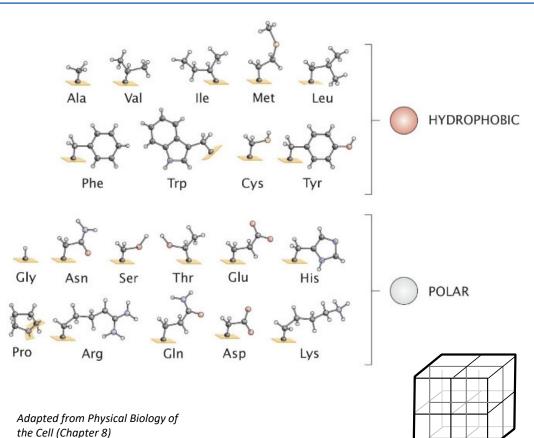
## **HP-models of protein folding**



categorization of amino acids as hydrophobic (H) or polar (P)

→ <u>2 letter alphabet</u> allows an abstract model of structure formation

Of note: finer categorization possible -> charged, acidic, basic, helix forming, etc.

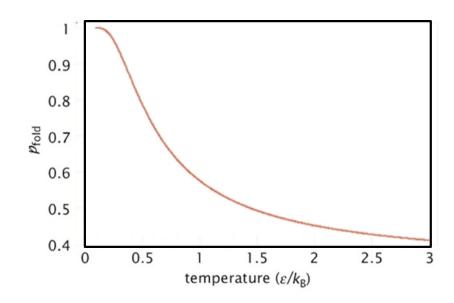
Quiz: How many HP sequences possible on a 3x3x3 lattice?

How many different HP protein configurations are possible?

Note: there possible 103'346 compact structures.

6x2 lattice model p. 1

## Temperature dependence of folding



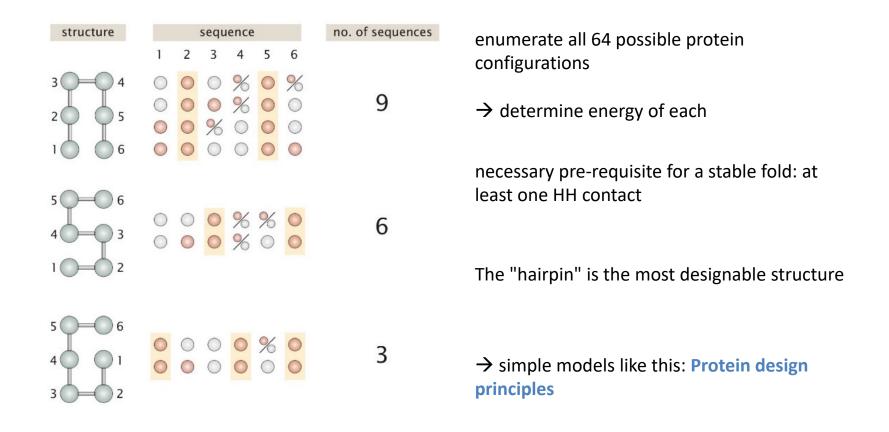
$$p_{fold} = \frac{e^{-2\beta\varepsilon}}{e^{-2\beta\varepsilon} + 2e^{-4\beta\varepsilon}} = \frac{e^{-2\beta\varepsilon}}{Q}$$

### sigmoidal transition

reminiscent of real protein denaturation

Adapted from Physical Biology of the Cell (Chapter 8)

# Identification of protein-like (foldable) structures



## Real structures: Simple tertiary structure motifs



Secondary structure elements form the **elementary motifs** of protein structure.

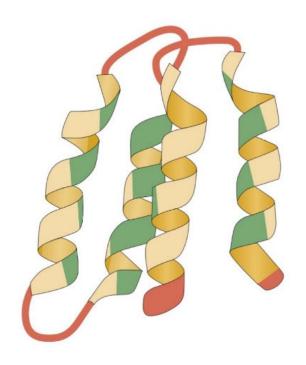
#### Quiz:

The sequence of GCN4 is given as follows: RMKQLEDKVEELLSKNYHLENEVARLKKLVGER

how can it be immediately recognized that this folds into a coiled coil?

GCN4 coiled coil domain PDB: 1zik

# Helix bundles: Inherently designable structures



Hecht et al. Protein Sci 2004

### **Secondary structure**

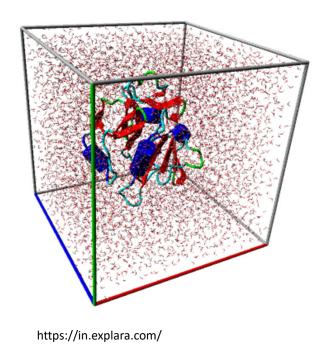
→ fixed, helical

### **Tertiary structure:**

follows HP rules

Provides a platform, on which further functionality can be designed

# Force field for protein structure



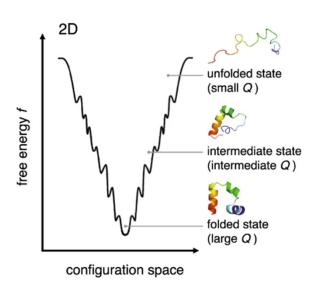
# Force field for protein structure evaluation:

$$V = \sum_{bonds} a_{\alpha} (x_i - x_{i0})^2$$

$$+ \sum_{bond \text{ angles}} b\beta (\theta_i - \theta_{i0})^2$$

$$+ \sum_{charges} \frac{Z_i Z_j e^2}{D(r) r_{ij}}$$

$$+ \sum_{neutral \text{ atoms}} 4d_{\delta} \left[ \left( \frac{Ai_j}{ri_j} \right) 12 - \left( \frac{B_{ij}}{r_{ij}} \right) \right]$$



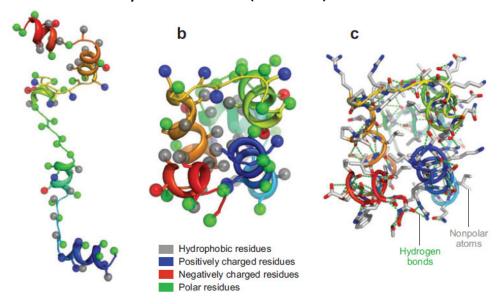
https://www.nature.com/articles/s41598-019-50825-6

Goal: Minimize the configurational energy, find the global minimum

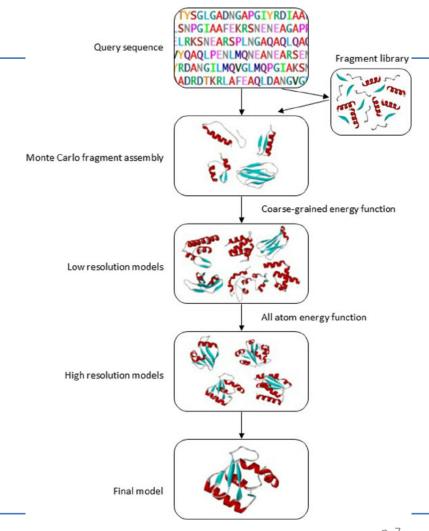
4-Secondary structure formation p. 6

## Protein structure prediction / design

Design from fragment libraries, followed by refinement (Rosetta)

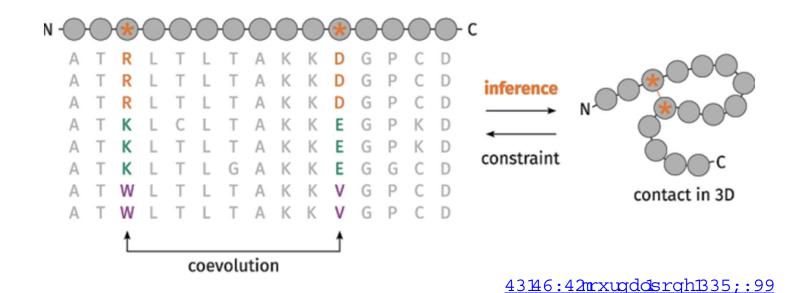


Das & Baker, Annu Rev Biochem 2008



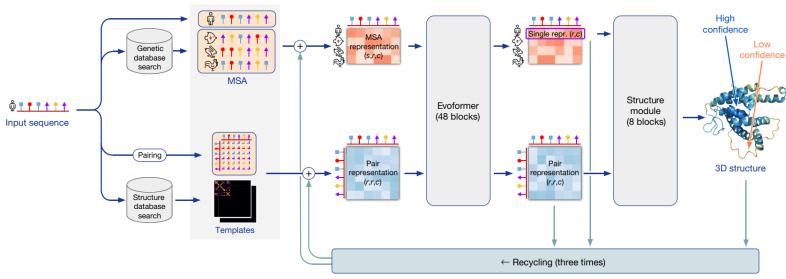
2-Protein conformations

# Structural information from sequence: Co-evolution analysis



4-Secondary structure formation p. 8

## Protein structure prediction – ML approaches



#### Input:

- primary sequence of target protein
- multiple sequence alignments of homologues
- structural information of homologues (PDB)

#### Process 1:

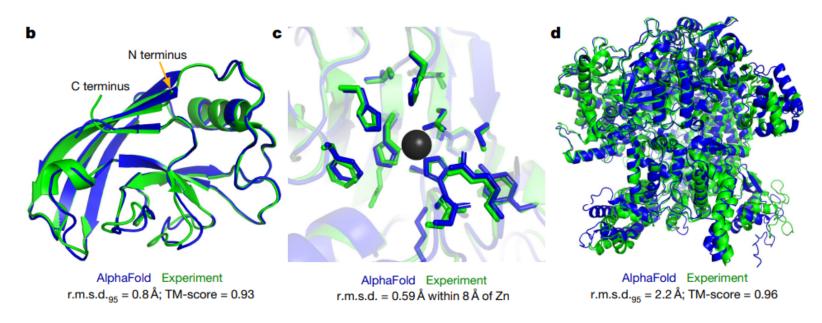
- MSA representation
- Residue pair representation

#### Process 2:

- 3D structure representation: rotation & translation of each residue
- refinement

AlphaFold2 - Nature 2021

# **Protein structure prediction – ML approaches**

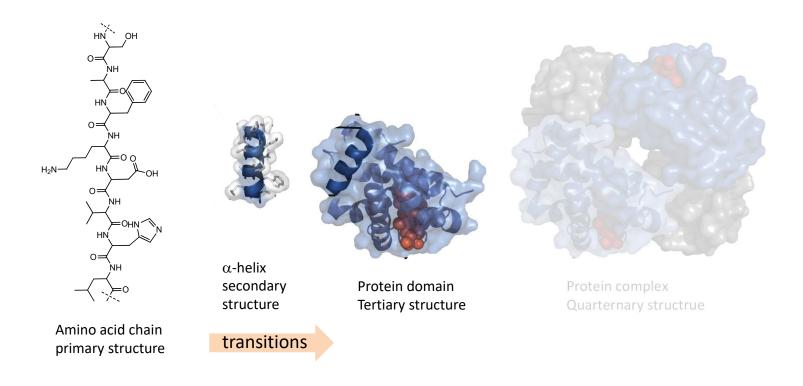


#### Result:

- highly accurate structure prediction
- low backbone RMSD
- correct residue orientation

AlphaFold - Nature 2021

# Protein structure – A thermodynamic view

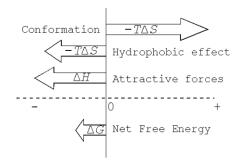


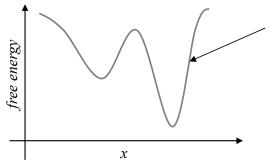
1-Protein structure and stability p. 11

# A free energy surface to understand protein structure

using a basic chemistry principles, the free energy surface, to describe state transitions in proteins

#### Free energy:





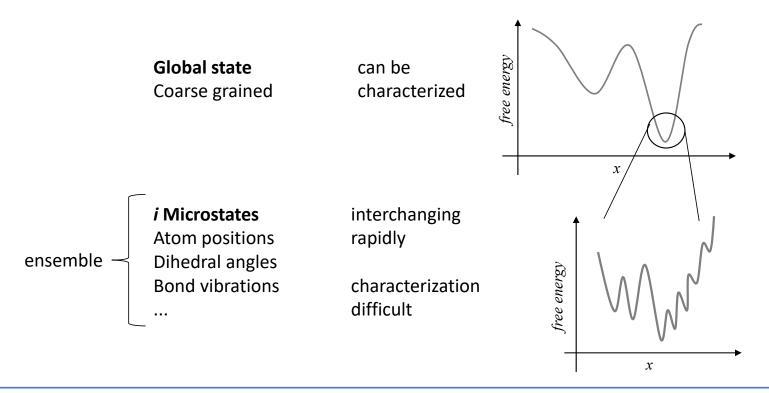
each (populated) protein conformation falls somewhere on this line

#### some reaction coordinate:

solvent accessibility compactness % hydrogen bonds saturated

# **Global states in proteins**

For a biophysical understanding  $\rightarrow$  simplifications are required.



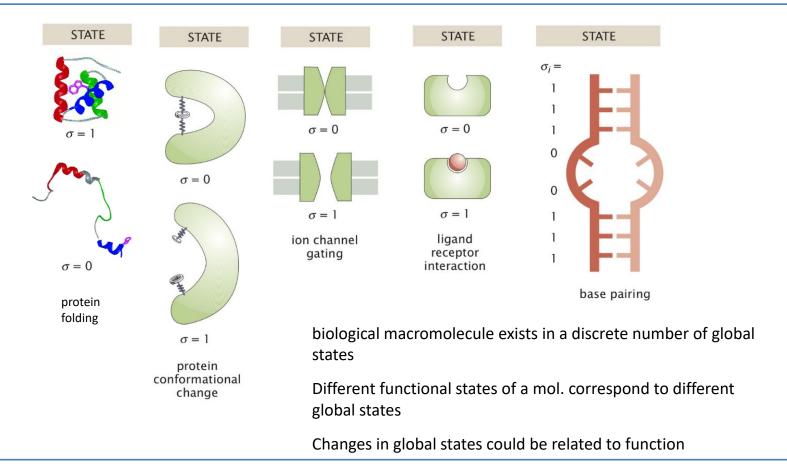
### **Global states in proteins**

### **Biology: Global states are useful concept**

- We can assume that any biological macromolecule exists in a discrete number of global states, dependent e.g. on the environment
- Different functional states of a protein correspond to different global states
- Changes in global states could be related to function

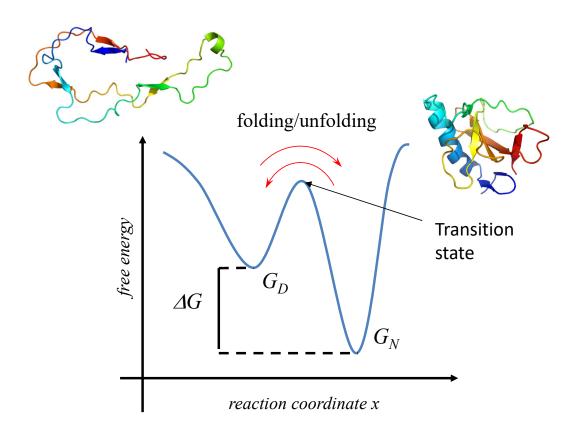
As discussed earlier, complex systems such as proteins can be treated with statistical thermodynamics: This allows to extract useful parameters.

# Motivation – biomolecules exist in multiple states



8-Two state transitions p. 15

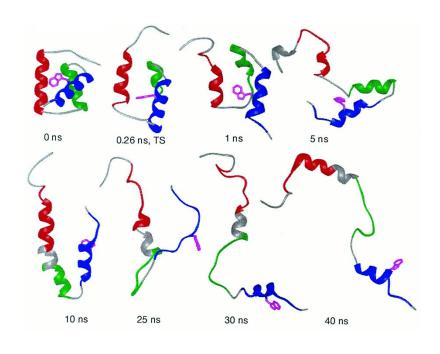
# Global states in a protein: N and D



### Quiz:

What could be a measure for the reaction coordinate x? i.e. what could x represent?

## **Protein denaturation process**



Mayor & Fersht, PNAS 2000

#### can be reversible:

- Loss of defined tertiary structure
- Partial loss / change in secondary structure
- exposure of buried hydrophobic amino acids

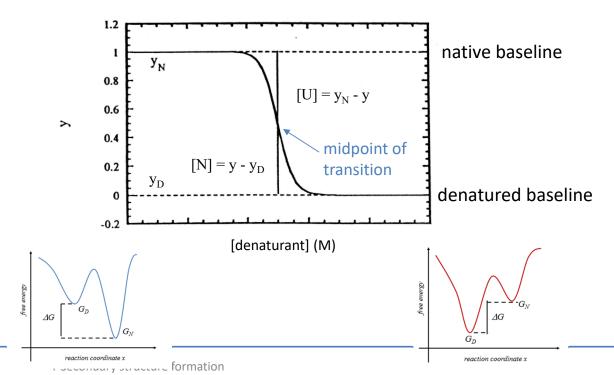
#### or irreversible

- at high protein concentration, aggregation
- can make sick (prions)

# Denaturation of globular, monomeric protein (2-states)

### Isolated protein in solution

We monitor one variable (e.g. tyrosine fluorescence) and vary another variable (e.g. temperature or a chemical denaturant)



Protein denaturation equilibrium:

$$N \stackrel{K}{\rightleftharpoons} D$$

Measurement variable y:

$$y = [N] y_N + [D] y_D$$

Determination of K throughout the transition:

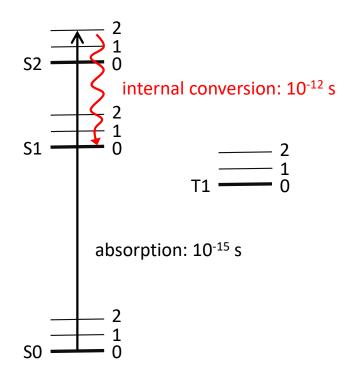
$$K = \frac{[D]}{[N]} = \frac{y_N - y}{y - y_D}$$

### How can we observe two-state transitions?

#### Any methods that can distinguish between $oldsymbol{U}$ and N

- Absorbance (e.g. Trp, Tyr) due to change in the micro-environment
- Fluorescence (Trp)-difference in emission spectrum & intensity, due to change in microenvironment
- Circular dichroism (far or near UV), due to change in asymmetric environment of fluorophores
- Calorimetry (DSC), due to change in heat capacity and heat absorption
- NMR spectroscopy
- Gel electrophoresis or size exclusion chromatography
- Catalytic activity, functional assays
- External probes (chromophores, fluorophores)

### Lifetimes of excited states and emission



### **Absorption**

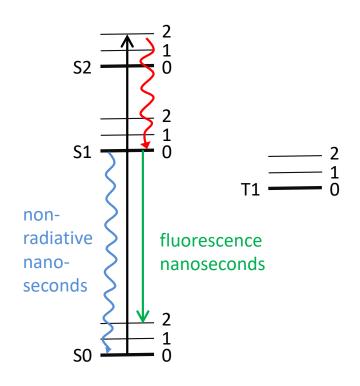
time: 10<sup>-15</sup> s, corresponds to the time it takes for light wave to pass molecule

#### **Internal conversion**

Molecule returns to lowest singlet state, lowest vibrational niveau

time: 10<sup>-12</sup> s

### Lifetimes of excited states and emission



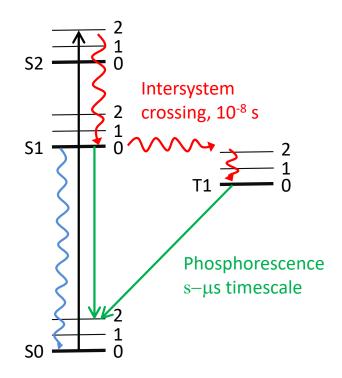
#### **Fluorescence**

time: 10<sup>-8</sup> - 10<sup>-10</sup> s

### Nonradiative, internal conversion

time: 10<sup>-8</sup> - 10<sup>-10</sup> s

### Lifetimes of excited states and emission



### **Intersystem crossing**

time: 10<sup>-8</sup> s

inversion of the electron spin

### **Phosphorescence**

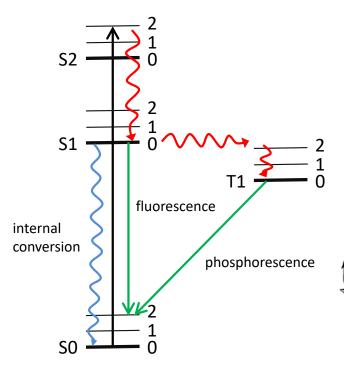
time:  $10^2 - 10^{-4}$  s

requires again inversion of e- spin

forbidden transition, thus long

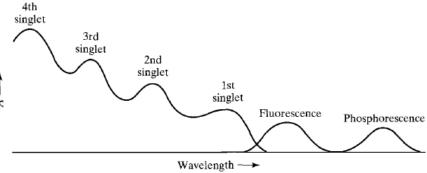
timescale

# **Absorption and emission spectra**

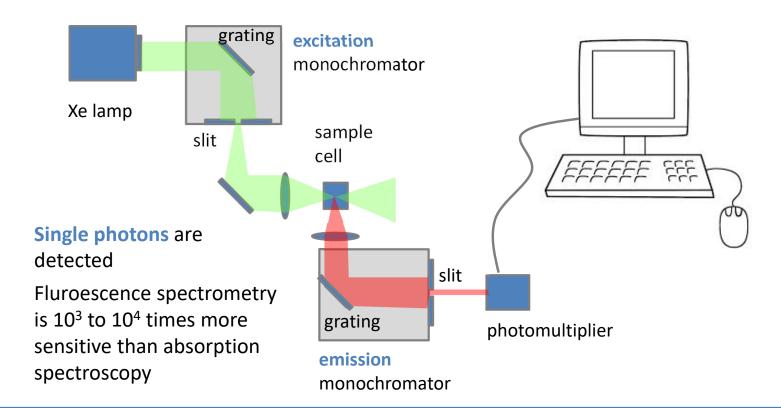


### Spectra:

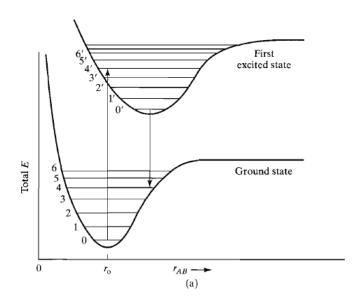
Fluorescence is red-shifted to the absorption spectrum phophorescence is at even higher wavelengths

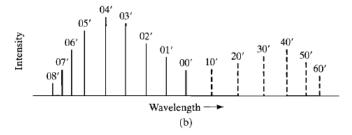


# **Measuring fluorescence**



## Fluorescence spectrum





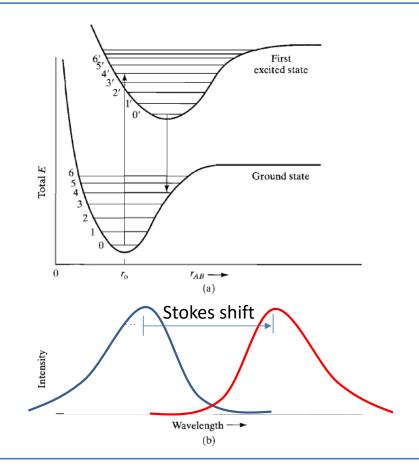
### Shape of fluroescence spectra:

The arrows denote the most probable transitions from ground state -> s1 s1 -> ground state

The fluorescence spectrum is a mirror image of the absorption spectrum

the different in absorbance and fluorescence maximum is the **Stokes shift** 

## Fluorescence spectrum



### Shape of fluroescence spectra:

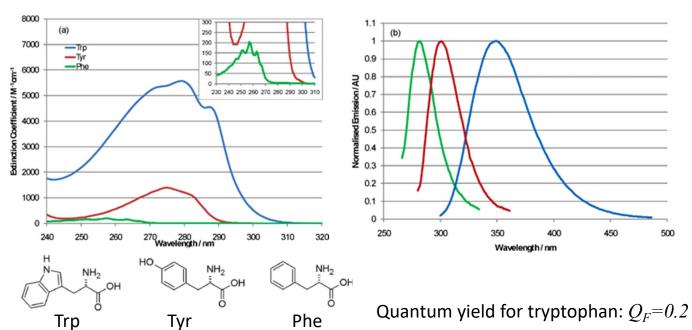
The arrows denote the most probable transitions from ground state -> s1 s1 -> ground state

The fluorescence spectrum is a mirror image of the absorption spectrum

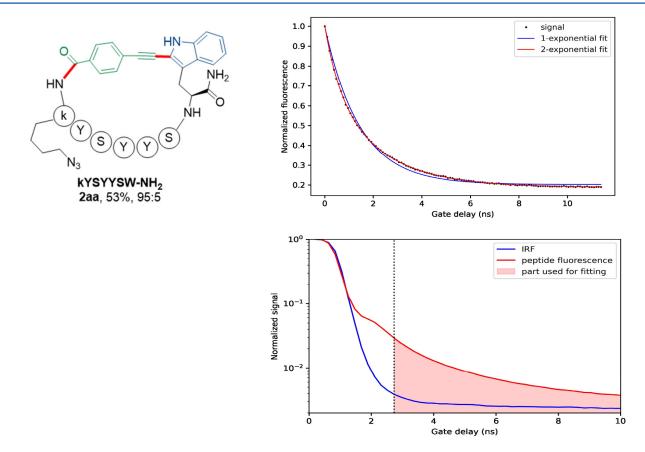
the different in absorbance and fluorescence maximum is the **Stokes shift** 

# Amino acids: Fluroescence spectra

### Absorbance and fluroescence spectra of aromatic amino acids



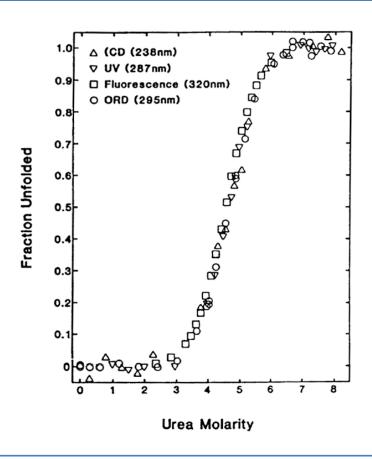
## Fluorescence lifetime



Xing-Yu Liu, Nathan Ronceray

4-Secondary structure formation p. 28

## Denaturation of globular, monomeric protein: RNase T1



$$N \longleftrightarrow D$$

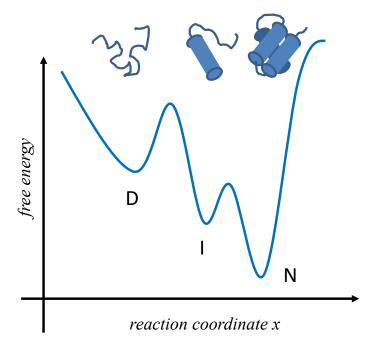
$$y = [N] y_N + [D] y_D$$

$$K_D = \frac{[D]}{[N]} = \frac{y_N - y}{y - y_D}$$

different parameters completely overlap

normalized transitions ( $\theta_N = [N] / ([N] + [D])$ ) overlap

# Three (or more) state equilibrium transitions

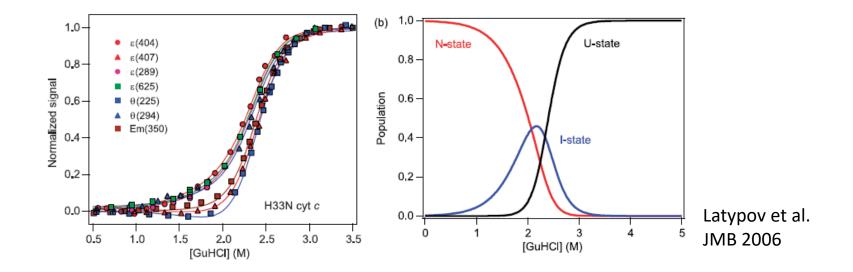


In many proteins, intermediates are populated.

Intermediates include proteins, where only partial structure has formed.

This complicates the analysis.

# Multistate transitions in cytochrome c unfolding

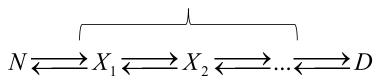


If different parameters are observed, unfolding traces do no longer coincide.

Intermediates accumulate during the unfolding transition

### **Multi-state transition**

### unfolding intermediates



apparent stability, eludicated by summing the individual contributions

$$K_{app} = K_{D} \frac{1 + \sum d_{i} \frac{K_{i}}{K_{D}}}{1 + \sum (1 - d_{i})K_{i}} = \frac{K_{D} + \sum d_{i}K_{i}}{1 + \sum (1 - d_{i})K_{i}} \qquad d_{i} = \frac{y_{i} - y_{N}}{y_{D} - y_{N}}, \quad 0 < d_{i} < 1$$

$$d_i = \frac{y_i - y_N}{y_D - y_N}, \quad 0 < d_i < 1$$

$$K_i = \frac{[X_i]}{[N]}$$
  $K_D = \frac{[D]}{[N]}$ 

## **Denaturation with chemical agents**

#### Molecular mechanism of denaturant action:

#### 1. Direct effect:

H-bonding to polar groups, mostly the protein backbone, thereby competing with internal H-bonds

If charged: Interaction with ionic groups

#### 2. Indirect effect:

Alteration of water structure and thus diminishment of the hydrophobic effect Facilitation of the exposure of hydrophobic groups.

guanidinium chloride

$$H_2N$$
 $NH_2$ 
urea

### **Protein denaturation with denaturants**

The **effect of denaturants** on the free energy is linear (empirical finding)

$$\Delta G^0 = \Delta G_{H_2O}^0 + m \text{ [denaturant]}$$

The free energy of unfolding can thus be determined by an extrapolation to **0** M denaturant

200 A

100

0.0 2.0 4.0 6.0

[GdnHCI] (M)

1.8 B

4.5

4.0

[GdnHCI] (M)

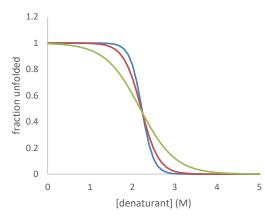
Example: Chymotrypsin inhibitor 2 (CI2)

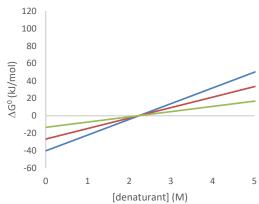
7 - Protein structure p. 34

-0.2

# Sensitivity to denaturant

#### simulated unfolding curves





#### **Parameters**

— 
$$\Delta G_0 = -40 \text{ kJ/mol}, \quad m = 18 \text{ kJ/mol/M}$$

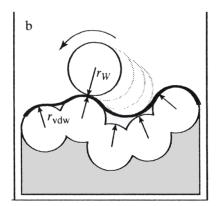
— 
$$\Delta G_0 = -26.5 \text{ kJ/mol}, m = 12 \text{ kJ/mol/M}$$

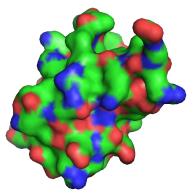
— 
$$\Delta G_0 = -13.1 \text{ kJ/mol}, m = 6 \text{ kJ/mol/M}$$

### molecular meaning of m-value:

- proportional of buried ASA
- proteins with large hydrophobic core exhibit high m-value
- the higher the m-value the stronger the dependence of a folding transition to denaturant (steepness)

# M-values are proportional to change in ASA





### **Calculating ASA**

- a water-sized sphere is rolled across the chemical structure keeping VdW radii
- the accessible surface corresponds to the ASA

### molecular meaning of m-value:

- proportional to change in ASA
- proteins with large hydrophobic core exhibit high m-value
- the higher the m-value the stronger the dependence of a folding transition to denaturant (steepness)

8-Two state transitions p. 36

## **Small quiz:**

- We have a small protein, whose standard free energy of folding (stability) is  $\Delta G^o_f = 20 \ kJ/mol$
- Upon addition of guanidinium hydrochloride (GdmHCl), the protein denatures reversibly
- Fluorescence measurements determined a mid-point of the transition at 2 M GdmHCl
- What is the *m-value* for this protein?
- If we compare this to a different protein with  $m = 5 \, kJ/mol/M$ , what can we say about its structure?