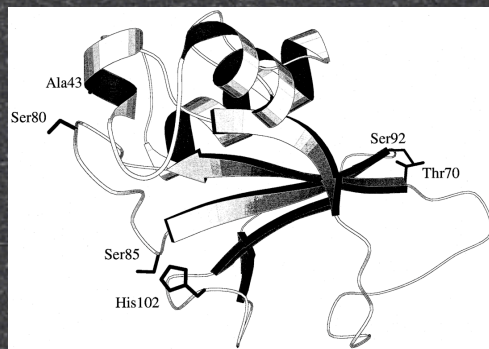


# **GeoFold: Topology-based protein unfolding pathways capture the effects of engineered disulfides on kinetic stability.**

Vibin Ramakrishnan<sup>1,2,5</sup>, Sai Praveen Srinivasan<sup>1,4</sup>, Saeed M Salem<sup>3,7</sup>, Suzanne J Matthews<sup>3,6</sup>, Wilfredo Colón<sup>1,4</sup>, Mohammed Zaki<sup>3</sup>, Christopher Bystroff<sup>1,2,3\*</sup>,

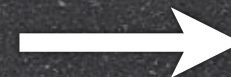
Proteins, in review



coordinates



unfolding  
pathway

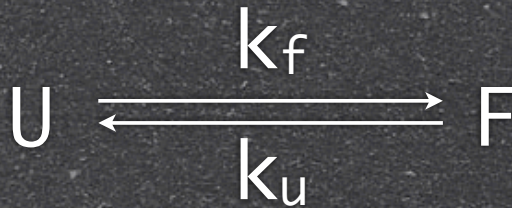


$k_u$

unfolding  
rate

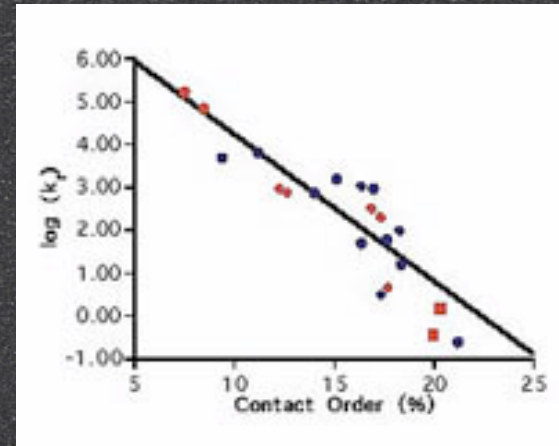


$k_f$  can be predicted from the structure.



$$K_{eq} = \frac{k_f}{k_u}$$

Stability is a function of both rates



Contact order:

$$CO = 100\% \times \langle |i-j| / L \rangle$$

Plaxco, K. W., Simons, K. T., and Baker, D. (1998)

Flory's equation predicts  $k_f$ .

$$\Delta S = -2.1 - 3/2(\ln n)$$

Decreased entropy of the unfolded state due to a disulfide link between residues separated by  $n$ .

Flory, P., Statistical mechanics of chain molecules. *Carl Hanser Verlag*, 1989 **1989**, 432





# $k_u$ is more difficult

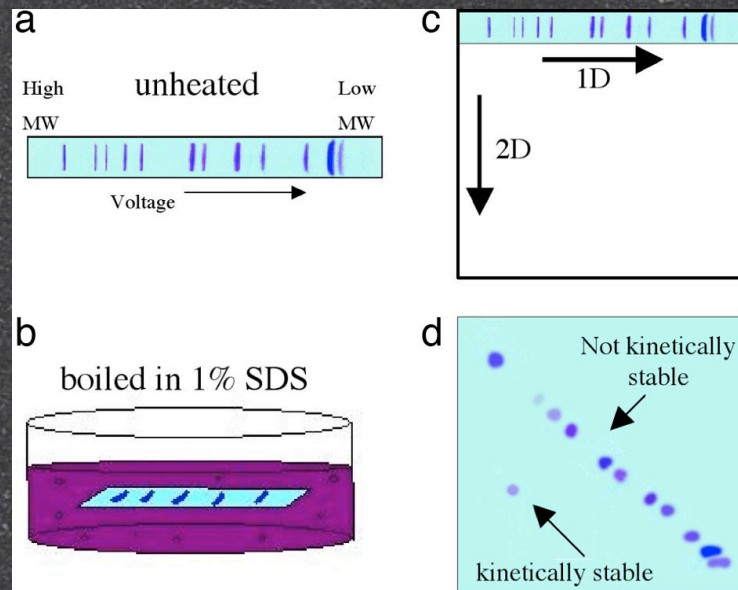
depends on...

- packing of core sidechains
- electrostatic potential
- number and arrangement of hydrogen bonds
- stiffness of the backbone
- topology

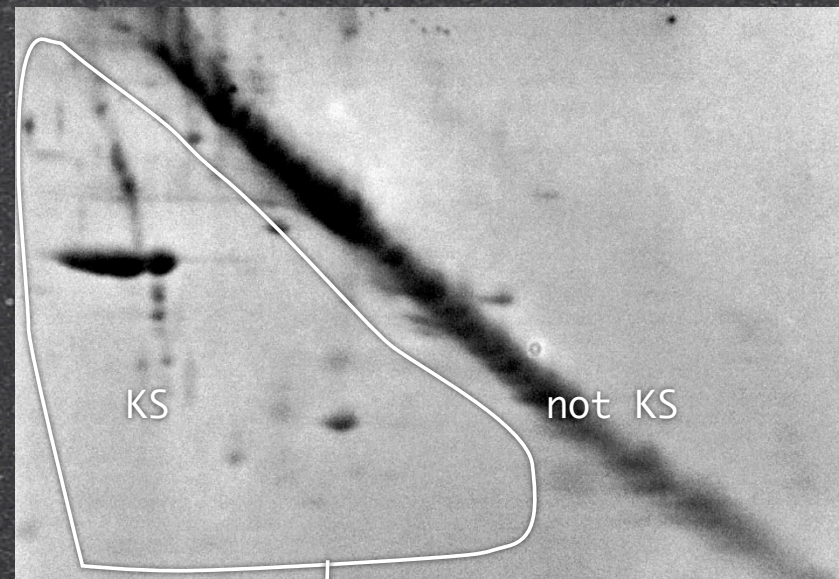




# Can we learn something about unfolding kinetics from extremely stable proteins?



...providing a basis for 2D gel separation of KS/non-KS

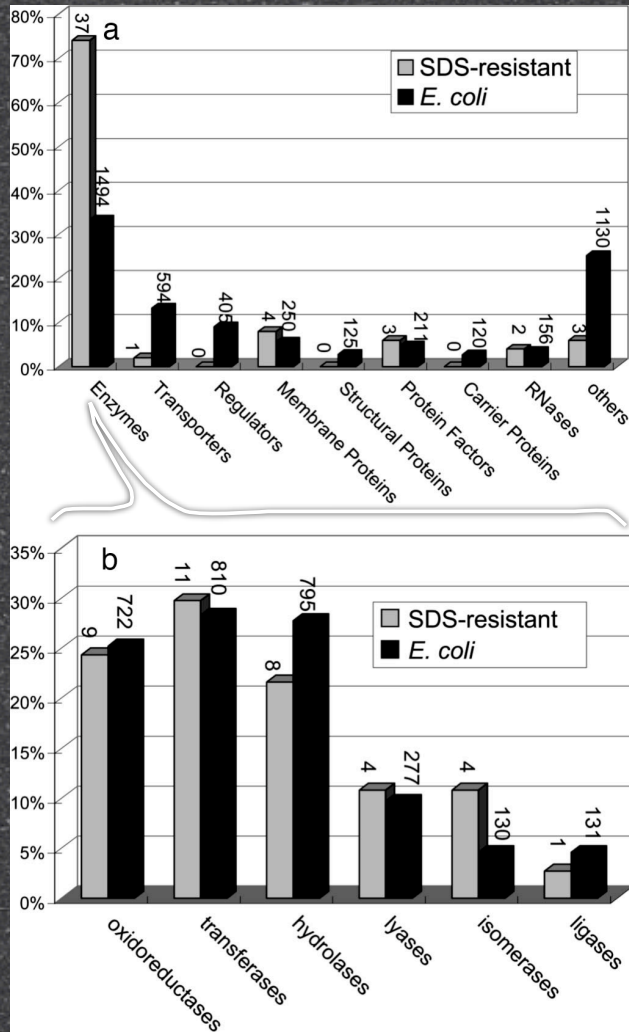


to mass spec sequencing

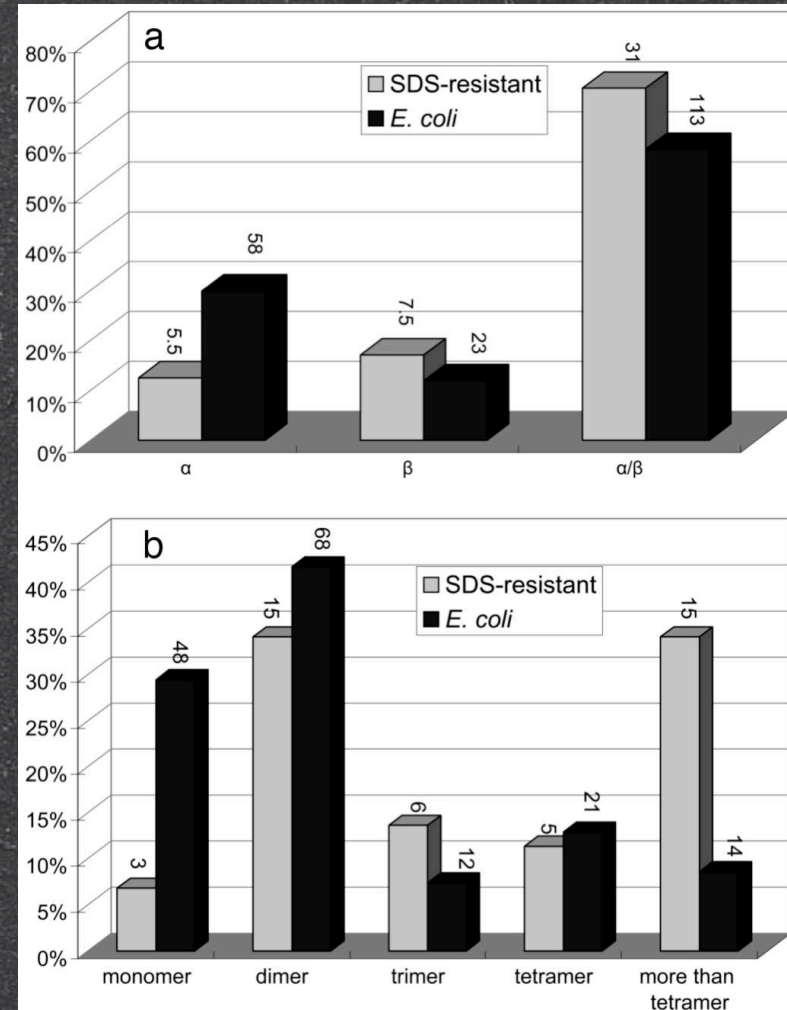
Xia, K., et al. (2007) Identifying the subproteome of kinetically stable proteins via diagonal 2D SDS/PAGE. *Proc Natl Acad Sci U S A*, 104(44): 17329-34.



Kinetically stable proteins tend to be ..



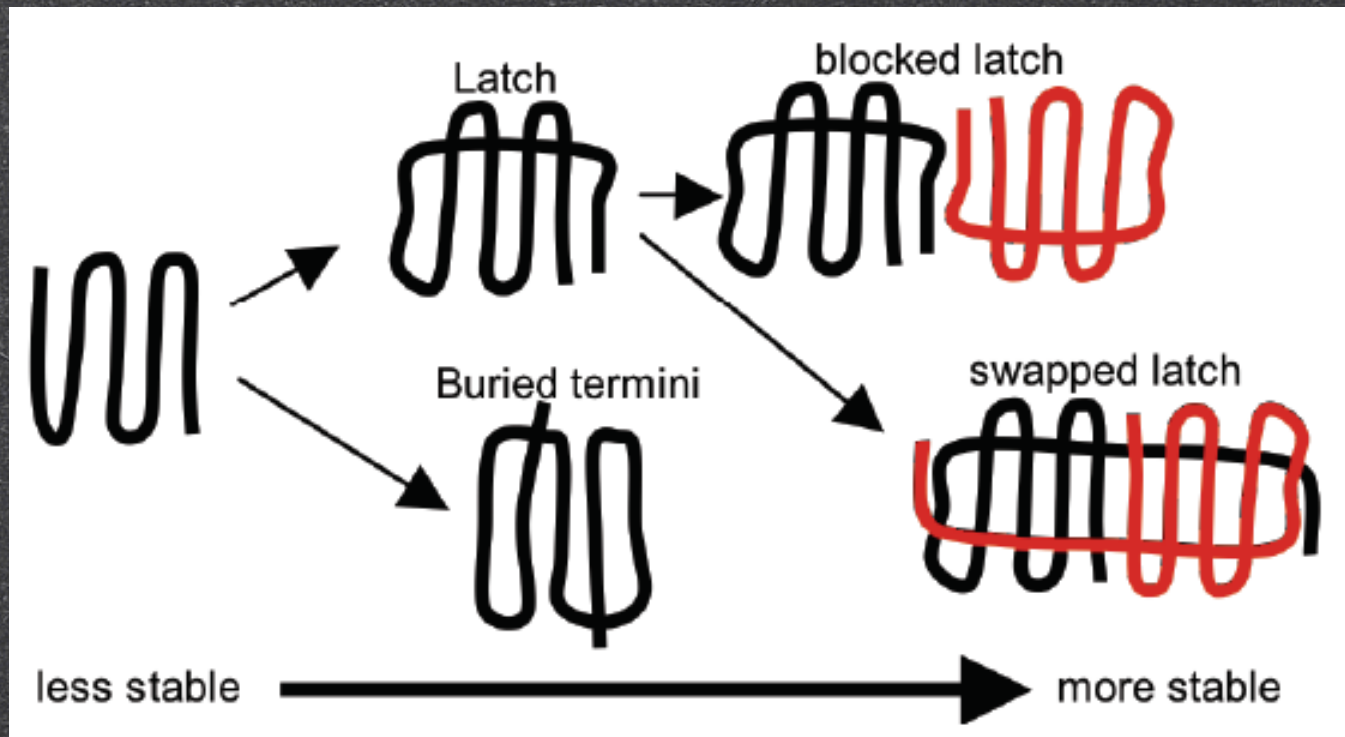
... enzymes, ...



... multimeric,  $\alpha/\beta$

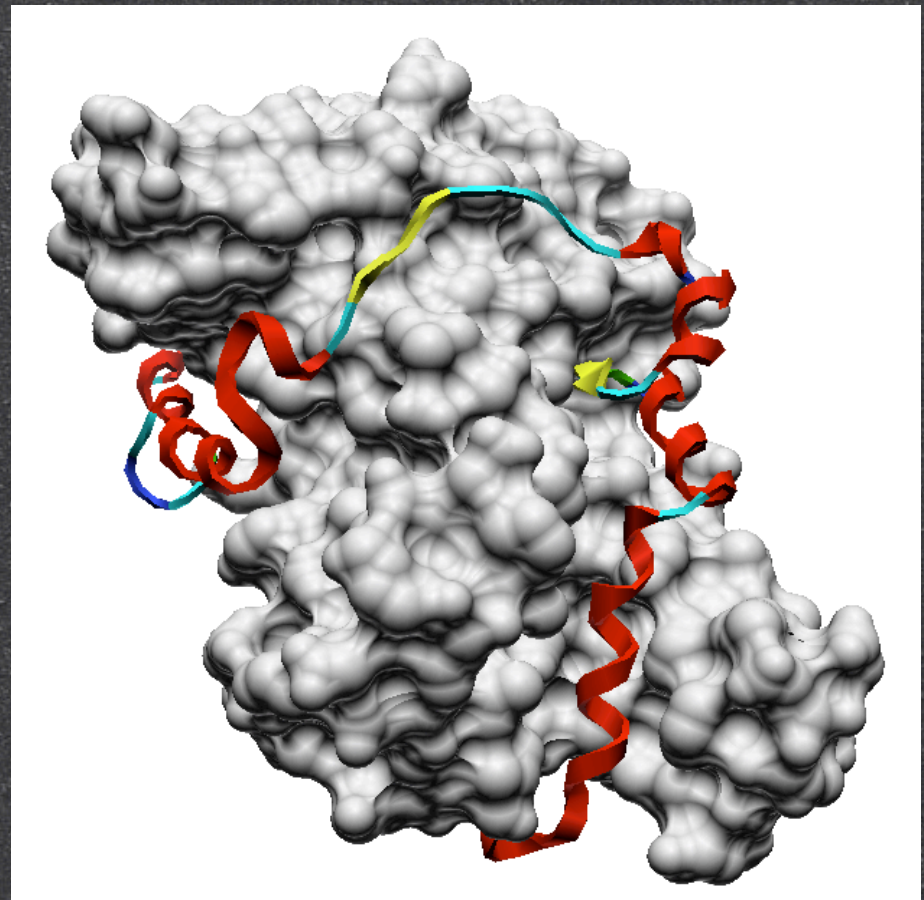
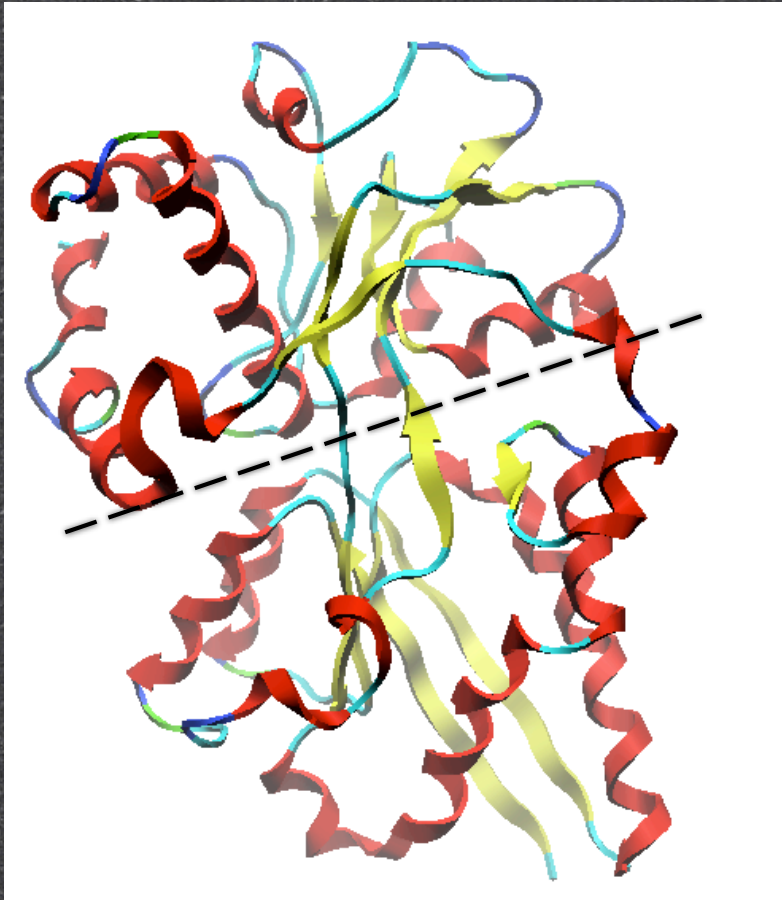


# Kinetically stable proteins have characteristic topologies





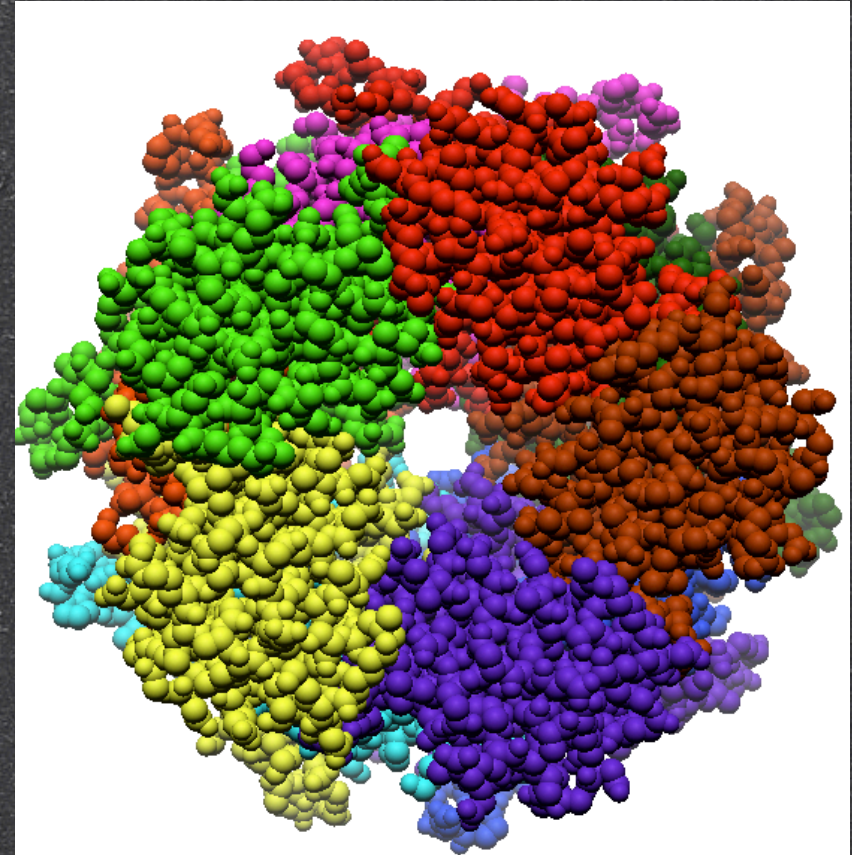
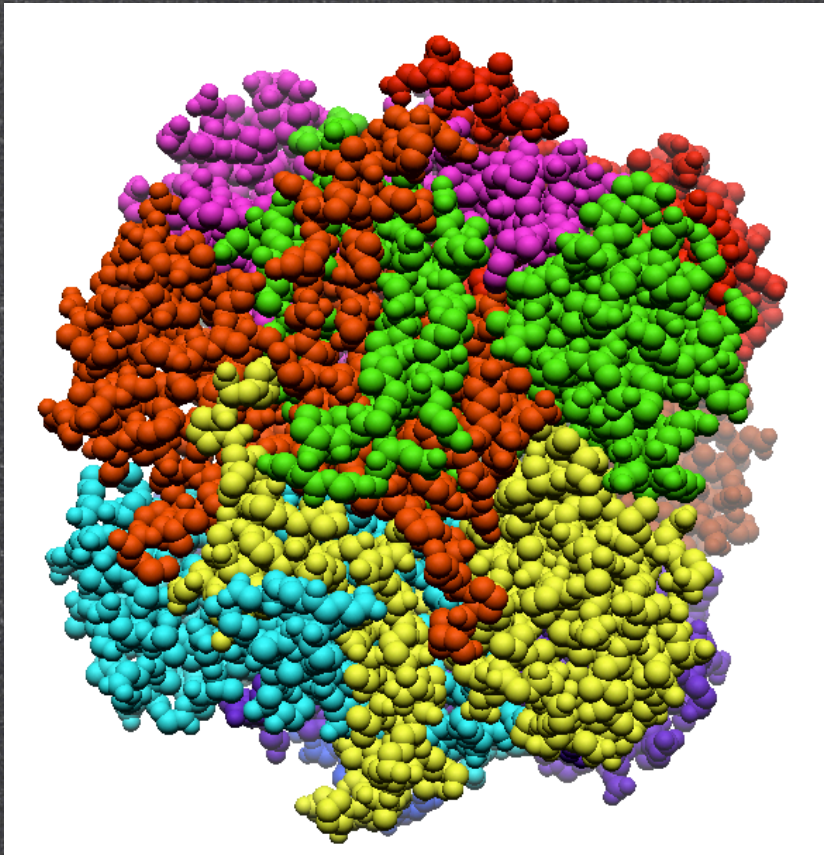
## A “latch”



1sbp: sulfate-binding protein.



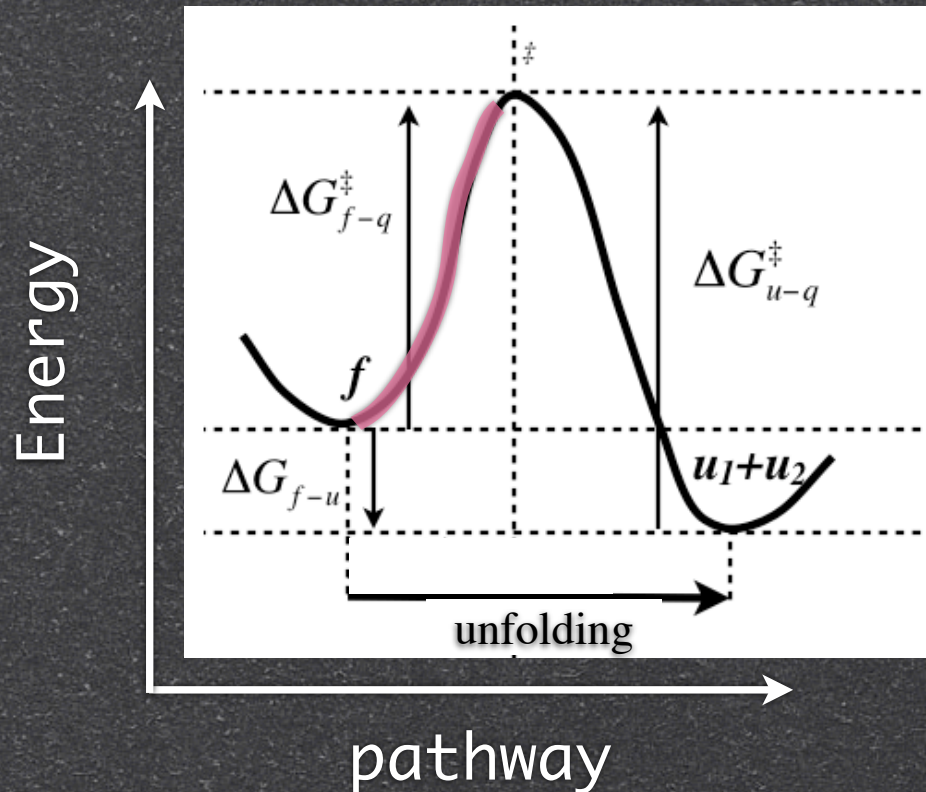
## Domain-swapping



1dwk: Cyanase.



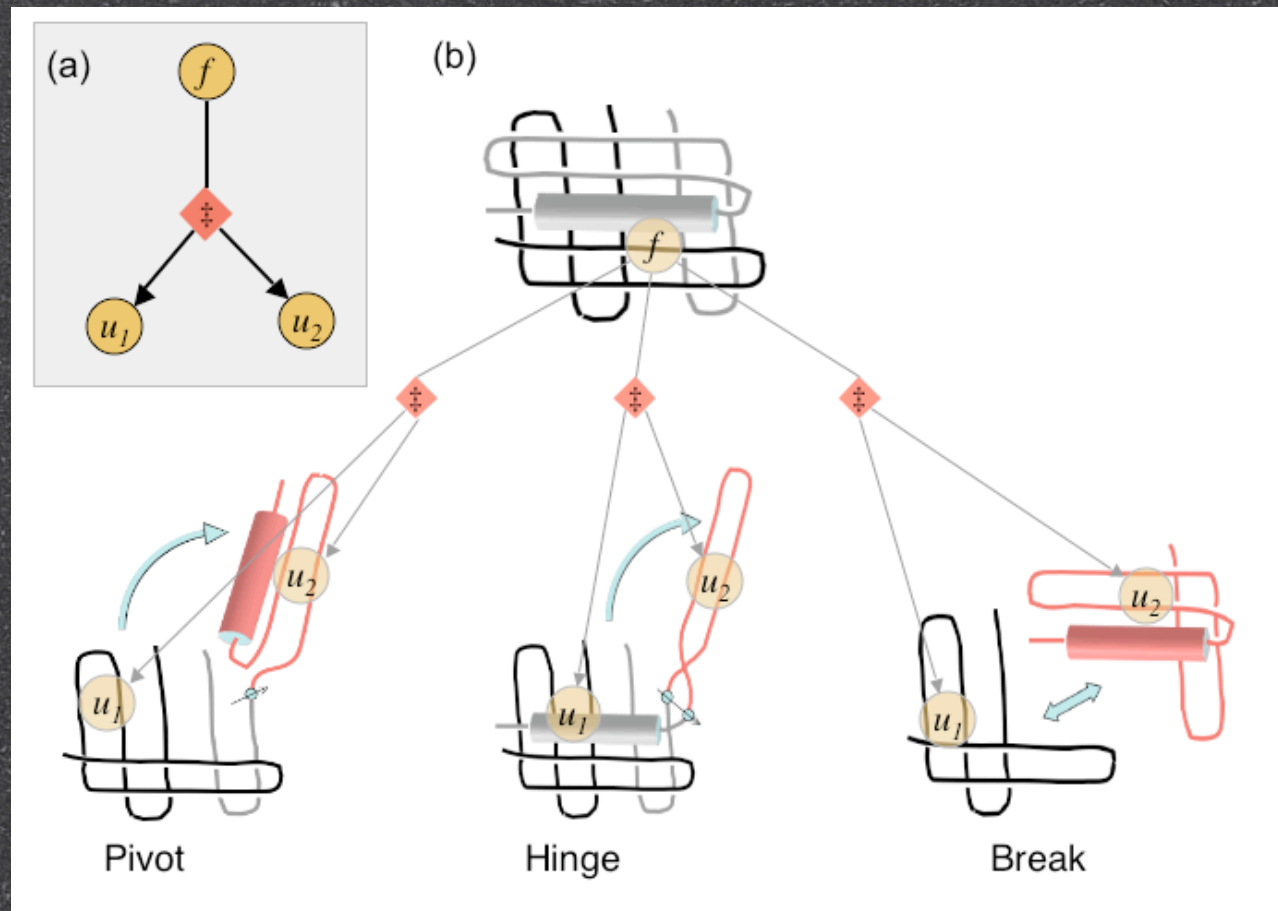
To predict kinetics, we need...



$$k = \zeta e^{-\frac{\Delta G_{f-q}^\ddagger}{RT}}$$



# Finding a pathway of “cuts”



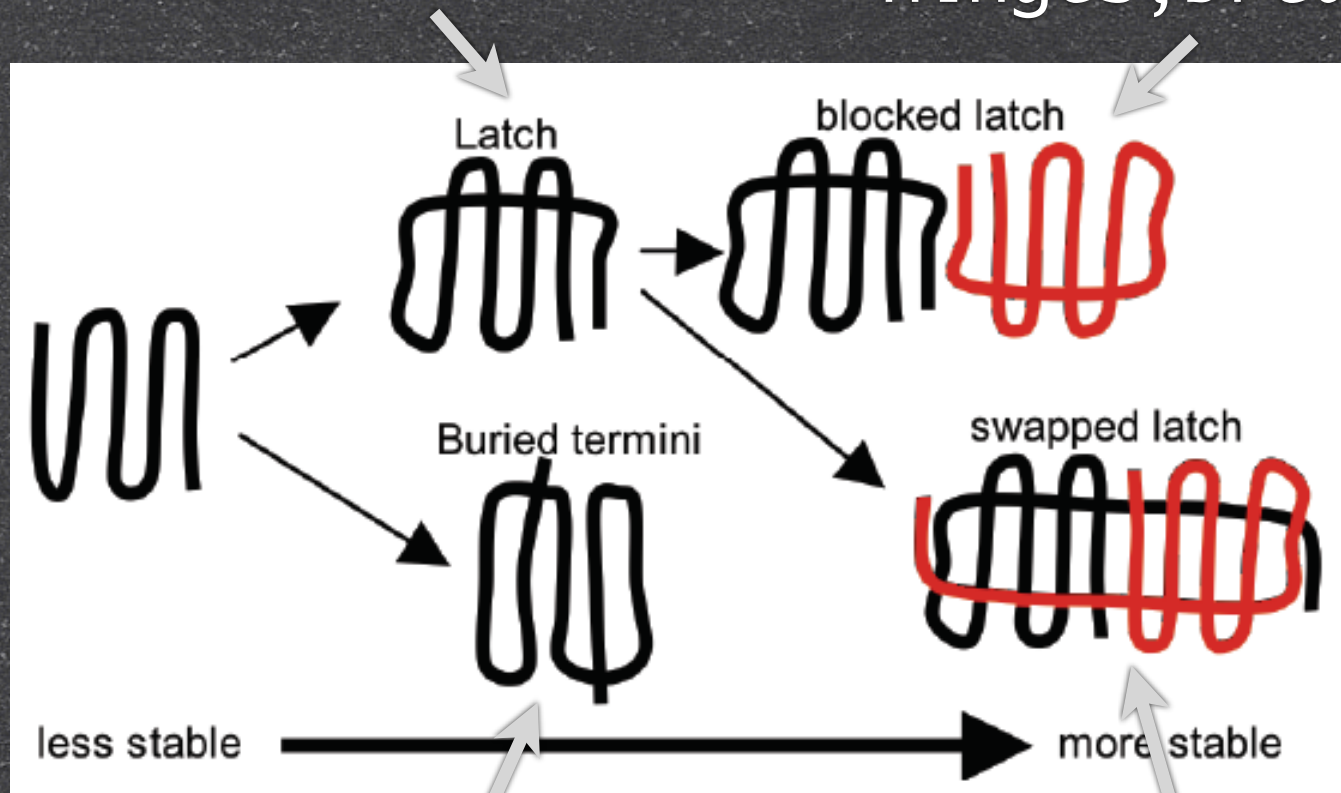
“cut” = {pivot | hinge | break}



# How cuts capture topological features

fewer pivots

no pivots, only  
hinges, breaks



fewer pivots

no breaks, few  
pivots, hinges

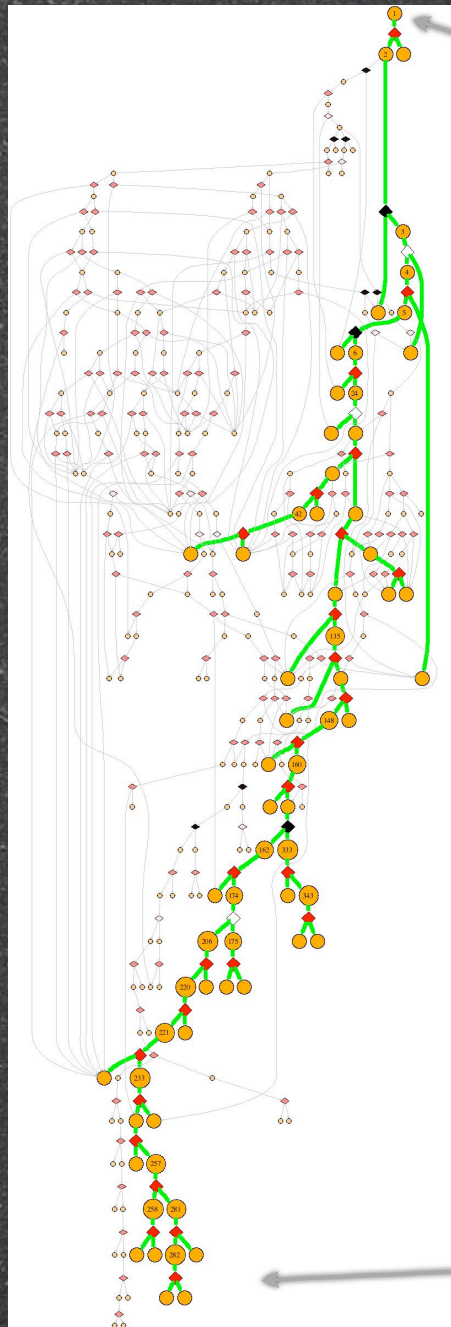


```

// -----Variables -----
// f,u1,u2 = {coordinate sets}. (nodes)
// cut = {f,u1,u2,cuttype}. (edges)
// DAG = directed acyclic graph, {nodes, edges}.
// cuttype = (break|pivot|hinge|melt).
// kf(cut),ku(cut) = rate constants for folding, unfolding.
// C(f), dC(f) = concentration of f, rate of change in concentration of f.
// t, dt, F0 = time, time step, protein concentration
// ----- Functions -----
// GetBreak, GetPivot, GetHinge find new geometrically possible cuts,
//           returning False when there are no more.
// Split(f,cuttype) returns two subsets of f using cuttype.
//           Split(f, melt) returns { $\emptyset$ ,  $\emptyset$ }
// Exists(f, DAG) returns True if f is already in DAG.
GeoFOLD:
1. f = entire protein
2. DAG =  $\emptyset$ 
3. GetCuts(f, DAG)
4. UnfoldSim(DAG)
GetCuts(f, DAG):
5. If (f ==  $\emptyset$ ) Return
6. If Exists(f, DAG) Return
7. while (cuttype  $\neq$  melt) {
8.   If (GetBreak(f)) {cuttype = break}
9.   Elseif (GetPivot(f)) {cuttype = pivot}
10.  Elseif (GetHinge(f)) {cuttype = hinge}
11.  Else {cuttype = melt}
12.  {u1, u2} = Split(f,cuttype)
13.  DAG = DAG  $\cup$  {f, u1, u2, cuttype}
14.  GetCuts(u1, DAG)
15.  GetCuts(u2, DAG)
16. }
UnfoldSim(DAG):
17. C(1)=F0
18. For All cut  $\in$  DAG {calculate kf(cut) and ku(cut)}
19. While Not converged {
20.   t += dt
21.   For All f { dC(f) = 0 }
22.   For All cut  $\in$  DAG {
23.     dC(f) = dC(f) - C(f)*ku(cut) + C(u1)*C(u2)*kf(cut)
24.     dC(u1) = dC(u1) + C(f)*ku(cut) - C(u1)*C(u2)*kf(cut)
25.     dC(u2) = dC(u2) + C(f)*ku(cut) - C(u1)*C(u2)*kf(cut)
26.   }
27.   For All f { C(f) = C(f) + dC(f)*dt }
28.   Plot t, C
29.   If (All |dC| < VerySmall) Then converged
30. }

```



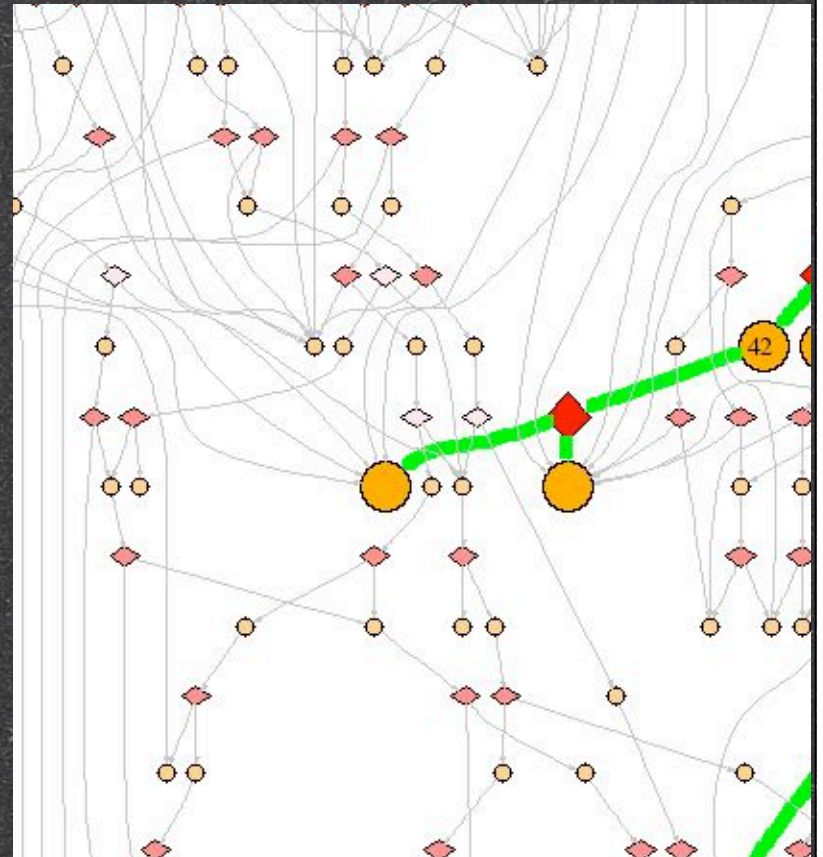


Native state

An unfolding pathway = A directed acyclic graph with bifurcating edges.

Intermediates

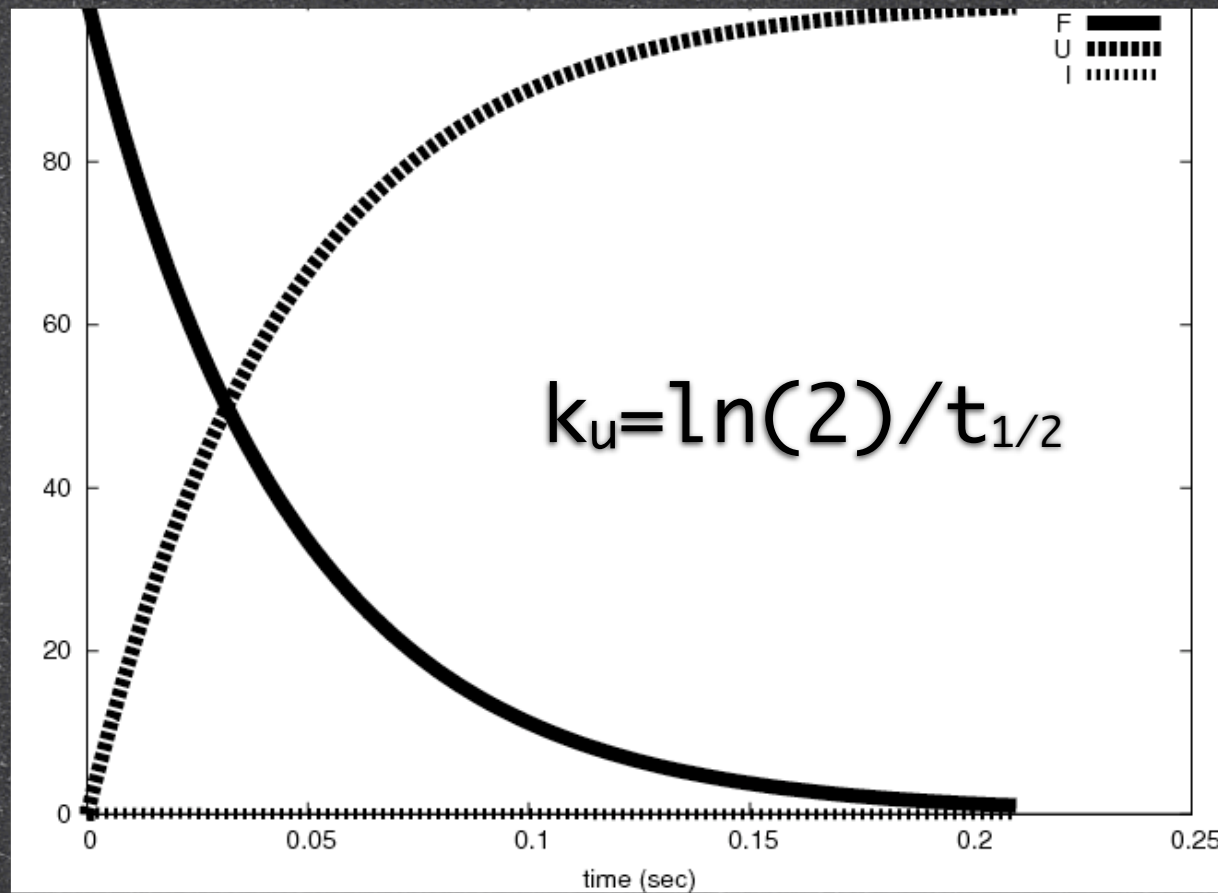
unfolded





[www.bioinfo.rpi.edu/geofold](http://www.bioinfo.rpi.edu/geofold)

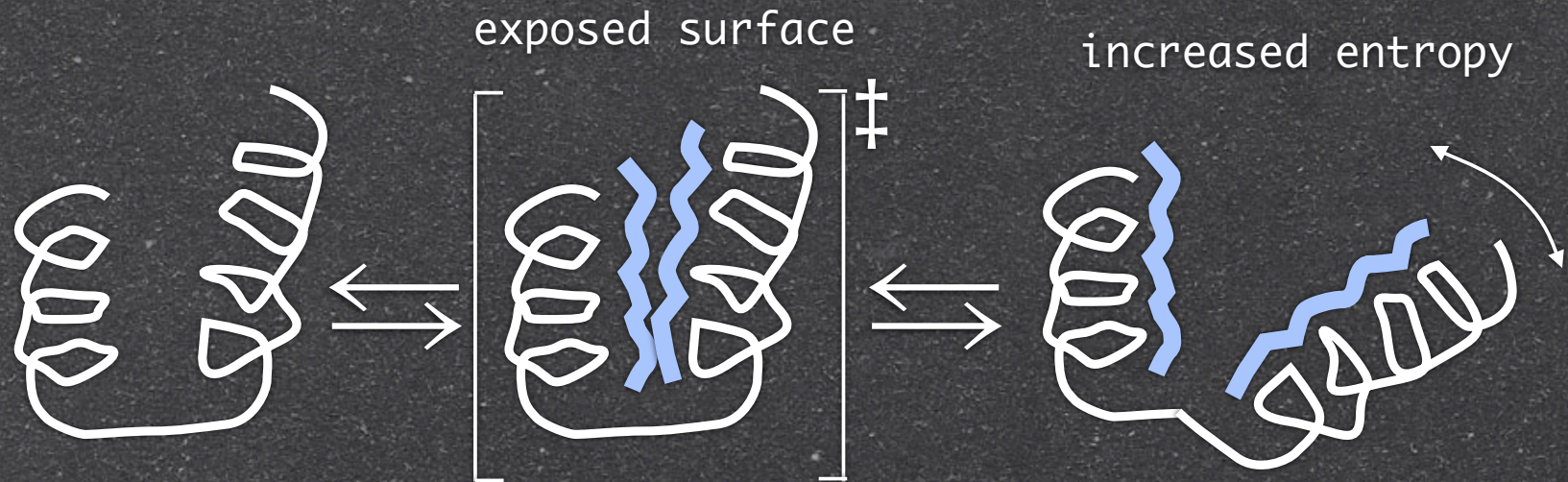
concentration



time



# Energy terms



$$\Delta G_{\text{solv}} = \omega \Delta S_{\text{AS}}$$

surface  
tension

change in  
surface area

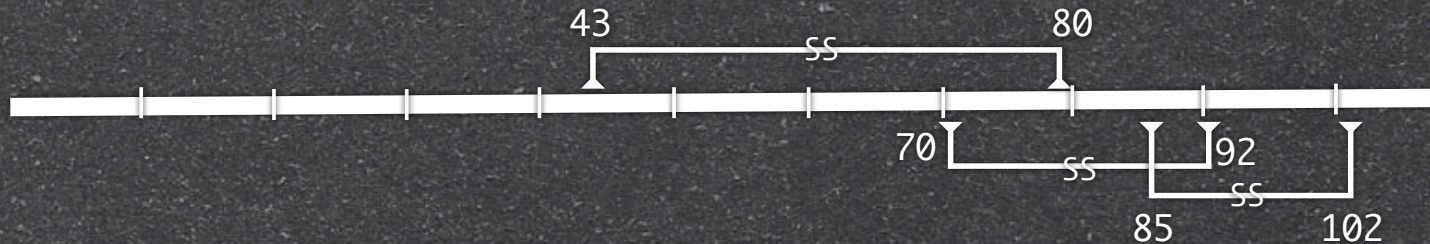
other terms

Hydrogen bonding	backbone entropy
Buried cavities	sidechain entropy
Electrostatic	

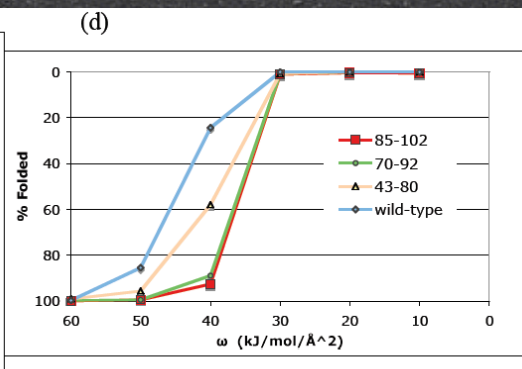
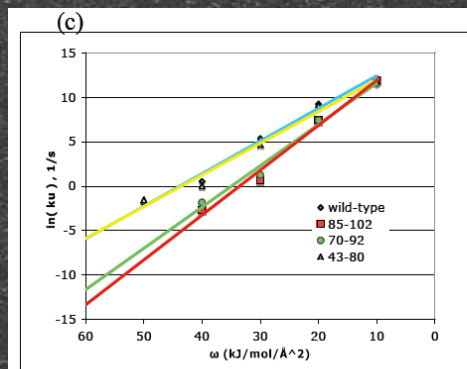


# Barnase

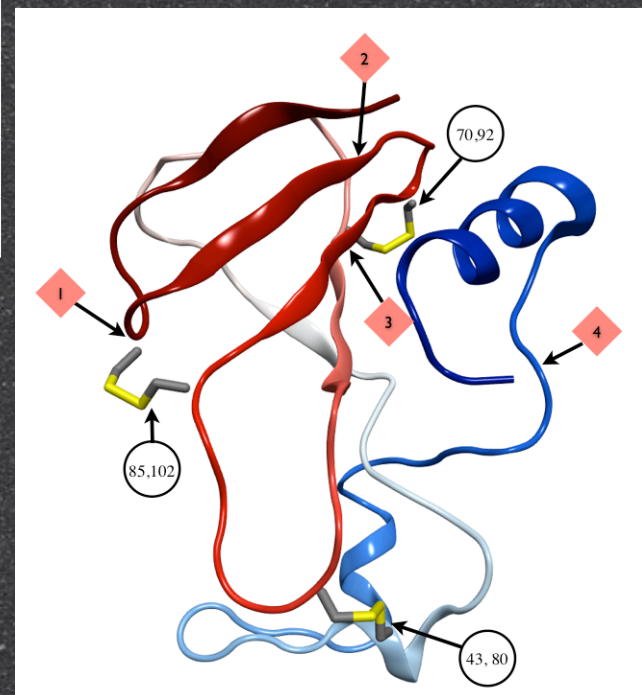
Clarke, J.; Fersht, A. R., Engineered disulfide bonds as probes of the folding pathway of barnase: Increasing the stability of proteins against the rate of denaturation. *Biochemistry* **1993**, 32 (16), 4322-4329.



Disulfide mutant	Result predicted by Flory's equation. $\Delta S = -2.1 - 3/2(\ln n)$	Experimental result	GeoFold result
43-80	most stabilized	least	least
70-92	stabilized		
85-102	least stabilized	most	most



Simulated kinetics

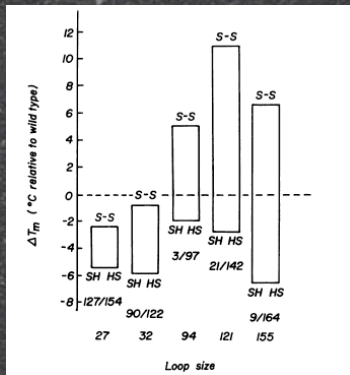
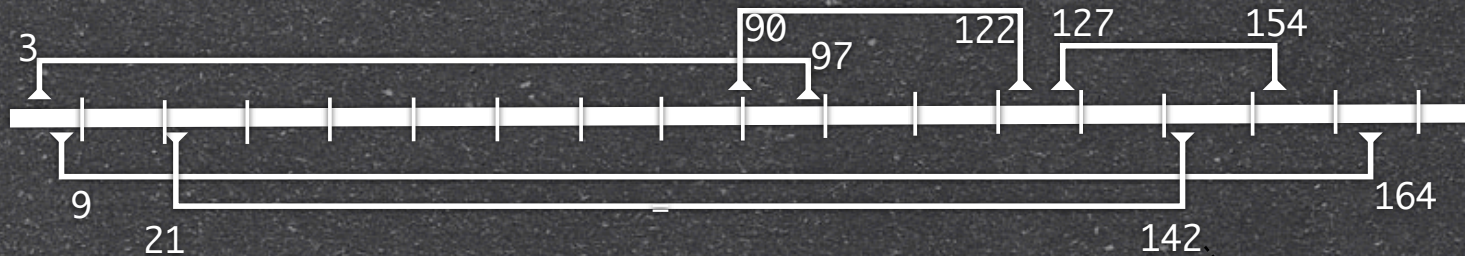


Simulated pathway: C-term first

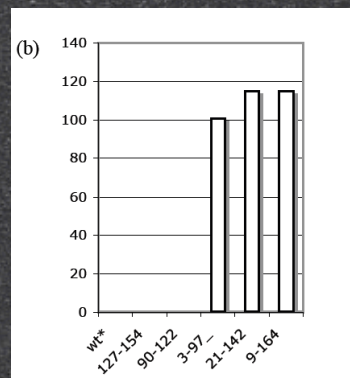


# Lysozyme

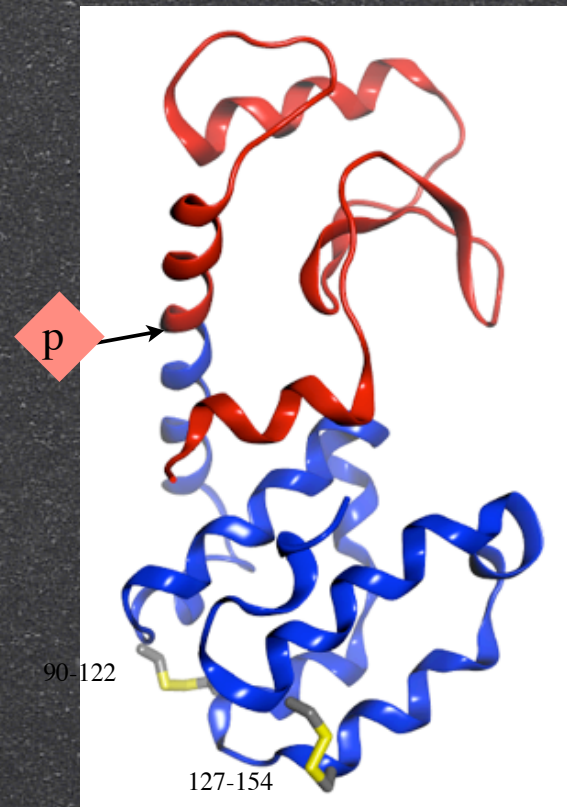
Matsumura, M.; Becktel, W. J.; Levitt, M.; Matthews, B. W., Stabilization of phage T4 lysozyme by engineered disulfide bonds. *PNAS* **1989**, 86 (17), 6562.



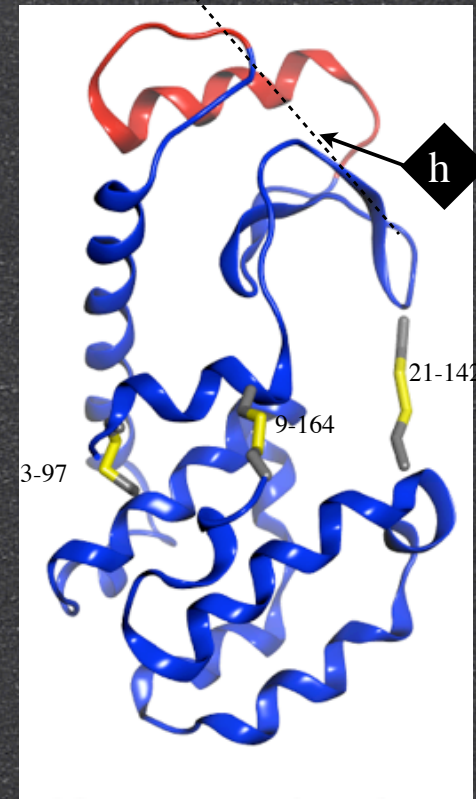
experimental



simulated



SS in helix domain  
allow wt pathway



SS across domains  
block wt pathway

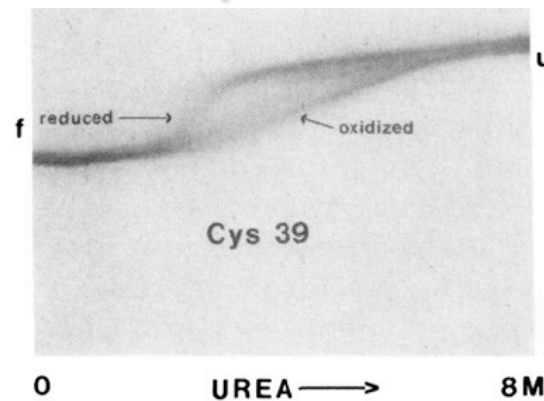


# DHFR

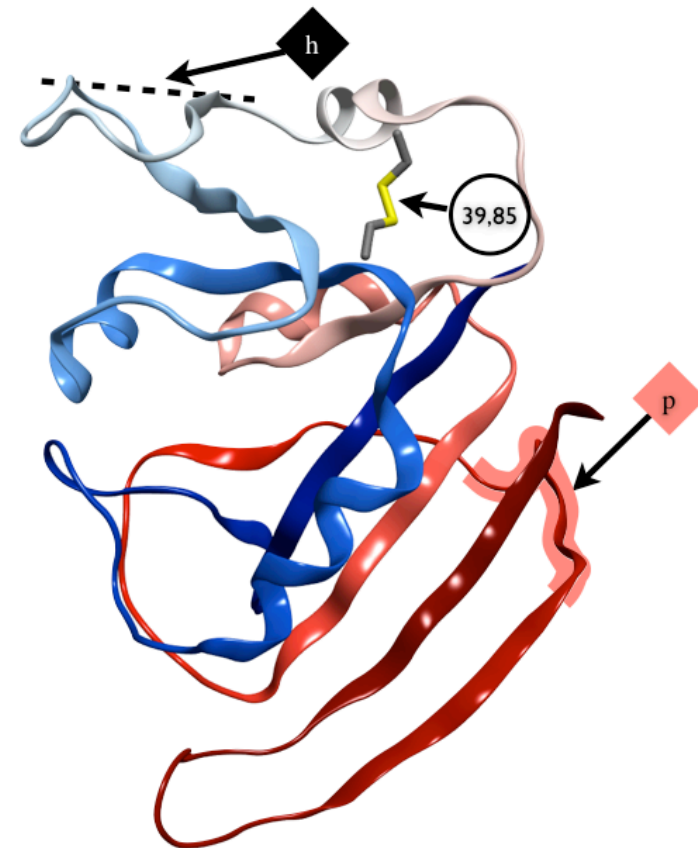
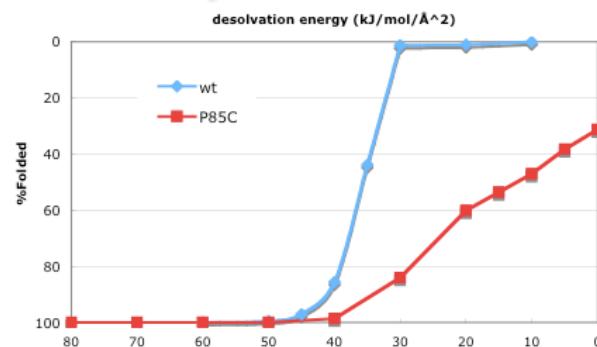
Villafranca, J. E.; Howell, E. E.; Oatley, S. J.; Xuong, N. H.; Kraut, J., An engineered disulfide bond in dihydrofolate reductase. *Biochemistry* **1987**, *26* (8), 2182-2189.

low denaturant pathway.  
middle hinges first

## Experimental equilibrium unfolding



## Simulated equilibrium unfolding



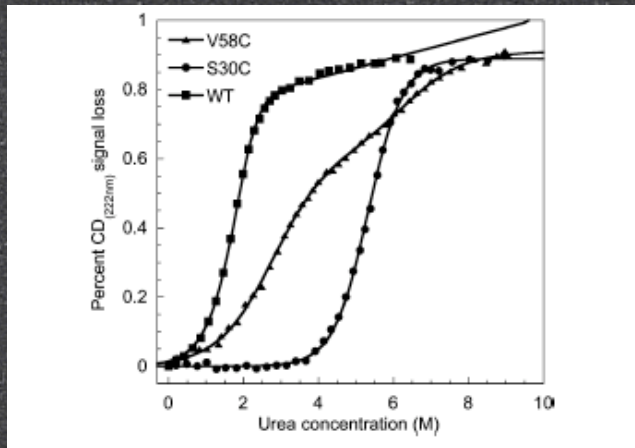
high denaturant pathway.  
end pivots first.



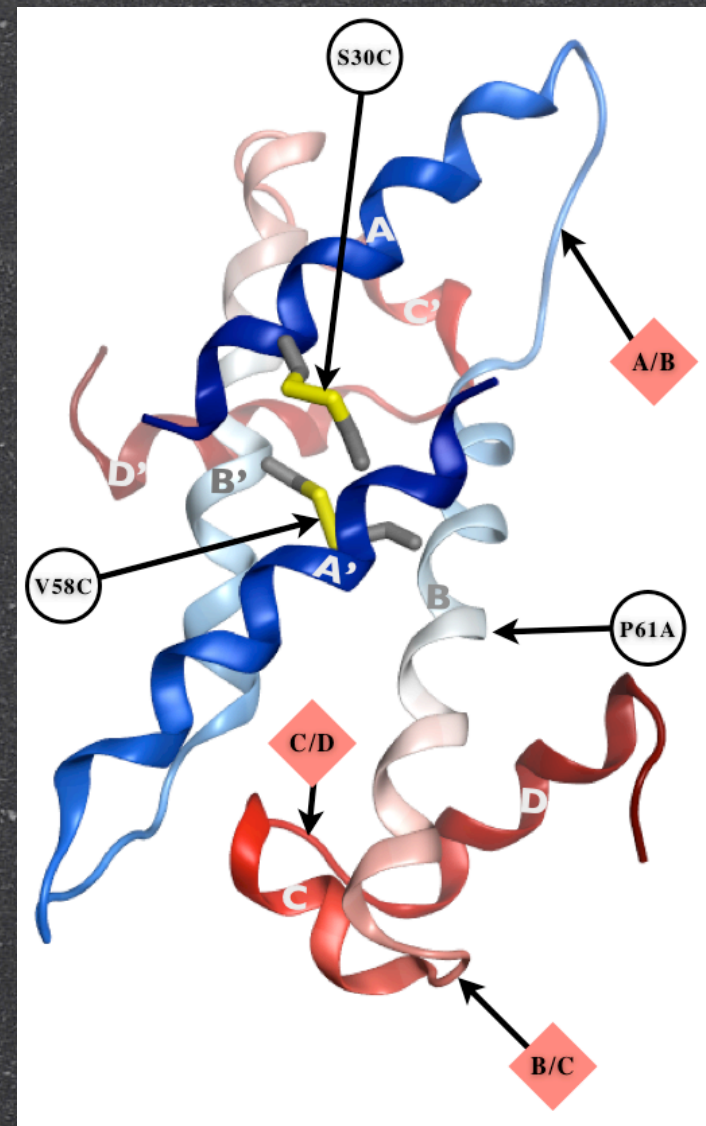
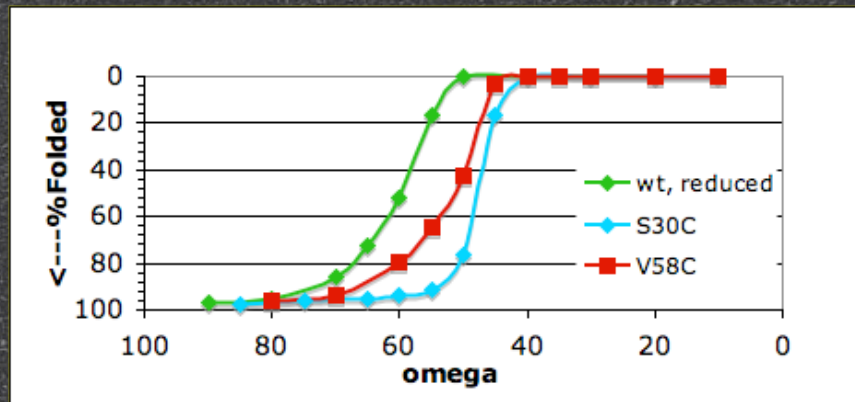
# FIS

Meinhold, D.; Beach, M.; Shao, Y.; Osuna, R.; Colón, W., The location of an engineered inter-subunit disulfide bond in factor for inversion stimulation (FIS) affects the denaturation pathway and cooperativity. *Biochemistry* **2006**, *45* (32), 9767-9777.

## Experimental equilibrium unfolding



## Simulated equilibrium unfolding

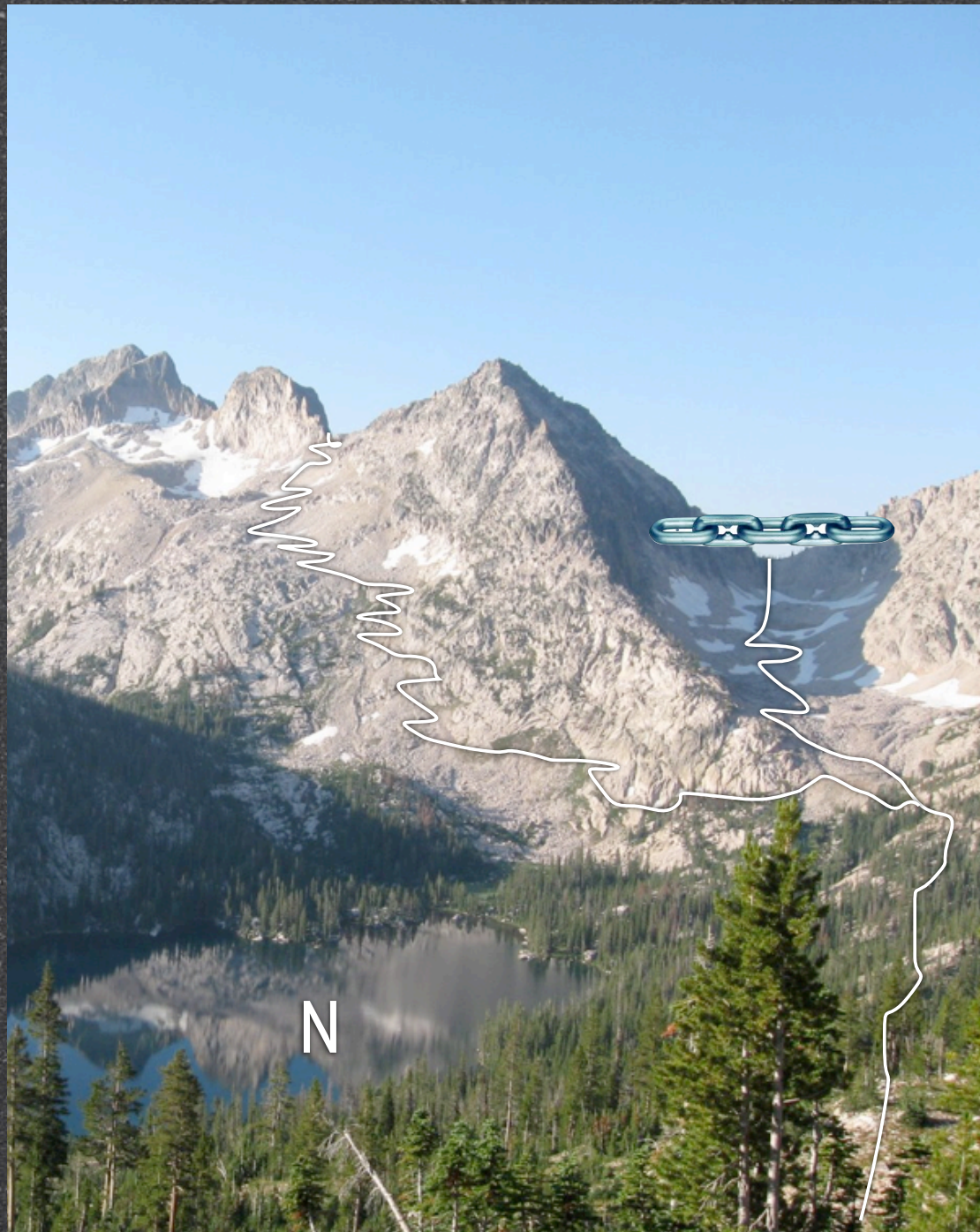




# How to stabilize a protein using disulfides

- Find the transition state of the most energetically favorable unfolding pathway.
- Make a SS bond to block that pathway.



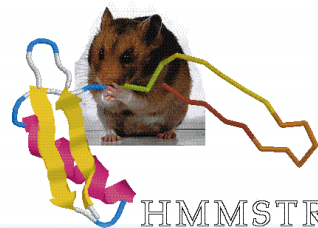






# Bystroff Lab

[www.bioinfo.rpi.edu/bystrc/](http://www.bioinfo.rpi.edu/bystrc/)



Rob Shaffer

Frank Teets

Christian Schenkelberg

Derek Pltman

Nick Talbot

Saeed Salem

Vibin Ramakrishnan

Suzanne Matthews

Ke Xia

Yao-ming Huang

me

Think Globally,  
Act Locally.



‡ Mohammed Zaki (RPI-Comp.Sci.)

\* Jon Dordick (RPI-Chem Eng.)

f Wilfredo Colón (RPI-Chemistry)