



## Analysis of Protein Binding Sites

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## Protein Binding Site Properties

### Residue properties:

- Amino acid type
- Surface accessibility
- Conservation
- Charge
- Hydrophobicity
- Secondary structure type
- Flexibility / Destabilization

### Surface/volume properties:

- Cavity size
- Cavity depth
- Cavity shape
- Surface curvature
- Electrostatic potential

Others

Which properties are favored in binding sites?



## Protein Binding Site Types

### Site types:

- Protein-ligand
- Protein-protein
- Protein-DNA
- etc.



## Protein Binding Site Types

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- ~~Ø~~Protein-ligand
- Protein-protein
- Protein-DNA
- etc.



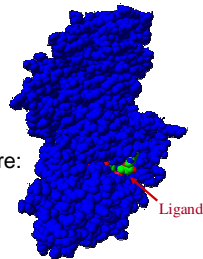
## Protein-Ligand Site Data

### Databases derived from PDB:

- PDBLIG [Chalk04]
- Ligand Depot [Feng04]
- PLD [Puvanendrapillai03]
- MSDsite [Golovin05]
- Relibase [Hendlich98]
- etc.

### Databases derived from literature:

- Catalytic Site Atlas [Porter04]



thid



## Protein-Ligand Site Analysis

Example study: [Bartlett et al., 2002]

### Data set:

- X-ray structures from PDB
- 178 non-homologous proteins
- Catalytic residues

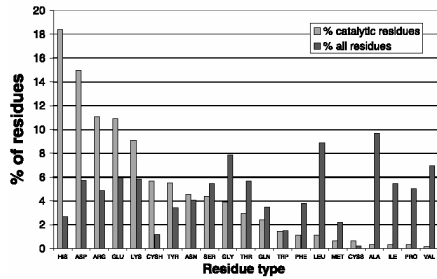
### Residue properties:

- Amino acid type
- Secondary structure
- Solvent accessibility
- Flexibility
- Conservation
- etc.

## Protein-Ligand Site Analysis



Amino acid type

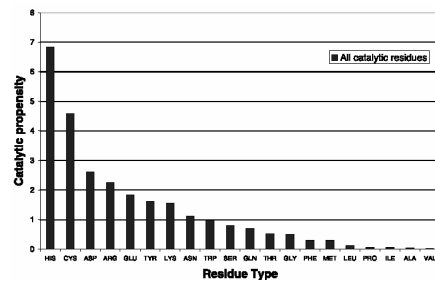


[Bartlett02]

## Protein-Ligand Site Analysis



Amino acid type

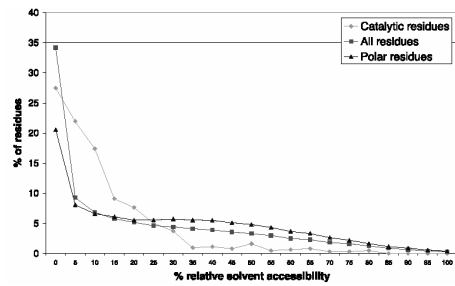


[Bartlett02]

## Protein-Ligand Site Analysis



Solvent accessibility

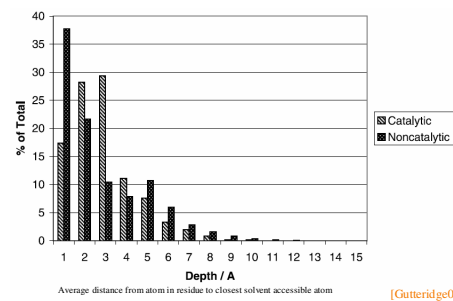


[Bartlett02]

## Protein-Ligand Site Analysis



Depth from surface

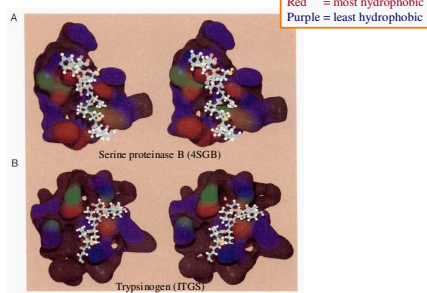


[Gutteridge03]

## Protein-Ligand Site Analysis



Hydrophobicity



[Young94]

## Protein-Ligand Site Analysis



Hydrophobicity

	Catalytic Residues	All Residues
Charged	65%	25%
Polar	27%	25%
Hydrophobic	8%	50%

% Catalytic residues (as compared to all residues)  
in data set with 178 enzymes

[Bartlett02]

## Protein-Ligand Site Analysis



### Secondary structure type

	Catalytic Residues	All Residues
Alpha helix	28%	47%
Beta sheet	22%	23%
Coil	50%	30%

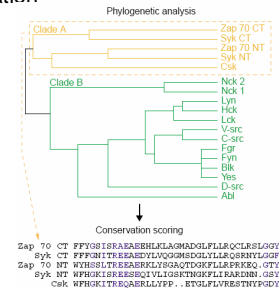
% Catalytic residues (as compared to all residues)  
in data set with 178 enzymes

[Bartlett02]

## Protein-Ligand Site Analysis



### Conservation

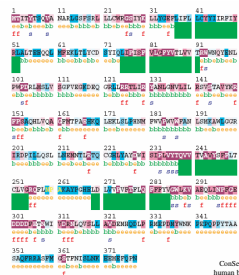


[Campbell03]

## Protein-Ligand Site Analysis



### Conservation



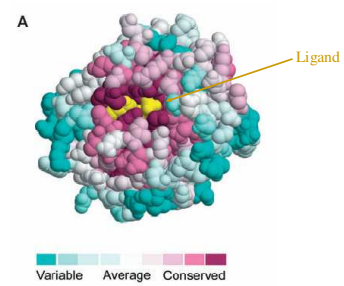
ConSeq predictions demonstrated on human histophilin using 43 homologues obtained from the Pfam database (SWISS-PROT: VMD2\_HUMAN) (family code: DUF239)

[Berezin04]

## Protein-Ligand Site Analysis



### Conservation

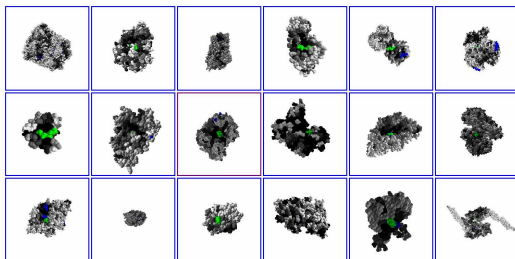


[Nimrod05]

## Protein-Ligand Site Analysis



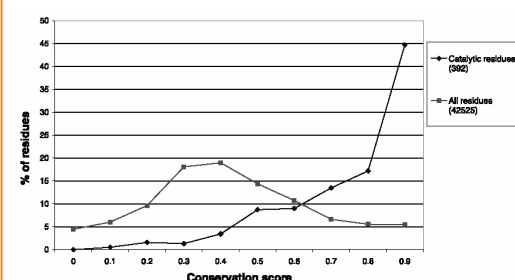
### Conservation



## Protein-Ligand Site Analysis



### Conservation

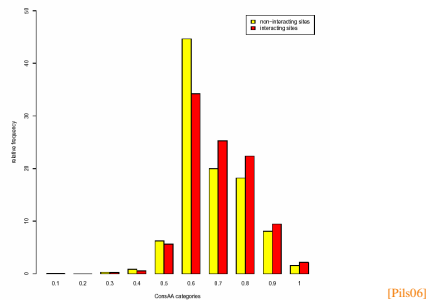


[Bartlett02]

## Protein-Ligand Site Analysis



### Conservation

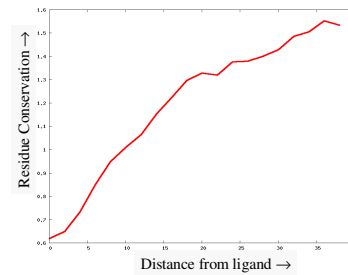


[Pis06]

## Protein-Ligand Site Analysis



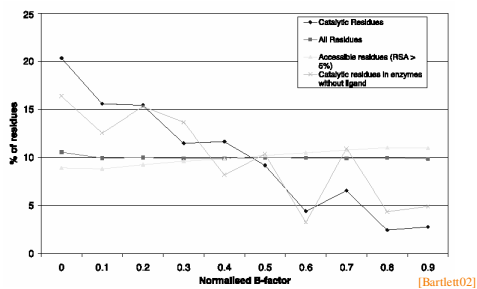
### Conservation



## Protein-Ligand Site Analysis



### Flexibility

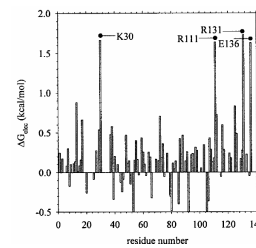


[Bartlett02]

## Protein-Ligand Site Analysis



### Contribution to stability



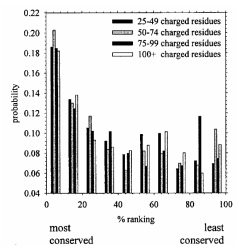
Electrostatic free energies for side-chains of residues in CRABP. (Positive values indicate residues that destabilize protein)

[Ecock01]

## Protein-Ligand Site Analysis



### Contribution to stability



Histogram showing the distribution of sequence entropy ranks for the top 10% most destabilizing charged residues in proteins of varying sizes.

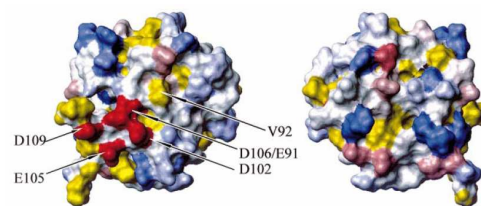
[Ecock01]

## Protein-Ligand Site Analysis



### Contribution to stability

Red = strongly destabilizing  
White = near-zero effect.  
Blue = strongly stabilizing  
Yellow = hydrophobic



$\Delta G_{elec}$  values of the residue side-chains for MTH538

[Ecock01]

## Protein-Ligand Site Analysis



### Residue properties:

- Amino acid type
- Surface accessibility
- Conservation
- Charge
- Hydrophobicity
- Secondary structure type
- Flexibility / Destabilization

### Surface/volume properties:

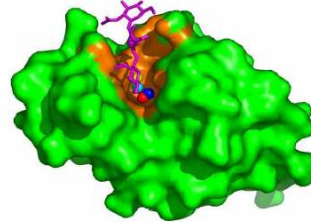
- Cavity size
- Cavity depth
- Cavity shape
- Surface curvature
- Electrostatic potential

Others

## Protein-Ligand Site Analysis



Active sites are usually found in surface cavities

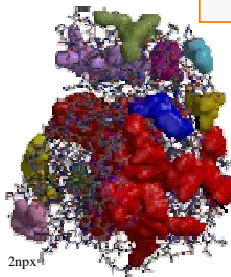


[Haang06]

## Protein-Ligand Site Analysis



Cavity size



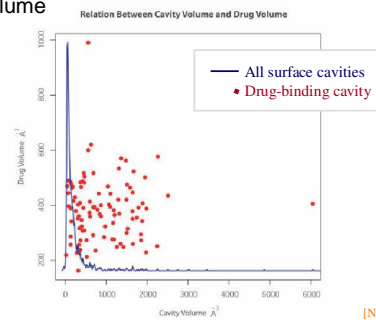
Ligand found in largest cleft in ~80% of proteins

[Laskowski96]

## Protein-Ligand Site Analysis



Cavity volume

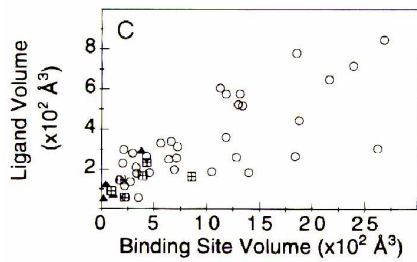


[Nayal06]

## Protein-Ligand Site Analysis



Cavity volume

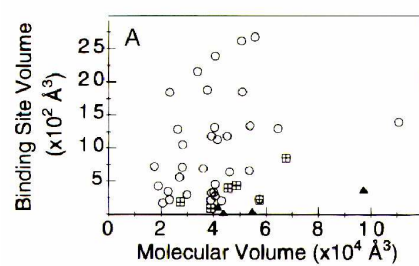


[Liang98]

## Protein-Ligand Site Analysis



Cavity volume

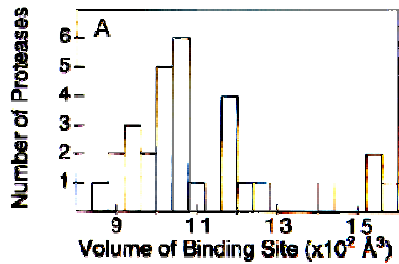


[Liang98]

### Protein-Ligand Site Analysis



Cavity volume

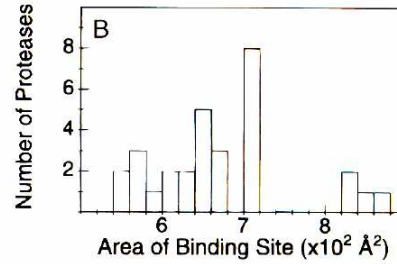


[Liang98]

### Protein-Ligand Site Analysis



Cavity surface area

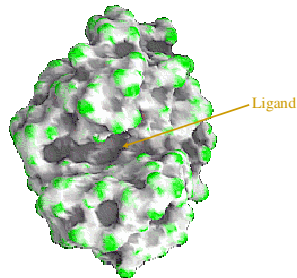


[Liang98]

### Protein-Ligand Site Analysis



Cavity surface curvature

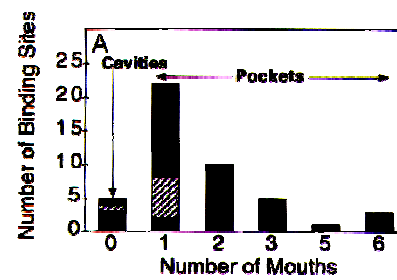


<http://honiglab.cpmc.columbia.edu/grasp/pictures.html>

### Protein-Ligand Site Analysis



Number of cavity openings

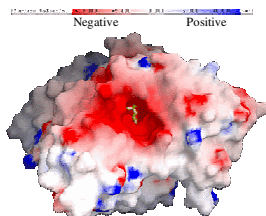


[Liang98]

### Protein-Ligand Site Analysis



Electrostatic potential



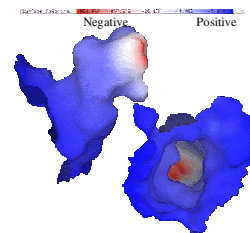
Acetyl choline esterase color coded by electrostatic potential.  
The negative charge in the pocket (red) corresponds to the positive charge on the ligand (acetyl choline)

<http://honiglab.cpmc.columbia.edu/grasp/pictures.html>

### Protein-Ligand Site Analysis



Electrostatic potential



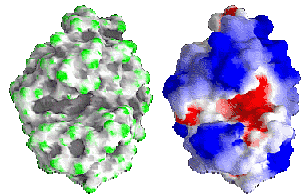
Acetyl choline esterase color coded by electrostatic potential.  
The negative charge in the pocket (red) corresponds to the positive charge on the ligand (acetyl choline)

<http://honiglab.cpmc.columbia.edu/grasp/pictures.html>

## Protein-Ligand Site Analysis



### Electrostatic potential



Lysozyme

Curvature

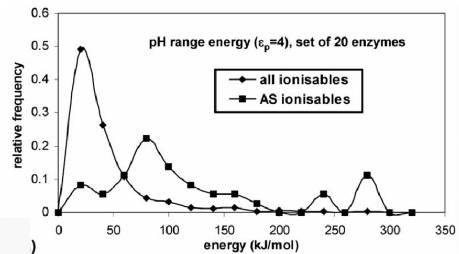
Electrostatic Potential

<http://honiqlab.epmc.columbia.edu/grasp/pictures.html>

## Protein-Ligand Site Analysis



### Electrostatic potential:



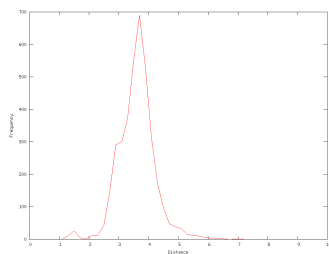
Relative frequencies of pH range energies for all and active site (AS) residues

[Bate04]

## Protein-Ligand Site Analysis



### Distance from protein surface



Distance from ligand atom to closest protein atom

## Protein-Ligand Site Summary



### Distributions of properties:

Surface cavity property	Category	Drug-binding cavities	Non-drug-binding cavities
Cavity rank <sup>a</sup>	Size	1.89 ± 2.07	8.88 ± 5.4
Number of residues <sup>b</sup>	Size	22.6 ± 14.3	7.31 ± 5.4
Number of atoms <sup>c</sup>	Size	85.0 ± 92.4	18.7 ± 21.2
Smallest moment of inertia <sup>d</sup>	Size/shape	$1.7 \times 10^4 \pm 2.5 \times 10^4$	$1.2 \times 10^3 \pm 8.3 \times 10^2$
Depth standard deviation <sup>e</sup>	Size/shape	$2.3 \pm 1.1 (\text{Å}^3)$	0.75 ± 0.45
Maximum depth <sup>f</sup>	Size/shape	10.5 ± 4.0 (Å)	4.75 ± 1.67
Average depth <sup>g</sup>	Size/shape	5.3 ± 1.9 (Å)	3.2 ± 0.7
Normalized smallest moment of inertia <sup>h</sup>	Shape	17.0 ± 11.7	3.8 ± 5.3
Proportion of cavity at depth between [6.5, 6.75] <sup>i</sup>	Shape	0.02 ± 0.013	0.003 ± 0.001
Largest moment of inertia <sup>j</sup>	Size/shape	$1.6 \times 10^4 \pm 8.4 \times 10^4$	$2.8 \times 10^3 \pm 1.6 \times 10^4$
Average side-chain residual entropy <sup>k</sup>	Rigidity	-0.41 ± 0.18 (kcal)	-0.55 ± 0.25
Average curvature <sup>l</sup>	Shape	-49.0 ± 8.3	-57.0 ± 13.1
Maximum curviness <sup>m</sup>	Shape	6.4 ± 2.9	4.0 ± 4.9
Maximum mean curvature <sup>n</sup>	Shape	5.3 ± 2.6	3.5 ± 4.2
Curviness < 0.5 <sup>o</sup>	Shape	0.35 ± 0.04	0.29 ± 0.08
Proportion of proline <sup>p</sup>	Amino acid composition	0.010 ± 0.029	0.04 ± 0.09
Proportion of cavity with log <sup>q</sup> between [-1, 0] <sup>r</sup>	Hydrophobicity	0.09 ± 0.07	0.15 ± 0.16
Side-chain residual entropy standard deviation <sup>s</sup>	Rigidity	0.43 ± 0.18 (kcal)	0.55 ± 0.17

[Nayal06]

## Protein Binding Site Types



### Site types:

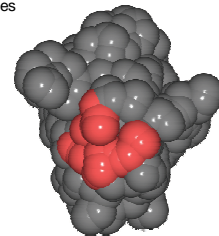
- Protein-ligand
- Protein-protein
- Protein-DNA
- etc.

## Protein-Protein Site Analysis



### Example study: [Boas & Altman, 2000]

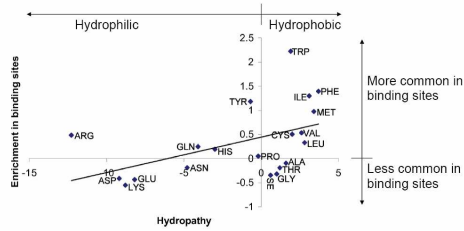
- $5.5 \times 10^5$  solvent accessible atoms in 4,800 chains
- $1.2 \times 10^5$  are in protein-protein binding sites
- $4.3 \times 10^5$  are non-binding sites



## Protein-Protein Site Analysis



### Hydrophobicity



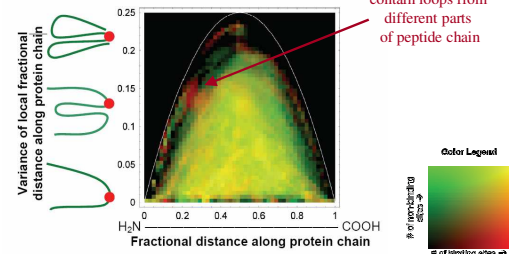
Hydrophobic residues are slightly more common in binding sites

[Boas00]

## Protein-Protein Site Analysis



### Primary structure proximity

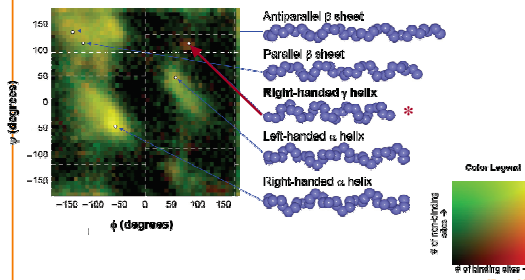


[Boas00]

## Protein-Protein Site Analysis



### Secondary structure

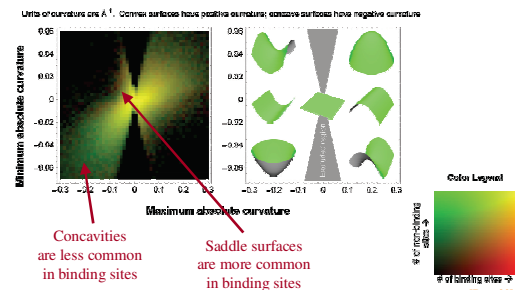


[Boas00]

## Protein-Protein Site Analysis



### Surface curvature

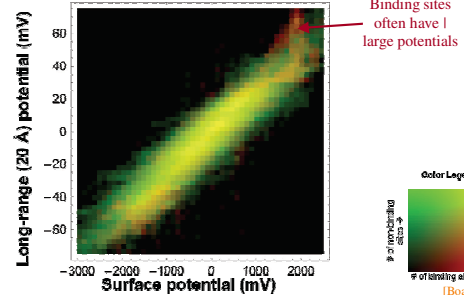


[Boas00]

## Protein-Protein Site Analysis



### Electrostatic potential



[Boas00]

## Protein Binding Site Types



### Site types:

- Protein-ligand
- Protein-protein
- Protein-DNA
- etc.



## Protein-DNA Site Analysis



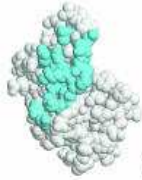
Example study: [Jones et al., 2003]

Data set:

- 427 protein-DNA complexes

Properties:

- Accessible surface area
- Electrostatics
- Amino acid type
- Hydrophobicity
- Conservation



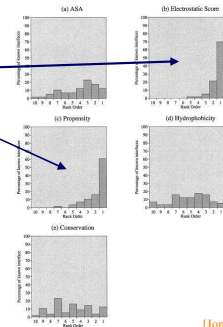
[Jones03]

## Protein-DNA Site Analysis



Most distinctive properties for DNA binding sites:

- Electrostatics
- Amino acid type



Imjo

[Jones03]

## Summary



Residue properties:

- Amino acid type
- Surface accessibility
- Conservation
- Charge
- Hydrophobicity
- Secondary structure type
- Flexibility / Destabilization

Surface/volume properties:

- Cavity size
- Cavity depth
- Cavity shape
- Surface curvature
- Electrostatic potential

Different properties are favored for different type of binding sites

Others

## Discussion



?

## References



- [Bartlett02] G.J. Bartlett, C.T. Porter, N. Borkakoti, J.M. Thornton, "Analysis of catalytic residues in enzyme active sites," *J. Mol. Biol.* 324, 1, 2002, pp. 105-121.
- [Bate04] P. Bate, J. Warwicker, "Enzyme/non-enzyme discrimination and prediction of enzyme active site location using charge-based methods," *J. Mol. Biol.* 340, 2, 2004, pp. 263-276.
- [Boas00] F.E. Boas and R. Altman, "Predicting protein binding sites", 2000, [http://www.stanford.edu/~boas/science/predicted\\_binding\\_sites/binding\\_site.pdf](http://www.stanford.edu/~boas/science/predicted_binding_sites/binding_site.pdf)
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- [Gutteridge03] A. Gutteridge, G.J. Bartlett, J.M. Thornton, "Using a neural network and spatial clustering to predict the location of active sites in enzymes," *J. Mol. Biol.* 330, 2003, pp. 719-734.
- [Jones03] Susan Jones, Hugh P. Shanahan, Helen M. Berman, and James M. Thornton, "Using electrostatic potentials to predict DNA-binding sites on DNA-binding proteins," *Nucleic Acids Res.* 2003 December 15, 31(24): 7189-7198.
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- [Young94] L. Young, R.L. Jernigan, D.G. Covell, "A role for surface hydrophobicity in protein-protein recognition," *Protein Sci.* 3, 5, 1994, pp. 717-29.