

# Protein stabilisation: Design, Experiments and Assessment (ProteSta)

ALS1 (BIFI-LACRIMA) 3rd-7thJuly 2023, Zaragoza, Spain



# DAY4 (6 July, 2023) 9:00/13:00 Computational tools for protein stabilization

- Rosetta
  Javier Sancho
- FoldX
- PoPMusic
- Protposer: a different approach





Rosetta	Search	Below is a partial list of prot	tocols. For the full list, please advise the User Guide.
The hub for Rosetta modeling soft	Home Software Software Software Software Blog	RosettaAbinitio	De novo protein structure prediction.
The hub for Rosella modeling son	ware	RosettaDesign	Identifies low free energy sequences for target protein backbones.
2 1 for nur	sity.dimension(grid[0],grid[1],grid[2]); (int i=0; i <density.u1()*density.u2()*density.u3(); ++i)="" density[i]="0.0;&lt;br">eric::xyzVector&lt; core::Real &gt; atm i, fracX; eric::xyzVector&lt; core::Real &gt; atm i, del ij;</density.u1()*density.u2()*density.u3();>	Rosetta Design PyMol Plugin	PyMOL plugin A user-friendly interface for submitting Protein Design simulations using RosettaDesign.
	<pre>st core::Real ATOM_MASK_PADDING = 1.5; (Size n=1; n&lt;=npose; +n) { ore::pose::Pose &amp;pose = *(poses[n]); th rnes = pose.total_residue();</pre>	RosettaDock	Predicts the structure of a protein-protein complex from the individual structures of the monomer components.
	or (int i=1 ; i<=nres; ++i) { conformation::Residue const &rsd_i (pose.residue(i));	RosettaAntibody*	Predicts antibody Fv region structures. See PubMed 24519881 and 19062174.
		RosettaFragments	Generates fragment libraries for use by Rosetta ab initio in building protein structures.
Documentation & Support	Home » Documentation & Support	RosettaNMR	Incorporates NMR data into the basic Rosetta protocol to accelerate the process of NMR structure prediction
Overview of Rosetta	Overview of the Rosetta Software Suite	RosettaDNA	For the design of proteins that interact with specified DNA sequences.
	Rosetta is a suite of software libraries for macromolecular modeling. The diverse functionality of the libraries may be used by the	RosettaRNA	Fragment assembly of RNA.
Forum	end user in different ways:	RosettaLigand	Small molecule - protein docking
User Guide	A set of premade applications define protocols that can be used to perform a specific task.	RosettaSymmetry	Enforcing symmetry in Rosetta
	<ul> <li>A set of frameworks (PyRosetta, RosettaScripts) allow creation of your own protocols for new use cases.</li> <li>Various web servers, notably ROSIE, are set up and lend their computing power to provide applications that may be used</li> </ul>	RosettaEnzdes	Enzyme design
Demos	remotely, without having to install anything on your computer.	RosettaMembrane	Membrane protein ab initio modeling
Education	A detailed list of protocols, frameworks and applications is available in the User Guide. Use cases	RosettaDDG*	Estimating the impact of sequence changes on protein stability
	Rosetta is best described by the science that our community, as well as other communities, have used it for. It is extendable and adaptable	RosettaScripts	An xml-based scripting language for control of modeling trajectories. Supports all major Rosetta functionalities
	if you need it to be. Protocols	Rosetta SnugDock*	Enables docking an antibody Fv region to an antigen and allows backbone flexibility in the paratope.
	Rosetta attempts to provide a flexible library of functionality to accomplish a diverse set of biomolecular modeling tasks. The basic tasks and operations that the libraries define, are combined together as algorithms which we call <b>protocols</b> , each of which use	RosettaMultigraft	Performs matching, backbone, and side chain grafting of functional motifs onto scaffold proteins.
	Rosetta's flexible molecular modeling library to accomplish specific modeling tasks. These protocols can either be used as self	Rosetta FlexPepDock	Peptide-protein dodking
	contained units, or they can be chained together to accomplish more complex tasks, either by successive use of different applications or by combining the protocols within the generalizable frameworks.	Rosetta ERRASER	Remodeling RNA aystallographic models with electron density constraint.
	Rosetta algorithms are able to accomplish prediction, design and analysis on a diverse set of bio-molecular systems, including	RosettaVIP	Stabilize a protein by identifying and filling voids
		RosettaMatdes	Materials design
		* marked applications might	t not be available in the latest version of Rosetta



Footer





# rosetta commons

high resolution structure prediction and design software

login	×	recetta decimas
documentation	×	rosetta.design <sup>3.5</sup> computational protein design software
register	×	welcome.
contact us	×	Rosetta design can be used to identify sequences compatible with a given protein backbone. Some of Rosetta design's successes include the design of a novel protein fold, redesign of an existing protein for greater stability, increased binding affinity between two proteins, and the design of novel enzymes.
free.servers		
× Rosetta Dock × Robetta Structure Prediction		If you would like to use Rosetta.design, please <u>register for an account</u> . If you already have an account, you can login below.
× Rosetta Antibody/Ho Modeling	mology	login.
swiftlib		User Name: jsancho Password:
SwiftLib degenerate codon optimizer	library	Submit

# rosetta commons

high resolution structure prediction and design soft

logout	×	submit ich
submit job	×	submit.job
view queue	×	Welcome back, jsancho. Please use the form below to submit your job. Note: This server will design at most 200 positions. If your PDB file contains more than 200 residue: must upload a resfile (see resfile format) which specifies which residues you want to design. For the
documentation	×	resfile format specification, see the <u>Rosetta release manual</u> .
		Protocol to run:  Protein design
register	×	Increase binding affinity help
contact us	×	PDB file to be redesigned: Browse 1FTG.pdb
		Residues to design:
free.servers		All residues
× Rosetta Dock		O Selected residues: Browse No file selected.
× Robetta Structure Prediction		Fixed backbone design options These options only apply to protein design protocol jobs. They have no effect on affinity increase j
× Rosetta Antibody/Homol Modeling	<u>ogy</u>	Number of independent trajectories (default: 1, max: 10):
		Use hpatch-SASA score: Note: This option increases runtime 20-fold, and limits nstruct to 1.
recent.publications		Submit Job



dd/mm/yyyy



# **Score Function**

Score functions in Rosetta are weighted sums of energy terms, some of which represent physical forces like electrostatics and van der Waals' interactions, while others represent statistical terms like the probability of finding the torsion angles in Ramachandran space. Below is a list of the energy terms used in the *ref2015* score function:

fa_atr	Lennard-Jones attractive between atoms in different residues
fa_rep	Lennard-Jones repulsive between atoms in different residues
fa_sol	Lazaridis-Karplus solvation energy
fa_intra_sol_xover4	Intra-residue Lazaridis-Karplus solvation energy
lk_ball_wtd	Asymmetric solvation energy
fa_intra_rep	Lennard-Jones repulsive between atoms in the same residue
fa_elec	Coulombic electrostatic potential with a distance-dependent dielectric
pro_close	Proline ring closure energy and energy of psi angle of preceding residue
hbond_sr_bb	Backbone-backbone hbonds close in primary sequence
hbond_lr_bb	Backbone-backbone hbonds distant in primary sequence
hbond_bb_sc	Sidechain-backbone hydrogen bond energy
hbond_sc	Sidechain-sidechain hydrogen bond energy
dslf_fa13	Disulfide geometry potential
rama_prepro	Ramachandran preferences (with separate lookup tables for pre-proline positions and other positions)
omega	Omega dihedral in the backbone. A Harmonic constraint on planarity with standard deviation of $\sim$ 6 deg.
p_aa_pp	Probability of amino acid, given torsion values for phi and psi
fa_dun	Internal energy of sidechain rotamers as derived from Dunbrack's statistics
yhh_planarity	A special torsional potential to keep the tyrosine hydroxyl in the plane of the aromatic ring
ref	Reference energy for each amino acid. Balances internal energy of amino acid terms. Plays role in design.
METHOD_WEIGHTS	Not an energy term itself, but the parameters for each amino acid used by the ref energy term.

Further description of energy terms can be found here.

The weights associated with the ref2015 score function are:

fa atr 1	
fa_rep 0.55	
fa_sol 0.9375	
_ fa_intra_rep 0.005	
fa_elec 0.875	
pro_close 1.25	
hbond_sr_bb 1.17	
hbond_lr_bb 1.17	
hbond_bb_sc 1.17	
hbond_sc 1.1	
dslf_fa13 1.25	
rama 0.25	
omega 0.625	
fa_dun 0.7	
p_aa_pp 0.4	
yhh_planarity 0.625	
ref 1	
<	

# **Comparing Rosetta Scores to Real-Life Energies**

While much of the energy function in Rosetta is physics-based, it also has certain statistical terms to favor structures that look like known protein structures (as nature often conserves protein folds).

While a lower scoring structure is more likely to be closer to the native structure, the scores do not have a direct conversion to physical energy units like kcal/mol. Instead we represent them in *Rosetta Energy Units (REU)*.

# Rosetta Scoring tutorial





Full apps list

Rosetta Scripting Interfaces

Development Documentation

FAQ

Glossary

RosettaEncyclopedia

Options list

 SEWING: Build new protein structures from large elements (e.g. helix-loophelix motifs) of native proteins.

## Library Design

Sequence tolerance: Optimize proteins for library applications (e.g. phage or yeast display).

SwiftLib server: Web-based tool for rapid optimization of degenerate codons.

### Stability Improvement

- Point mutation scan: Identify stabilizing point mutants
- Supercharge: Reengineer proteins for high net surface charges, to counter aggregation.
- Void Identification and Packing (RosettaVIP): Identify and fill cavities in a protein.

# **Secondary Structure**

- Hydrogen bond surrogate design: Design stabilized alpha helical binders
- Beta strand homodimer design: Find proteins with surface exposed betastrands, then design a homodimer that will form via that beta-strand.

# Protein-Protein Interface Design

- Protein-protein design: Protein-protein interface design with RosettaScripts.
- Zinc heterodimer design: Design zinc-mediated heterodimers.

### Enzymes

Enzyme Design: Design a protein around a small molecule, with catalytic constraints.

# Point Mutation scan

## **Expected Outputs**

The only output from the protocol, by default, is the log file for the run. The log file will contain the predicted ddG and difference in average total energy for all mutants found to be stabilizing. If the option "output\_mutant\_structures" was specified, a PDB file for each of the mutants found to be stabilizing will also be output. The PDB files will be named with the input file + a string representing the mutant. For example, the mutant histidine-1-glycine on chain A for structure 1l2y\_renameH.pdb will be output to a file named 1l2y\_renameH.A-H1G.pdb.

## Limitations

Mutants predicted to be stabilizing by the pmut scan protocol may not be stabilizing, and mutants which are stabilizing may be missed. The reasons for these outcomes are varied. The Rosetta energy function is imperfect. Thus, certain energetics which Rosetta does not account for can make a mutant predicted to be stabilizing actually destabilizing. Additionally, to model the mutations, the protocol assumes a fixed backbone conformation. Studies have shown that better results can be achieved using protocols that allow backbone flexibility. Refining the protocol based on the results of experimental characterization of predictions will be necessary to improve prediction accuracy.







# https://github.com/ELELAB/RosettaDDGPrediction

Received: 2 September 2022 Revised: 25 November 2022 Accepted: 25 November 2022 DOI: 10.1002/pro.4527

#### TOOLS FOR PROTEIN SCIENCE

BROTEIN WILEY

# RosettaDDGPrediction for high-throughput mutational scans: From stability to binding

Valentina Sora<sup>1,2</sup> | Adrian Otamendi Laspiur<sup>2</sup> | Kristine Degn<sup>2</sup> | Matteo Arnaudi<sup>1,2</sup> | Mattia Utichi<sup>1,2</sup> | Ludovica Beltrame<sup>1,2</sup> | Dayana De Menezes<sup>2</sup> | Matteo Orlandi<sup>2</sup> | Ulrik Kristoffer Stoltze<sup>3,4,5</sup> | Olga Rigina<sup>2</sup> | Peter Wad Sackett<sup>2</sup> | Karin Wadt<sup>3,5</sup> | Kjeld Schmiegelow<sup>4,5</sup> | Matteo Tiberti<sup>1</sup> | Elena Papaleo<sup>1,2</sup>

<sup>1</sup>Cancer Structural Biology, Danish Cancer Society Research Center, Copenhagen, Denmark <sup>2</sup>Cancer Systems Biology, Section for Bioinformatics, Department of Health and Technology, Technical University of Denmark, Lyngby, Denmark <sup>3</sup>Department of Clinical Genetics, Copenhagen University Hospital Rigshospitalet, Copenhagen, Denmark <sup>4</sup>Department of Pediatrics and Adolescent Medicine, University Hospital Rigshospitalet, Copenhagen, Denmark <sup>4</sup>Institute of Clinical Medicine, Faculty of Medicine, University of Copenhagen, Copenhagen, Denmark

This is an open access article under the terms of the Creative Commons Attribution-NonCommercial License, which permits use, distribution and reproduction in any

#### Correspondence

Elena Papaleo, Cancer Structural Biology, Danish Cancer Society Research Center, 2100 Copenhagen, Denmark. Email: elpap@dtu.dk; elenap@cancer.dk

#### Funding information

Carlsberg Foundation Distinguished Fellowship, Grant/Award Number: CF18-0314, Danmarks Grundförskningsfond, Grant/Award Number: DNRF125; Hartmanns Fond, Grant/Award Number: R241-A3387; LEO Foundation, Grant/Award Number: LF17006; NovoNordisk Fonden Bloscience and Basic Biomedicne, Grant/Award Number: NNF200C0065262; European Regional Development Fund; Dankh Cancer Society, Grant/Award Numbers: R-237-A14720; Danish Childhood Cancer Foundation, Grant/Award Numbers 2020-5789, 2019-5934

Review Editor: Nir Ben-Tal

Protein Science, 2023;32:e4527.

https://doi.org/10.1002/pro.4527

 ciety Research Center,
 Reliable predictio

 , Denmark.
  $(\Delta \Delta Gs)$  is crucial

 udk; elenap@cancer.dk
 protein interaction

 ation
 throughput studied

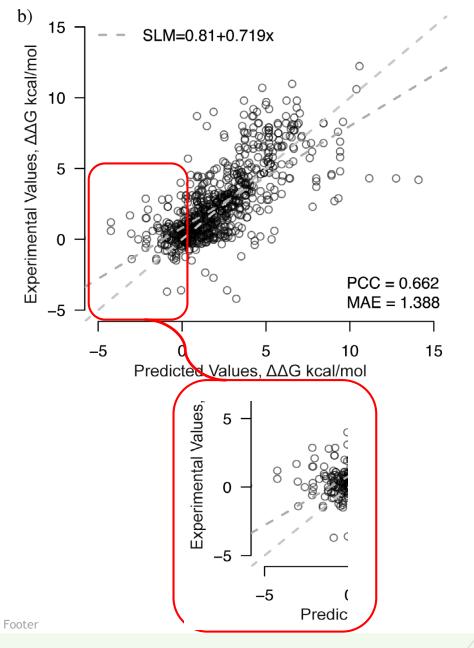
 not Distinguished
 mics initiatives protein

Valentina Sora and Adrian Otamendi Laspiur equally contributed to this study.

medium, provided the original work is properly cited and is not used for commercial purposes. © 2022 The Authors. Protein Science published by Wiley Periodicals LLC on behalf of The Protein Society

Abstract

Reliable prediction of free energy changes upon amino acid substitutions  $(\Delta\Delta Gs)$  is crucial to investigate their impact on protein stability and proteinprotein interaction. Advances in experimental mutational scans allow highthroughput studies thanks to multiplex techniques. On the other hand, genomics initiatives provide a large amount of data on disease-related variants that can benefit from analyses with structure-based methods. Therefore, the computational field should keep the same pace and provide new tools for fast and accurate high-throughput  $\Delta\Delta G$  calculations. In this context, the Rosetta modeling suite implements effective approaches to predict folding/unfolding  $\Delta\Delta G$ s in a protein monomer upon amino acid substitutions and calculate the changes in binding free energy in protein complexes. However, their application can be challenging to users without extensive experience with Rosetta. Furthermore, Rosetta protocols for  $\Delta\Delta G$  prediction are designed considering one variant at a time, making the setup of high-throughput screenings cumbersome. For these reasons, we devised RosettaDDGPrediction, a customizable Python wrapper designed to run free energy calculations on a set of amino acid substitutions using Rosetta protocols with little intervention from the user Moreover, RosettaDDGPrediction assists with checking completed runs and aggregates raw data for multiple variants, as well as generates publication-





dd/mm/yyyy

This project has received funding from the European Union's Horizon 2020 research and innovation programme under grant agreement No 101004806

wileyonlinelibrary.com/journal/pro 1 of 25

# Foldx



PRODUCTS - LICENSING AND SERVICES - DOCUMENTATION - DOWNLOAD - ABOUT -

#### STABILITY

Calculates the DG to fold the proteins from their unfolded state. The minimal configuration file for Stability is:

command=Stability pdb=ST.pdb

#### It can be run from the command line

FoldX --command=Stability --pdb=ST.pdb

FoldX uses output-file as a tag to label different outputs from different commands in batch runs. After running Stability you'll get one file to look at. Given output-file="TAG" the output file is:

TAG\_ST fxout -> calculates the different DG energy terms of folding the protein

If you don't set output-file, TAG will be the pdbld of the first pdb on the batch. Output file contains the Gibbs energy of protein folding decomposed into the different terms used by FOLD-X. This file will have different headers and then rows (one for each PDB run) with the energy decomposition in Kcali mol, the different columns are described below in the table Energy Terms:

#### **ENERGY TERMS**

Title	energy_description
Pdb	Pdb file
Total Energy	This is the predicted overall stability of your protein
Backbone Hbond	This the contribution of backbone Hbonds
Sidechain Hbond	This the contribution of sidechain-sidechain and sidechain-backbone Hbonds
Van der Waals	Contribution of the VanderWaals
Electrostatics	Electrostatic interactions
Solvation Polar	Penalization for burying polar groups
Solvation Hydrophobic	Contribution of hydrophobic groups
Van der Waals clashes	Energy penalization due to VanderWaals' clashes (interresidue)
Entropy Side Chain	Entropy cost of fixing the side chain
Entropy Main Chain	Entropy cost of fixing the main chain
Sloop Entropy	ONLY FOR ADVANCED USERS
Mloop Entropy	ONLY FOR ADVANCED USERS
Cis Bond	Cost of having a cis peptide bond
Torsional Clash	VanderWaals' torsional clashes (intraresidue)
Backbone Clash	Backbone-backbone VanderWaals. These are not considered in the total
Helix Dipole	Electrostatic contribution of the helix dipole
Water Bridge	Contribution of water bridges
Disulfide	Contribution of disulfide bonds
Electrostatic Kon	Electrostatic interaction between molecules in the precomplex
Partial Covalent Bonds	Interactions with bound metals
Energy Ionisation	Contribution of ionisation energy
Entropy Complex	Entropy cost of forming a complex
Residue Number	Number of residues

# https://github.com/ELELAB/mutatex



Briefings in Bioinformatics, 2022, 23(3), 1–16 https://doi.org/10.1093/bib/bbac074 Problem Solving Protocol

# MutateX: an automated pipeline for *in silico* saturation mutagenesis of protein structures and structural ensembles

Matteo Tiberti, Thilde Terkelsen, Kristine Degn, Ludovica Beltrame, Tycho Canter Cremers,

#### Isabelle da Piedade, Miriam Di Marco, Emiliano Maiani and Elena Papaleo ô

Corresponding authors: Elena Papaleo, Cancer Strucutral Biology, Daniah Cancer Society Research Center, Copenhagen, Denmark and Cancer Systems Biology, Dep. Health and Technology, Technical University of Denmark, Lyngby, Tel. 004535257311; E-mail: elenap@cancer.dk; elapa@dtu.dk; Matteo Tiberti, Cancer Structural Biology, Daniah Cancer Society Research Center, Copenhagen 2100, Denmark, Tel: 004535257307; E-mail: Uberti@cancer.dk;

#### Abstract

Mutations, which result in amino acid substitutions, influence the stability of proteins and their binding to biomolecules. A molecular understanding of the effects of protein mutations is both of biotechnological and medical relevance. Empirical free energy functions that quickly estimate the free energy change upon mutation (AAG) can be exploited for systematic screenings of proteins and protein complexes. In silico saturation mutagenesis can guide the design of new experiments or rationalize the consequences of known mutations. Often software such as FoldX, while fast and reliable, lack the necessary automation features to apply them in a highthroughput manner. We introduce MutateX, a software to automate the prediction of AAGs associated with the systematic mutation of each residue within a protein, or protein complex to all other possible residue types, using the FoldX energy function. MutateX also supports AAG calculations over protein ensembles, upon post-translational modifications and in multimeric assemblies. At the heart of MutateX lies an automated pipeline engine that handles input preparation, parallelization and outputs publication-ready figures. We illustrate the MutateX protocol applied to different case estudies. The results of the high-throughput scan provided by our tools can help in different applications, such as the analysis of disease-associated mutations, to complement experimental deep mutational scans, or assist the design of variants for industrial applications. MutateX is a collection of Python tools that relies on open-source libraries. It is available free of charge under the GNU General Public License from https://github.com/ELLAM/mutatex.

Keywords: free energy, mutations, post-translational modifications, structural ensembles, binding, stability

#### Introduction

Advances in proteomics are now providing a massive amount of data on protein-protein interaction or posttranslationally modified proteins [1–5] that benefit from structural studies to be rationalized [6, 7]. On the other hand, genomic initiatives allow the identification of missense mutations [8–10] in the coding region of genes that

need to be understood at a structural and functional level [11–13]. Indeed, single amino acid substitutions (i.e. mutations) or post-translational modifications (PTMs) in proteins may alter structural stability and intermolecular interactions, impacting protein activity, function and cellular signaling. An accurate and systematic prediction of changes in stability and binding upon mutations or

8

Research Infrastructure

Matteo Tiberti is a staff scientist at the Cancer Structural Biology group (Danish Cancer Society Research Center, DCRC, Copenhagen, Denmark) and his research focuses on software development for structural bioinformatics and annotations of cancer mutations.

Thilde Terkelsen worked as PhD student at the Cancer Structural Biology group at DCRC and she is now Data Sciencist at the Center for Health and Data Science at the University of Copenhagen. At DCRC, she worked on the implementation of MutateX functions for downstream analyses and the analyses of -omics data. **Kristine Degn** is a PhD student in the Cancer Systems Biology group (Department of Health and Technology, Technical University of Denmark, DTU, Lyngby, Denmark) and her research focuses on structure-based methods to characterize and classify variants found in cancer samples with impact on the protein products.

Ludovica Beltrame is an Erasmus exchange student at the Cancer Structural Biology group at DCRC. Her research is focusing on free energy calculations and molecular simulations to study the effect of mutations on protein structures.

Tycho Canter Cremers carried out his Master Studies in the Cancer Structural Biology group at DCRC, focusing on implementing new functions for MutateX and he is currently working as Bioinformatician at the Center of Medical Genetics, Antwerp.

Isabelle da Piedade worked as a Post-Doctoral Researcher at the Cancer Structural Biology Group at DCRC with a focus on analyzes of genomics and transcriptomics data. She is currently working at Senior Bioinformatician at the Danish National Genome Center (Copenhagen, Denmark). Miriam Di Maxoro worked as a pre-graduate fellow and master's student at the Cancer Structural Biology group at DCRC. She applied free energy calculations to

Minimum of Marco worked as a pre-graduate relow and master's student at the cancer structural slobey group at DLRC. She applied free energy calculations to characterize disease-related proteins and the impact of mutations on protein stability.

Emiliano Maiani worked as a Post-Doctoral Researcher and Senior Scientitä at the Cancer Structural Biology group of DCRC. His main research focus in the group has been in the area of experimental structural and cellular studies of short linear motifs. He is currently an Adjunct Professor at UniCamillus-Saint Camillus International University of Health Sciences, Rome, Italy. His current research focuses on DNA damage response and autophage.

Elena Papaleo is Associate Professor and leader of the Cancer Systems Biology group at DTU and group leader of the Cancer Structural Biology group at DCRC. Her research focuses on applying-omics bioinformatics and structural methods, accompanied by experimental validation with in vitro and cellular assays. These methodologies are used to unravel the effects of disease-related mutations and post-translational modifications on protein structures and to characterize protein-protein interactions mediated by disordered regions.

Received: November 30, 2021. Revised: January 28, 2022. Accepted: February 16, 2022

© The Author(s) 2022. Published by Oxford University Press. All rights reserved. For Permissions, please email: journals.permissions@oup.com

# PopMusic



# Prediction of protein thermodynamic stability changes upon single-site mutations

**PoPMuSiC** is a tool for the computer-aided design of mutant proteins with controlled **thermodynamic stability** properties. It evaluates the changes in **folding free energy** of a given protein or peptide under point mutations, on the basis of the experimental or modeled protein structure.

#### Three modes are available:

- 1. Systematic: Evaluation of the stability changes resulting from all possible point mutations. Returns a report with the list of the most stabilizing or destabilizing mutations, or of the mutations that do not affect stability.
- 2. Manual: Prediction of the stability changes caused by the point mutations specified by the user.
- 3. File: Prediction of the stability changes caused by a list of mutations specified by the user in an uploaded file.

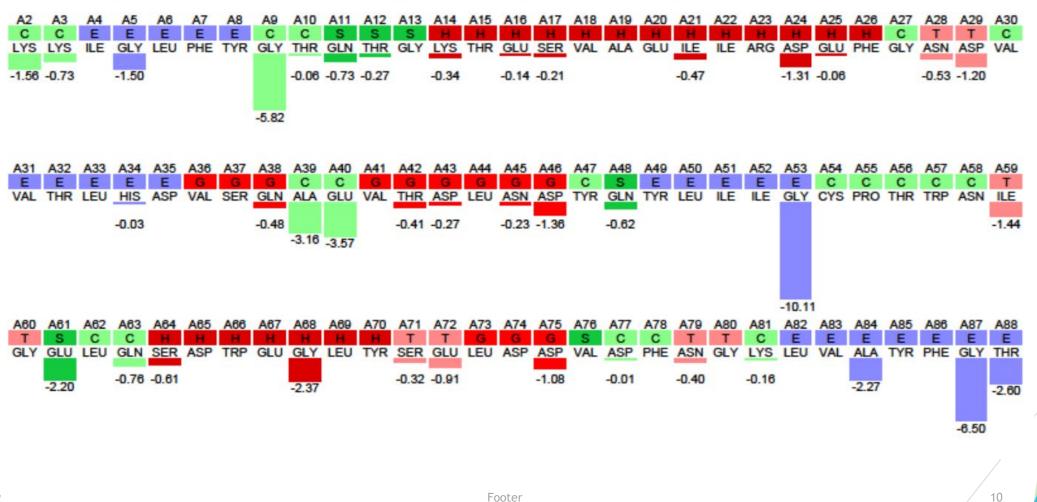
# Predictions for 1FTG by PopMusic







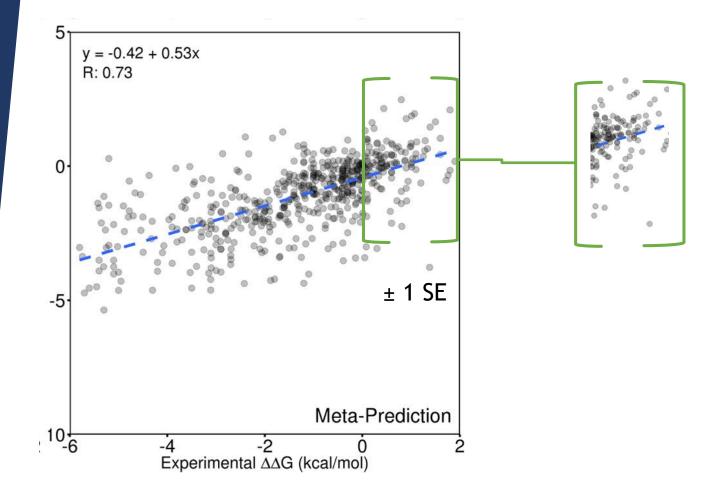
# PopMusic



## Sequence optimality (sum of negative ddG per sequence position) - 1FTG.pdb - Systematic - 27-06-2023

dd/mm/yyyy





Tool	S.E.
	kcal/mol
EGAD	1.61
FoldX	1.78
Rosetta-ddG	2.34
CUPSAT	1.77
DFire	1.84
Hunter	1.89
MultiMutate	2.34
SDM	1.96
PoPMuSiC	1.32
IMutant3	1.52
MuPro	1.52
Meta-predictor	1.29

A. Broom, Z. Jacobi, K. Trainor, and E.M. Meiering *J. Biol. Chem.* 292:14349-14361 (2017)



11

dd/mm/yyyy



# http://webapps.bifi.es/the-protposer



Computational and Structural Biotechnology Journal Volume 20, 2022, Pages 2415-2433

Footer

Protposer: The web server that readily proposes protein stabilizing mutations with high PPV

Helena García-Cebollada <sup>a, b, c</sup>, Alfonso López <sup>a, b, c</sup>, Javier Sancho <sup>a, b, c</sup> A 🖾







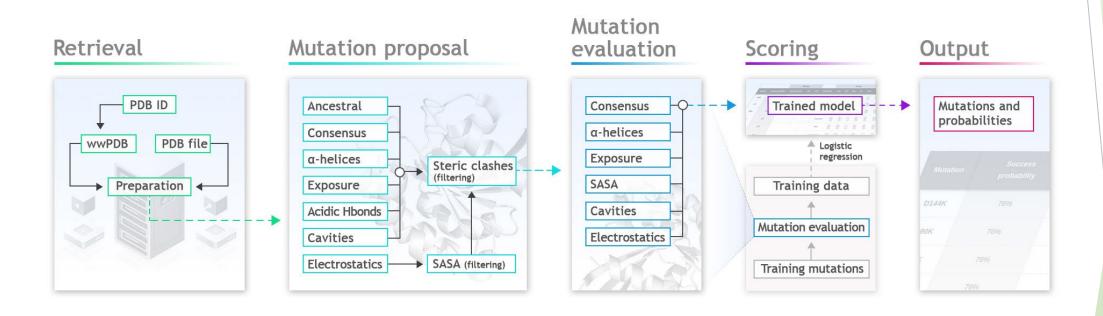
## Protposer $\Delta\Delta G$ predictors Expected Proposed Energy ΔΔG **PDB** file **User** ideas values for mutations calculation indicated mutations **PROTPOSER** List of **Evaluation of Mutation** Proposed Evaluated proposed PDB file Scoring mutations features mutations mutations proposal (with PPV) Trained logistic regression classifier Analysis of PDB file in search for wt residues that might represent opportunities for stabilization through their replacement by other residues

Footer

13



dd/mm/y





14

dd/mm/yyyy



# Testing and Precision or PPV(Positive Predictive Value)

# Ex post test set

# ED

Filtered ThermoMutDB database 916 single mutations in 9 proteins Used as external validation

# ED +

ED + 1FTG + 1PGA 1916 single mutations in 11 proteins Used as external validation

$$PPV = \frac{TP}{TP + FP}$$

Fraction of mutations predicted to stabilize that do so experimentally

## Protposer compared with other software

A real-case scenario: the user choses the 10 best mutations

Predictor	Positive Predictive Value
Protposer <sub>OK</sub>	78,6%
<b>Protposer</b> <sub>classic</sub>	<b>56,0%</b>
Protposer <sub>HM</sub>	<b>42,9%</b>
Protposer	36,1%
PoPMuSiC <sub>sel</sub>	32,3%
Rosetta <sub>sel</sub>	29,0%
FoldX <sub>sel</sub>	22,1%





FoldX		Rosetta			PoPMuSiC				Protposer						
PDB	Mutatio n	ΔΔG	Exp. ΔΔG	PDB	Mutatio n	score	Exp. ΔΔG	PDB	Mutation	ΔΔG	Exp. ΔΔG		Mutatio n	score	Exp. ΔΔG
1ftg	Q63L	4,15	-0,01	1ftg	Q63L	-551,81	-0,01	1ftg	G87V	0,8	-0,13	1ftg	E40K	0,73	<mark>1,85</mark>
1ftg	Q99L	3,44	<mark>0,32</mark>	1ftg	Q99L	-551,05	<mark>0,32</mark>	1ftg	A142V	0,78	<mark>0,56</mark>	1ftg	E72K	0,72	1,24
1ftg	D43A	2,56	0	1ftg	W66F	-550,03	-0,71	1ftg	G68A	0,54	<mark>0,57</mark>	1ftg	D75K	0,71	<mark>0,92</mark>
1ftg	Q99A	1,73	<mark>1,63</mark>	1ftg	159A	-549,41	<mark>1,05</mark>	1ftg	Q99L	0,37	<mark>0,32</mark>	1ftg	E61K	0,64	0,66
1ftg	T122S	1,6	-0,31	1ftg	E16Q	-549,33	<mark>1,37</mark>	1ftg	S71A	0,32	-0,69	1ftg	E20K	0,6	1,37
1ftg	V18I	1,25	<mark>0,86</mark>	1ftg	152V	-549,28	-1,40	1ftg	G87L	0,28	-0,64	1ftg	D126K	0,61	<mark>0,86</mark>
1ftg	V117A	1,19	-1,74	1ftg	D150K	-548,93	-0,22	1ftg	A101V	0,24	-0,29	1ftg	D150K	0,59	-0,1
1ftg	S110A	1,13	-0,64	1ftg	G87A	-548,44	-0,05	1ftg	N128A	0,18	0,2	1ftg	I21A	0,56	<mark>0,45</mark>
1ftg	159A	1	<mark>1,05</mark>	1ftg	E20K	-548,43	<mark>1,37</mark>	1ftg	Q63L	0,16	-0,01	1ftg	Q111A	0,53	-0,23
1ftg	V31A	0,94	-1,72	1ftg	K81M	-547,98	-1,52	1ftg	D96N	0,14	<mark>0,89</mark>	1ftg	Q99L	0,46	<mark>0,32</mark>
1ftg	WT	0	0	1ftg	WT	-549,06	0	1ftg	WT		0	1ftg	WT		0
	Stabilizing if ∆∆G >0				Stabilizing if score more negative than WT			Stabilizing if ∆∆G >0			Stabilizing (probability given by the score)				

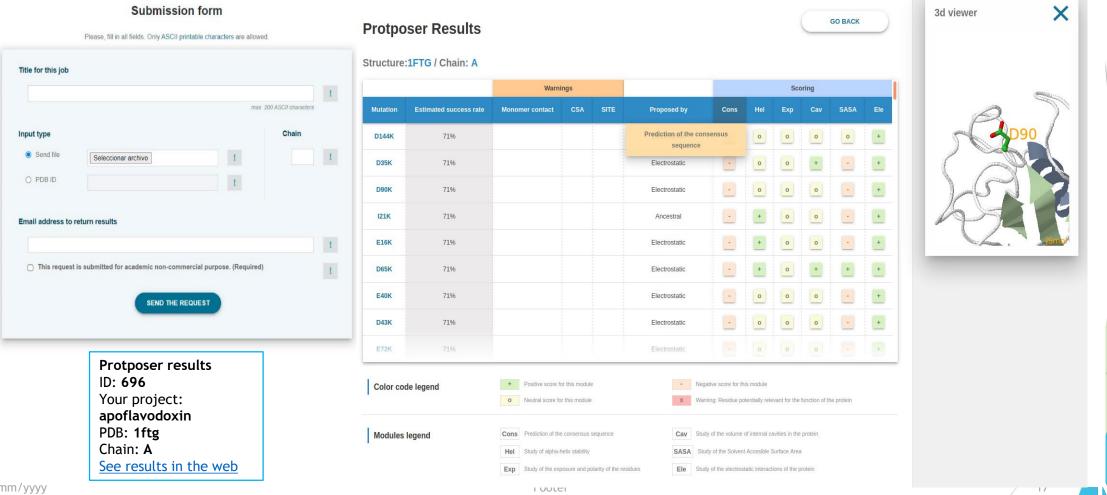


MOSBR

Molecular-Scale Biophys Research Infrastructure



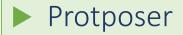
# Server input and output



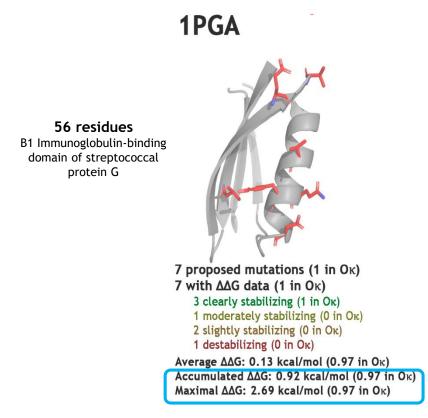
Research Infrastructur

dd/mm/yyyy





# Two examples





18

dd/mm/yyyy



Footer

# Very simple to use

- Great precision: up to 78% PPV in predicted mutations
- Free for academic use (no need to register so far)



# http://webapps.bifi.es/the-protposer



Computational and Structural Biotechnology Journal Volume 20, 2022, Pages 2415-2433



19

Protposer: The web server that readily proposes protein stabilizing mutations with high PPV

Helena García-Cebollada <sup>a, b, c</sup>, Alfonso López <sup>a, b, c</sup>, Javier Sancho <sup>a, b, c</sup>  $\stackrel{\circ}{\sim}$  🛛





Juan José Galano



Alfonso López





Footer

dd/mm/yyyy









This project has received funding from the European Union's Horizon 2020 research and innovation programme under grant agreement No 101004806

# MOSBR Molecular-Scale Biophysics Research Infrastructure

Protposer results ID: 1948 Your project: Test PDB: 1ftg Chain: A See results in the web



21

dd/mm/yyyy



Footer