# Affinity Maturation

MeilerLab Rosetta Workshop April 2019
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# Protein design is the inverse folding problem



# Given a protein fold – which primary sequence(s) can fold into it?

# Using rotamer libraries and the Rosetta scoring function to optimize packing





#### Simulated Annealing Monte Carlo optimization

### Affinity maturation of the antibodyantigen complex

- Sequence redesign of the proteinprotein sequence
- Using one conformation or multiple conformations ("state")
- In-silico affinity maturation to improve the interface score for tighter binding



## Single state design overview





FastRelax is designed to optimize the protein backbone/side chains to model at an energy minimum

Helps relieve clashes that may introduce artifacts into design





#### Please open

~/rosetta\_workshop/tutorials/protein\_design/single\_state\_design/input\_files/ design.xml

#### Where should you start looking?

```
<PROTOCOLS>
Run the design protocol
        <Add mover="design" />
```



Design and repack residues based on resfile
<ReadResfile name="rrf" filename="4HKX.resfile"/>



Do only design the residues specified below (the interface)

Free sequence design on heavy and light chain interface residues

Repack the antigen, do not mutate



#### Use the python script located in

~/rosetta\_workshop/tutorials/protein\_design/scripts/define\_interface.py

Calculates residues on each side of the interface using a side chain cutoff (default 5 A)

If any atom of a residue is within 5 A of any atom of a residue on the opposing chain – it's considered to be an interface residue



Single State Design (SSD):

- Optimize the sequence for one antibody-antigen conformation (design)
- Repack the wild-type sequence to descend to the lowest possible score (control)





Sevy, A. M., Jacobs, T. M., Crowe, J. E. & Meiler, J. *PLoS Comput. Biol.* **11**, e1004300 (2015).

Multi State Design (MSD):

- Optimize the sequence for two antibody-antigen conformations (design)
- Repack the wild-type sequence to descend to the lowest possible score for each state (control)



## **RE**strained **CON**vergence (RECON)



Sevy, A. M., Jacobs, T. M., Crowe, J. E. & Meiler, J. *PLoS Comput. Biol.* **11**, e1004300 (2015).

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#### Please open

~/rosetta\_workshop/tutorials/protein\_design/multi\_state\_design/input\_files/
design.xml

<PROTOCOLS>
Run four rounds of design
<Add mover=msd1 />
<Add mover=msd2 />
<Add mover=msd3 />
<Add mover=msd4 />
Find a consensus sequence for all states
<Add mover=finish />
Calculate interface metrics for the final sequence
<Add mover=analyze />

```
</PROTOCOLS>
```

Multiple design operations with gradually forcing the design to one consensus sequence

Agree on the final consensus sequence (if yet unclear)



- Total score: score of the entire complex
- Interface score: score of residues that are at the interface
- Binding energy: difference in energy between the bound and unbound partners

ddG - dG\_separated

• **Binding density:** ddG divided by the buried surface area. Prevents a low binding energy by increasing buried surface area.

dG\_separated dSASA × 100



```
<InterfaceAnalyzerMover name="analyze" scorefxn="REF2015"
packstat="0" pack_input="0" pack_separated="1"
fixedchains="H,L" />
```

- packstat: activates packstat calculation (packing statistics, Rosetta holes); can be slow so it defaults to off
- fixedchains: comma-delimited list of chain ids to define a group in the interface.
- pack\_separated: repack the exposed interfaces when calculating binding energy? Usually a good idea.
- pack\_input: prepack before separating chains when calculating binding energy? Useful if these are non-Rosetta inputs



Useful to quickly see which residues are being designed, and what amino acids are being put there

Made by WebLogo application through ~/rosetta\_workshop/tutorials/protein\_design/scripts/design\_analysis.py



http://weblogo.berkeley.edu/



- Position specific score changes for each Rosetta scoring term
- REF 2015 scoring terms:

The Rosetta All-Atom Energy Function for Macromolecular Modeling and Design Alford et al (2017)

• Made by supplementary script through

~/rosetta\_workshop/tutorials/protein\_design/scripts/ PerResidueEnergies.py



#### Please begin the Rosetta protein design tutorial found at

~/rosetta\_workshop/tutorials/protein\_design/