

It's giving dEVA: An Algorithm for Structure-Based Enzyme Design

Adam Fillion
Beau Lonquist

Zero-shot design of a *de novo* metalloenzyme

1. Foundational tools and challenges in *de novo* enzyme design
2. Design of *de novo* metalloproteins
3. Training data curation and model sensitivity
4. Design of *de novo* metalloenzymes
5. Conclusions
6. Strengths and Weaknesses
7. Future Directions

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New Results

Zero-shot design of a *de novo* metalloenzyme

 Gina El Nesr,  Simon L. Dürr,  Irimpan I. Mathews,  Qi Wen,  Kewei Zhao,  Ritimukta Sarangi,  Ursula Röthlisberger,  Fanny Sunden,  Po-Ssu Huang

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This article is a preprint and has not been certified by peer review [what does this mean?].

Abstract

Full Text

Info/History

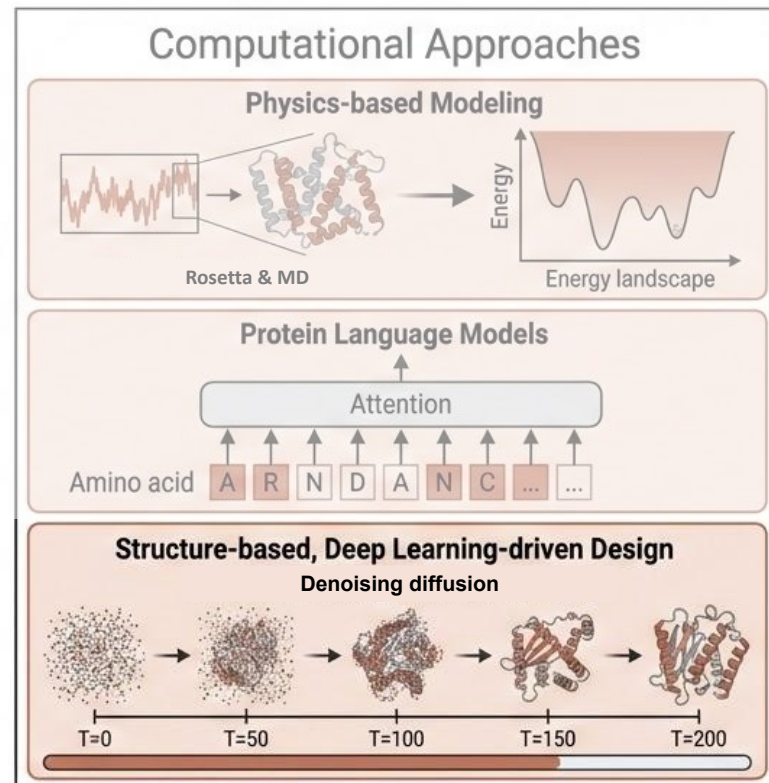
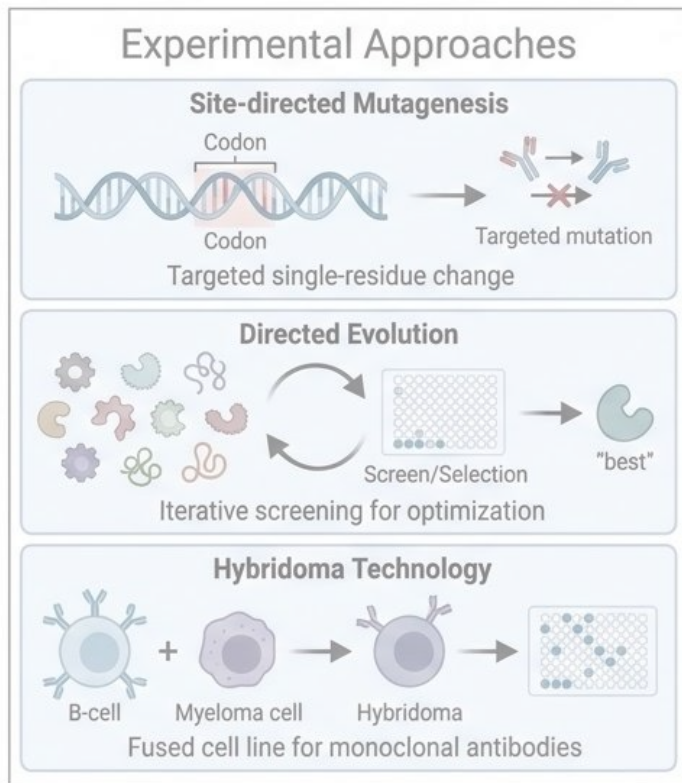
Metrics

 Preview PDF

Abstract

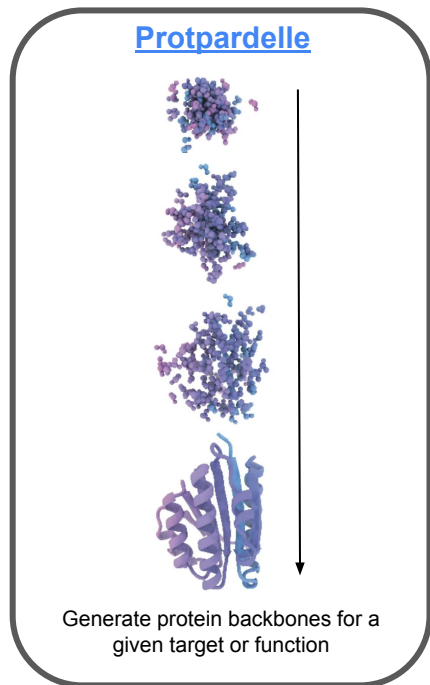
The *de novo* design of enzymes remains a central challenge, requiring consideration of catalytic mechanism and optimization across biochemical and biophysical criteria. To capture these criteria, we draw on principles from evolutionary biology. Here, we present dEVA (design by EVolutionary Algorithm), a multi-objective design framework for structure-based protein design. We apply dEVA to the zero-shot, *de novo* design of metalloenzymes by optimizing for the coordination sphere of catalytic metals. We fully characterize one of these designs: a bi-zinc metalloenzyme exhibiting promiscuous hydrolytic activity towards both phosphomonoesters and phosphodiesteres. This design achieves a catalytic efficiency (k_{cat}/K_M)

Protein engineering and design come in many flavors



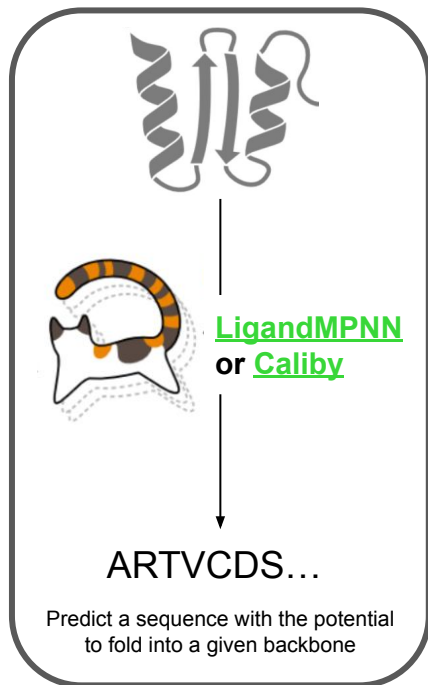
Notable deep learning tools for metalloenzyme design

Backbone Design



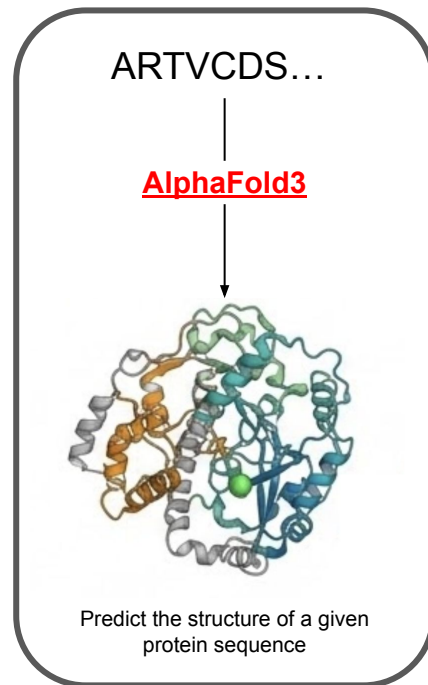
Chu *et al*, **PNAS**, 2024

Sequence Design



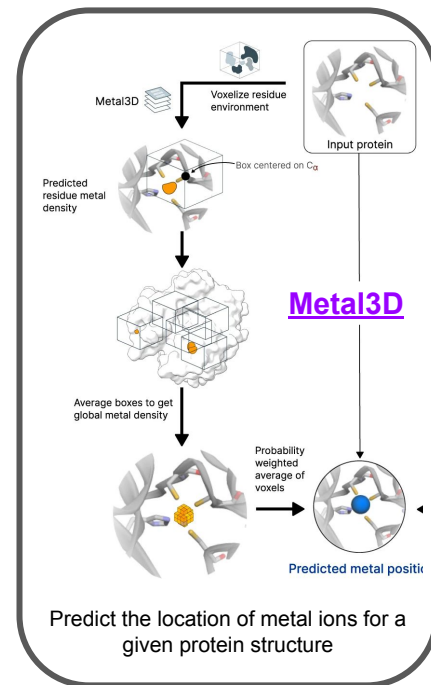
Dauparas *et al*, **Nat Methods**, 2025
Shuai *et al*, **bioRxiv**, 2025

Structure Prediction



Abramson *et al*, **Nature**, 2024

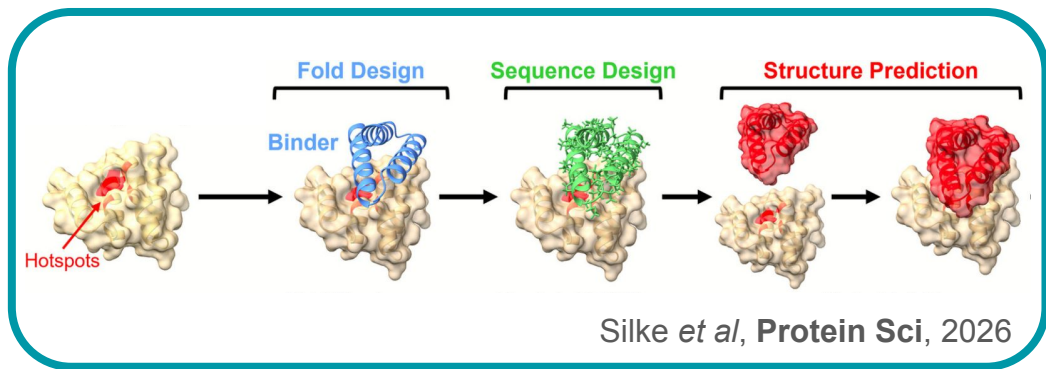
Metal-specific



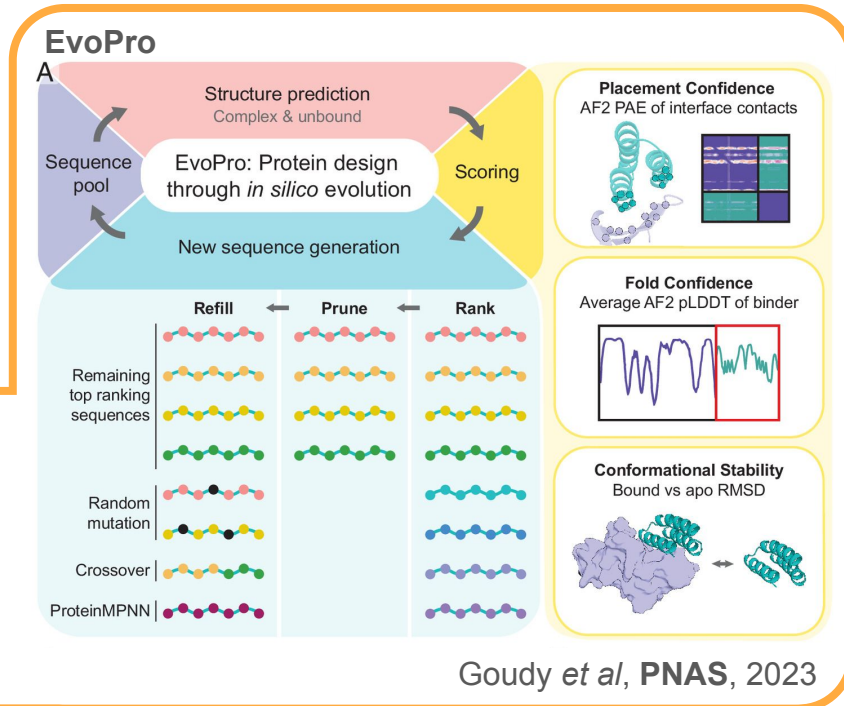
Dürr *et al*, **Nat Commun**, 2023

Structure-based approaches to *de novo* protein design

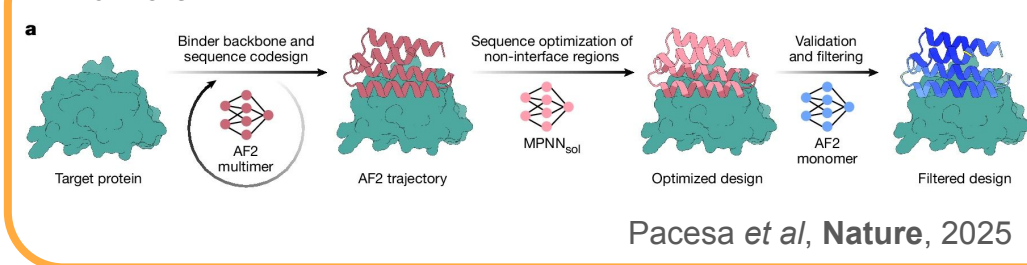
Parallelized, Generation-based



Iterative, Optimization-based

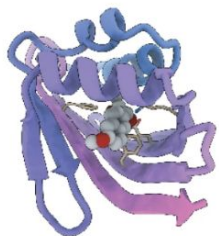
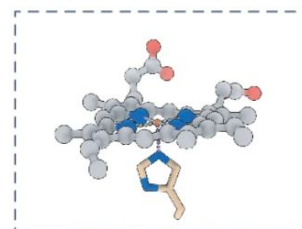
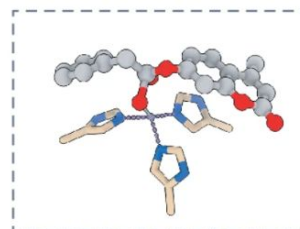
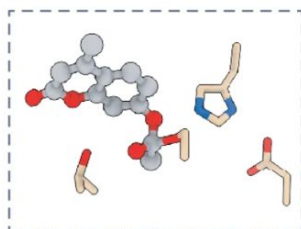
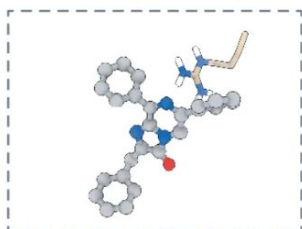
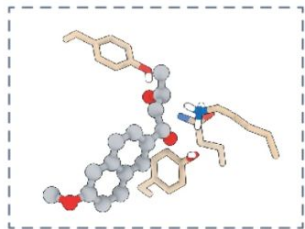


BindCraft

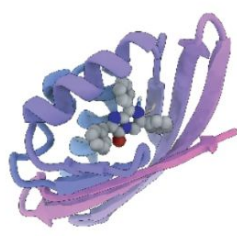


Previous success stories in *de novo* enzyme design

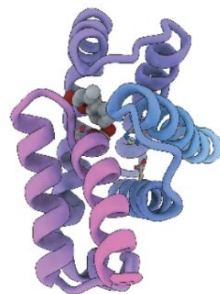
d Enzymes



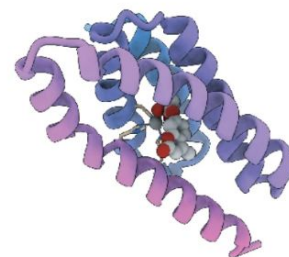
Retro-aldolase, $180 \text{ M}^{-1} \text{ s}^{-1}$



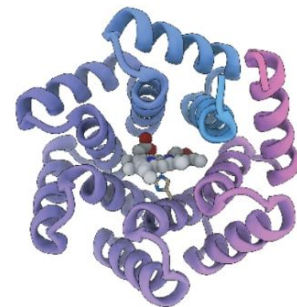
Luciferase, $1,400 \text{ M}^{-1} \text{ s}^{-1}$



Serine hydrolase, $3,800 \text{ M}^{-1} \text{ s}^{-1}$



Zinc hydrolase, $53,000 \text{ M}^{-1} \text{ s}^{-1}$



Haem peroxidase, $260 \text{ M}^{-1} \text{ s}^{-1}$

Previous success stories in *de novo* enzyme design

d Enzymes

Despite recent success, *de novo* enzyme design often relies on **natural templates**, **predefined motifs**, and/or **evolutionary information**, and still tends to yield low hit rates and modest activities.

Retro-aldolase, $180 \text{ M}^{-1} \text{ s}^{-1}$

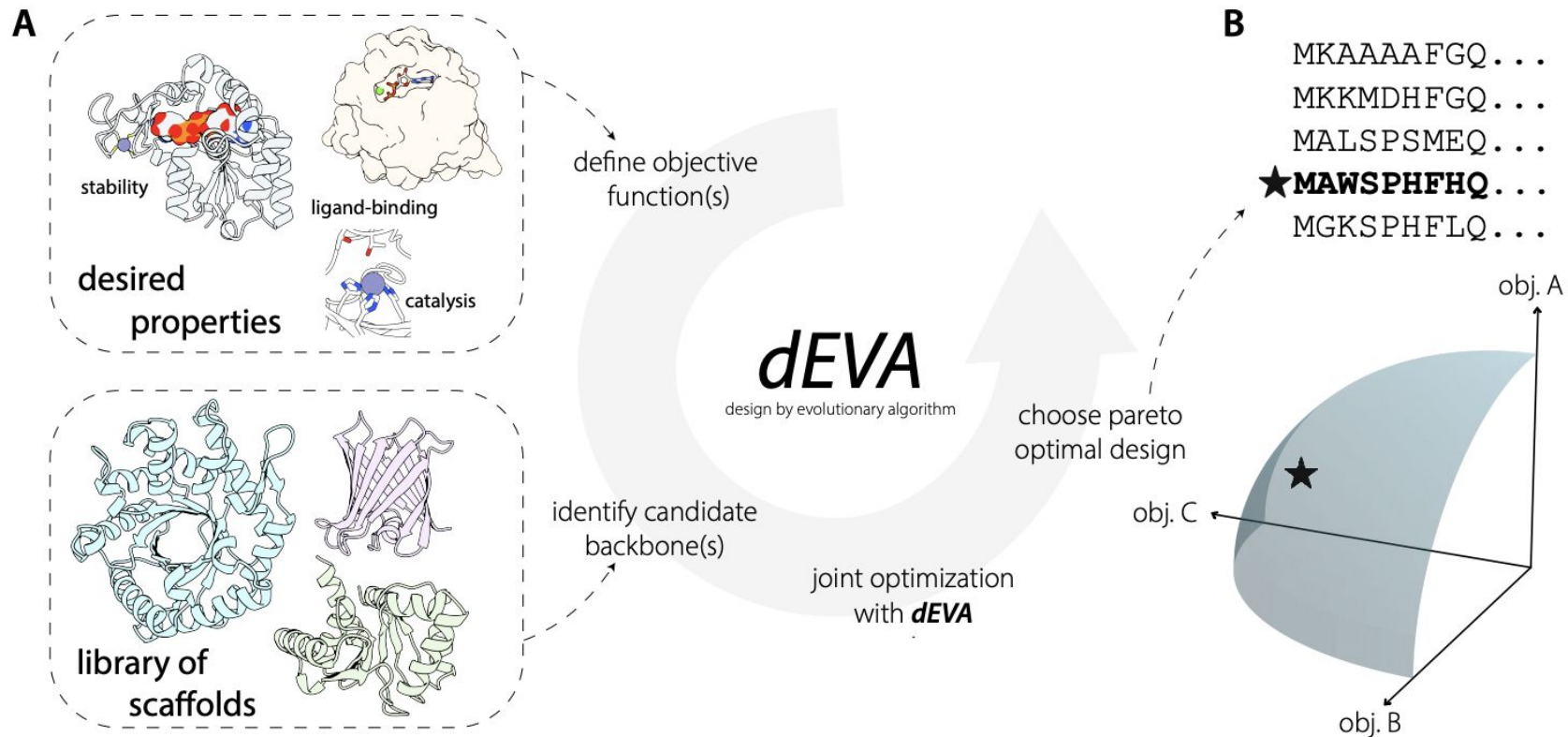
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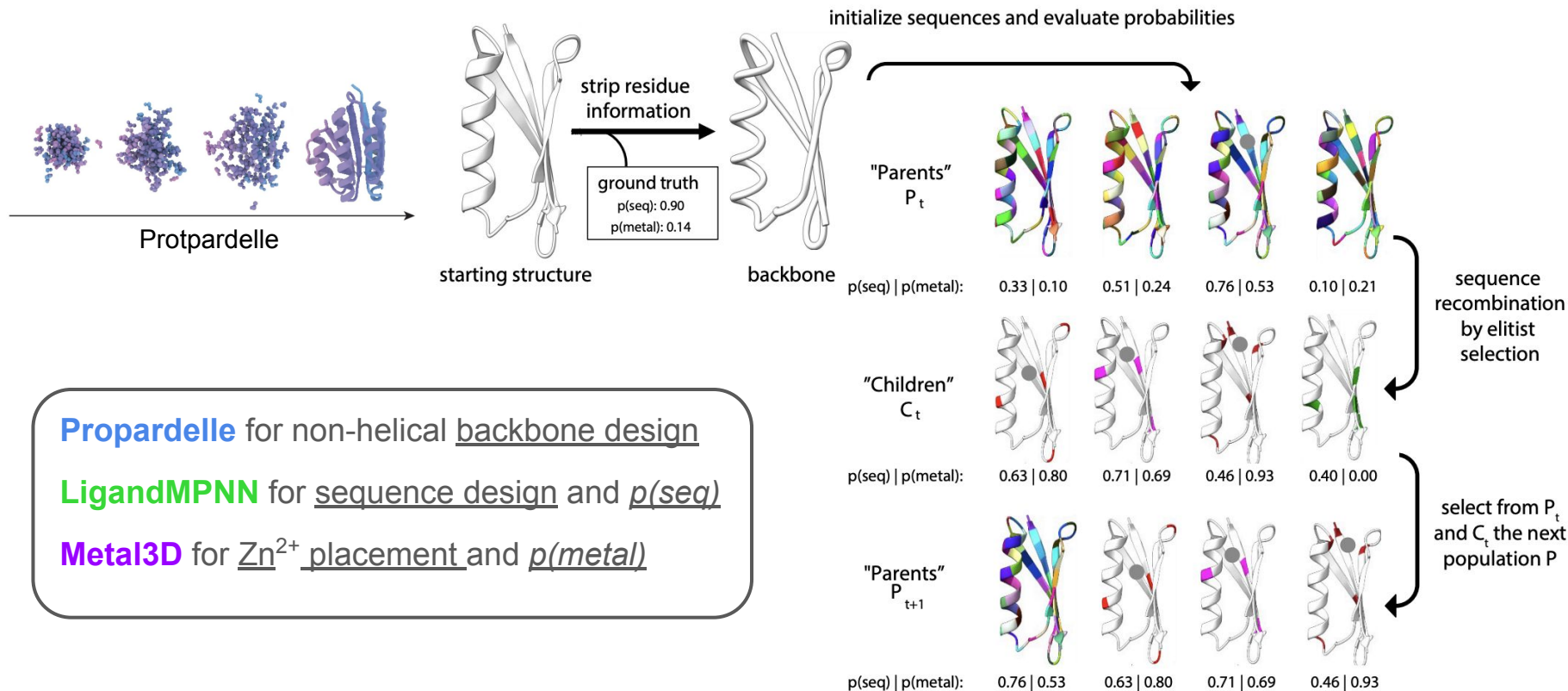
Zinc hydrolase, $53,000 \text{ M}^{-1} \text{ s}^{-1}$

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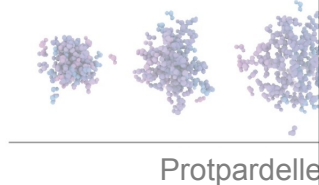
dEVA: a multi-objective framework for protein design



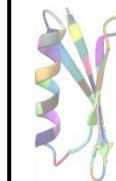
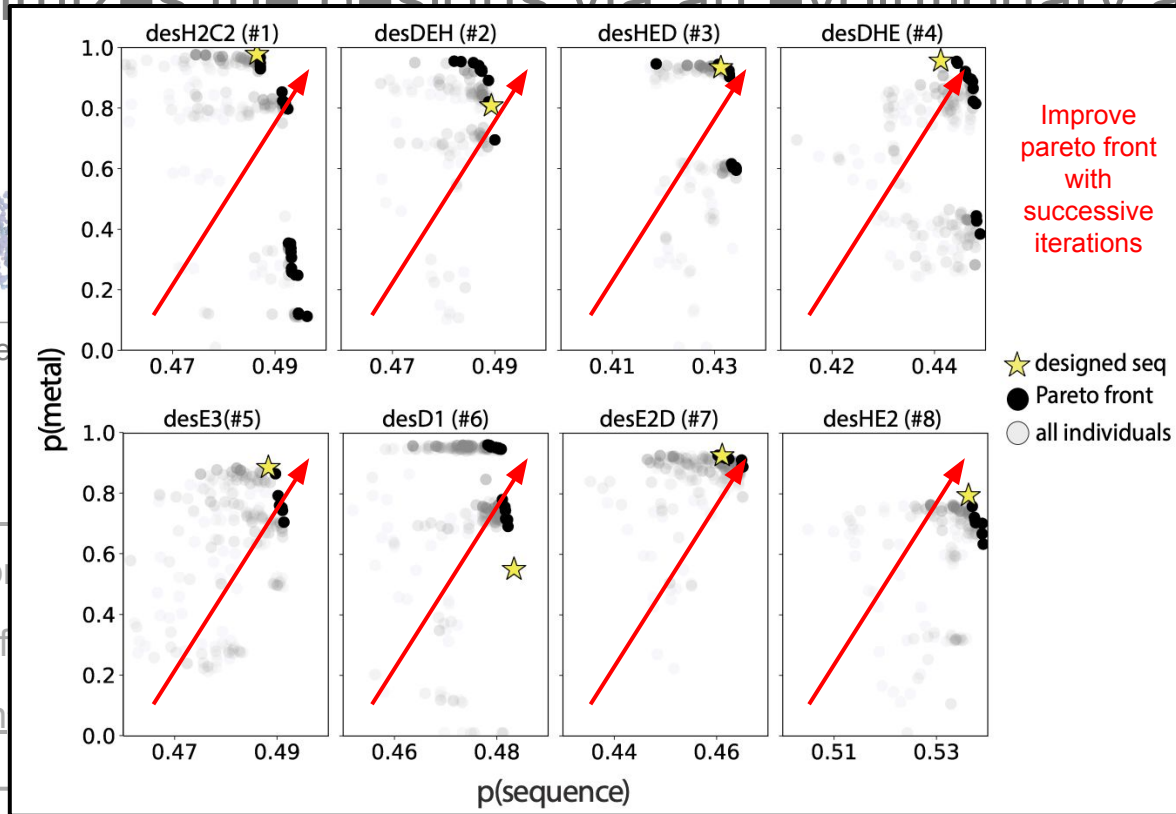
dEVA optimizes the designs via an evolutionary algorithm



dEVA optimizes the designs via an evolutionary algorithm



Propardelle for
LigandMPNN for
Metal3D for Zn



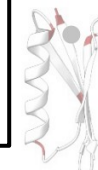
0.10 | 0.21

sequence recombination by elitist selection



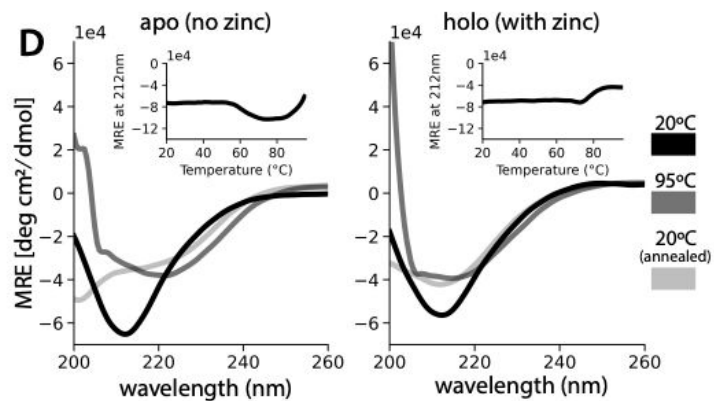
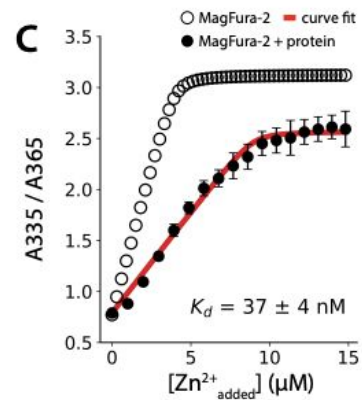
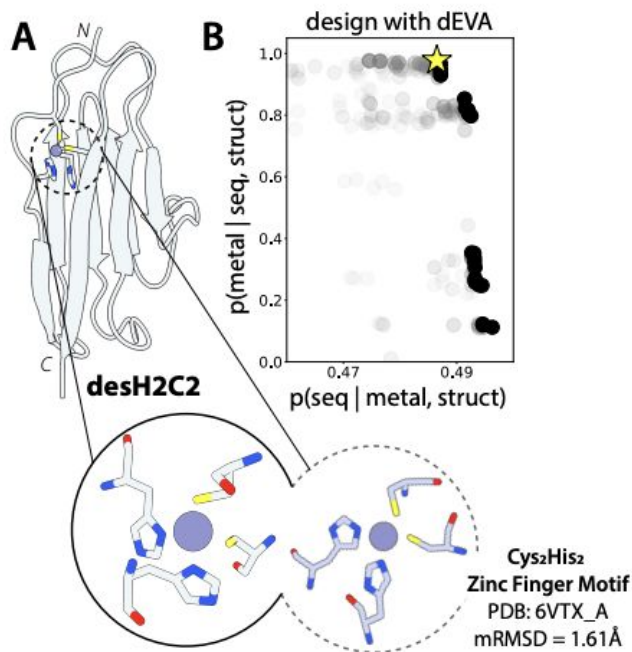
0.40 | 0.00

select from P_t and C_t the next population P

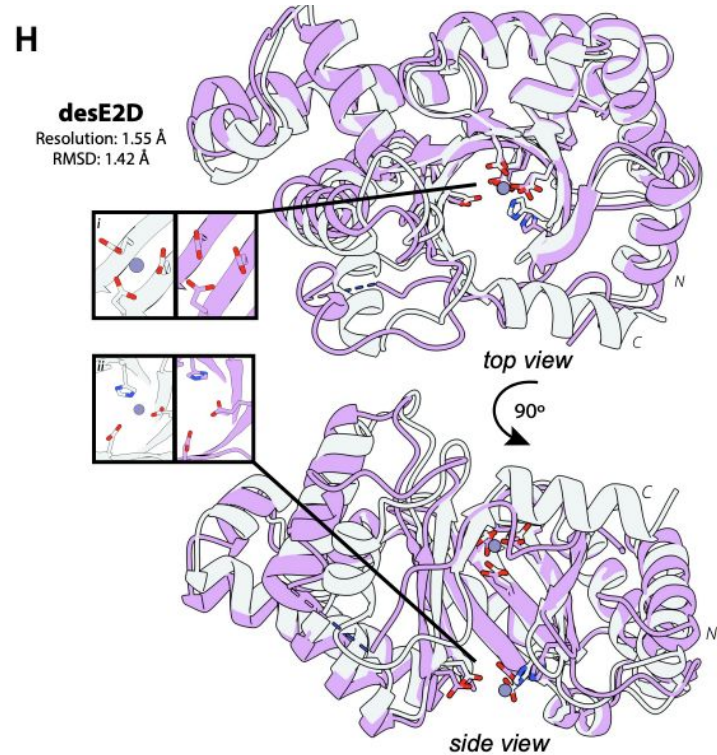
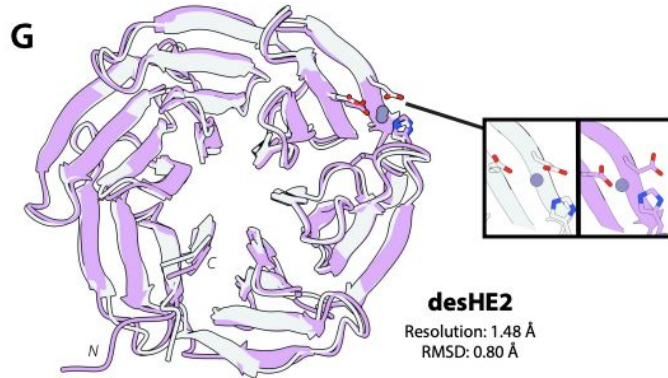


$p(\text{seq}) \mid p(\text{metal})$: 0.76 | 0.53 0.63 | 0.80 0.71 | 0.69 0.46 | 0.93

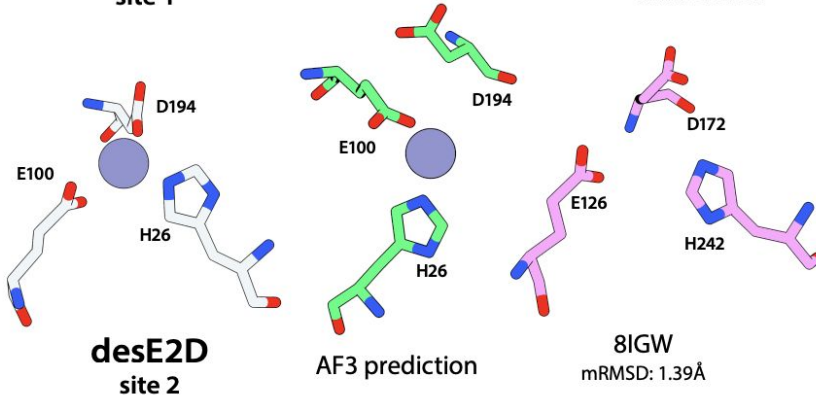
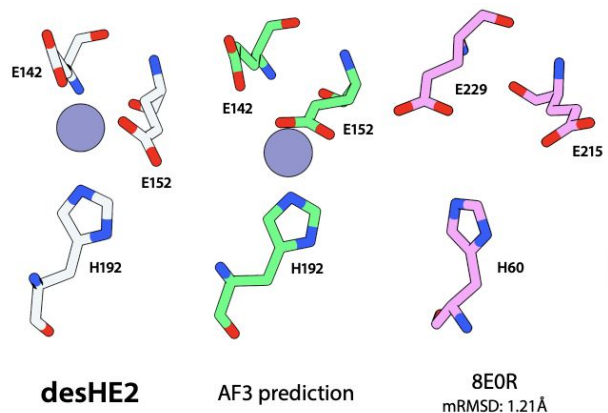
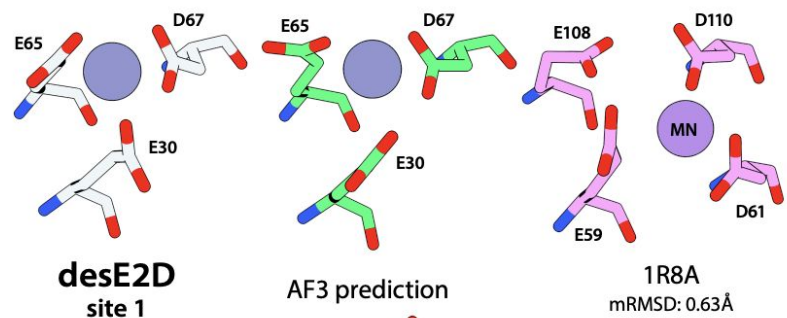
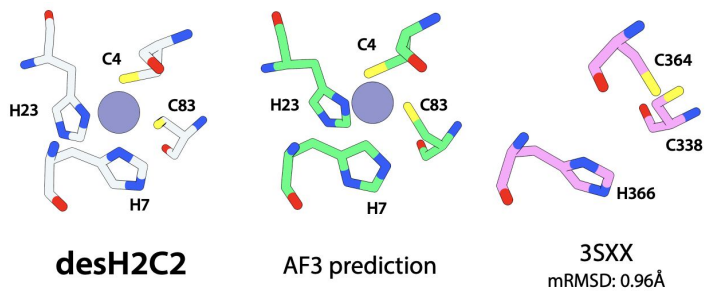
desH2C2 achieves top binding affinity and demonstrates metal-dependent stabilization



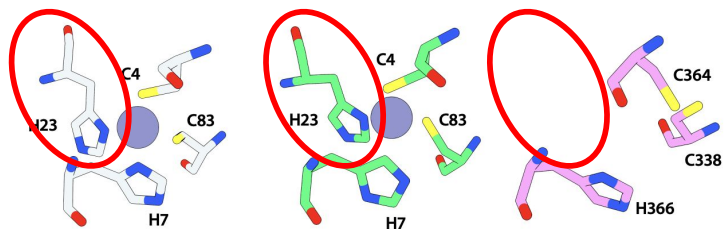
X-ray crystallography confirms dEVA can design functional sequences for diverse backbones



dEVA produces native-like, yet distinct, binding sites



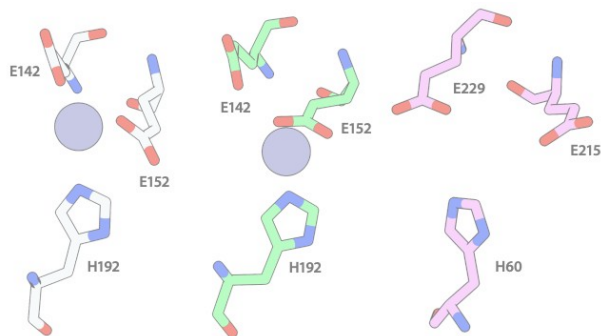
dEVA produces native-like, yet distinct, binding sites



desH2C2

AF3 prediction

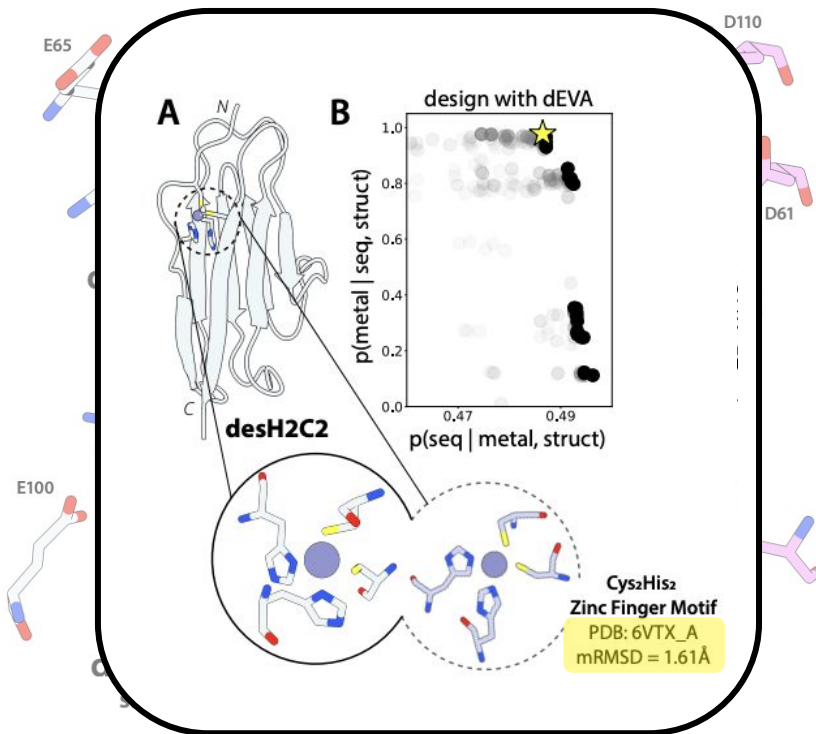
3SXX
mRMSD: 0.96Å



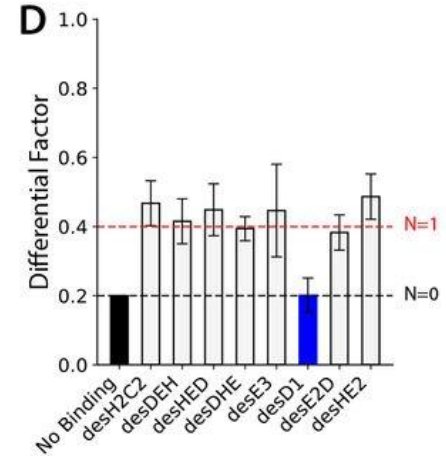
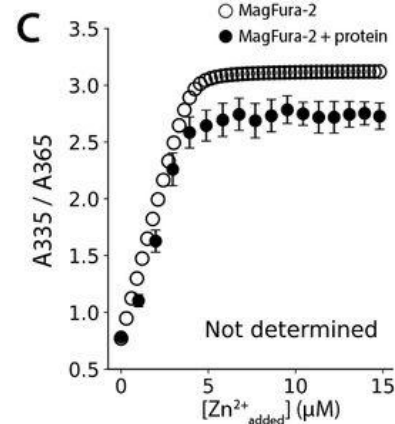
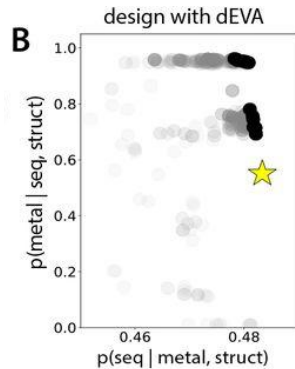
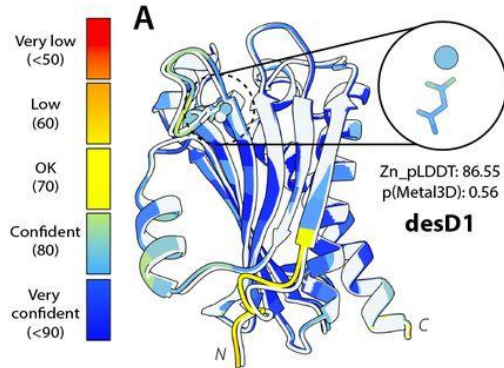
desHE2

AF3 prediction

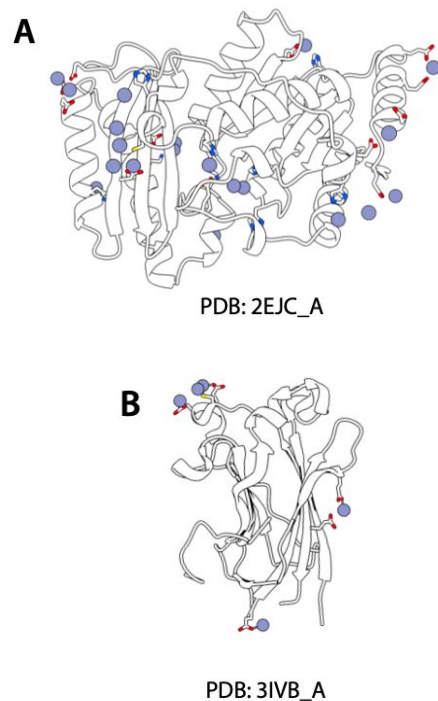
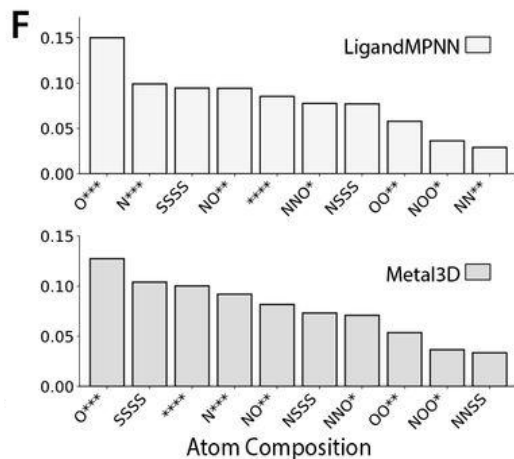
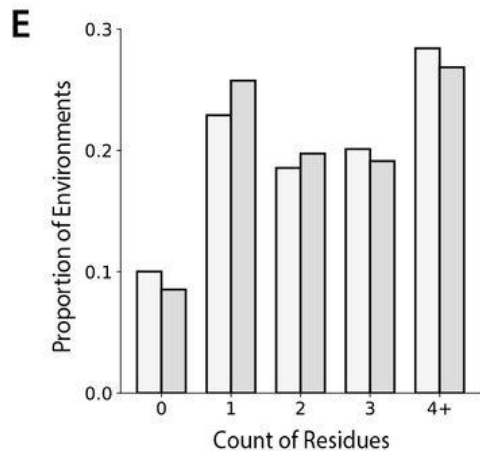
8EOR
mRMSD: 1.21Å



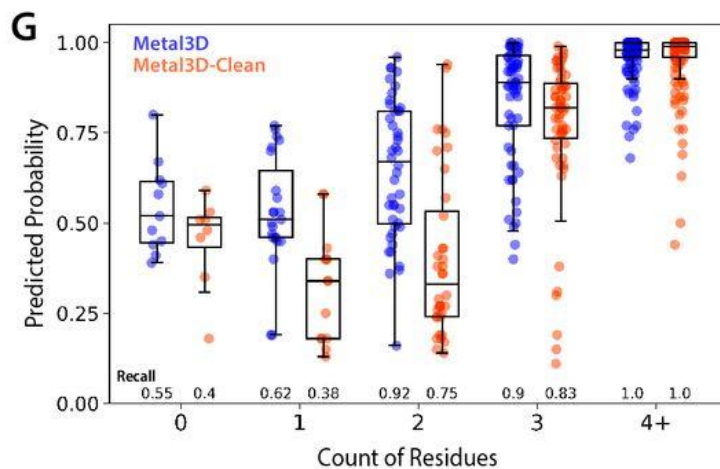
Negative control metalloprotein desD1 had a probable structure, but lacked experimental function



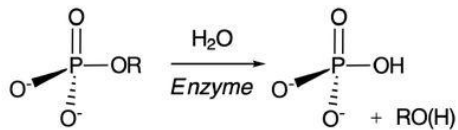
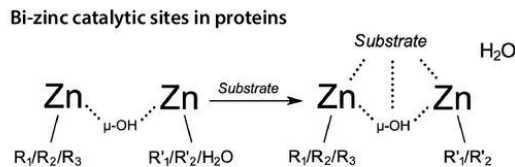
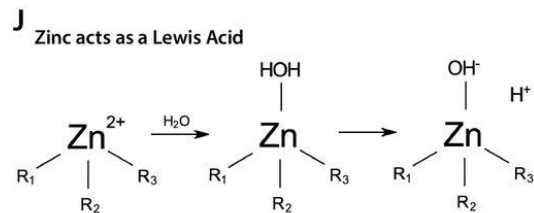
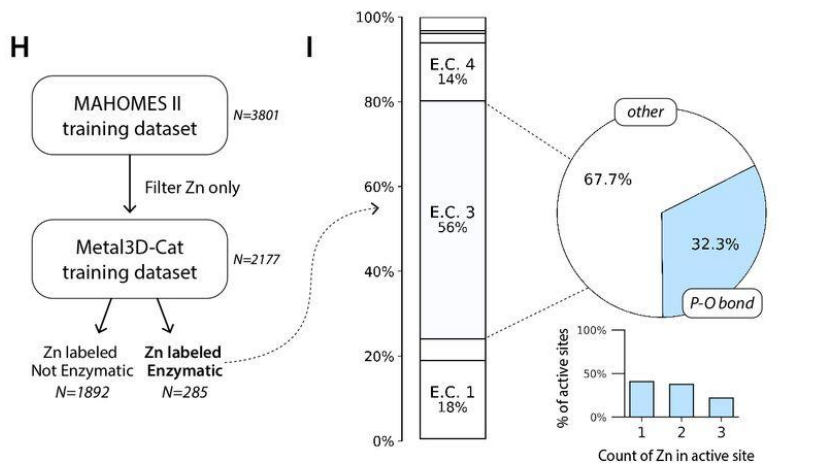
Analysis of training data for Metal3D showed >50% of coordination sites contained two or less residues



Exclusion of sites with less than three residues shifted the types of coordination sites predicted

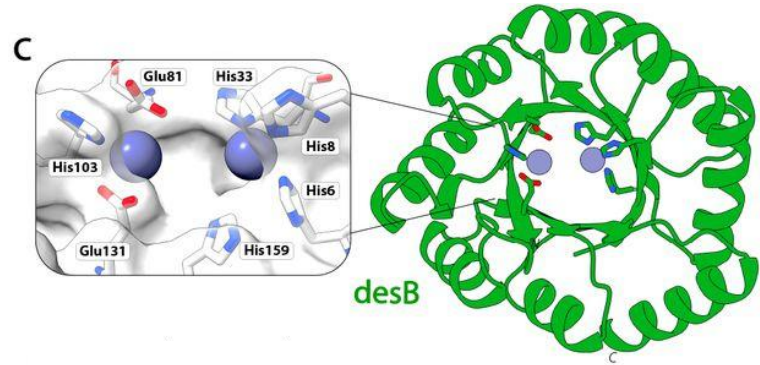
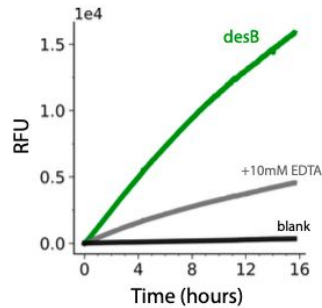
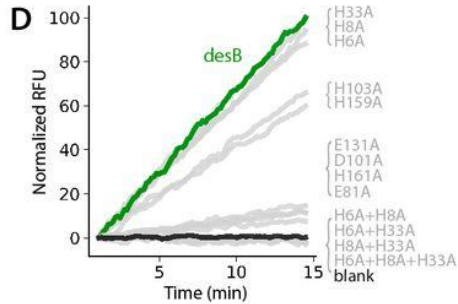
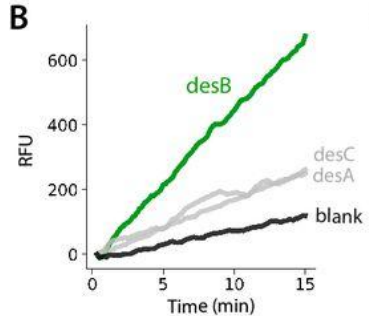


Improved Metal3D selectivity was then trained on catalytic zincs to model first- and second- shell environments



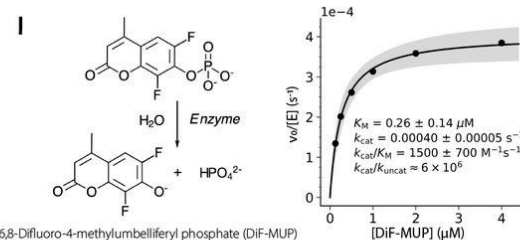
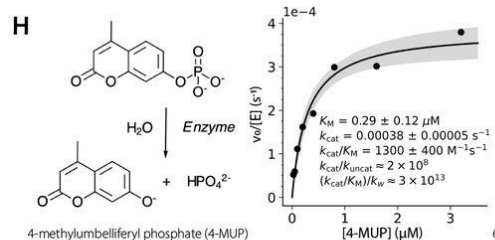
General Phosphomonoester Hydrolysis

dEVA generated three beta-barrel structures with novel, catalytically active bi-nuclear zinc active sites

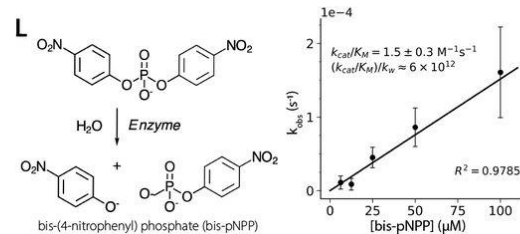
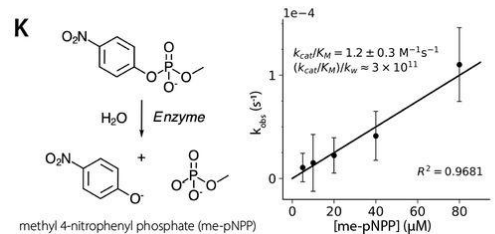


DesB is capable of catalyzing energetically demanding phosphate-oxygen bonds comparable to existing enzymes

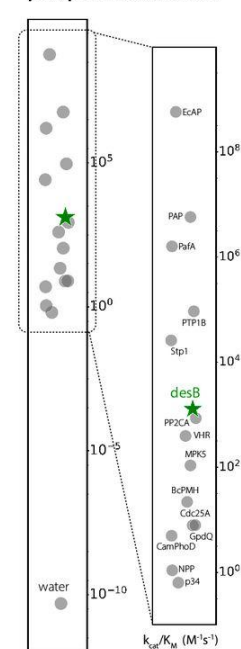
Phosphomonoester Hydrolysis



Phosphodiester Hydrolysis



J k_{cat}/K_M of natural phosphomonoesterases



Summary

- Developed protocol for multi-objective optimization and used it to generate metalloproteins with affinity for zinc.
- Improved coordination chemistry by considering the biophysical properties of the datasets that they were training on.
- Improved model was used to generate a bi-nuclear catalytically active zinc site with novel coordination ligands

Strengths vs Weaknesses

- Logical stepping in experimental complexity (Protein then enzyme)
- Generation of novel enzymatic coordination chemistries
- Ability to introduce enzymatic active sites into any structure
- Rationale for design/filtering decisions were not clear
- Limited by need for pre-existing annotated datasets
- Metalloenzyme scaffold ultimately resembled existing enzymes
- New-to-nature functions would not be achievable

Future Directions

- Expanding the filters on the types of structures used to predict metalloenzymes
- Attempting to generate an enzyme with a specific function rather than training on a group of functions
- Explore other types of metal coordination and enzymatic function for zinc
- Show generalizability across coordinating metals and enzyme types