

# Impact of scaffold rigidity on the design and evolution of an artificial Diels-Alderase

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**By combining targeted mutagenesis, computational refinement, and directed evolution, a modestly active, computationally designed Diels-Alderase was converted into the most proficient biocatalyst for [4+2] cycloadditions known. The high stereoselectivity and minimal product inhibition of the evolved enzyme enabled preparative scale synthesis of a single product diastereomer. X-ray crystallography of the enzyme-product complex shows that the molecular changes introduced over the course of optimization, including addition of a lid structure, gradually reshaped the pocket for more effective substrate preorganization and transition state stabilization. The good overall agreement between the experimental structure and the original design model with respect to the orientations of both the bound product and the catalytic side chains contrasts with other computationally designed enzymes. Because design accuracy appears to correlate with scaffold rigidity, improved control over backbone conformation will likely be the key to future efforts to design more efficient enzymes for diverse chemical reactions.**

biocatalysis | computational enzyme design | Diels-Alder reaction | laboratory evolution | enzyme mechanism

The Diels-Alder reaction, one of the most powerful transformations in organic chemistry, generates two carbon-carbon bonds and up to four stereogenic centers in a single concerted step. Although putative enzymes for unimolecular [4+2] cycloadditions have been reported (1–4), no naturally occurring enzyme is known to catalyze a bimolecular Diels-Alder reaction (5, 6). The generation of artificial Diels-Alderas has therefore been a longstanding and alluring goal for protein engineers.

The first noteworthy successes toward this end were achieved with catalytic antibody technology. A range of biocatalysts for both normal and inverse electron-demand Diels-Alder reactions has been elicited in response to immunogenic transition-state analogs (7–12). Analogous nucleic acid-based catalysts have been isolated from large random libraries with powerful in vitro selection techniques (13–16). In a different line of attack, metal ion catalysis has been combined with diverse biomacromolecular scaffolds to promote several cycloaddition reactions (17, 18). Although such catalysts often exhibit significant regio- and stereoselectivity, their activities generally are orders of magnitude lower than those typical of natural enzymes.

More recently, computational design has proven effective at generating novel catalytic activities in proteins (19, 20). This approach was used, for example, to create DA\_20\_00, an enzyme that catalyzes the enantio- and diastereoselective Diels-Alder reaction between 4-carboxybenzyl-*trans*-1,3-butadiene-1-carbamate (**1**) and *N,N*-dimethylacrylamide (**2**) (21). The active site of a  $\beta$ -propeller scaffold was altered to bind the diene and dienophile for productive reaction and to stabilize the cycloaddition transition state electronically with appropriately placed hydrogen bond donors and acceptors (Fig. 1). Judging from its catalytic proficiency,  $[k_{\text{cat}}/(K_{\text{diene}}K_{\text{dienophile}})]/k_{\text{uncat}}$ , which reflects the enzyme's ability to lower the activation barrier for reaction (22), the starting design is a poorer catalyst than analogous catalytic

antibodies (9, 11). However, its low initial activity was increased substantially by targeted mutagenesis of active site residues (21) and installation of a lid element through further computational refinement (23).

Systematic laboratory evolution is a powerful tool for boosting the efficiency of artificial enzymes (24). Here, we exploited this approach to further augment the activity of the computationally designed Diels-Alderase, applying extensive random mutagenesis and screening to sculpt a more effective active site for the target reaction. The most advanced catalyst, which exhibits the highest catalytic proficiency reported for any natural or artificial Diels-Alderase, was characterized biochemically and structurally. X-ray crystallographic analysis of its complex with a phosphorylated product analog provides direct insight into the origins of catalysis in this system as well as a basis for understanding the structural changes underlying its enhanced efficiency.

## Results

**Optimization of the Original Computational Design.** As previously described, the first steps toward optimization of DA\_20\_00 involved systematic mutation of all residues predicted to interact with the substrates or the designed catalytic residues (21). Six

## Significance

Creating artificial enzymes that catalyze arbitrary chemical reactions is challenging. Although computational approaches to this problem hold great promise, starting designs typically exhibit low efficiency and require extensive optimization through directed evolution. In this study, we chronicle the evolution of a modestly active, computationally designed Diels-Alderase into a proficient biocatalyst for an abiological [4+2] cycloaddition reaction. Biochemical and structural characterization of the evolved enzyme reveals the molecular origins of its enhanced efficiency. The close match between the experimental structure, which changed only subtly over the course of evolution, and the original design model is particularly notable. In addition to enhancing our understanding of the principles of enzymatic catalysis, these findings should aid future efforts to produce active enzymes more reliably.

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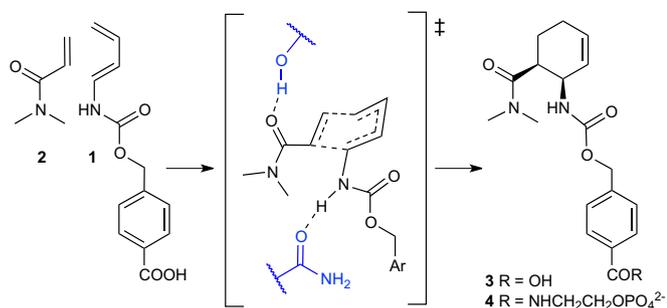
Data deposition: The atomic coordinates and structure factors have been deposited in the Protein Data Bank, [www.pdb.org](http://www.pdb.org) (PDB ID codes 4O55 and 4O5T).

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**Fig. 1.** Diels–Alder reaction between 4-carboxybenzyl-*trans*-1,3-butadiene-1-carbamate (**1**) and *N,N*-dimethylacrylamide (**2**). The theozyme for promoting formation of the 3*R*,4*S* *endo* cyclohexene product (**3**) is shown in brackets. The phosphorylated product analog (**4**) was used for inhibition and crystallization experiments.

mutations, when combined, improved catalytic efficiency 100-fold [compare  $k_{\text{cat}}/(K_{\text{diene}} \cdot K_{\text{dienophile}})$  for DA\_20\_00 and DA\_20\_10, Table 1] (21). Toward further enhancement, we carried out eight consecutive rounds of directed evolution, introducing sequence diversity at random positions in the DA\_20\_10 gene by error-prone PCR (epPCR). The resulting libraries were screened for variants exhibiting improved production and/or catalytic activity.

In each evolutionary round, one to five mutations were introduced per gene, and the activity of 720 variants was assessed in microtiter plates by a direct MS-MS assay (*SI Materials and Methods* and Fig. S1). Typically, 1–5% of the total population had activity equal to or higher than either DA\_20\_10 or the most active clone from the previous round, and these variants were used as input for the following cycle of mutagenesis and screening. Numerous mutations were found that had no effect on activity, either beneficial or deleterious, and these frequently disappeared in subsequent rounds. At the end of the eighth round of evolution, DA\_20\_20, the most active DA\_20\_10 descendant, contained five substitutions at surface sites (R50H, V96I, T197R, E288D, and L309S) and two mutations at positions remote from the active site in the hydrophobic core (D232V and H274L) (yellow spheres in Fig. 2*A*; sequence in Fig. S2). The evolved DA\_20\_20 showed a 5.5-fold higher catalytic efficiency than DA\_20\_10 because of an increase in turnover number ( $k_{\text{cat}}$ ) and a simultaneous decrease in  $K_{\text{M}}$  for the dienophile (Table 1).

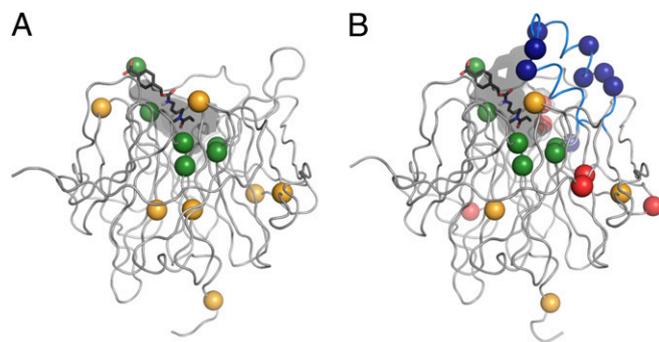
In parallel with these laboratory evolution experiments, Eiben et al. (23) submitted DA\_20\_10 to additional rounds of computational refinement. They hypothesized that the activity of the catalyst was limited by its very open active site and with the help of players of the online game Foldit, designed CE6, a variant of DA\_20\_10 containing a 24-residue helix-turn-helix motif (shown in cyan in Fig. 2*B*) that functions as a lid to constrain the substrates in a productive orientation for reaction (23). This structural element improved the enzyme's affinity for both substrates, judging from the lower  $K_{\text{M}}$  values, but left  $k_{\text{cat}}$  unchanged (Table 1). Compared with DA\_20\_20, CE6 exhibits a twofold lower turnover number but a fivefold higher chemical proficiency. Directed evolution and computational redesign thus provided complementary optimization pathways for DA\_20\_10.

**Further Evolutionary Refinement.** To generate even better Diels-Alderase, we combined all mutations found during the laboratory evolution of DA\_20\_10 with the lid structure designed in CE6. Despite targeting different regions of the protein, the results of the two optimization strategies were not additive. Because of compensating effects on  $k_{\text{cat}}$  and  $K_{\text{M}}$ , the new variant, CE11, has a  $k_{\text{cat}}/(K_{\text{diene}} \cdot K_{\text{dienophile}})$  value intermediate between that of its precursors (Table 1). It was therefore subjected to further directed evolution. As in the earlier optimization rounds,

the gene encoding CE11 was diversified by epPCR. All variants that showed improved activity after four rounds of diversification and screening shared two mutations in the engineered helix-turn-helix motif: T43I in direct contact with the substrates and R56S on the solvent-exposed supporting helix. Subsequent random mutagenesis consequently focused exclusively on this structural element. Over four additional rounds of laboratory evolution, mutations were found at most positions in the targeted segment. In the helix designed to interact with the substrates (residues 36–44), conservative substitutions were found at three sites (S39T, E40D, and K44R/N). The solvent-exposed supporting helix and the interhelical loop proved even more tolerant to mutation. Residues 45–56 were all substituted at least once and often by two or three different amino acids. Only four mutations—T43I, P48L, K53E, and R56S—persisted over the entire evolutionary trajectory. The best variant to emerge after eight rounds of mutagenesis and screening, CE20 (Fig. 2*B*, red and blue spheres), contained these substitutions as well as an additional mutation in the helix that interacts with the substrates (K44N) and two mutations in the supporting helix (S55R and G57D).

**Characterization of CE20.** CE20 was characterized kinetically by measuring the dependence of reaction velocity on dienophile concentration at several fixed diene concentrations. The pattern of intersecting lines in the double-reciprocal plot (Fig. 3*A*) indicates that the diene and dienophile bind independently to the enzyme active site (25). The steady-state kinetic parameters obtained by globally fitting the data to a random binding mechanism are summarized in Table 1. As a consequence of increases in  $k_{\text{cat}}$  and decreases in the  $K_{\text{M}}$  values, this Diels-Alderase is 6 times more efficient than CE6 and 16 times more efficient than DA\_20\_20 (Table 1). Overall, CE20 has a 100-fold higher effective molarity ( $k_{\text{cat}}/k_{\text{uncat}}$ ) and a 9,700-fold higher chemical proficiency than the original DA\_20\_00 computational design (Table 1).

As expected for concerted cycloaddition of diene **1** and dienophile **2**, the rate of the CE20-catalyzed reaction is pH independent in the range 5–10 (Fig. 3*B*). As per design (21), the evolved catalyst only promotes stereoselective formation of the 3*R*,4*S* *endo* product; none of the other possible diastereomers could be detected by chiral HPLC analysis of the reaction mixture (Fig. 3*C*). Finally, although product inhibition often hampers enzyme-catalyzed bimolecular reactions, this is minimal in the case of CE20. The half-maximal inhibitory concentration ( $\text{IC}_{50} = 0.42 \text{ mM}$ ) of the phosphorylated



**Fig. 2.** Optimization of an artificial Diels-Alderase. (A) The computational design DA\_20\_00 was optimized by cassette mutagenesis of active site residues (green balls) and epPCR (yellow balls) to afford DA\_20\_20. Mutations are mapped onto the DA\_20\_00 structure (PDB ID code 311C). (B) Combining these mutations with a computationally designed helix-turn-helix lid element (cyan backbone), followed by epPCR of the entire protein (red balls) and then the lid element (blue balls) yielded the proficient Diels-Alderase CE20. Mutations are mapped onto the CE6 structure (PDB ID code 3U0S). The active sites containing manually docked substrates (black carbons) are shown as transparent gray surfaces.

**Table 1. Steady-state kinetic parameters**

Catalyst*	$k_{\text{cat}}$ , $\text{h}^{-1}$	$K_{\text{diene}}$ , mM	$K_{\text{dienophile}}$ , mM	$k_{\text{cat}}/(K_{\text{diene}} \cdot K_{\text{dienophile}})$ , $\text{M}^{-1} \cdot \text{M}^{-1} \cdot \text{s}^{-1}$	EM <sup>†</sup> , M	1/ $K_{\text{TS}}$ <sup>‡</sup> , $\text{M}^{-1}$
DA_20_00 <sup>§</sup>	0.10 ± 0.02	3.5 ± 1.5	146 ± 2.5	0.06 ± 0.03	4	8.7 × 10 <sup>3</sup>
DA_20_10 <sup>§</sup>	2.1 ± 0.2	1.3 ± 0.1	73 ± 5	6.1 ± 0.9	94	1.0 × 10 <sup>6</sup>
DA_20_20	4.5 ± 0.6	1.0 ± 0.2	37 ± 4	34 ± 9	199	5.4 × 10 <sup>6</sup>
CE6 <sup>†</sup>	2.2 ± 0.1	0.2 ± 0.03	34 ± 2	87 ± 14	97	1.4 × 10 <sup>7</sup>
CE11	4.4 ± 0.3	0.53 ± 0.06	46 ± 4	50 ± 8	194	7.7 × 10 <sup>6</sup>
CE20	10.8 ± 0.5	0.29 ± 0.03	19 ± 2	540 ± 70	478	8.4 × 10 <sup>7</sup>

Measured at 25 °C in PBS, pH 7.4. The estimated errors reflect the SD of three independent measurements. Under the same conditions,  $k_{\text{uncat}} = 2.26 \pm 0.02 \times 10^{-2} \text{ M}^{-1} \cdot \text{h}^{-1}$ , in good agreement with the previously reported value (21).

\*The sequences of all catalysts are provided in Fig. S2.

<sup>†</sup>Effective molarity (EM =  $k_{\text{cat}}/k_{\text{uncat}}$ ) (27).

<sup>‡</sup>Chemical proficiency (1/ $K_{\text{TS}} = [k_{\text{cat}}/(K_{\text{diene}} \cdot K_{\text{dienophile}})]/k_{\text{uncat}}$ ) (22).

<sup>§</sup>Values reported by Siegel et al. (21).

<sup>¶</sup>Values reported by Eiben et al. (23).

product analog **4**, which has enhanced water solubility compared with **3**, is similar in magnitude to the value of  $K_{\text{diene}}$ , facilitating efficient substrate processing (Fig. S3A). As a result, CE20 can conduct >770 turnovers at room temperature without signs of inactivation (Fig. S3B).

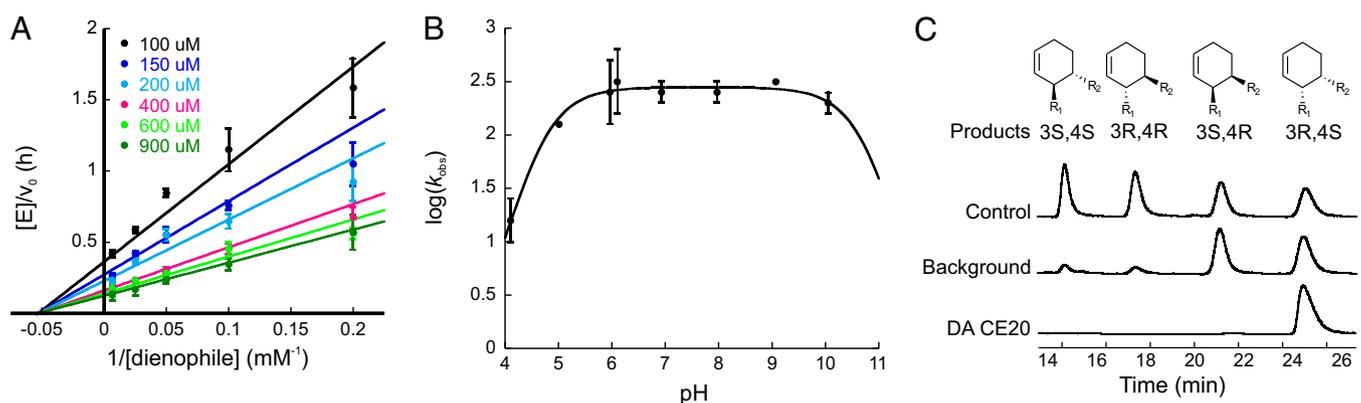
The optimized features of CE20 enabled preparative-scale synthesis of the reaction product in aqueous buffer and at room temperature. Greater than 90% conversion was observed, yielding 30 mg of the 3R,4S *endo* cyclohexene product isomer after isolation (SI Materials and Methods). By comparison, refluxing the substrates in toluene for several days in the absence of catalyst affords a 66:34 mixture of racemic *endo* and *exo* products (26). The artificial Diels-Alderase thus provides a mild and practical alternative to standard chemical synthesis, and is notable with respect to its efficiency and stereoselectivity.

**Crystal Structure of CE20.** The structure of CE20 in complex with the phosphorylated product analog **4** was determined by X-ray crystallography to a resolution of 2.9 Å (Table S1). Overall, it is remarkably similar to the original DA\_20\_00 computational design (21) and the computationally optimized CE6 intermediate (23). Pairwise comparison of the respective proteins gives C $\alpha$  atom rms deviations of ~0.4 Å (Table S2). The  $\beta$ -propeller scaffold used for the design is evidently quite rigid, as neither the appended helix-turn-helix motif nor extensive mutation alters its fold (Fig. S4). It is particularly noteworthy that the side chains of the catalytic residues Tyr134 and Gln208 adopt virtually identical orientations in all three structures (Fig. 4A). The observed

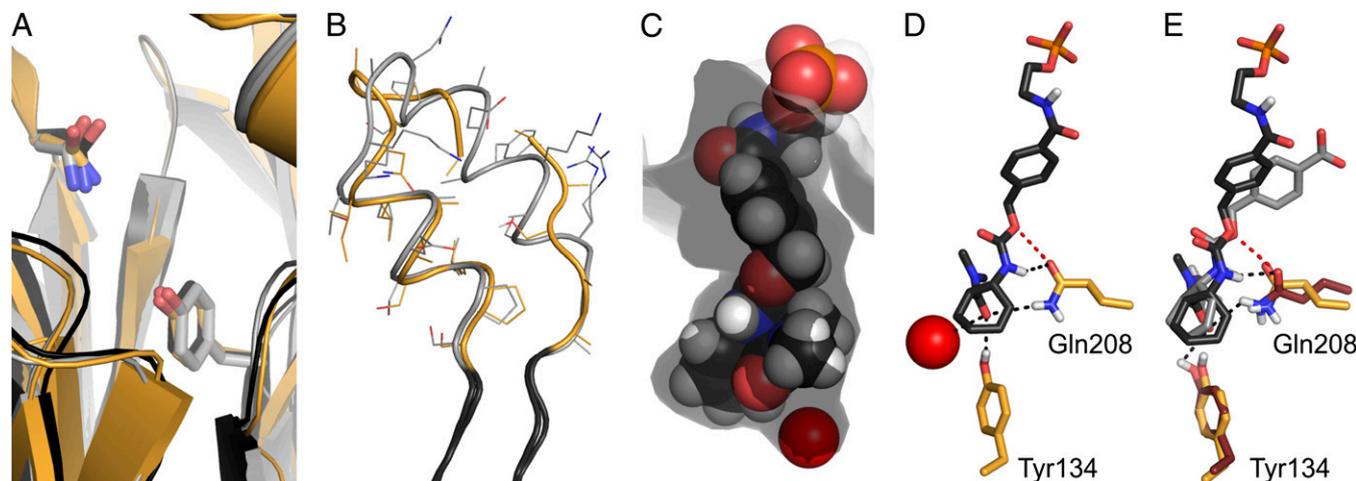
rotameric preferences of these side chains are consistent with the predictions of the original design model (21).

The largest differences between the CE20 and CE6 structures are localized in the appended lid element (Fig. 4B). In CE6, the two helices of the helix-turn-helix motif are resolved and assume a packing angle of 180°, somewhat larger than the 150° predicted by design (23). In CE20, the helix designed to interact with the substrates (residues 36–44) overlays well with its counterpart in CE6 (C $\alpha$  rmsd = 0.2 Å; Table S2), but the interhelical loop and the second supporting helix are largely disordered. Residues 51–53 in the solvent-exposed helix completely lack electron density, whereas the side chains of the flanking amino acids at positions 45–50 and 54–58 could not be resolved (Table S2). Crystal contacts in the vicinity of the helix-turn-helix of CE6 and their absence in CE20 may account for the different geometries observed for the second helix. The crystal structure of CE11 supports this hypothesis (Table S2): the helix-turn-helix motif in one of the proteins in the asymmetric unit engages in crystal contacts, and the supporting helix is well resolved (packing angle ~130°), whereas such interactions are absent in the second protein chain, and this helix is disordered. The high mobility of the solvent-exposed helix compared with the active-site helix rationalizes its relative tolerance to mutation.

Visualization of the phosphorylated product analog **4** at the CE20 active site provides direct insight into catalytically relevant interactions as well as a structural basis for rationalizing the evolutionary improvements. The ligand docks snugly in a deep hydrophobic pocket within the protein. Excluding the



**Fig. 3.** Characterization of Diels-Alderase CE20. (A) Dependence of reaction velocity on dienophile concentration at different fixed diene concentrations. (B) pH dependence of the enzymatic reaction. (C) Stereoselectivity of the uncatyzed (background) and CE20-catalyzed reactions; authentic standards (control) are shown for reference. All error bars reflect the SD of three independent measurements.



**Fig. 4.** Crystal structure of CE20 with bound product. (A) The structures of CE20 (orange), CE6 (gray), and the DA\_20\_00 computational design model (black) are very similar. The catalytic amino acids Tyr134 and Gln208 (shown as sticks) adopt nearly identical conformations. (B) The largest differences between CE20 and CE6 are localized in the appended lid element. The helix designed to interact with the substrates (left in the figure) overlays well with its counterpart in CE6, whereas the interhelical loop and the supporting helix (right) are largely disordered in CE20. (C) The reaction product (black carbons) binds deeply in a shape-complementary pocket (transparent gray surface) containing a buried water molecule (red sphere). (D) The catalytic residues interact with the ligand as designed. The side-chain phenol of Tyr134 donates a hydrogen bond to the carboxamide carbonyl group, whereas the side-chain amide of Gln208 accepts a hydrogen bond from the carbamate NH of the product and donates a hydrogen bond to the carboxamide carbonyl group. The latter interactions are offset by an unfavorable interaction between the Gln208 amide and the carbamate ether oxygen (red dashes). (E) Superposition of the product and catalytic residues shows that the crystal structure (black and yellow carbons) closely matches the original design model (gray and brown carbons). Hydrogen bonds in the design are depicted as black dashes. An unfavorable interaction between Gln208 amide and the carbamate ether oxygen is also evident in the design (3.2 Å in the design vs. 3.0 Å in the crystal structure).

2-aminoethylphosphate moiety, which was introduced to increase solubility and points out into solution, 86% of its solvent-accessible surface is buried upon complex formation (Fig. 4C and Fig. S5). Ligand recognition is mediated by 88 van der Waals contacts with the peptide backbone, the side chains of many aliphatic and aromatic residues, and a buried water molecule. Roughly a sixth of these interactions are provided by the appended helical element, which functions as a lid and effectively shields the ligand from bulk solvent (Fig. S6). The cyclohexene ring of the product sits at the bottom of the active site pocket, largely filling the available space. Although small interfacial cavities are discernable, implying slightly imperfect shape complementarity, the ligand is fixed in place by extensive hydrophobic contacts, on the one hand, and specific hydrogen bonding interactions with the two catalytic residues on the other (Fig. 4D). This binding mode agrees quite well with the original design model of the product complex (21) (Fig. 4E).

The high stereoselectivity observed for the catalyst suggests that the diene and dienophile substrates must engage in similar interactions with the protein. As programmed, the side chain of Tyr134 is located at the bottom of the binding pocket, effectively positioned to donate a hydrogen bond to the carbonyl group of the dienophile; the importance of this interaction is underscored by mutagenesis studies with CE11 showing that replacement of Tyr134 by any other amino acid causes complete loss of activity under the screening conditions. The buried water molecule, although somewhat distant in the product complex (Fig. 4C and D), may further stabilize the expanded transition state by providing a second hydrogen-bonding interaction to the dienophile carbonyl group. Placement of the Gln208 side chain amide also is consistent with the design model. It is poised to accept a hydrogen bond from the carbamate NH of the diene and simultaneously donate a hydrogen bond to the dienophile. Nevertheless, an unfavorable electronic interaction between the amide oxygen of Gln208 and the ether oxygen of the diene carbamate (Fig. 4D and E) may explain why substitution of this residue with methionine decreased the activity of the CE11 variant only twofold.

## Discussion

Because Diels–Alder reactions proceed through highly ordered transition states, complementarily shaped protein binding sites may function as “entropy traps” to increase reaction rate (27). Utilization of binding energy to preorganize the substrates for reaction at an active site represents a simple strategy for overcoming large translational and rotational entropic barriers. Further rate enhancements can be achieved by reducing the energy gap between the highest occupied molecular orbital of the diene and the lowest unoccupied molecular orbital of the dienophile through specific hydrogen bonding interactions (28).

The computational design process that yielded DA\_20\_00 relied on both strategies to transform a  $\beta$ -propeller scaffold incapable of catalyzing cycloadditions into an artificial Diels–Alderase (21). Its success reflects both the choice of catalytic groups for stabilizing the transition state, in this case Tyr134 and Gln208, and effective experimental installation of the idealized active site, or “theozyme,” in a suitable protein host. The structure of the CE20–product complex attests to the accuracy of the computational modeling of the catalytic residues. The conformations of the Tyr134 and Gln208 side chains, which donate a hydrogen bond to the dienophile and accept a hydrogen bond from the diene, respectively, closely match the design model and changed negligibly over the entire evolutionary trajectory. Because the design algorithms assume an immobile protein backbone, the relative rigidity of the  $\beta$ -propeller fold undoubtedly was conducive to the accurate placement of the theozyme. When more flexible scaffolds have been used for other computationally designed enzymes, significant discrepancies between model and experiment have been observed (29–31).

Despite effective positioning of the catalytic groups in the original DA\_20\_00 design, considerable refinement of the active site was required to achieve respectable levels of activity. Multiple rounds of directed evolution and further computational refinement helped sculpt a more effective binding pocket without substantially altering the core fold. Tolerance to extensive mutation in this case may also be linked to the robustness of the  $\beta$ -propeller scaffold. The largest leaps in activity were

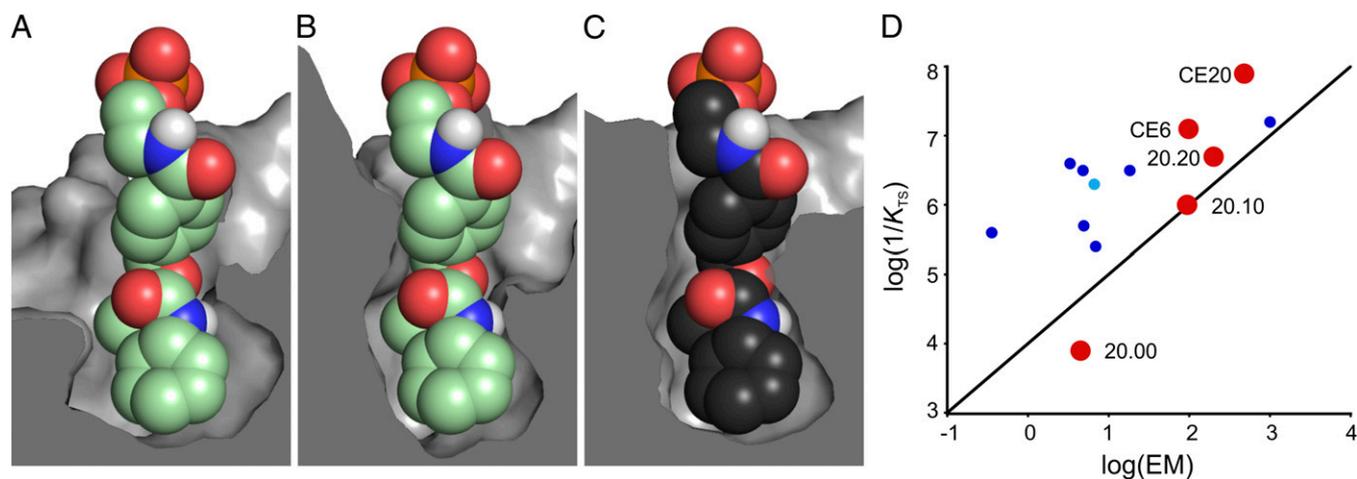
achieved in the early optimization rounds, in which small residues at the bottom of the catalytic pocket were replaced by bulkier amino acids (21) and a lid element was grafted onto the structure to shield the reactants from bulk solvent (23). These changes, together with the subtle modifications caused by T43I and more distant mutations (Fig. 2), resulted in gradual contraction of the active site around the highly ordered transition state (Fig. 5 A–C), enhancing the ability of the Diels-Alderase to constrain the substrates in a reactive orientation with respect to each other and the two catalytic residues. The resulting improvements are manifest in a  $10^2$ -fold higher “effective molarity” ( $EM = k_{cat}/k_{uncat}$ ) for CE20 compared with the original computational design and an  $\sim 10^4$ -fold increase in catalytic proficiency ( $\sim 1/K_{TS}$ ). The difference in proficiency reflects the greater affinity of the evolved enzyme for the cycloaddition transition state (22). Although several mechanistic factors likely contribute to improved molecular recognition of this transient species, the 5.4 kcal/mol of additional stabilization achieved during optimization exceeds the 4.7 kcal/mol predicted by quantum mechanics (21) for electronic stabilization of the transition state by the hydrogen bonding interactions provided by the catalytic residues.

As a consequence of these improvements, CE20 is currently the most proficient Diels-Alderase known. It is 30- to 300-fold more active than catalytic antibodies that promote the same [4+2] cycloaddition (9, 11), and it outperforms the best artificial enzymes for other Diels-Alder reactions, including antibody catalysts (7–12), ribozymes (13–16), and artificial metalloenzymes (17, 18) (Fig. 5D and Table S3). For example, antibody 1E9, which accelerates the inverse electron-demand cycloaddition of tetrachlorothiophene dioxide to *N*-ethylmaleimide (7) and exhibits nearly perfect shape complementarity with its transition-state analog (32), has a sixfold lower catalytic proficiency. Other artificial Diels-Alderas are one to three orders of magnitude less effective. The catalytic proficiency of CE20 is also 63 times higher than that of SpnF, the only natural Diels-Alderase to be characterized kinetically so far, which promotes a transannular [4+2] cycloaddition in the biosynthesis of the natural product spinosyn A (4).

Compared with other natural enzymes, though, the absolute efficiency of CE20 is modest. It turns over only 10 substrate molecules per hour, and the  $k_{cat}/K_{diene}$  and  $k_{cat}/K_{dienophile}$  parameters are four to five orders of magnitude lower than the  $k_{cat}/K_M$  values

of moderately efficient natural enzymes (33). It is possible that additional rounds of directed evolution might improve this Diels-Alderase further. Directed evolution of other computational designs, such as the Kemp eliminase HG3 (34) and the retroaldolase RA95 (29), has afforded 1,000-fold higher chemical proficiencies. Because active site shape complementarity is not yet fully optimal (Figs. 4C and 5), filling the remaining cavities at the bottom of the pocket might further constrain the substrates and optimize their interactions with the catalytic residues. However, the gains per round of laboratory evolution significantly diminished over the course of evolution, and additional large increases in activity may prove practically elusive. The rigidity of the scaffold may well constrain CE20 evolvability in this instance, precluding the subtle conformational changes of the backbone that might be necessary for attaining perfectly snug transition-state binding. It is also possible that the mechanistic choices implicit in the theozyme intrinsically limit the activities that may be achieved, in which case, different catalytic side chains, or perhaps even metal ion cofactors (35), will be required for more effective substrate activation and transition-state stabilization.

Computational enzyme design has made substantial strides in recent years (19, 20). Despite impressive accomplishments, though, most structurally characterized designs differ significantly from the original computational prediction, especially with respect to ligand binding and catalytic residue placement (29–31, 34, 36). The assumption that the protein backbone stays fixed upon installation of a theozyme into a scaffold, made for computational tractability, is a clear weakness of this approach. The good agreement between the original design model of the catalytic site and the experimentally determined structure in the case of the computationally designed Diels-Alderase studied here shows that when the scaffold does not change significantly upon introduction of mutations, the calculations may be quite accurate. This finding suggests that controlling backbone conformation will be a key determinant of future progress in this area. The drawback with rigid scaffolds is that the backbone cannot readily be tuned to the reaction of interest. Properly modeling the reconfigurations of flexible regions of protein scaffolds upon sequence perturbation—and, going further, the custom design of new backbones with geometry optimal for the desired catalytic site—will be important steps toward a next generation of highly active designed catalysts for any desired chemical reaction.



**Fig. 5.** Evolution of a shape-complementary pocket. Cut-away views of the active sites of DA\_20\_00 variants illustrate the gradual contraction of the binding pocket around the reaction product over the course of evolution. (A) DA\_20\_00, the original computational design, (B) the evolutionary intermediate CE6, and (C) CE20, the most evolved variant. The ligand depicted in the DA\_20\_00 and CE6 pockets (green carbons) was docked manually in the same orientation as the product seen in the crystal structure of the CE20 complex (black carbons). (D) Plot of effective molarity ( $EM = k_{cat}/k_{uncat}$ ) vs. catalytic proficiency ( $1/K_{TS} = [k_{cat}/(K_{diene} \cdot K_{dienophile})]/k_{uncat}$ ) for kinetically characterized catalytic antibodies (dark blue), a ribozyme (cyan), and descendants of the computationally designed DA\_20\_00 Diels-Alderase (red).

## Materials and Methods

Full details regarding materials and methods are provided in *SI Materials and Methods*.

**In Vitro Evolution.** Gene libraries of the most active variants from each round were generated by epPCR using the GeneMorph PCR mutagenesis kit (Stratagene). The Diels–Alder activity of 720 variants per round was assayed in 96-well plates. A solution containing substrates and hexadeuterated product as an internal standard was added to cleared cell lysates and allowed to react for 3.5 h at room temperature before quenching with 50 mM HCl. The reaction mixture was extracted with water-saturated 1-butanol, and the product concentration was determined by a direct MS–MS analysis on a Bruker ESI–(Qq)TOF mass spectrometer (maxis) equipped with an Agilent HPLC system (1200). The clones with the largest increase in activity, typically corresponding to about 1% of the screened population, were picked from replica plates for plasmid isolation, sequencing, and further diversification.

**Biochemical Characterization.** All Diels–Alderase variants were produced as C-terminally His-tagged proteins in *Escherichia coli* BL21(DE3) and purified by affinity chromatography (Ni–NTA). Catalytic activity was assayed by varying the dienophile concentration at several fixed concentrations of diene at 25 °C in PBS buffer containing 4% DMSO and 40  $\mu$ M hexadeuterated product as an

internal standard. Reactions were incubated for 2.5 h at room temperature before acid quenching, extraction, and MS–MS measurement. Steady-state parameters were obtained by fitting the data to the Michaelis–Menten equation. The pH-rate profiles were determined under subsaturating conditions by using acetate buffer for pH 4–6 and Bis–Tris propane for pH 6–10, both containing 100 mM NaCl. Product enantiomers were separated by analytical chiral normal phase HPLC.

**Crystallization and Structure Determination.** The proteins were crystallized using the hanging and sitting drop diffusion methods, and their structures were solved by molecular replacement. See *SI Materials and Methods* for detailed procedures and a summary of crystal parameters, data collection, and refinement statistics for the CE11 structure (PDB ID code 4O5S) and the CE20 structure with product analog (PDB ID code 4O5T).

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