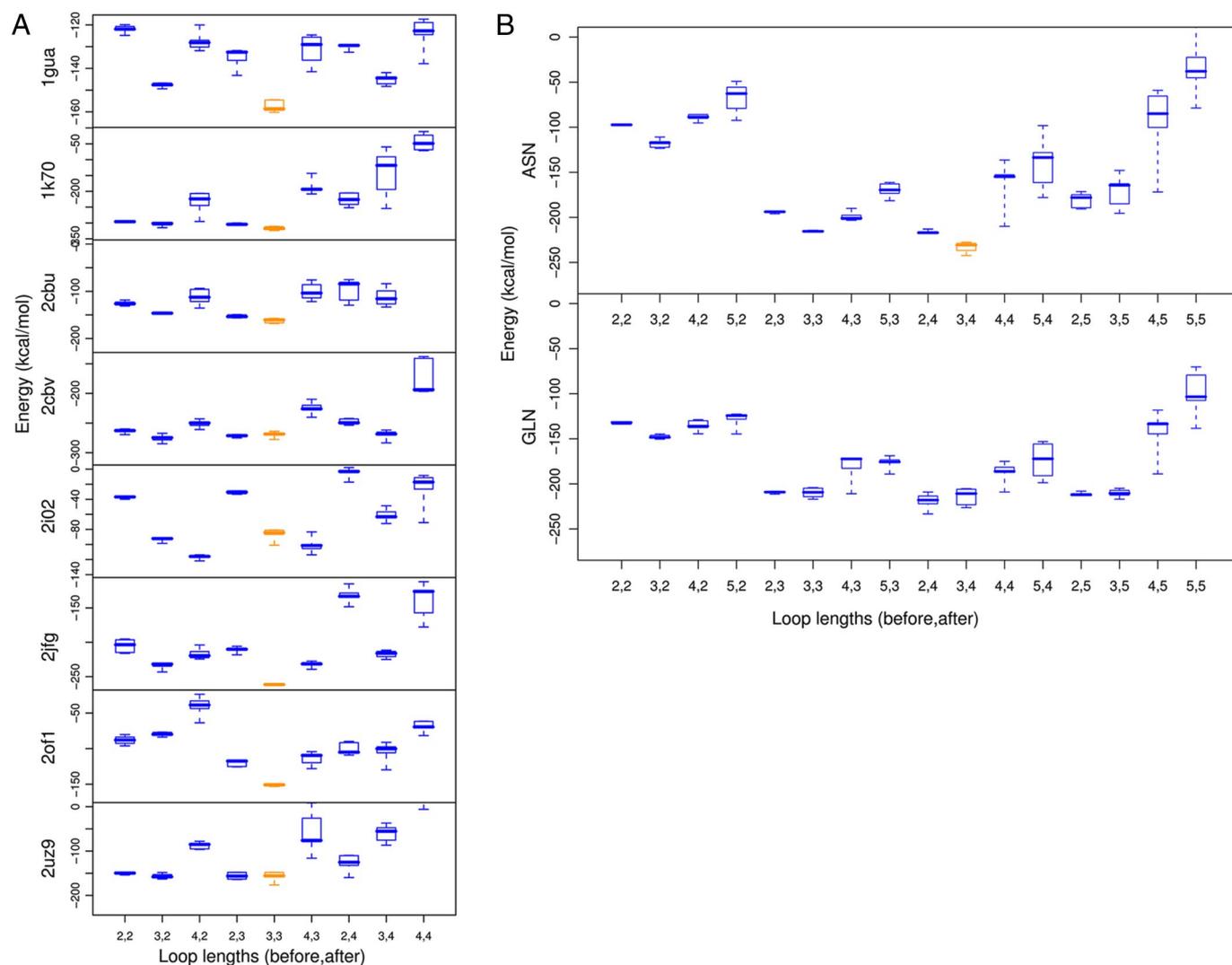


Fig. 1. Benchmarking and application of loop design methodology. (A) Eight protein/ligand complexes were chosen from the PDB to benchmark the loop design protocol. A 7-residue window centered on an anchor residue was excised from a model of the complex. To assess our ability to recapitulate native loop lengths with this protocol, the excised region was filled by using loops of the native length (3,3; orange) and several nonnative lengths (blue). Loop lengths indicate the number of residues inserted in the excised region before and after the anchor residue. The total loop length also includes the anchor residue. The energies of the 5 lowest-energy structures generated for each loop length are shown in box-and-whiskers form. In 6 of 8 cases, the native length structures are lower in energy than the nonnative length structures. Thus, native loop lengths can be identified with this protocol. (B) The sequence requirements for hGDA specificity alteration were determined by comparing energies of several different loop lengths and anchor identities. The lowest-energy structures (orange) had loop length 3,4, which was 2 residues shorter than the native loop, and anchor identity asparagine. The lowest-energy glutamine design had loop length 2,4 and had a higher energy than the lowest-energy asparagine design. The lowest energy loop overall (orange, asparagine) was selected for experimental characterization.

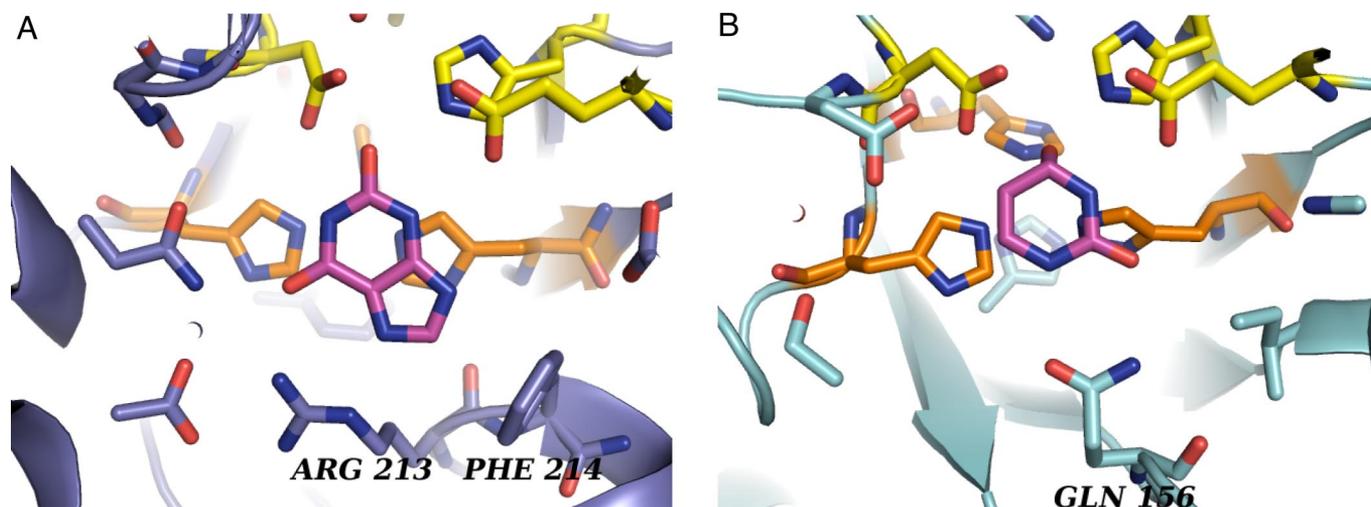


Fig. 2. Active-site structures. (A) The active site of human guanine deaminase (hGDA) with product, xanthine (PDB ID code 2UZ9). Arginine 213 and phenylalanine 214 are visible at the bottom of the image. (B) The active site of bacterial cytosine deaminase (bcd) with transition state analog, di-hydropyrimidine (PDB ID code 1K70). Glutamine 156 is visible at the bottom of the image. Proton shuttling residues, colored yellow, are conserved and are responsible for positioning and transferring protons from a bound water molecule to the substrate. Metal-binding histidines, colored orange, are responsible for binding a metal (zinc in hGDA, iron in bcd), which lowers the pK_a of the bound water molecule. The transition state of the reaction is the tetrahedral intermediate formed after attack of the bound water molecule and before leaving group departure.

compound ammelide, which is a structural intermediate between guanine and cytosine (Fig. 3).

The application of our method to this system consisted of superimposing ammelide onto the 6-membered ring of guanine in the transition state for deamination in a model derived from the

crystal structure of hGDA (25). Based on the structure of bacterial cytosine deaminase (26), in which an interaction between cytosine N1/O2 and a glutamine residue is observed (Fig. 2B), a starting model for design was created with a glutamine or asparagine residue positioned such that its amide group made analogous hydrogen bonds with ammelide. The segment between residues 211 and 220 was then remodeled to generate configurations capable of hosting this new glutamine or asparagine residue. Loops of 16 different lengths (2, 3, 4, or 5 residues, before and after the anchor residue) were built by using the protocol described above. For each loop length, 200 models were generated. The energy of the 5 lowest-energy structures is shown in Fig. 1B.

The optimal loop identified by this protocol involved sequence changes only to residues 213–218, used an asparagine to bind the

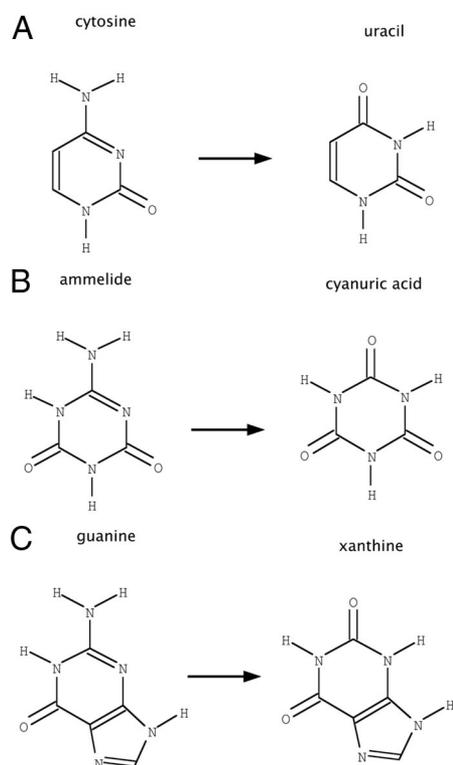


Fig. 3. Deaminase substrates. (A) The reaction performed by wild-type human guanine deaminase (hGDA). (B) The reaction under study in this article. (C) The reaction performed by prodrug-activating cytosine deaminases, such as bacterial cytosine deaminase (bcd). Ammelide is a structural intermediate between guanine and cytosine and thus provides a stepping stone for specificity alteration of hGDA. Each reaction consumes 1 molecule of H_2O and releases 1 molecule of NH_3 .

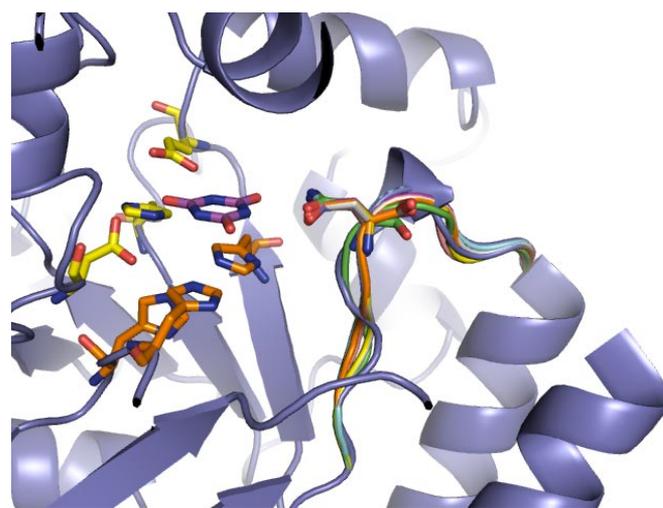


Fig. 4. Structure of design models. The backbone configuration of several designs are superimposed on wild-type hGDA, highlighting the differences that allow binding to the new reaction transition state. The design structures differ in length, conformation, and sequence. Two residues have been deleted, and 4 mutations have been made, including the introduction of an asparagine that directly interacts with the substrate.

In summary, hGDA-des offers an improved starting point for further computational design and directed evolution approaches to creating a nonimmunogenic cytosine deaminase. The accuracy of the benchmarking experiments and the close correspondence of the computational design with experimental results suggest our methodology should be broadly useful for redesign of specificity.

Materials and Methods

Full materials and methods are provided in *SI Text*.

Computational Method. Our general method was implemented as an extension to the Rosetta suite of molecular modeling programs (11, 31). First, a model of a complex between a scaffold enzyme and a new reaction transition state is created, based on homology modeling or quantum chemical calculations, for use as input. Second, protein side-chain functional groups important for specific interactions between the enzyme and the reaction transition state are optimally positioned in the model, analogous to the “inverse rotamers” described in a previous study (32). Third, the polypeptide backbone of the scaffold protein is remodeled by using several techniques from structure prediction (13, 33, 34) (Fig. S7), so that it is able to host the newly introduced side chains in the optimal position. Fourth, standard computational design protocols (35) are used to identify sequences that maximally stabilize the generated backbone structures and thus optimize transition state binding. De novo loop-modeling methods (15) are used to corroborate that designed sequences computationally fold to the desired structure when the constraint between substrate and side chain is removed. Some sequences are observed to fold to configurations that do not satisfy the substrate–side chain constraint, and are thus not further evaluated. This method is for applications in which a single key interaction is to be introduced through large-scale loop remodeling. A complementary method for introducing one of a large library of equally acceptable interactions through finer-scale backbone alterations has also been developed in our group (44). The former method is tailored for enzyme–small molecule interactions, the latter, protein–DNA interactions.

The methods differ algorithmically and in the amount of compute time allocated to searching for solutions that contain any single interaction.

Ammelide Deamination Assay. cDNA for hGDA was obtained (Origene Technologies) and cloned between the NdeI and XhoI sites of pET-29b. hGDA-des and related controls were made by overlap assembly PCR (36) and Kunkel mutagenesis (37, 38) of the same vector. Proteins were expressed in an autoinduction medium (39) and purified by using NiNTA His*Bind resin (Qiagen). Reaction rates were measured in PBS (pH 7.5) at 25 °C, by using 20 μ M enzyme and 50–750 μ M ammelide (Sigma–Aldrich). Product formation was measured by HPLC by using an isocratic elution of 22% 5 mM sodium phosphate (pH 6.0) and 78% acetonitrile over a Zorbax NH2 Analytical Column (Agilent) at 1 mL/min (40). Absorption at 210 nm was monitored. Ammelide eluted between 12.7 and 13.0 min, whereas cyanuric acid eluted between 5.7 and 6.0 min.

Crystallography. hGDA-des was cloned into pET-15b, expressed as above, and purified by using Talon resin (Clontech). After thrombin removal of the hexahistidine tag, size-exclusion chromatography was performed by using a Superdex 200 26/60 column (GE Healthcare). Purified protein at 10 mg/mL was dialyzed into 25 mM Hepes (pH 7.5), 100 mM sodium chloride, 2% glycerol, 1 mM TCEP, and 200 μ M ammelide and crystallized by vapor-phase equilibration in the hanging-drop geometry, against a mother liquor of 100 mM Mes (pH 6.5), 200 mM sodium chloride, and 1.8 M ammonium sulfate. Crystals of space group I212121 produced diffraction data to 2.4-Å resolution at beamline 5.0.1 at the Advanced Light Source, Lawrence Berkeley Laboratory, Berkeley, CA at wavelength 0.9774. After processing and scaling with HKL-2000 (41), phases were determined by molecular replacement with PHASER using a truncated model of wild-type hGDA. Model building was performed by using the CCP4 suite of programs (42, 43), excluding a random 5% of the data for cross-validation. Statistics are provided in Table S4, and coordinates were deposited into the RCSB Protein Data Bank (accession no. 3E0L).

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