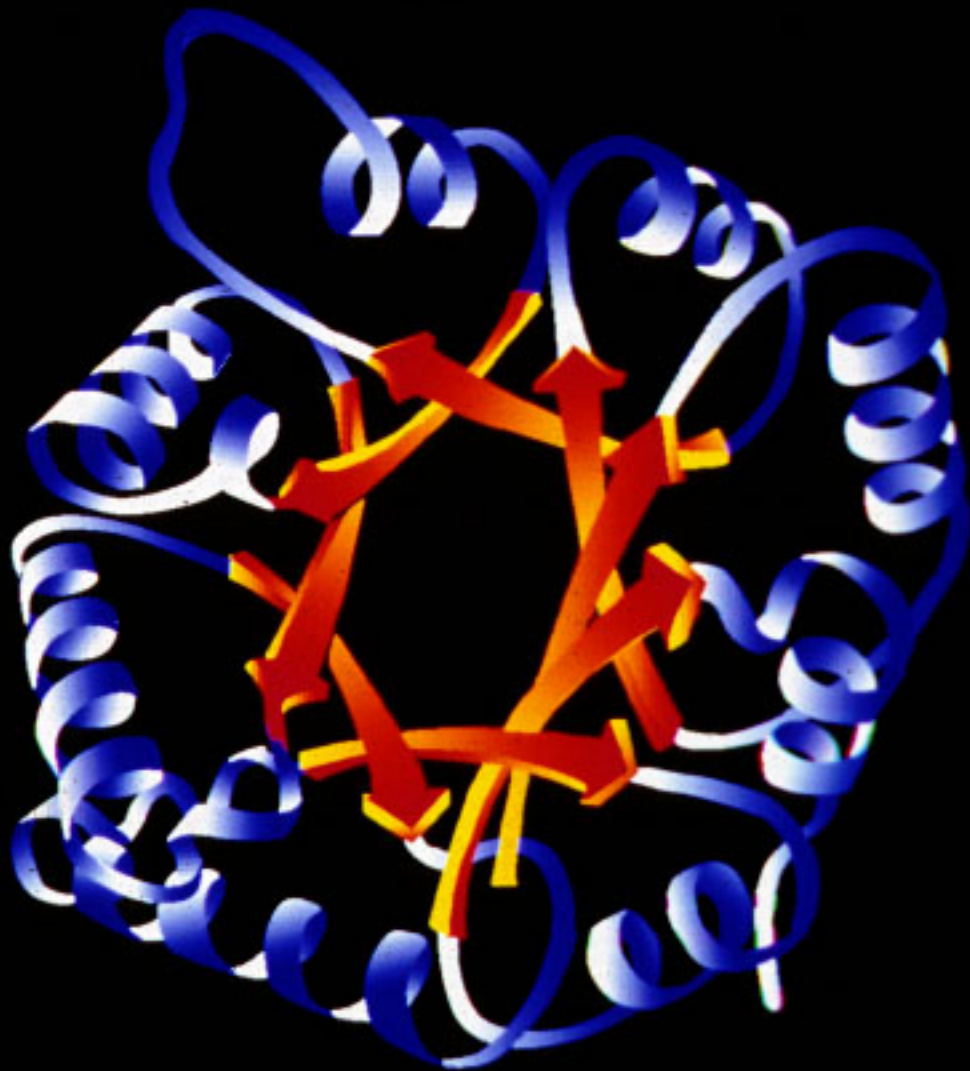
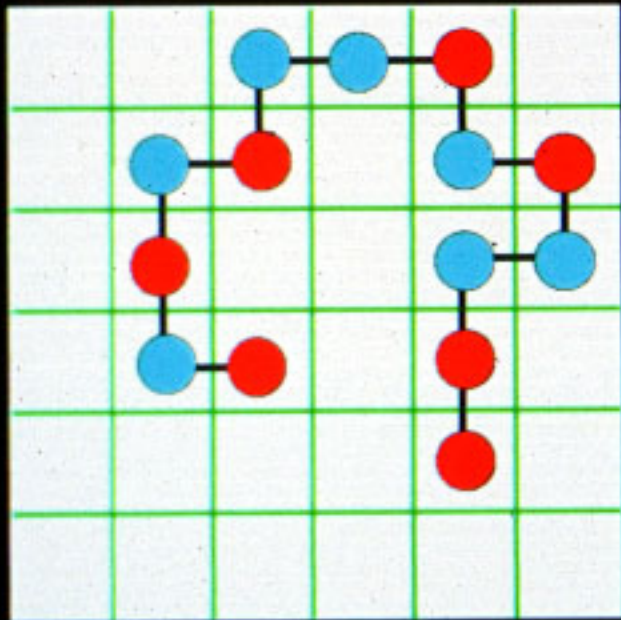


**folding**

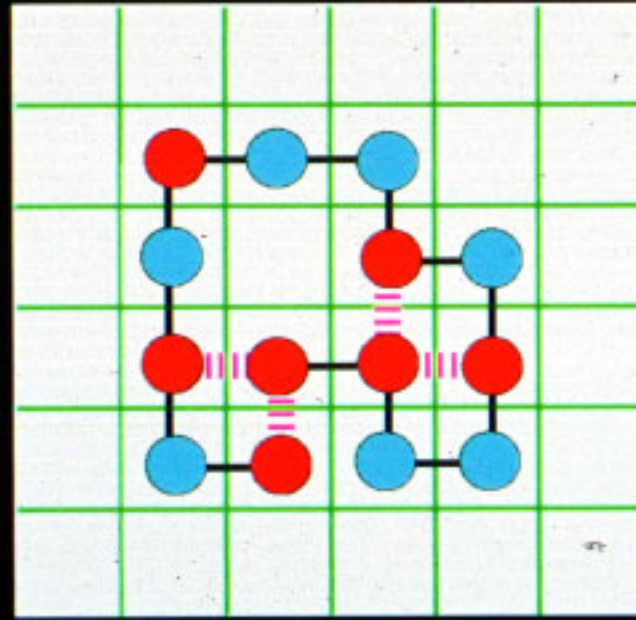


# HP is Simplest Folding Code

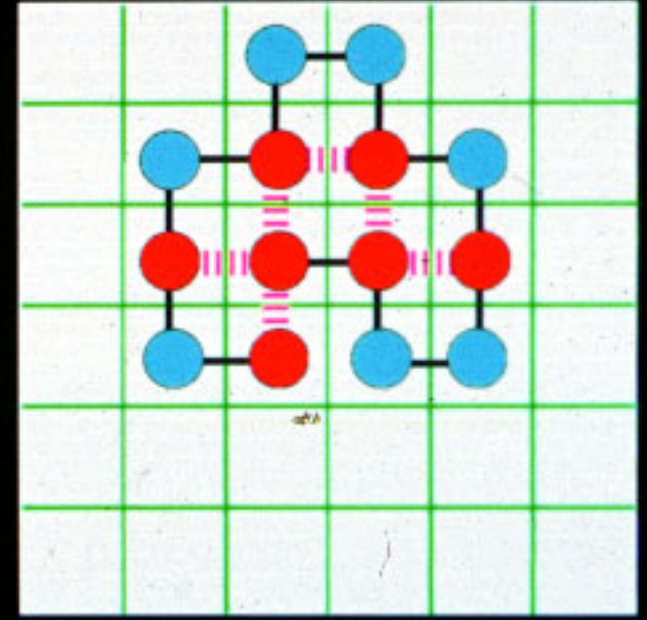
$h = \#HH$  contacts



$h=0$



$h=4$



$h=6$

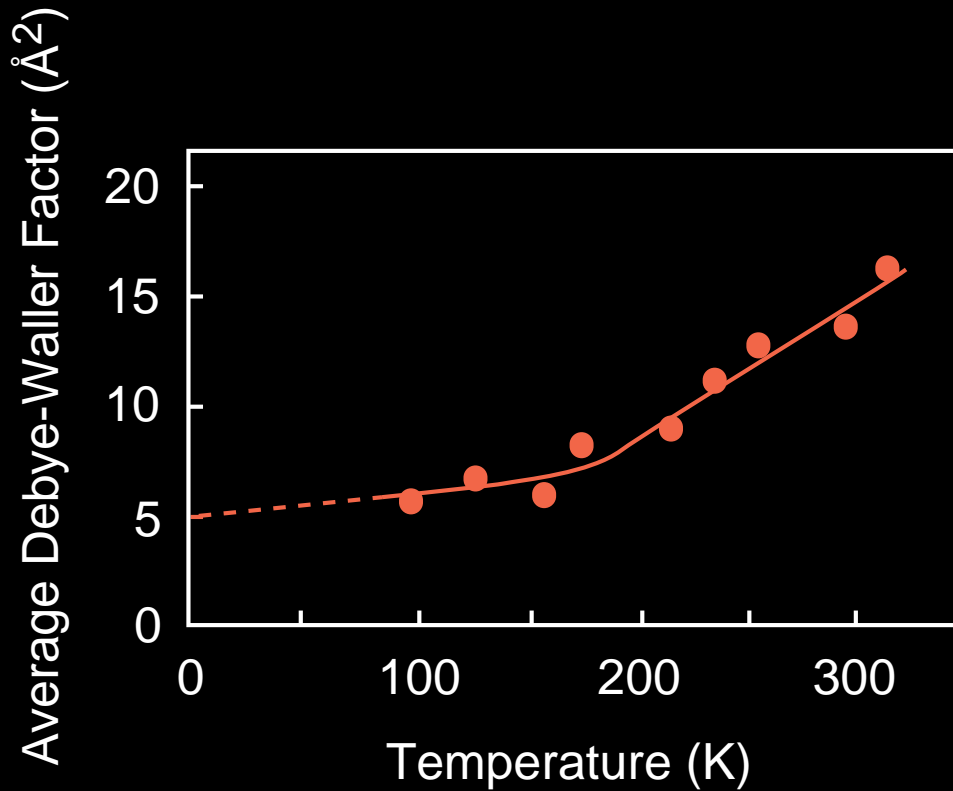
GKLNLLNDFEDLINGPRSGNVQQLLKKLQQMIQR  
GDLHNLINKLDDVMQGPRSGKMHDLIDDLHLLNR  
GKLDHFMEEMNKFLKGPRSGELHDVHLKHHVMDR  
GKLEHVMEFNDMVEGPRSGKLKEFIQEMQHLLQR  
GQLEEIMKNLENLLQGPRSGDIQNLIKEMQNFLQR  
GNFHEVVKELNKLMMGPRSGVVKQFMNQFQQMFKR  
GDLDKFLKELEEIYQQLLQQLKNLIER  
GQLKHLIEQLQQNLVEQLQNILHR  
GKFQQFFQOLEHPRSGFLKNIDQIINR  
GKLGQMMDEIHQMPRSGLMNHFNQVLER  
GHVENIKKLIQIEHVVR  
GKMDPRGPRSGVVKQFMNQFQQMFKR  
GELGPRSGHPRSGVVKQFMNQFQQMFKR  
GKIPRSGPRSGVVKQFMNQFQQMFKR  
GKLEPRSGPRSGVVKQFMNQFQQMFQR  
GELGPRSGPRSGVVKQFMNQFQQMFQR  
GOLDPRSGPRSGVVKQFMNQFQQMFQR  
GKLEELMQRQIMR  
GQMDEVLQEMQNVFEEMQNLIHR  
GNMENLLEQLEEVHDFDKMLNR  
GELEELFKEIEDILQEIEDLFNR  
GELDHFLKQLKELQIVHHIQHLFQR  
GEIKQIIDEMDQLLEHHLIQKFEHLIHR  
GKLDQLLEEVNDILTGPRSGQLHELLQDMHHLVQR  
GDMQKLLNDVKEILNGPRSGDFQNLLHQIHNVLDR  
GELHNFLHNLEHLLHGPRSGNVQKLVQDVQHLLFNR  
GKLQEMMKEFQQVLDGPRSGNIKEIFHHLEELVHR  
GHMQNIFKNLHKFLQGPRSGQVHQIFEKLHKFFHR

**S. Kamtekar *et al.***

**Science 262 1680 (1993)**

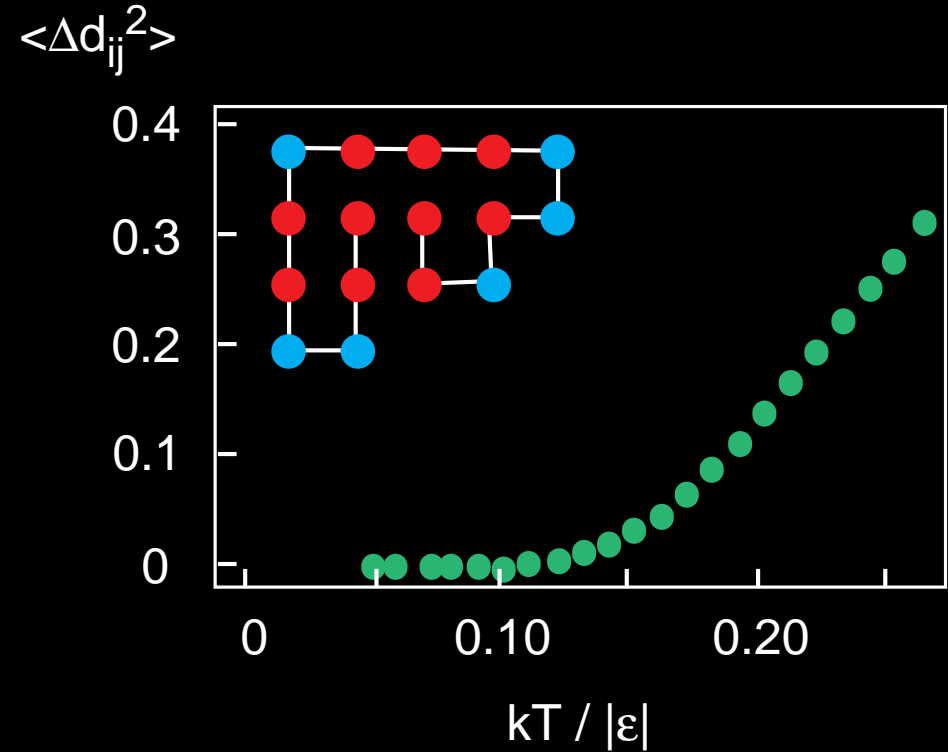
# Fluctuations in Crystals: a "Glass Transition?"

Experiments



Tilton *et al.* Biochem 31 2469 (1992)

Simulation



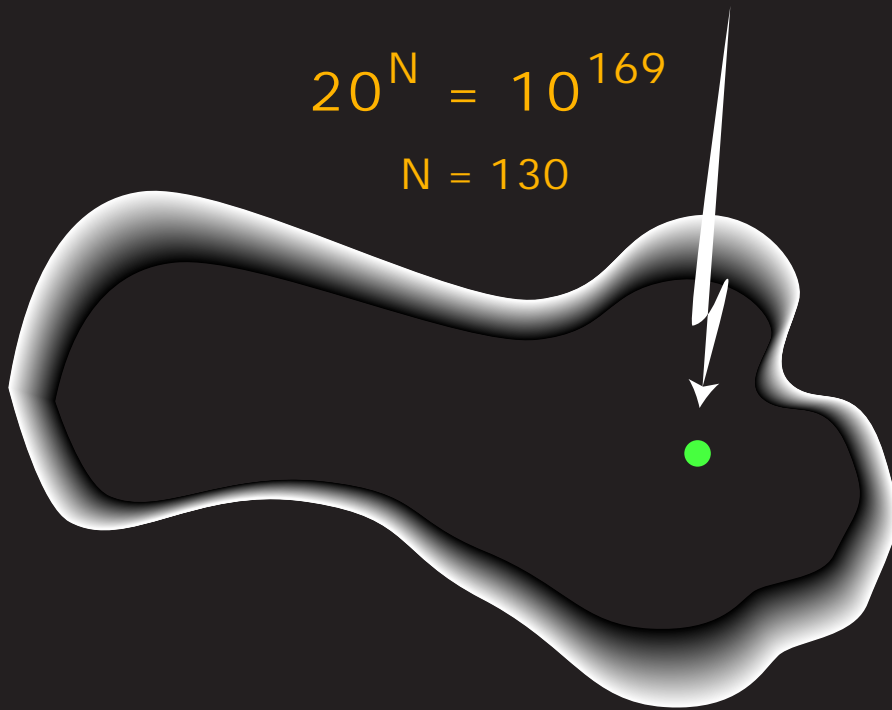
• Karen Tang

Sequence Space is dense with folded molecules.

How many sequences must be explored to find:

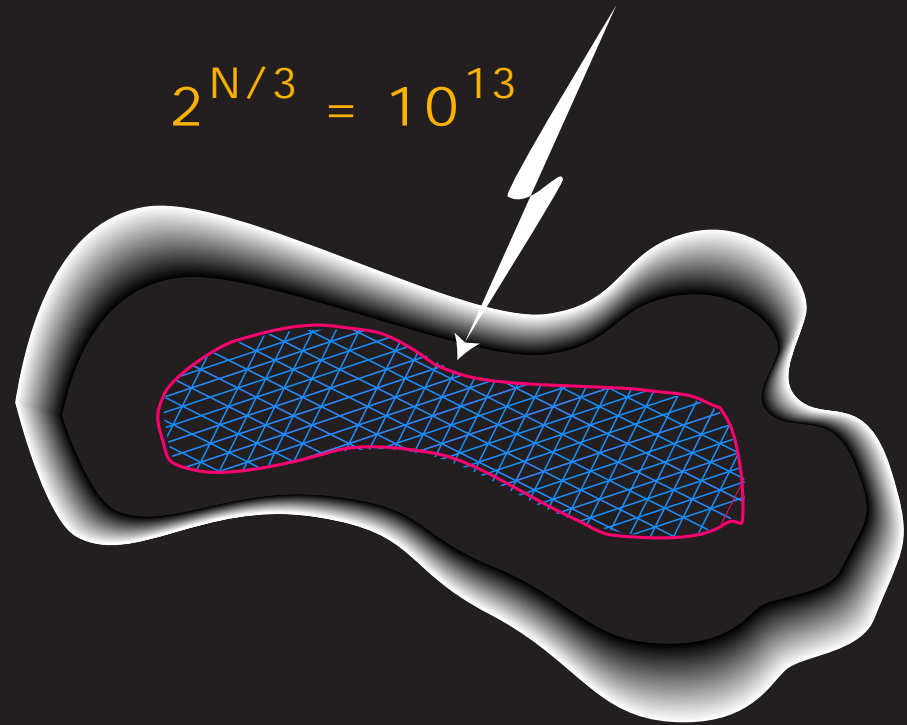
The Lysozyme  
*Sequence?*

$$20^N = 10^{169}$$
$$N = 130$$

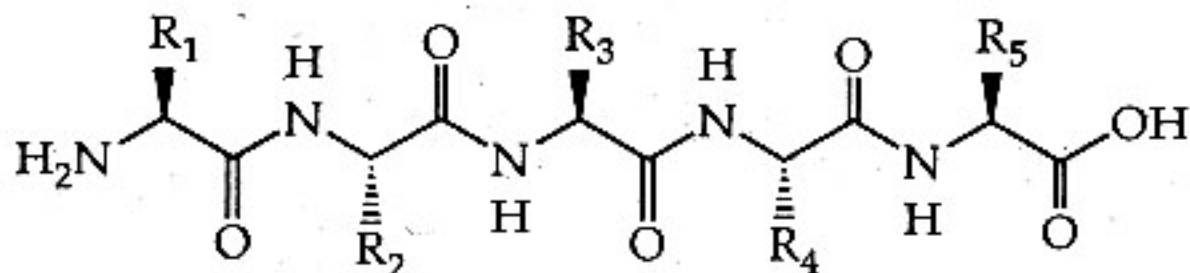


The Lysozyme  
*Structure?*

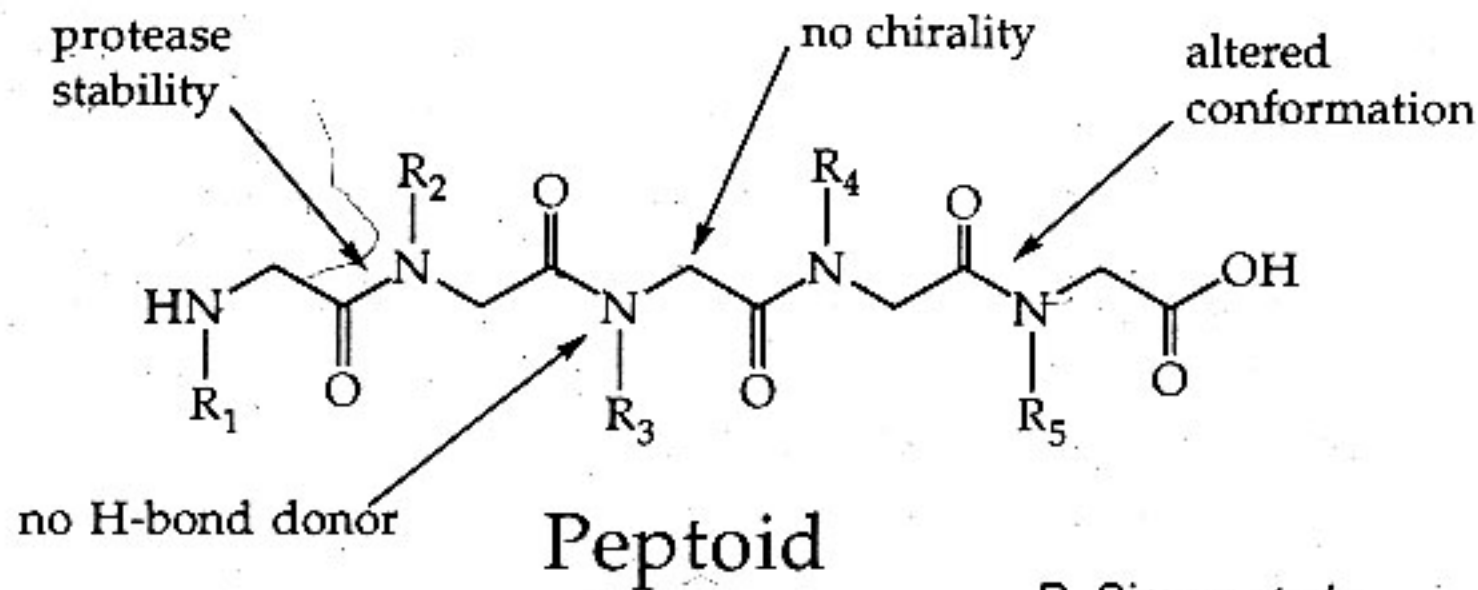
$$2^{N/3} = 10^{13}$$



# Oligo N-Substituted Glycines



Peptide

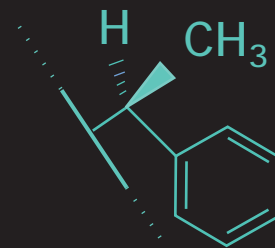
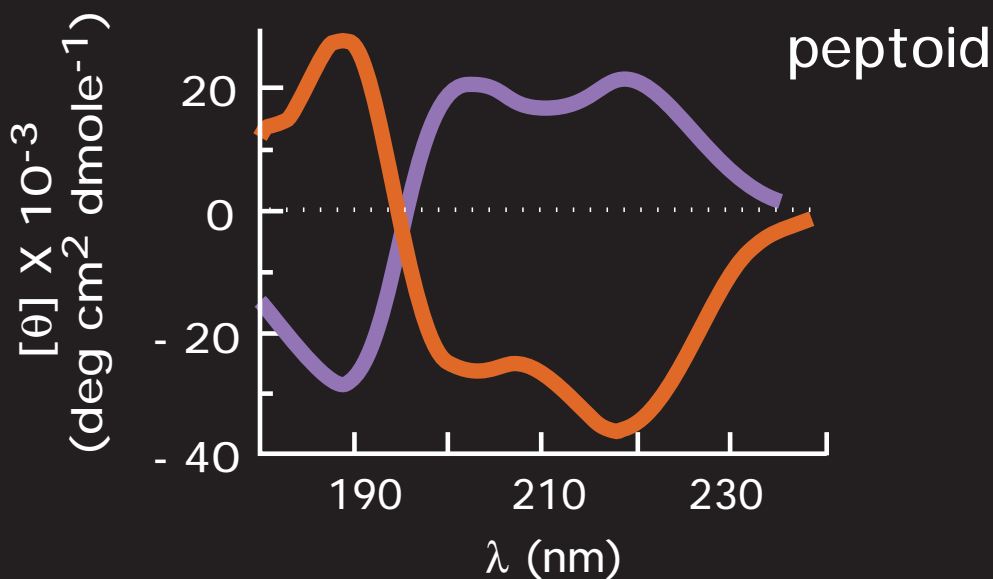


Peptoid

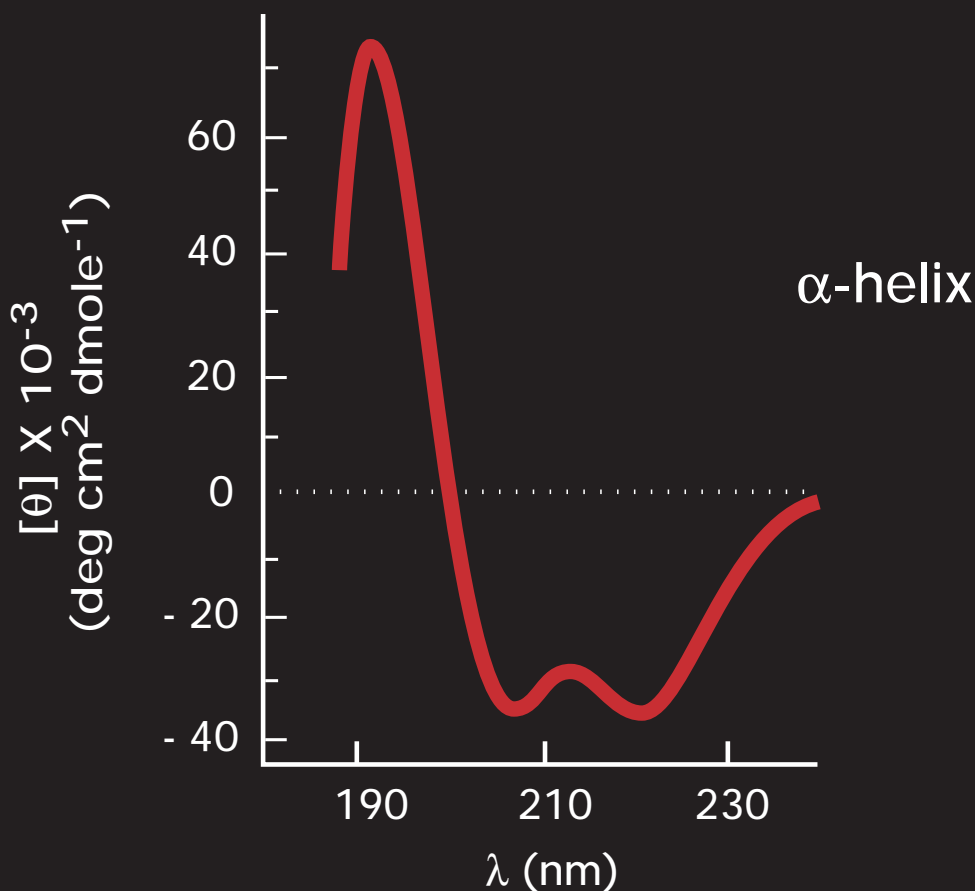
R. Simon *et al.*  
PNAS '92 (Chiron Corp.)

# Chirality in Side Chains Can Replace Chirality in Backbone

CD Spectrum looks helix-like. No hydrogen bonds.



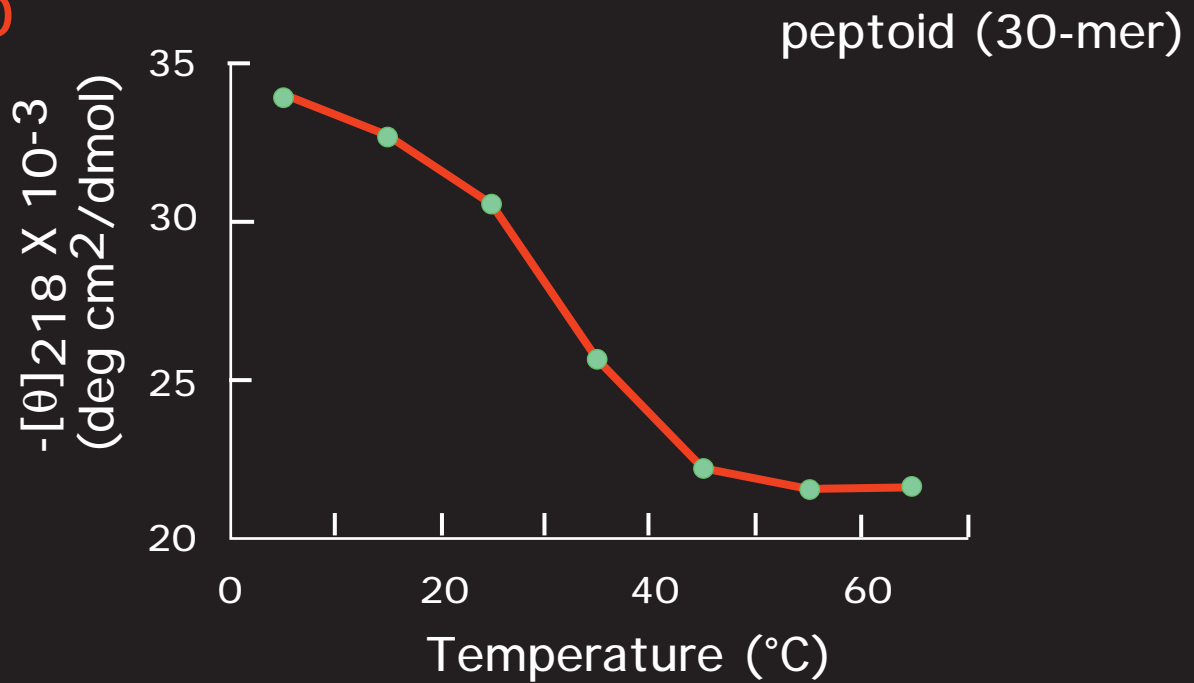
R, S enantiomers.  
phenylethylglycine



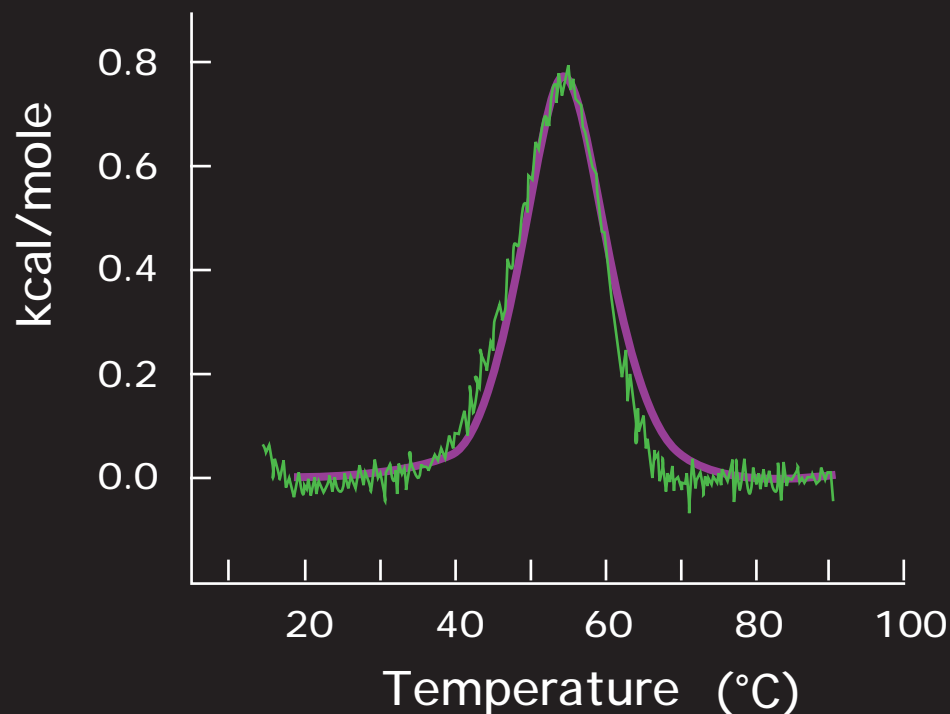


Peptoid 2° structure is stable, cooperative, despite lack of hydrogen bonds

CD



DSC



# PROTEIN FOLDING

- Why is it Fast?
- How can experimental kinetics help speed up computational searching?

# Protein Folding is Fast

Amino acid unit transition rate  $\cong 10$ -100 psec  
Number of unit transitions  $\cong 10^2$  -  $10^3$

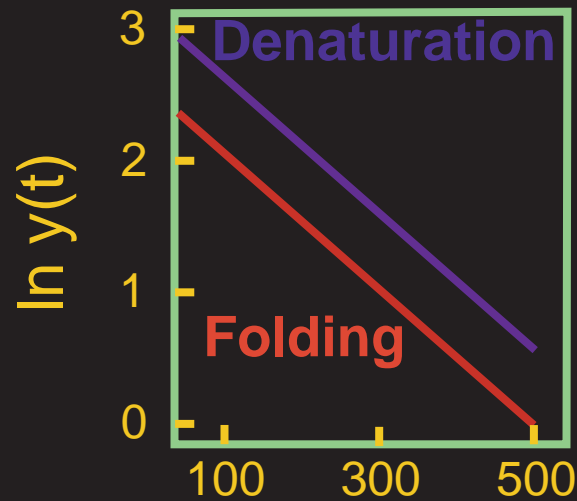
If no mistakes, 1-100 nsec to fold

Fastest known folding rate\*  $\cong 10$   $\mu$ sec

$\Rightarrow$  Protein makes only  $10^2$ - $10^5$  mistakes  
(thermal motion, uphill steps, re-tries of earlier conformations, kinetic traps, etc)

\* RE Burton, TG Oas et al. *Nat Struc Biol* 4:305 (1997)

# Folding Models



2 State

$D \rightarrow N$

Multi-State

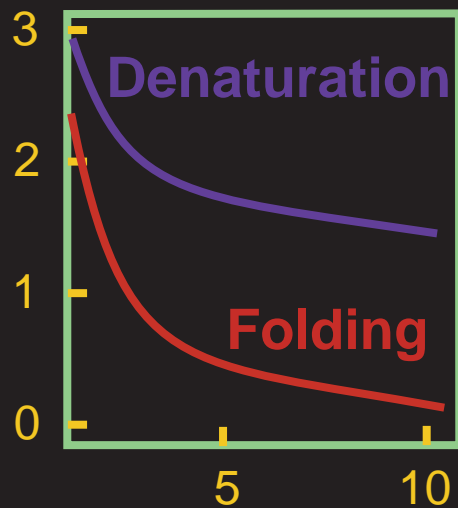
$D \rightarrow I \rightarrow N$  "on - path"  
intermediate

$D \rightarrow N$

↓

I

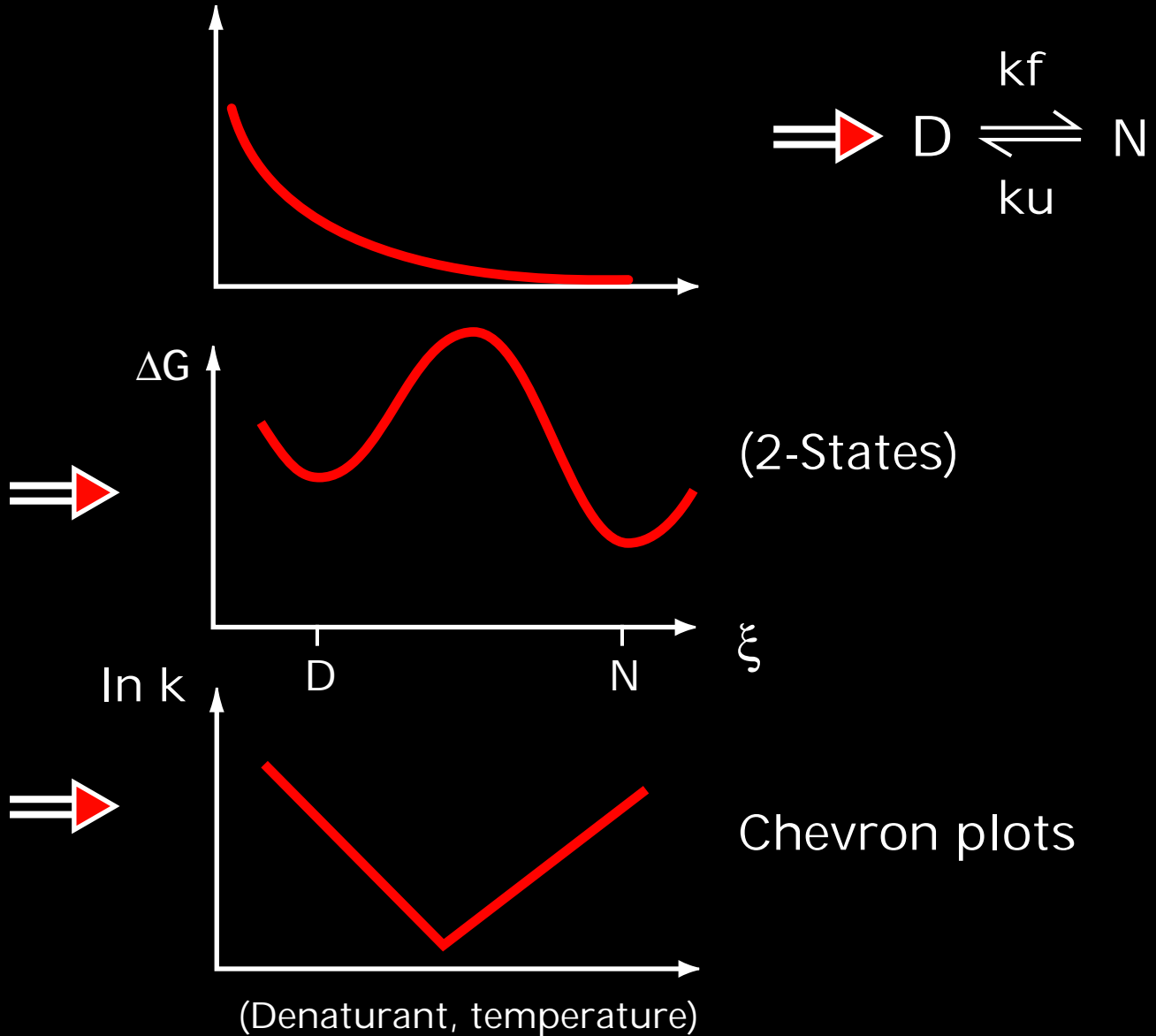
"off - path"  
intermediate



$t$

# Protein Folding Kinetics

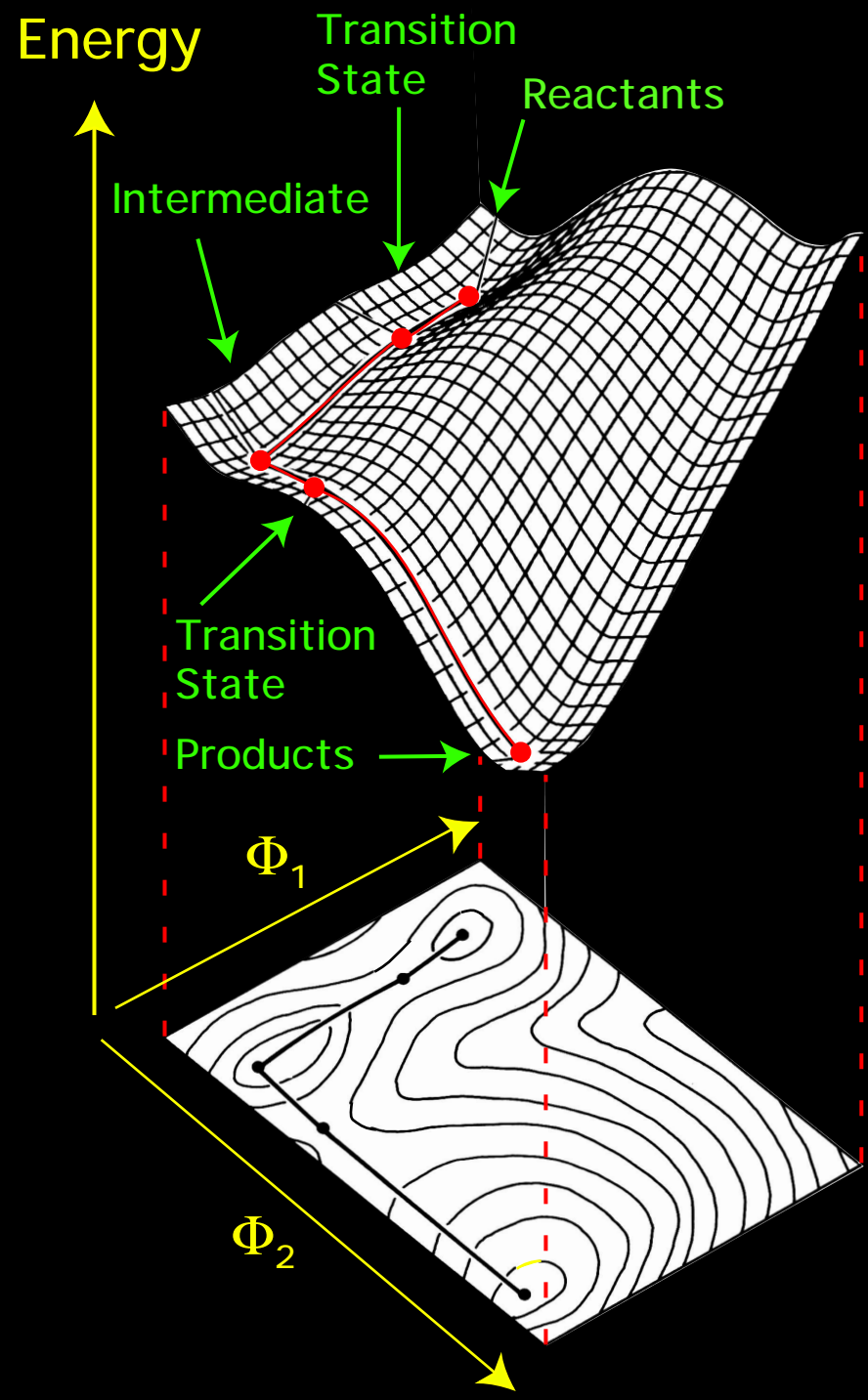
## As seen from Transition-State Theory



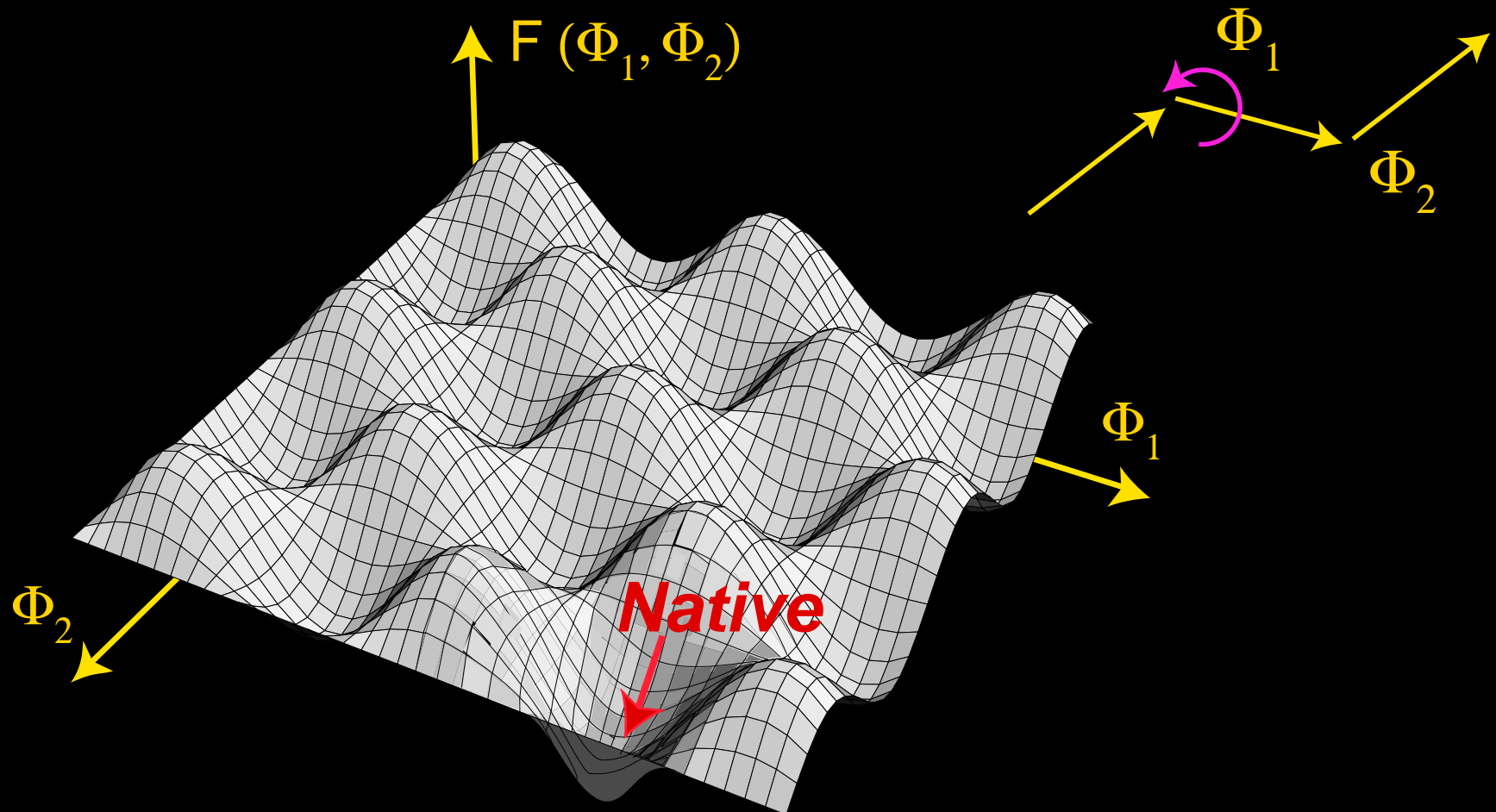
# Classical Rate Theory

$$\text{rate} = \frac{kT}{h} e^{-\Delta G^\ddagger / kT}$$

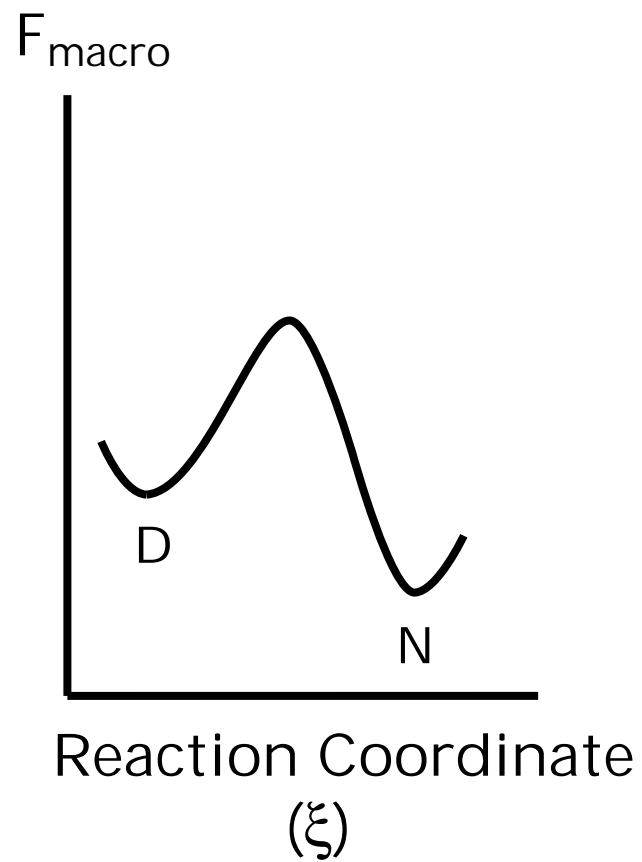
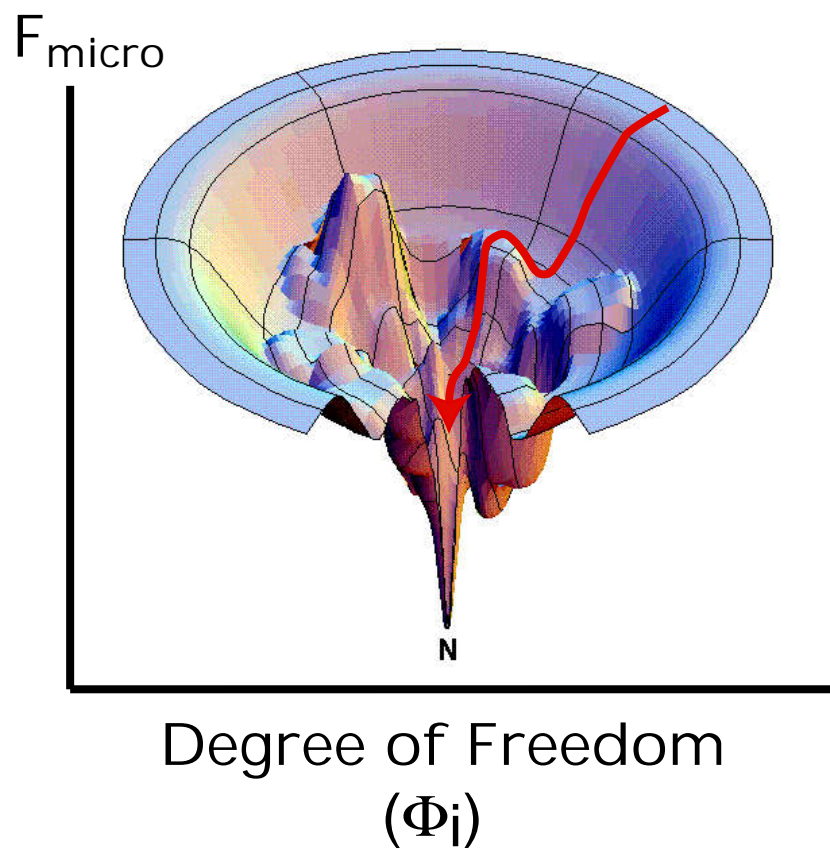
- Explains that chemical processes are slow relative to speed limit,  $kT/h = 0.2$  psec, because of energy barriers (activated states)
- Each macrostate (Reactant, I, TS, Product) can be identified with a microstate (a particular molecular structure).



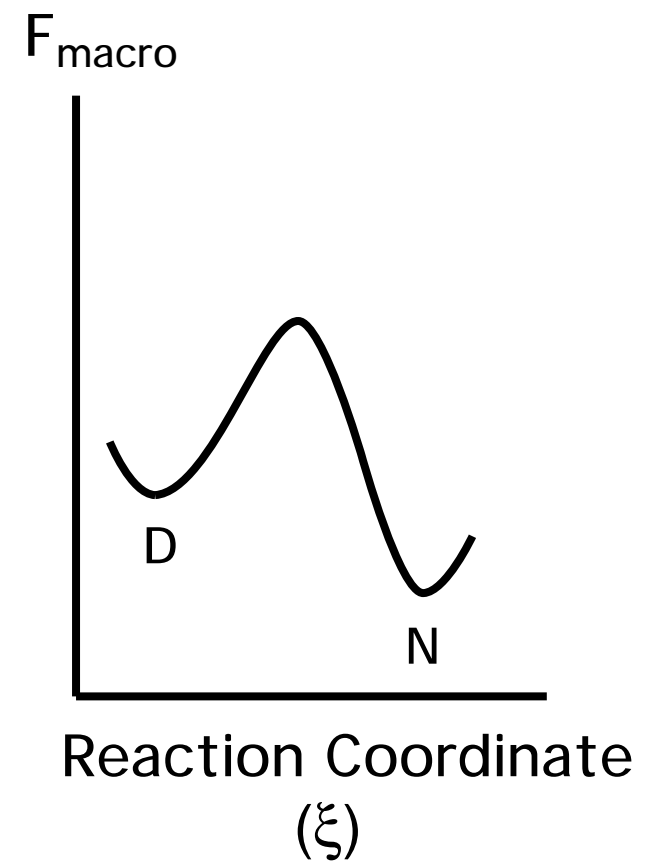
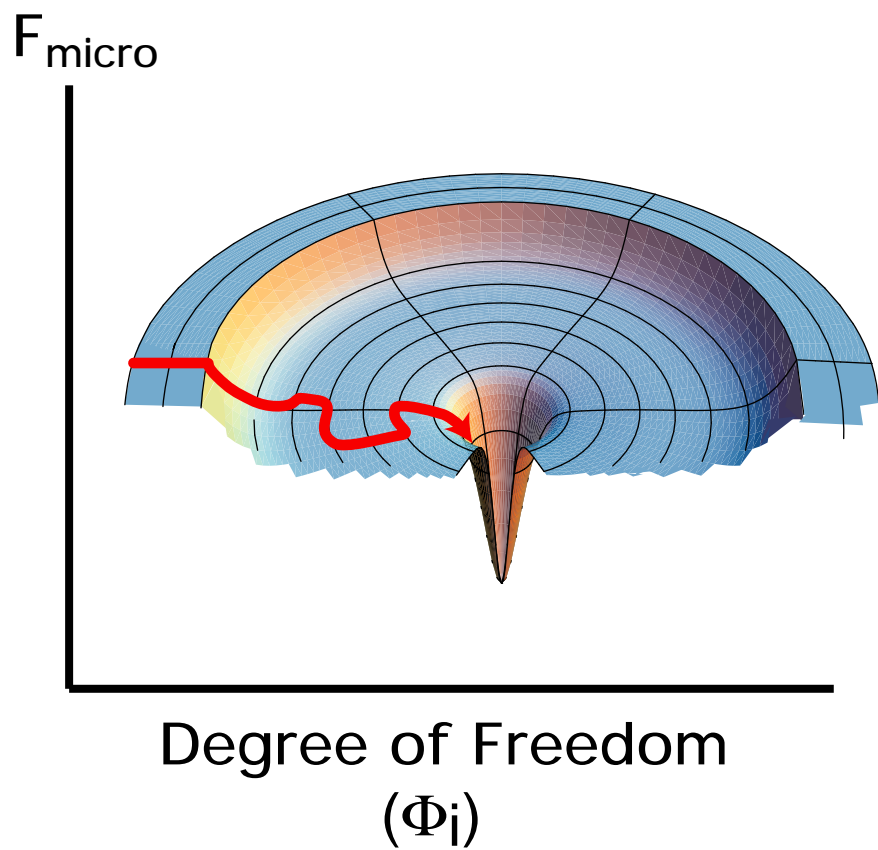
# Energy Landscape





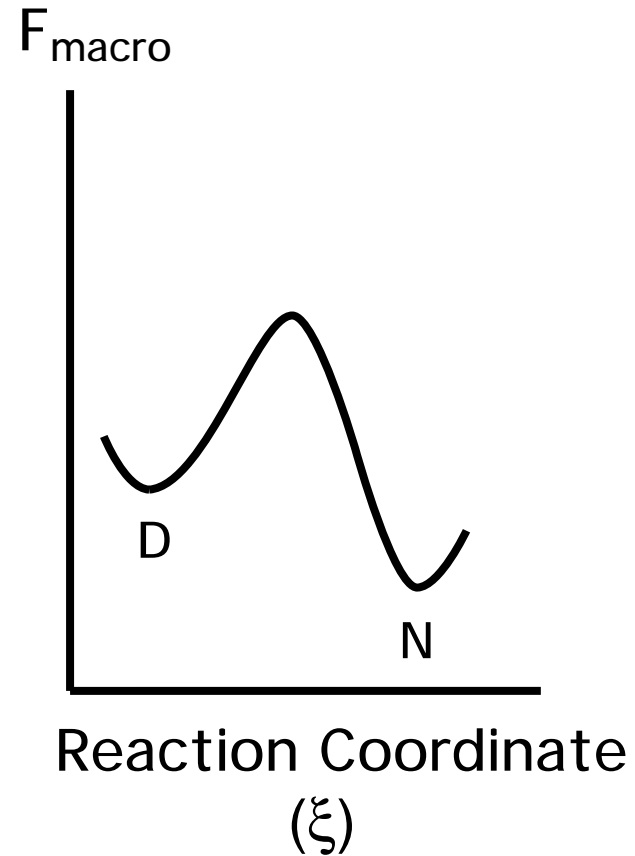
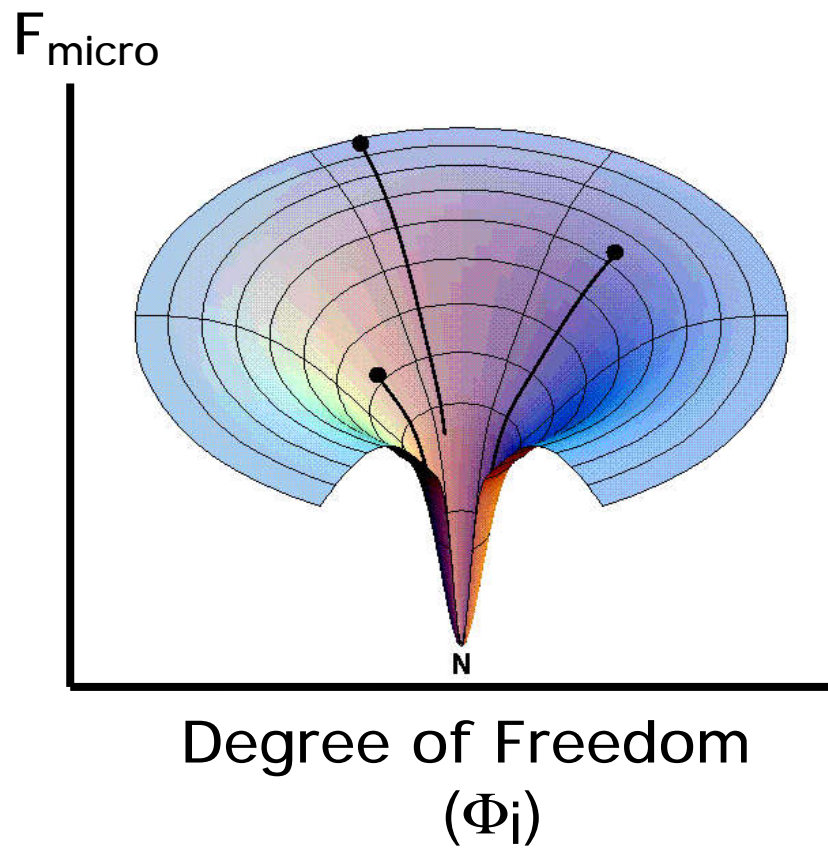


Energy Barrier



# Conformational Entropy Barrier

# What is the Barrier?



# How to Find the Transition State

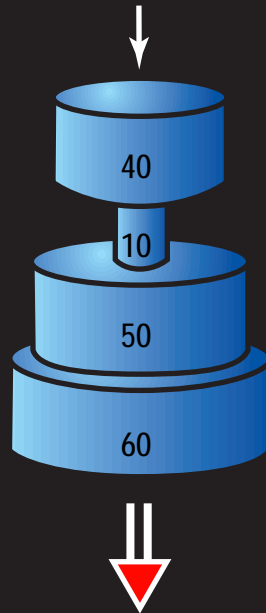
$$\frac{d\mathbf{C}}{dt} = \mathbf{A}\mathbf{C} \quad \mathbf{A} = \begin{bmatrix} k_{11} & k_{12} & k_{13} \dots \\ k_{21} & & \\ k_{22} & & \\ & & k_{NN} \end{bmatrix} \quad \mathbf{C} = \begin{bmatrix} C_1 \\ C_2 \\ \vdots \\ C_N \end{bmatrix}$$

- Diagonalize, get slowest eigenvalue
- Corresponding eigenvector is TS ensemble

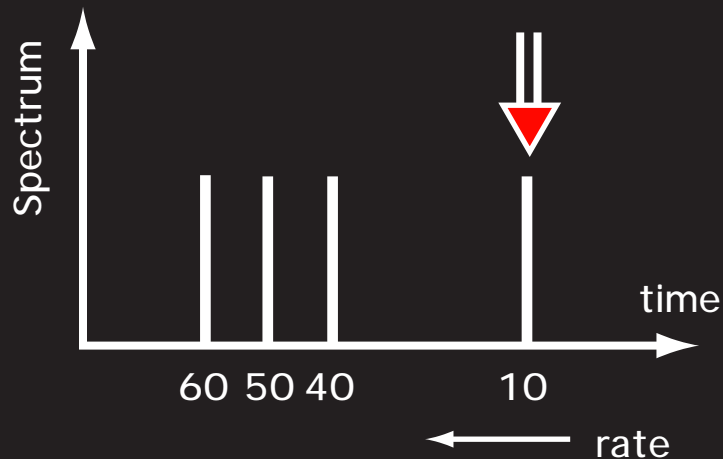
Model: 2D exact short-chain Go model

Macroscopic rate is a collective property,  
not a property of a single bottleneck

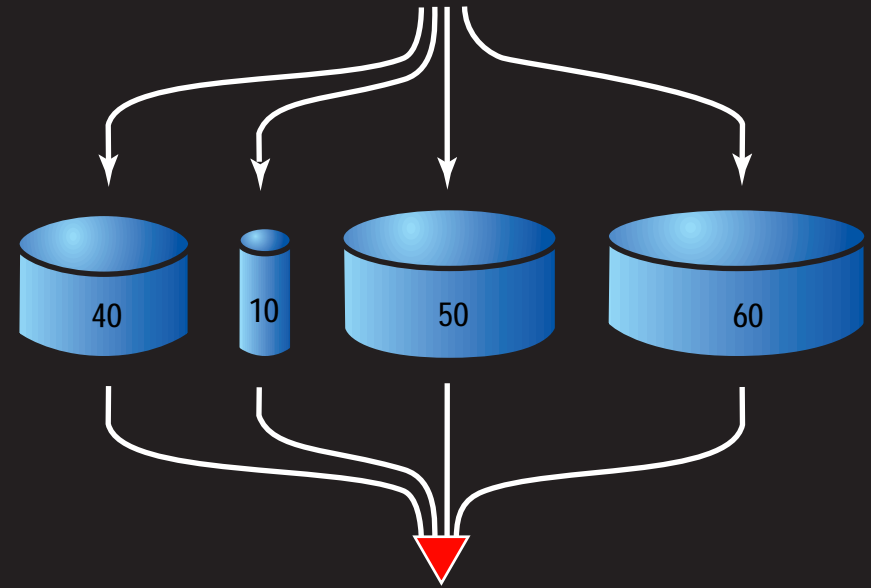
### Series Process



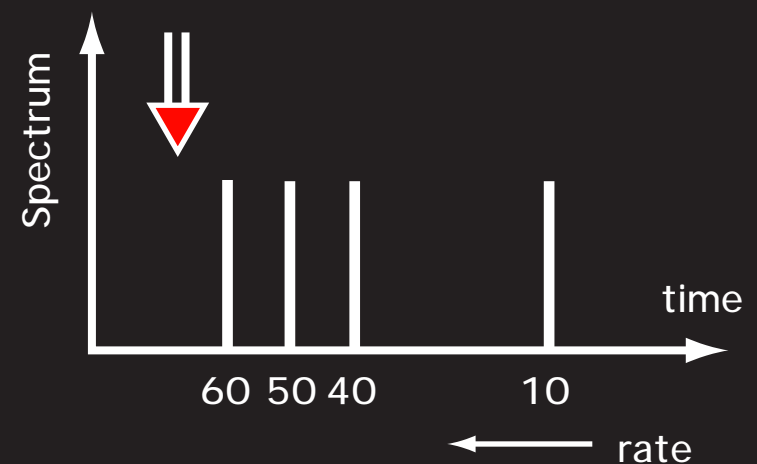
macroscopic rate  $\equiv$   
bottleneck rate



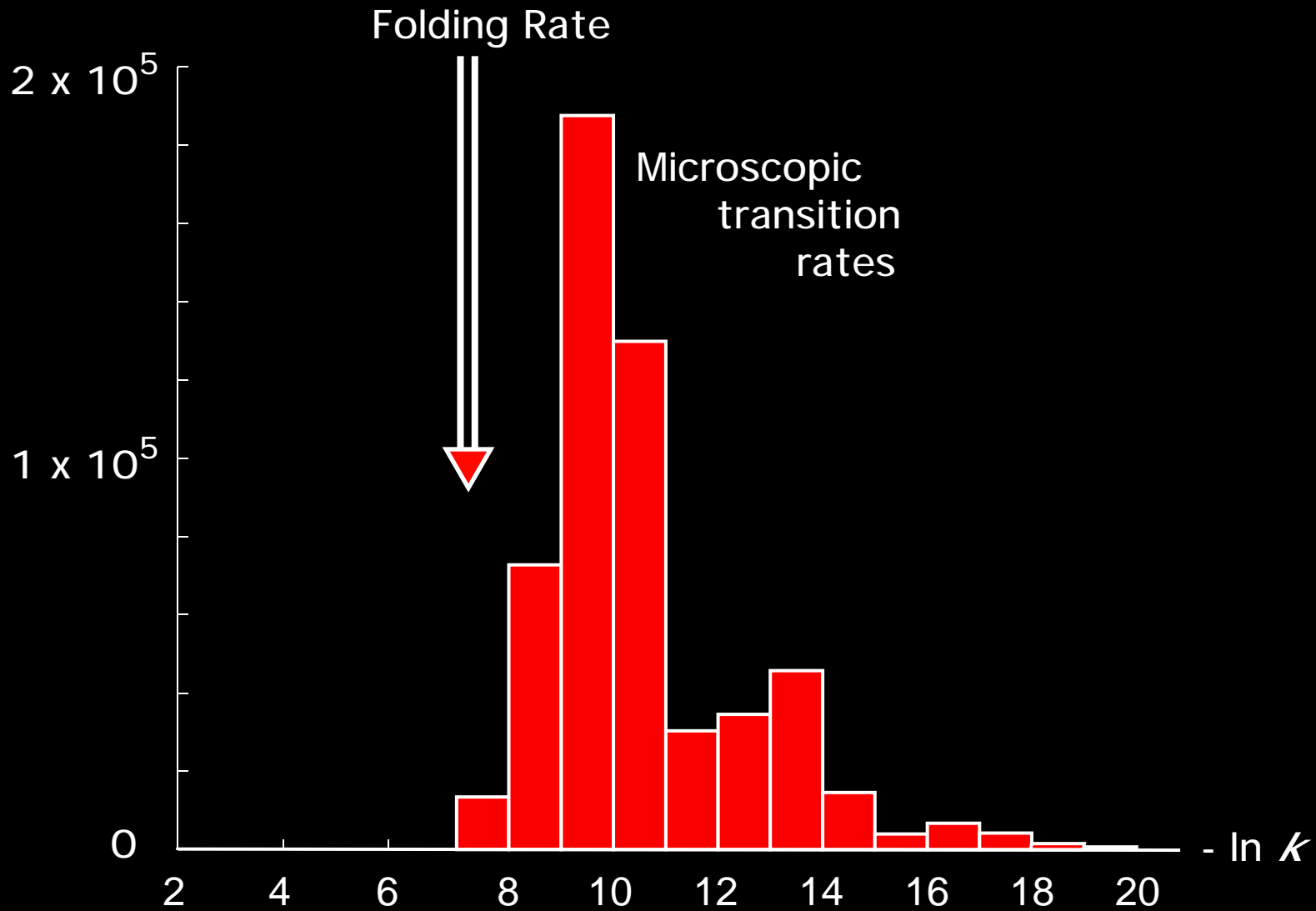
### Parallel Process



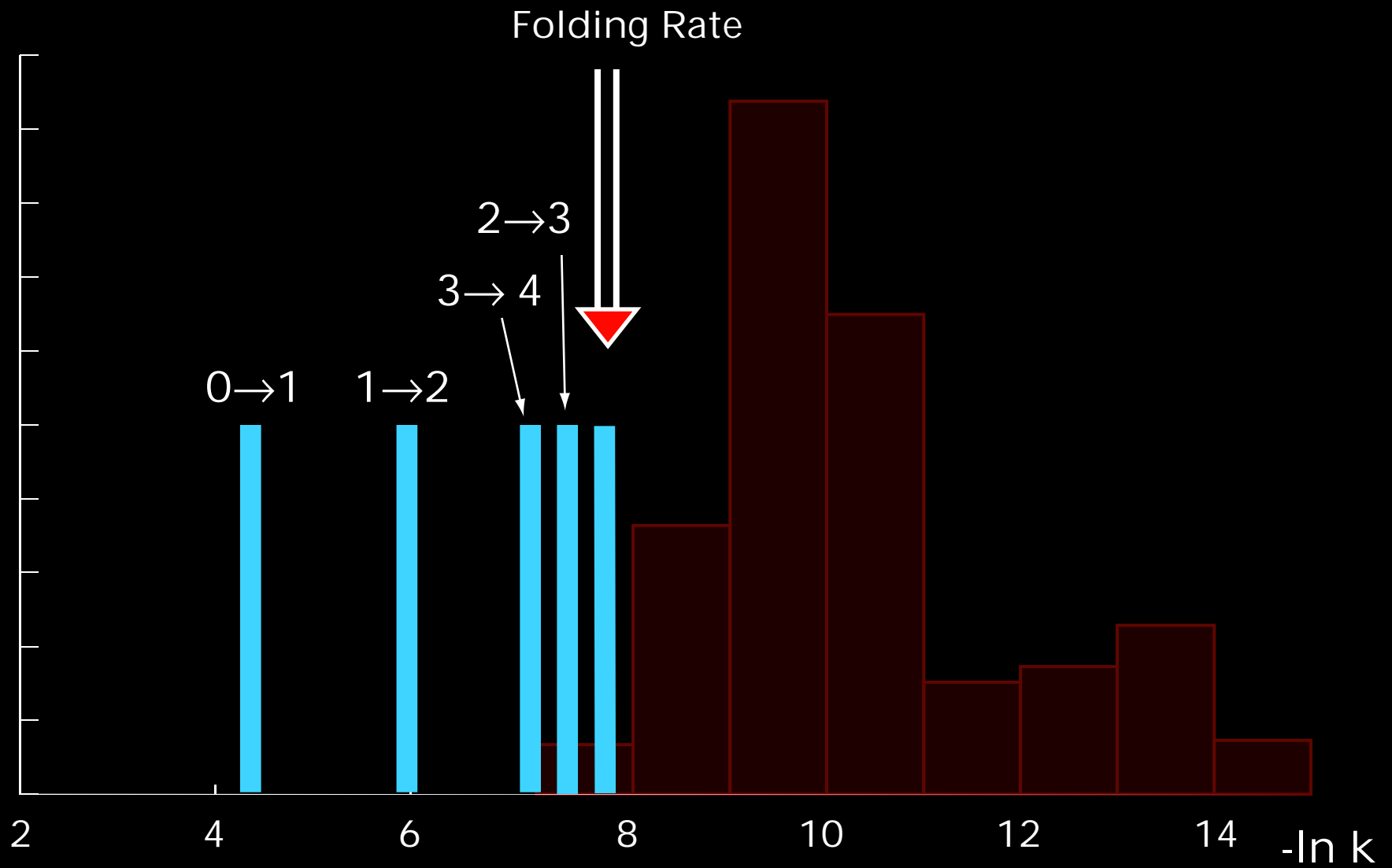
macroscopic rate  $>$   
 $\mu$ rates



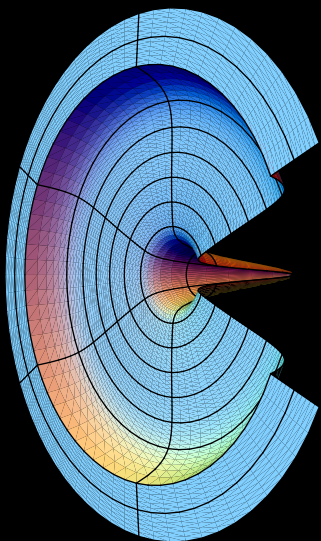
# Folding is Faster than Microscopic Transition Rates



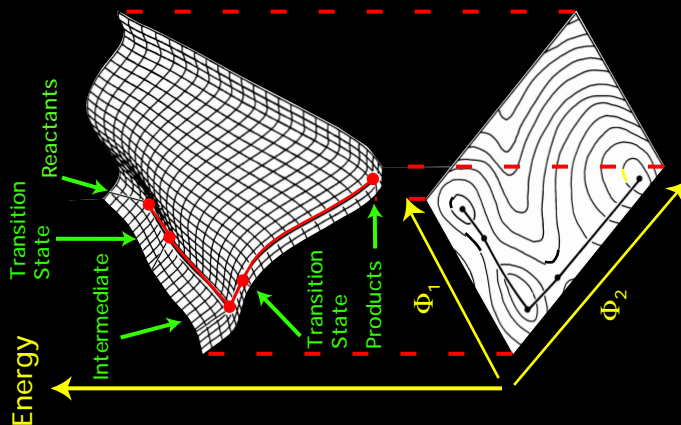
# Transitions Between Energy Levels Are Fast



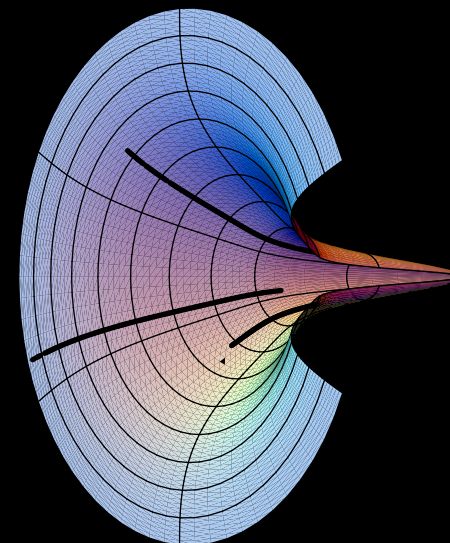
# Types of Rate Limiting Processes:



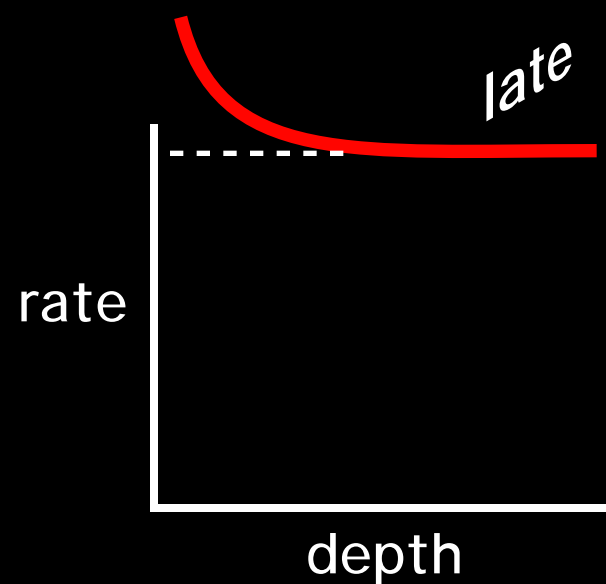
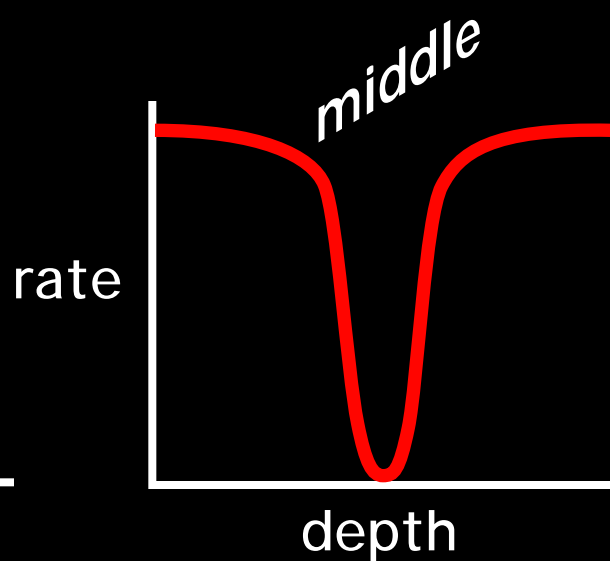
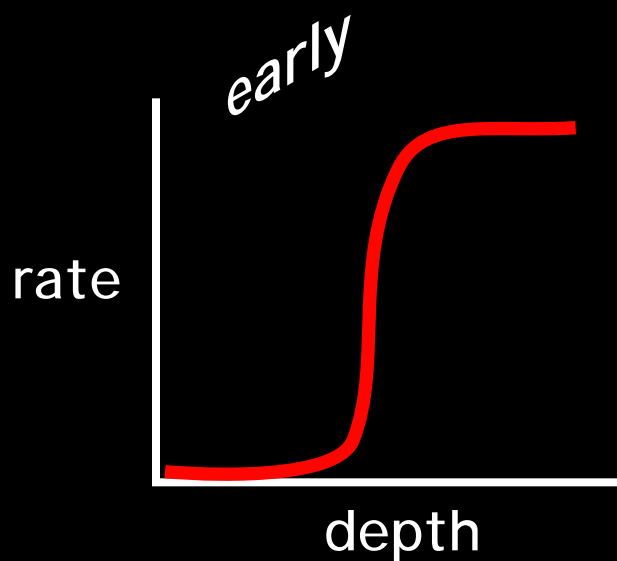
Random search



Specific microscopic barrier



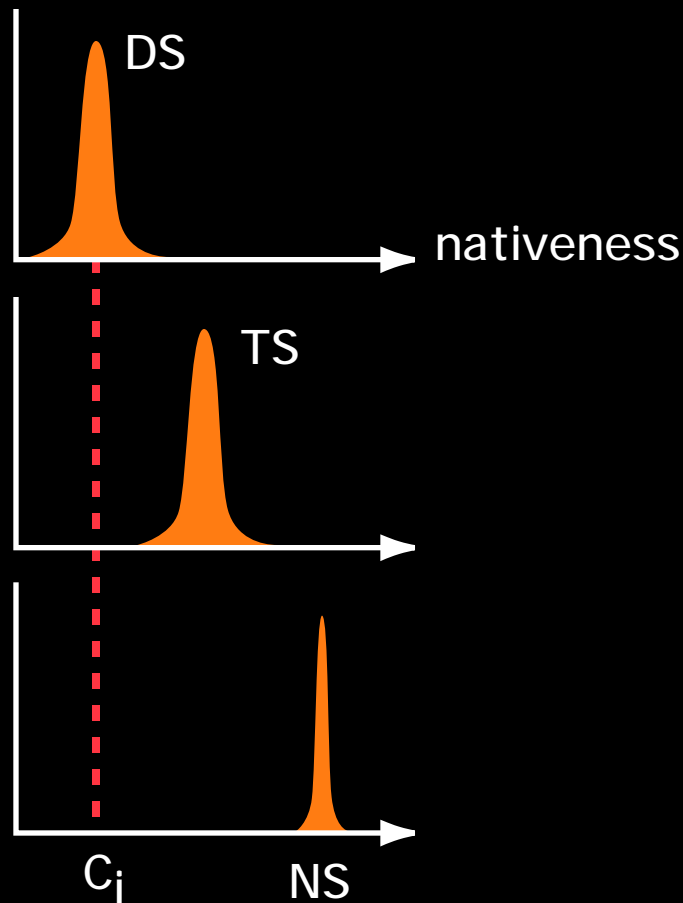
Funnelling the trajectories



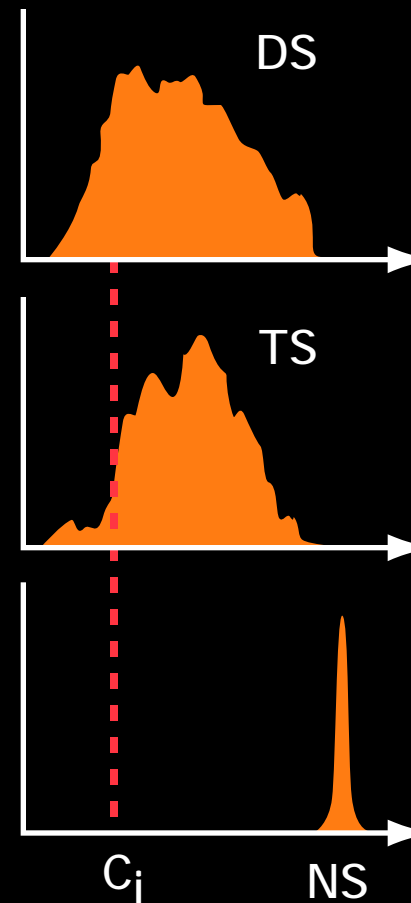


# Which Microconformations are Transition State Macroconformations?

## Series Model



## Parallel Model



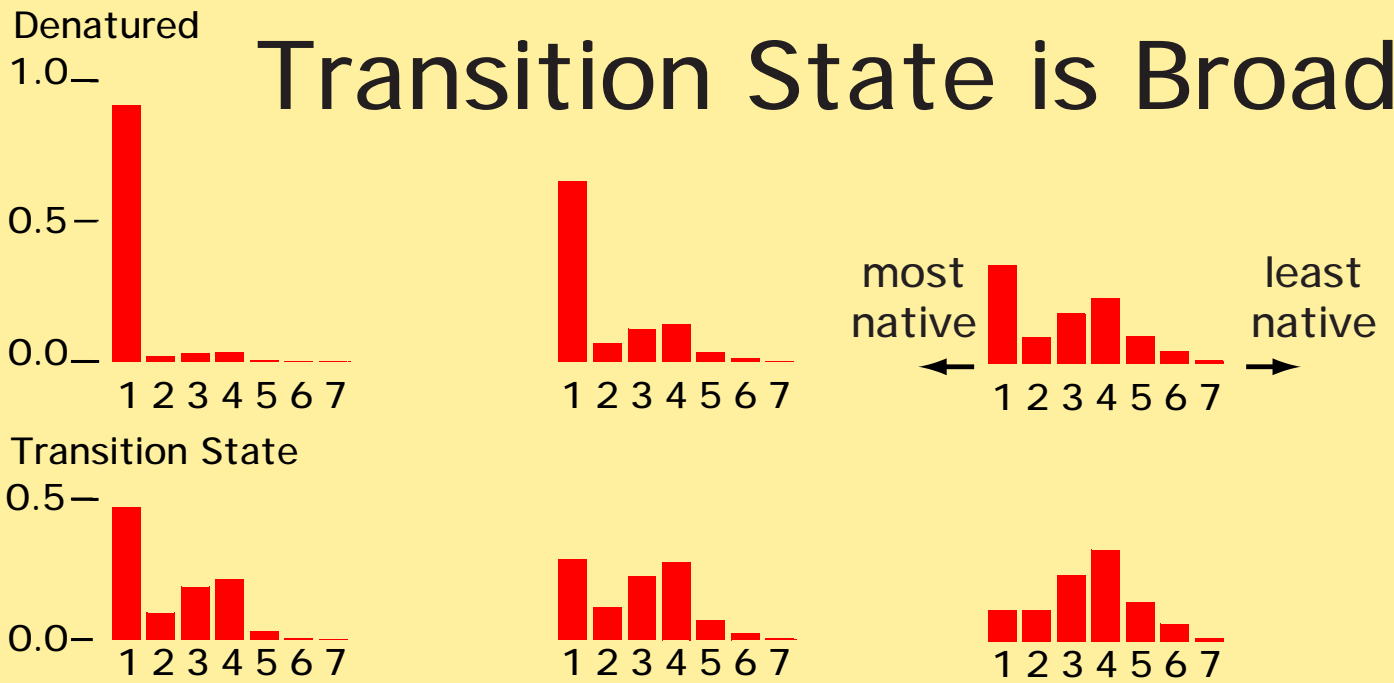
localized ensembles:

Conformation  $C_i$  is either D or TS

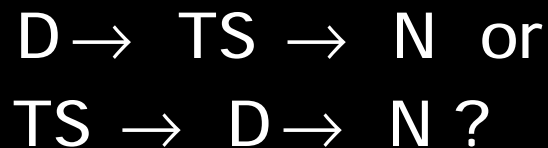
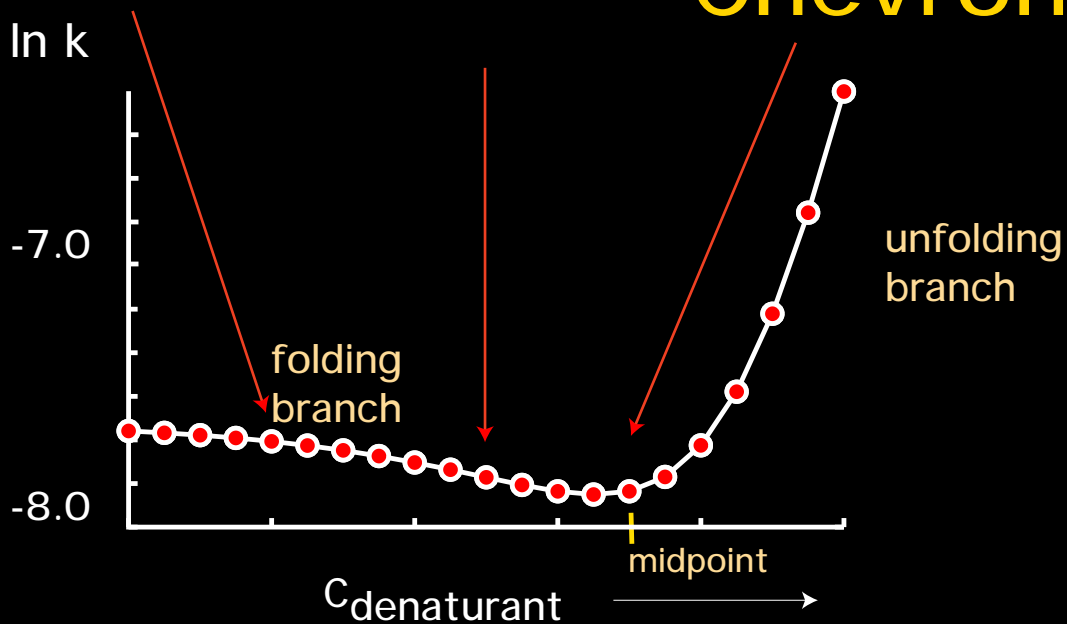
delocalized ensembles:

Conformation  $C_i$  can be in both D or TS

# Transition State is Broad



# Chevron Plot

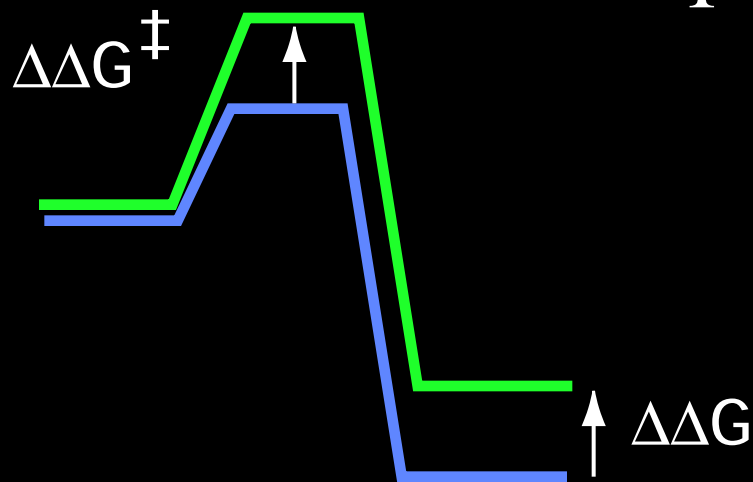


# $\Phi$ Value Analysis \*

$$\Delta G = -RT \ln K$$

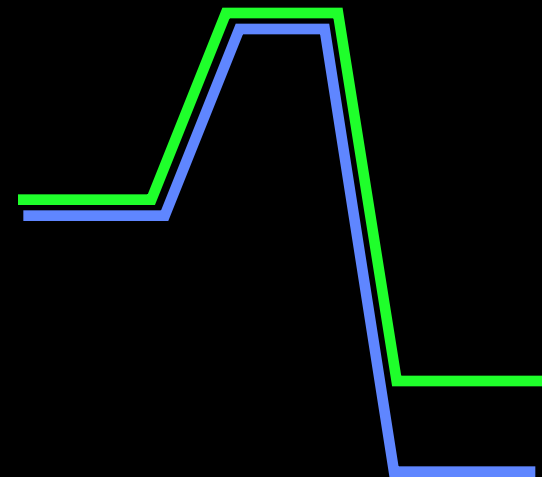
$$\Delta G^\ddagger = -RT \ln k_f$$

$$\Phi = \frac{\Delta\Delta G^\ddagger}{\Delta\Delta G}$$



$$\Phi = 1$$

At mutation site:  
TS has Native-like structure

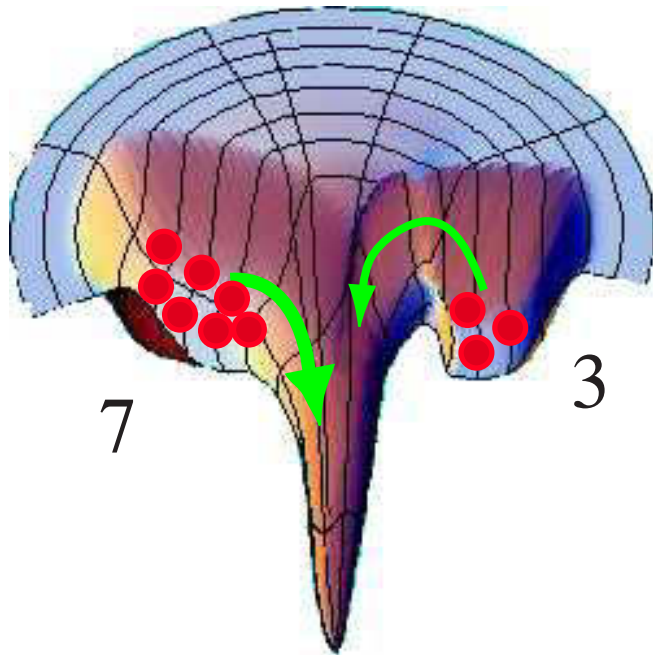


$$\Phi = 0$$

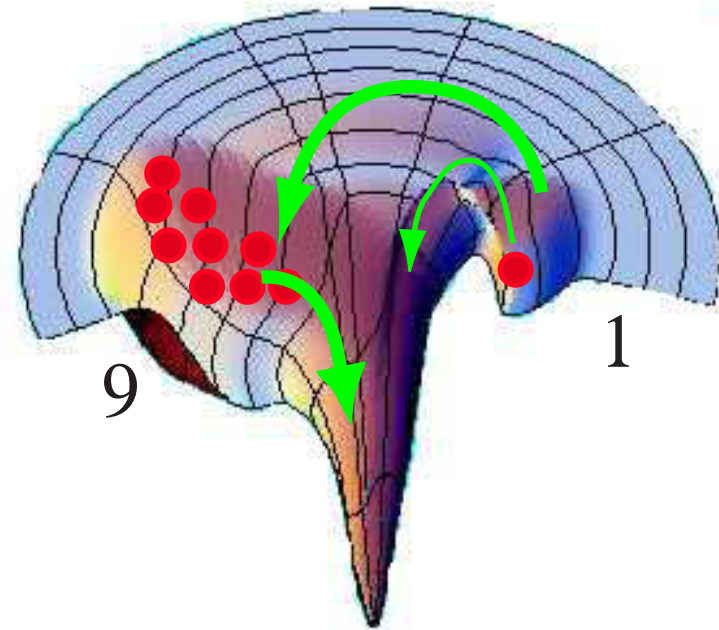
TS has Denatured-like structure

\* A Fersht, Structure and Mechanism in Protein Science. Freeman (1999)

# Negative $\Phi$ values come from Redirected Flow in Parallel Processes



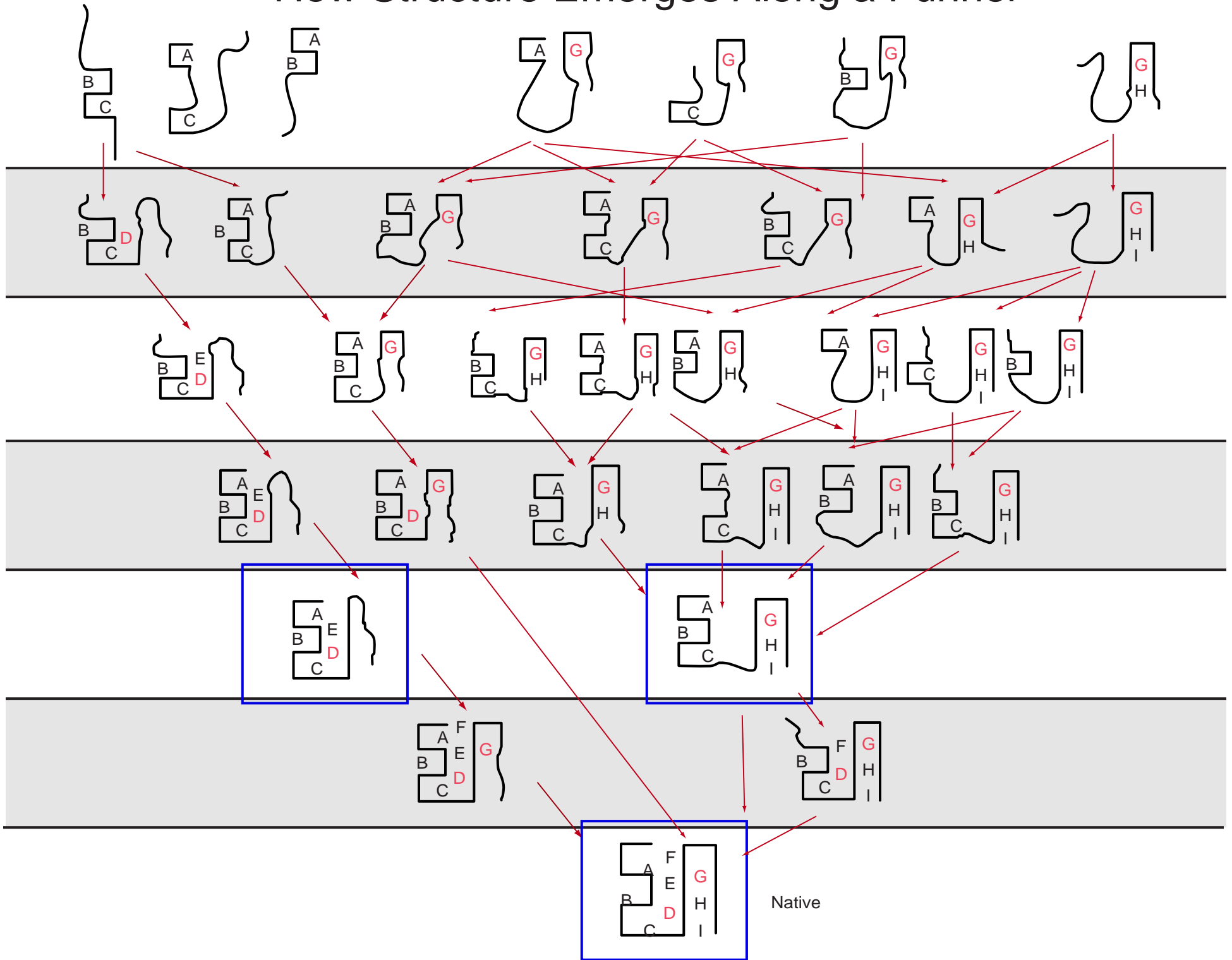
$$\text{Rate} = \left(\frac{7}{10}\right)1 + \left(\frac{3}{10}\right)(0.1) = 0.73$$



$$\text{Rate} = \left(\frac{9}{10}\right)1 + \left(\frac{1}{10}\right)(0.1) = 0.91$$

Destabilization leads to higher folding rates

# How Structure Emerges Along a Funnel



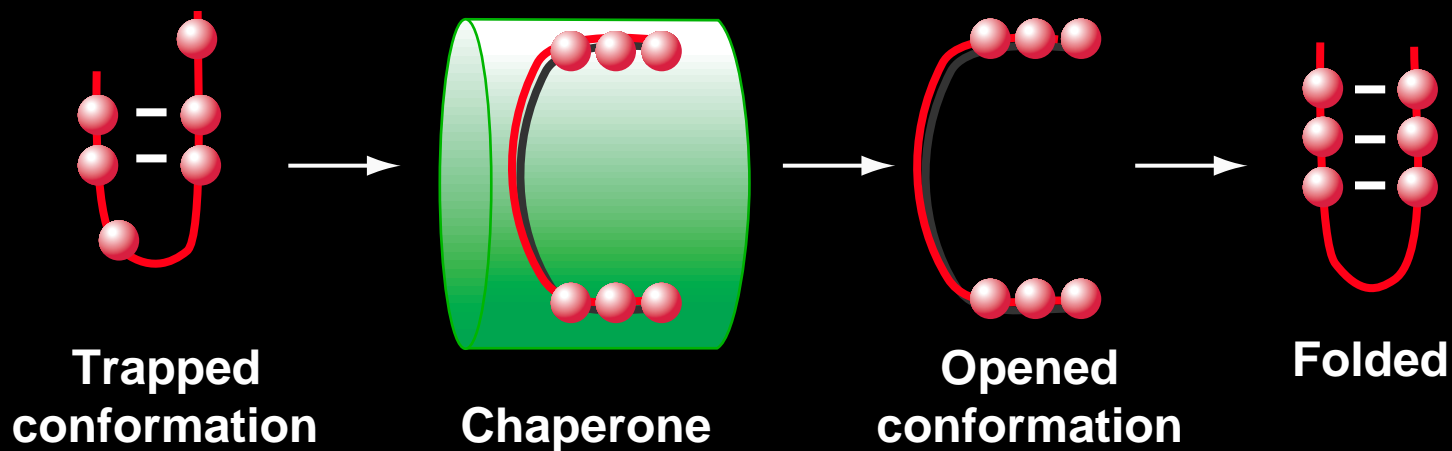
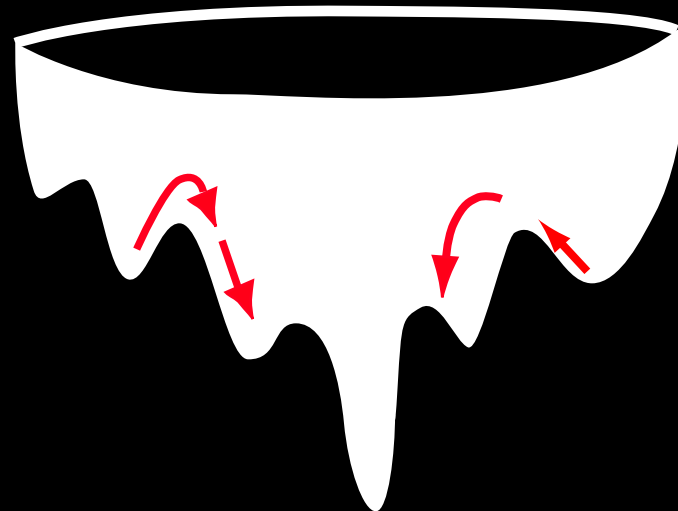
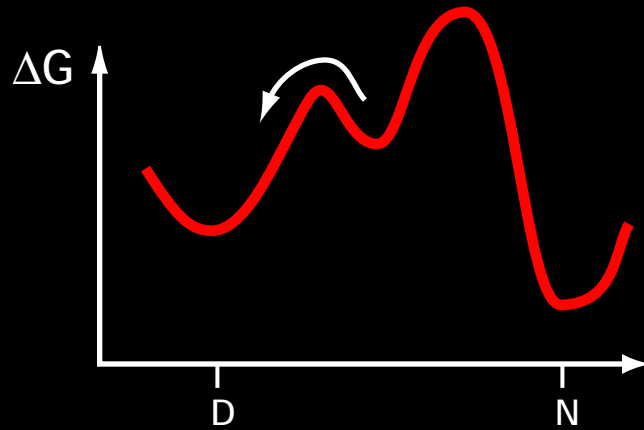
# Mechanism of Chaperone Action

## Series model dilemma:

- How to recognize specific TS?
- Unfolding can't help a protein fold

## Parallel model solution

- Unfolding a protein can help it fold



Summary--

2-state Kinetics can come from:

Pathways      single rxn coord,  
                  bottleneck step,  
                  macro-rate < slowest micro-rate,  
                  macrostates correspond to microstates

OR

Funnels        multiple routes,  
                  early acceleration,  
                  macro-rate > fast micro-rates  
                  macrostates are ensembles

- Kinetics is a collective property of landscapes. Not a property of a single trajectory.
- In 2-state folding, what is the barrier? The whole folding process, not just collapse.
- Transition States are broad. They overlap with Denatured States.
- Nonclassical  $\Phi$  values are evidence for parallel steps.
- Terminology that applies to series processes, but not necessarily to parallel processes:
  - (before, after)
  - (backward, forward),
  - (productive, unproductive (intermediates))



Thanks to:

Jack Schonbrun

Banu Ozkan

Ivet Bahar

Hue Sun Chan

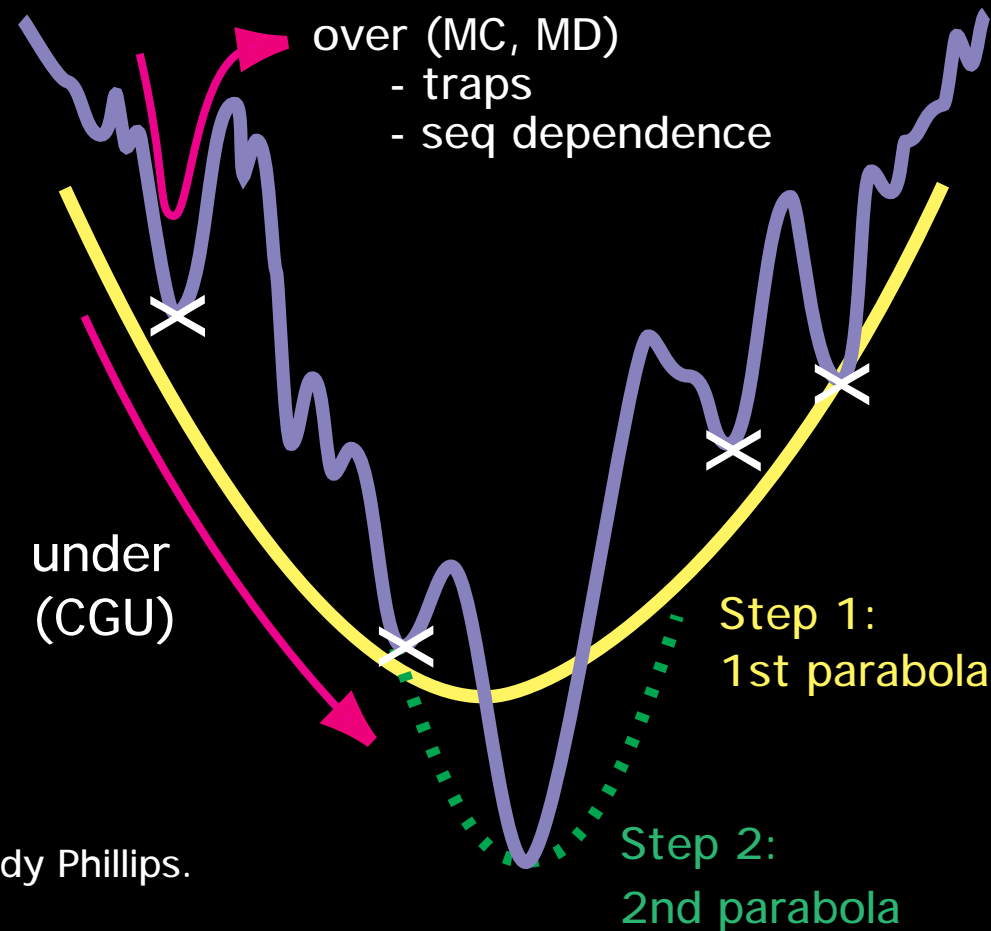
Ben Rosen

Andy Phillips

Ken Foreman

NIH, NSF

# A Fast Search Strategy from Landscape-ology

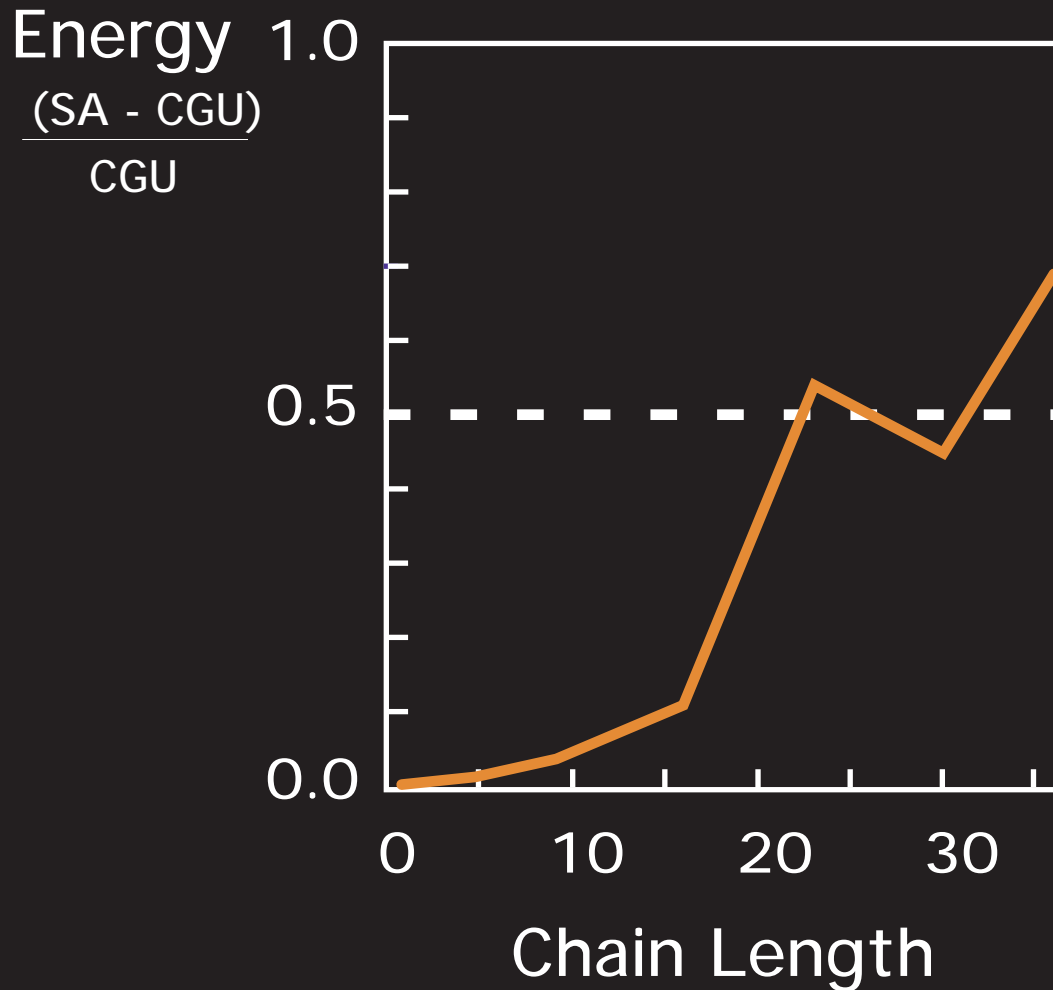


- CGU: Ben Rosen, Andy Phillips.  
*J Comp Bio* '97

# CGU:

- Finds Global Minimum
- Depends on  $n$ , not sequence
  - Search time  $\sim n^4$

# SA Gets Trapped High on the Landscape Relative to CGU



The Folding of an Enzyme. IV

Table 2  
 $\phi$  Values for folding and difference energies for intermediate and transition state

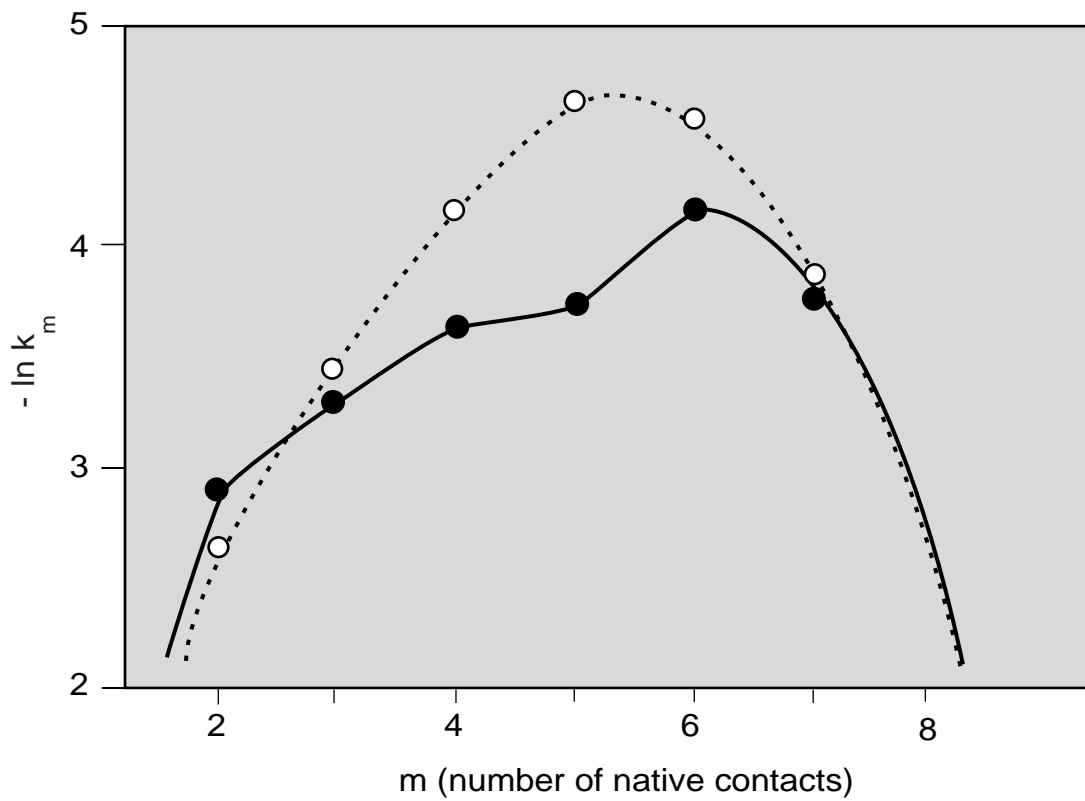
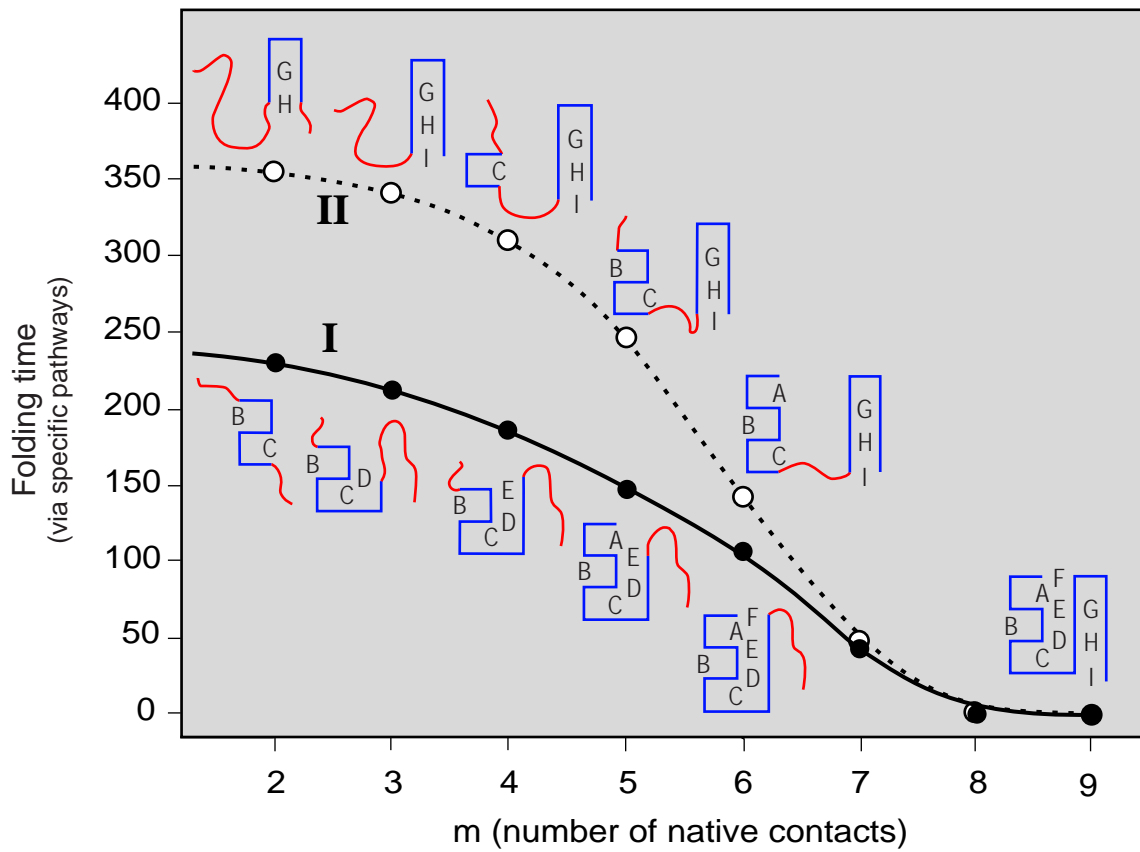
Residue and mutation	$\Delta\Delta G_{U-I}$ (kcal mol <sup>-1</sup> )†	$\Delta\Delta G_{U-I}$ (kcal mol <sup>-1</sup> )†	$\Delta\Delta G_{U-F}$ (kcal mol <sup>-1</sup> )†	$\phi_1$	$\phi_2$
IV4	0.00	0.00	0.67	0.0	0.0
IA4	0.00	0.07	1.50	0.0	0.0
VA4	0.00	0.08	0.83	0.0	0.1
NA5	0.17	0.19	2.06	0.0	0.1
TA6‡	0.69	0.68	2.30	0.3	0.3
VT10	0.70	1.03	2.58	0.3	0.4
VA10	1.0	1.27	3.63	0.3	0.3
YA13§	1.54	1.88	3.71	0.4	0.5
YA13/YA17§	1.51	1.99	4.64	0.3	0.4
LA14‡	2.37	2.84	4.55	0.5	0.6
TS16‡	1.28	1.46	1.68	0.8	0.9
YA17§	1.02	1.28	2.26	0.5	0.6
HQ18‡	1.18	1.21	1.42	0.8	0.9
NA23	-0.05	-0.09	2.50	0.0	0.0
IV25	-0.27	-0.28	1.18	-0.2	-0.2
TA26‡	0.02	-0.04	2.00	0.0	0.0
EG29	-0.24	-0.25	1.90	-0.1	-0.1
VT36	-0.07	-0.04	1.15	0.0	0.0
VA36	-0.34	-0.12	1.34	-0.2	-0.1
ND41	-0.04	-0.06	2.51	0.0	0.0
VT45	-0.20	-0.16	2.44	-0.1	-0.1
VA45	-0.53	-0.32	1.83	-0.3	-0.2
IV51	-0.28	-0.29	1.85	-0.1	-0.1
DN54	-0.49	-0.53	2.42	-0.2	-0.2
DA54	-0.47	-0.51	3.10	-0.2	-0.2
IT55	0.28	0.42	1.00	0.3	0.4
IA55	0.68	0.76	1.28	0.5	0.6
NA58	1.93	2.04	2.17	0.9	0.9
KR62	0.32	0.37	0.43	0.8	0.9
IV76	-0.10	0.02	0.88	0.0	0.0
LA76	0.45	0.91	2.04	0.2	0.5
VA76	0.55	0.89	1.16	0.5	0.8
NA77	-0.02	-0.03	1.88	0.0	0.0
YF78§	0.16	0.15	1.41	0.1	0.1
NA84	0.37	0.32	2.24	0.2	0.1
IV88§	0.95	1.31	1.40	0.7	0.9
IA88§	2.48	3.97	4.16	0.6	1.0
VA88	1.58	2.71	2.76	0.6	1.0
LV89	0.12	0.03	0.03	0.5	0.1
LT89	1.56	2.99	2.90	0.5	1.0
VT89	1.39	2.91	2.55	0.5	1.1
SA91	1.09	1.80	1.93	0.7	0.9
SA92	1.74	2.61	2.74	0.6	1.0
IV96§	0.56	0.55	0.95	0.6	0.6
IA96§	2.26	2.86	3.32	0.7	0.9
VA96	1.69	2.31	2.37	0.7	1.0
TV105	0.69	1.11	2.25	0.3	0.5
IV109	0.14	0.13	0.82	0.2	0.2
IA109	0.91	1.34	2.22	0.4	0.6
VA109	0.77	1.21	1.40	0.6	0.9

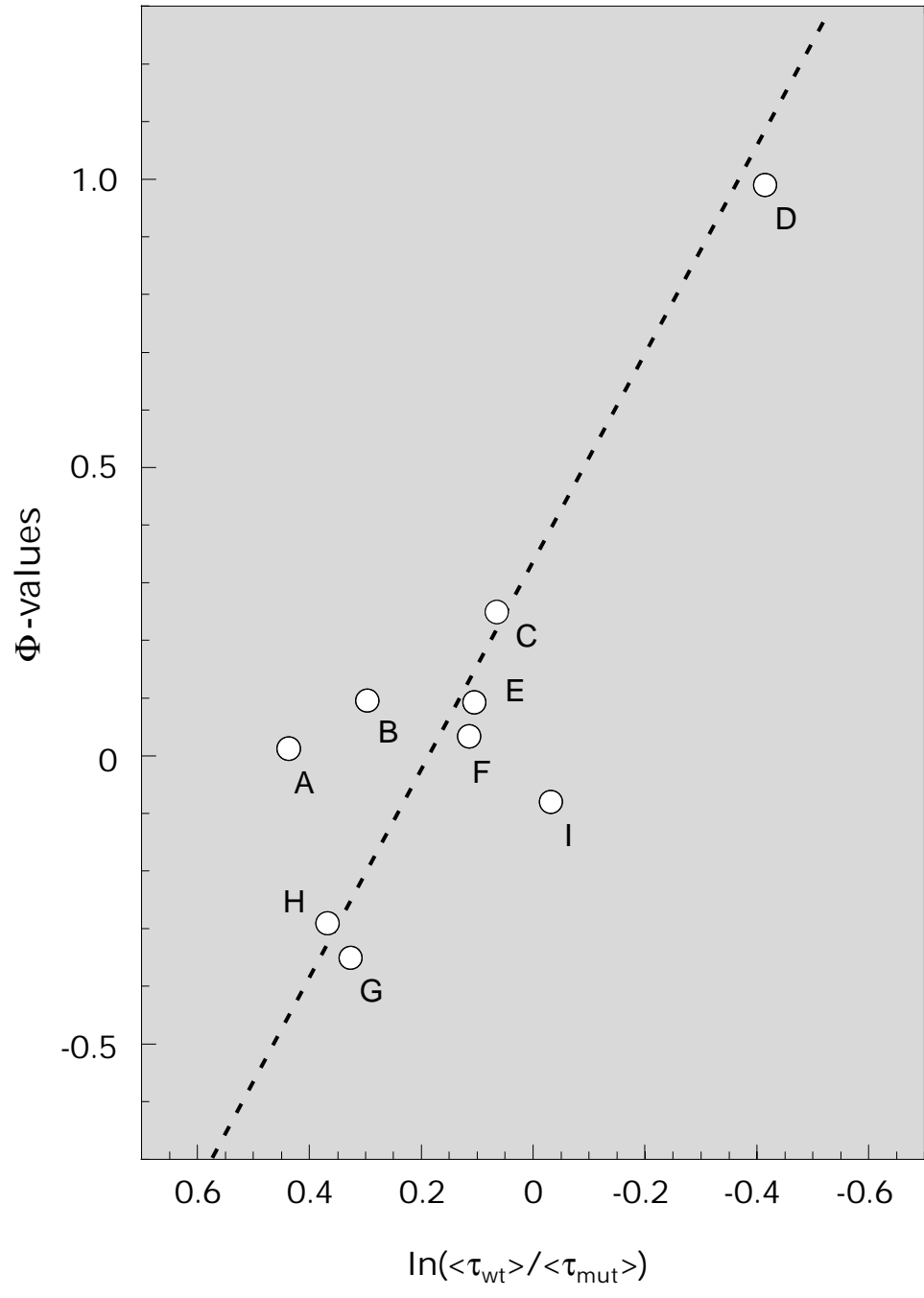
$\Delta\Delta G_{U-I}$ ,  $\Delta\Delta G_{I-I}$  and  $\Delta\Delta G_{U-F}$  are the difference energies defined in the text and paper I of the series, and  $\phi_1$  and  $\phi_2$  are the  $\phi$  values for folding in water. The values of  $\Delta\Delta G_{U-F}$  have been modified from paper II of this series (Table 3) by using the data from Table 7 of that paper to correct for the effect of ~4 M-urea.

†The energies are measured with a standard error of  $\pm 0.15$  kcal mol<sup>-1</sup>.

‡Taken from Matouschek *et al.* (1990).

§Taken from Horovitz *et al.* (1991).

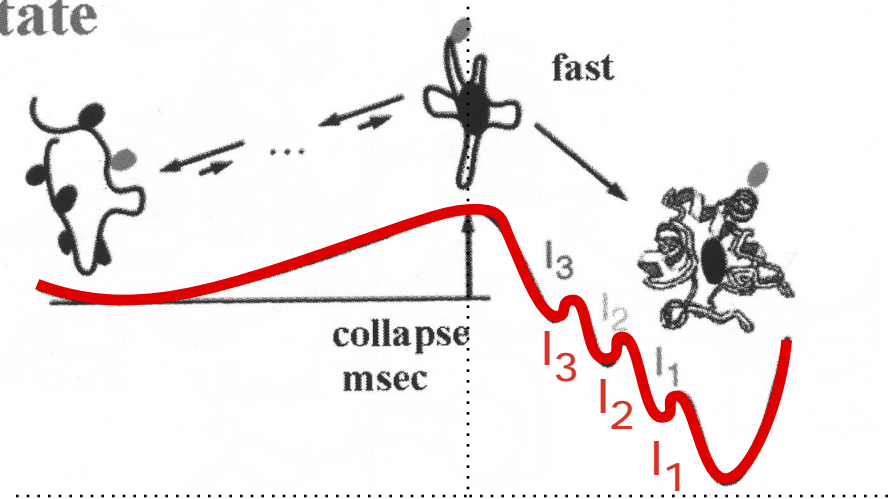




# Pathway Model: Collapse comes first, then detailed structure.

Englander, SW. Ann Rev Biophys Biomol Struct 29:213 (2000)

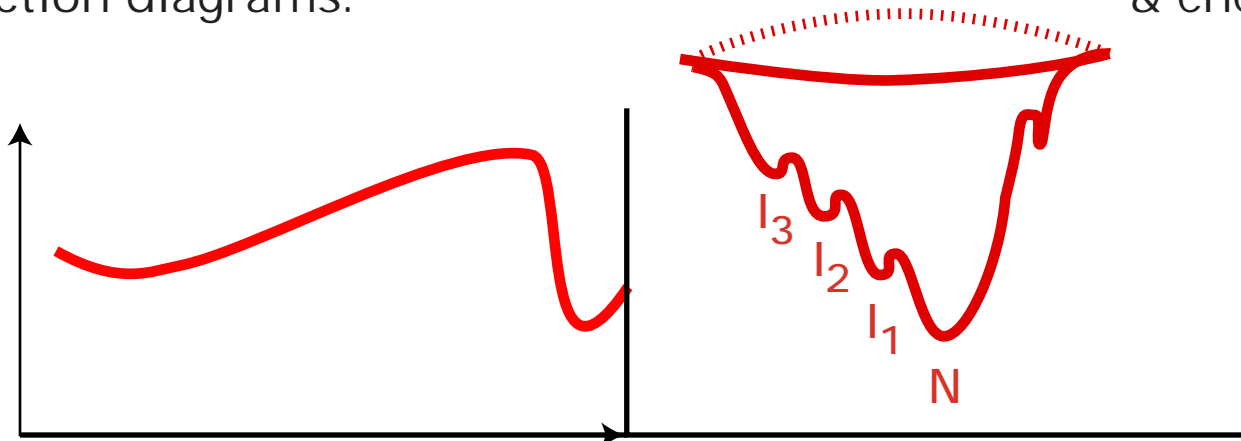
## 2 State



# Funnel Model: Collapse and structure formation are simultaneous

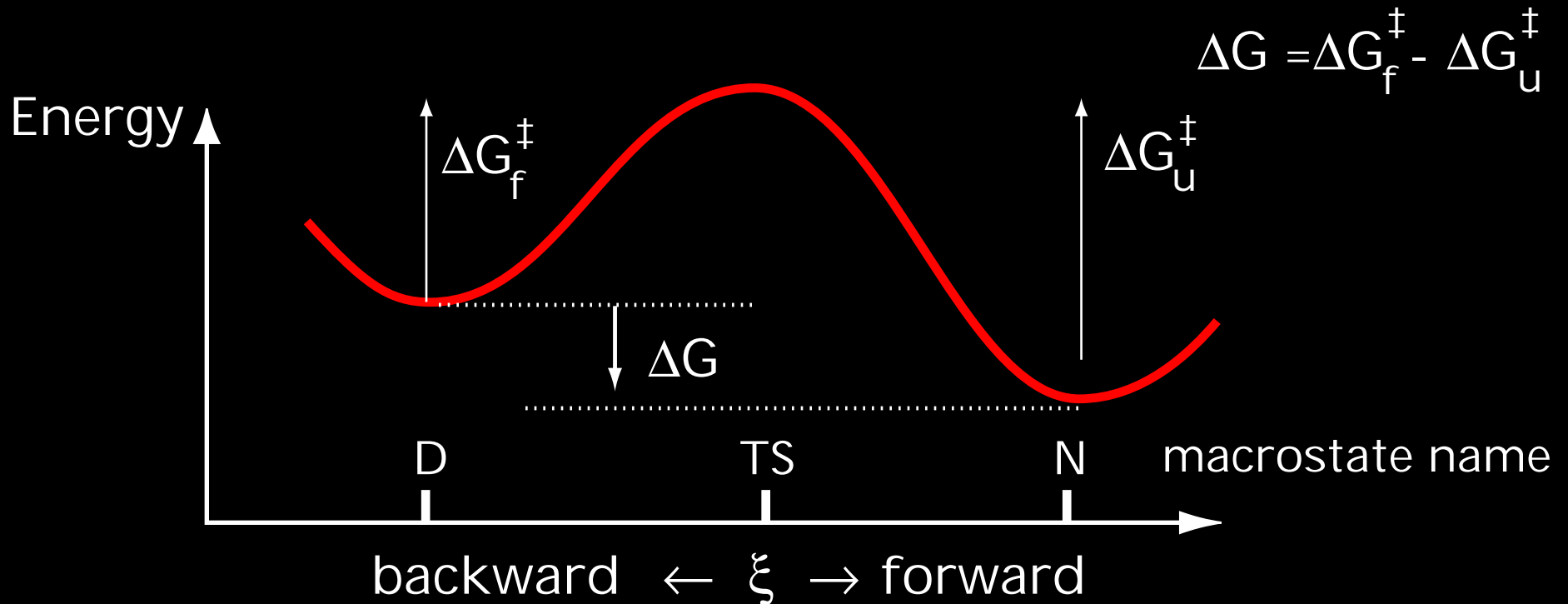
This side is about kinetics, reaction diagrams:

This side is about thermodynamics & energy landscapes:





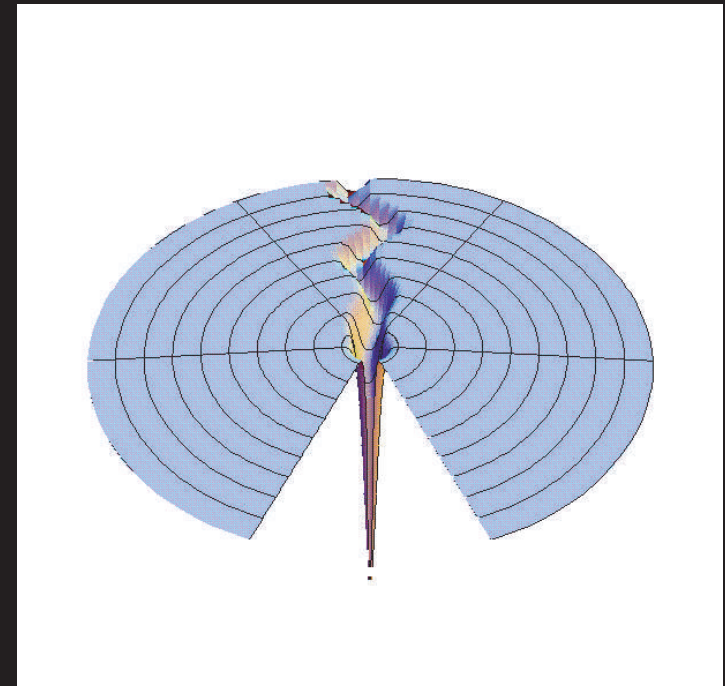
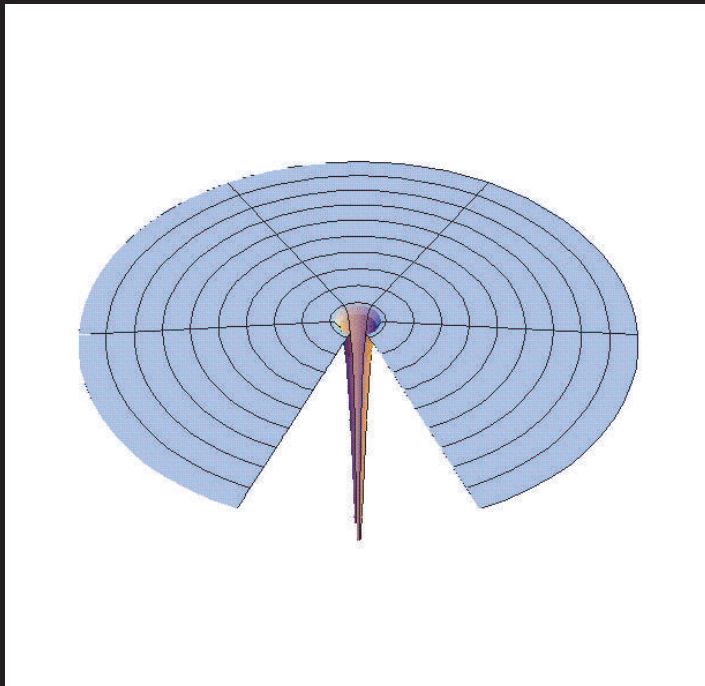
# The Classical Transition State



localized ensembles  $(C_1 C_2 C_3) \dots (C_i C_{i+1}) \dots (C_N)$  microstates

- Macrostates are localized ensembles of microstates.
- States are in series and don't overlap.
- Single reaction coordinate. Forward & backward directions.

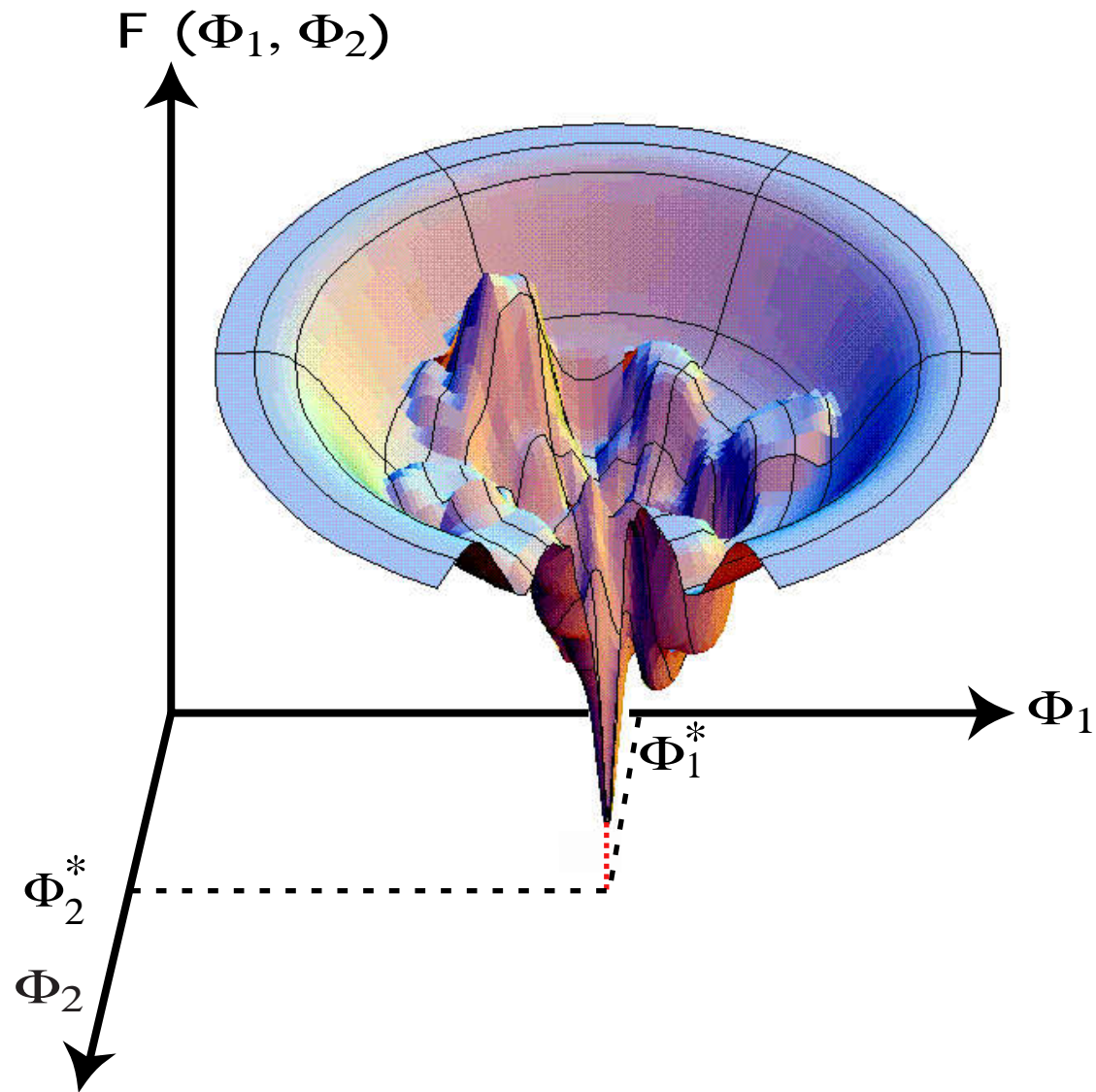
# Levinthal's Paradox



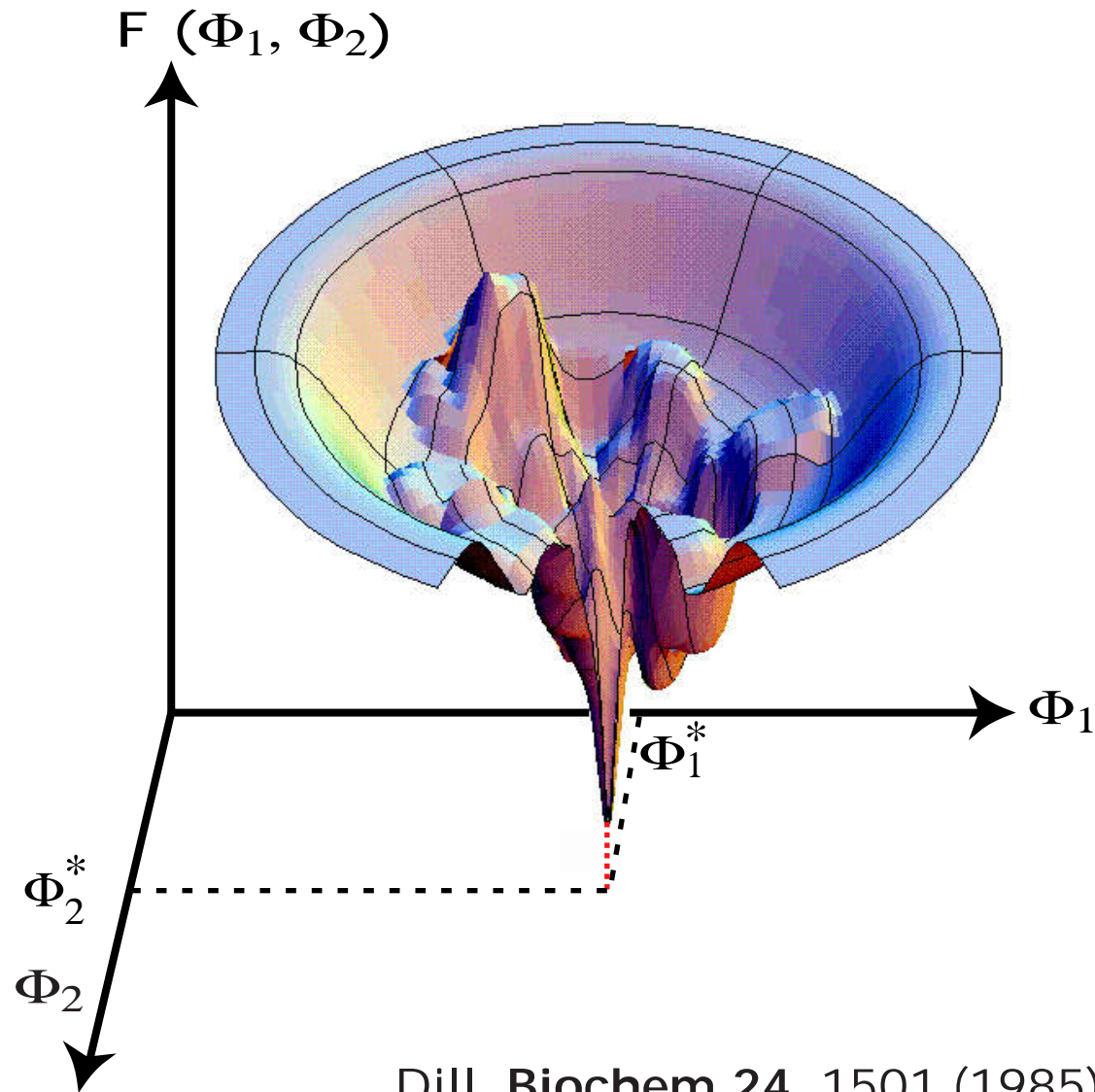
- Proteins find global min (Anfinsen)
- How so fast? (Levinthal)

Hue Sun Chan (Nat Struct Biol 4:10 (1997))

# Energy Landscape



# Protein Folding Energy Landscape



Dill **Biochem** 24, 1501 (1985)

Bryngelson & Wolynes **PNAS** 84, 7524 (1987)