

**1.021, 3.021, 10.333, 22.00 Introduction to Modeling and Simulation**  
**Spring 2011**

**Part I – Continuum and particle methods**

# **Applications to biophysics and bionanomechanics**

*Lecture 10*

**Markus J. Buehler**

**Laboratory for Atomistic and Molecular Mechanics  
Department of Civil and Environmental Engineering  
Massachusetts Institute of Technology**



# Content overview

## I. Particle and continuum methods

Lectures 1-13

1. Atoms, molecules, chemistry
2. Continuum modeling approaches and solution approaches
3. Statistical mechanics
4. Molecular dynamics, Monte Carlo
5. Visualization and data analysis
6. Mechanical properties – application: how things fail (and how to prevent it)
7. Multi-scale modeling paradigm
8. Biological systems (simulation in biophysics) – how proteins work and how to model them

## II. Quantum mechanical methods

Lectures 14-26

1. It's A Quantum World: The Theory of Quantum Mechanics
2. Quantum Mechanics: Practice Makes Perfect
3. The Many-Body Problem: From Many-Body to Single-Particle
4. Quantum modeling of materials
5. From Atoms to Solids
6. Basic properties of materials
7. Advanced properties of materials
8. What else can we do?

# Overview: Material covered so far...

- **Lecture 1: Broad introduction to IM/S**
- **Lecture 2: Introduction to atomistic and continuum modeling** (multi-scale modeling paradigm, difference between continuum and atomistic approach, case study: diffusion)
- **Lecture 3: Basic statistical mechanics – property calculation I** (property calculation: microscopic states vs. macroscopic properties, ensembles, probability density and partition function)
- **Lecture 4: Property calculation II** (Monte Carlo, advanced property calculation, introduction to chemical interactions)
- **Lecture 5: How to model chemical interactions I** (example: movie of copper deformation/dislocations, etc.)
- **Lecture 6: How to model chemical interactions II** (EAM, a bit of ReaxFF—chemical reactions)
- **Lecture 7: Application to modeling brittle materials I**
- **Lecture 8: Application to modeling brittle materials II**
- **Lecture 9: Application – Applications to materials failure**
- **Lecture 10: Applications to biophysics and bionanomechanics**

# Lecture 10: Applications to biophysics and bionanomechanics

## Outline:

1. Protein force fields
2. Single molecule mechanics
3. Fracture of protein domains – Bell model

## Goal of today's lecture:

- Force fields for organic materials, and specifically proteins
- Basic introduction into modeling of biological materials
- Fracture model for protein domains

# 1. Force fields for organic chemistry - how to model proteins

# Significance of proteins

- Proteins are **basic building blocks of life**
- **Define tissues, organs, cells**
- Provide a **variety of functions and properties**, such as mechanical stability (strength), elasticity, catalytic activity (enzyme), electrochemical properties, optical properties, energy conversion
- Molecular simulation is an **important tool in the analysis of protein structures and protein materials**

***Goal here:** To train you in the fundamentals of modeling techniques for proteins, to enable you to carry out protein simulations*

***Explain the significance of proteins (application)***

# Human body: Composed of diverse array of protein materials

**Eye's cornea**  
(collagen material)

**Skin** (complex composite of collagen, elastin)

**Cells** (complex material/system based on proteins)



Image courtesy of NIH.

Image removed due to copyright restrictions.

[Human Body 3D View™](http://www.humanbody3d.com/) image of whole bodies.

**Muscle tissue**  
(motor proteins)

**Nerve cells**

**Blood vessels**

**Tendon**  
(links bone, muscles)

**Cartilage** (reduce friction in joints)

**Bone** (structural stability)

# Cellular structure: Protein networks

**Cell nucleus**

**Actin network**

**Microtubulus**  
(e.g. cargo)

**Vimentin**  
(extensible,  
flexible, provide  
strength)

= cytoskeleton



Image courtesy of NIH.



# Protein structures define the cellular architecture

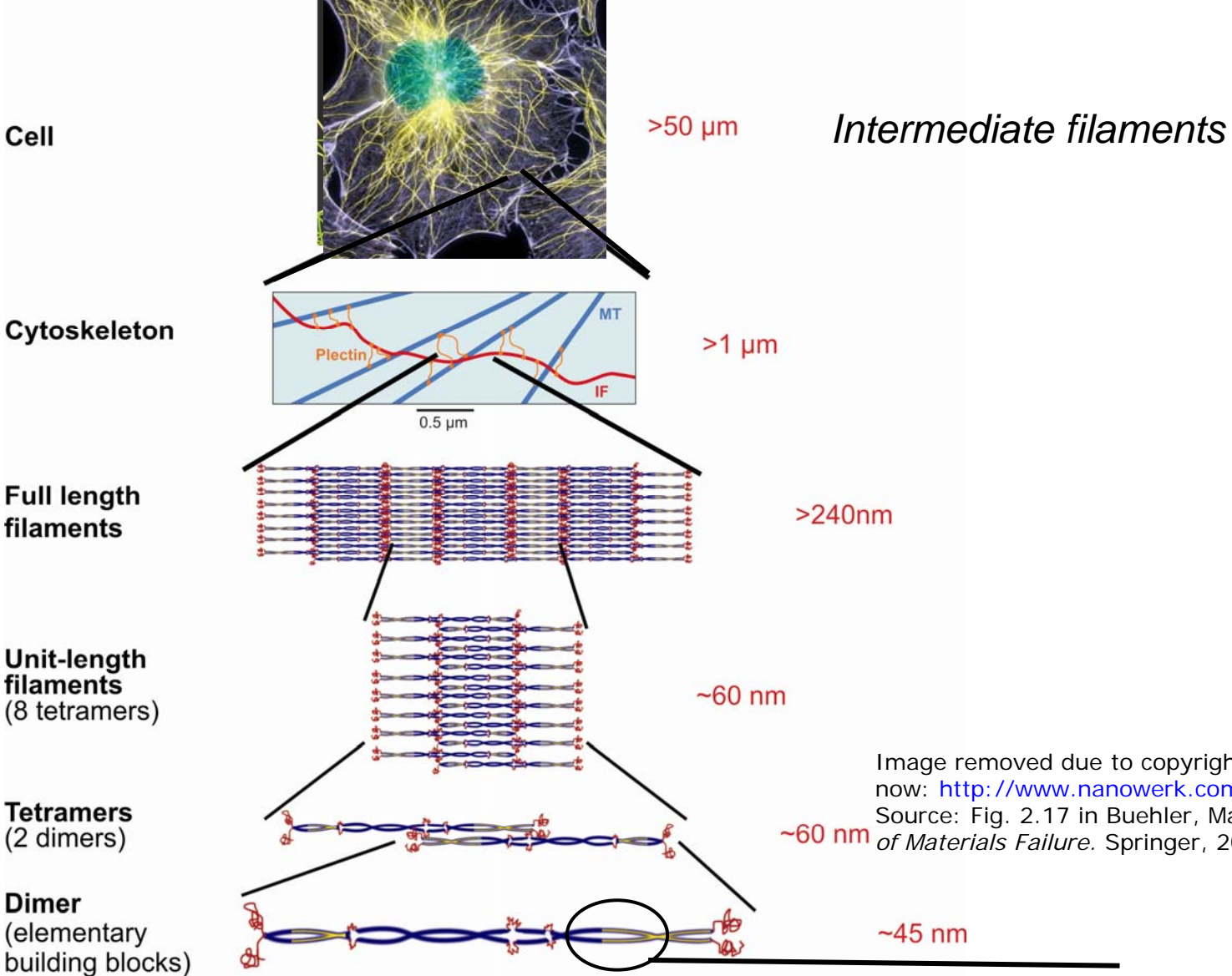
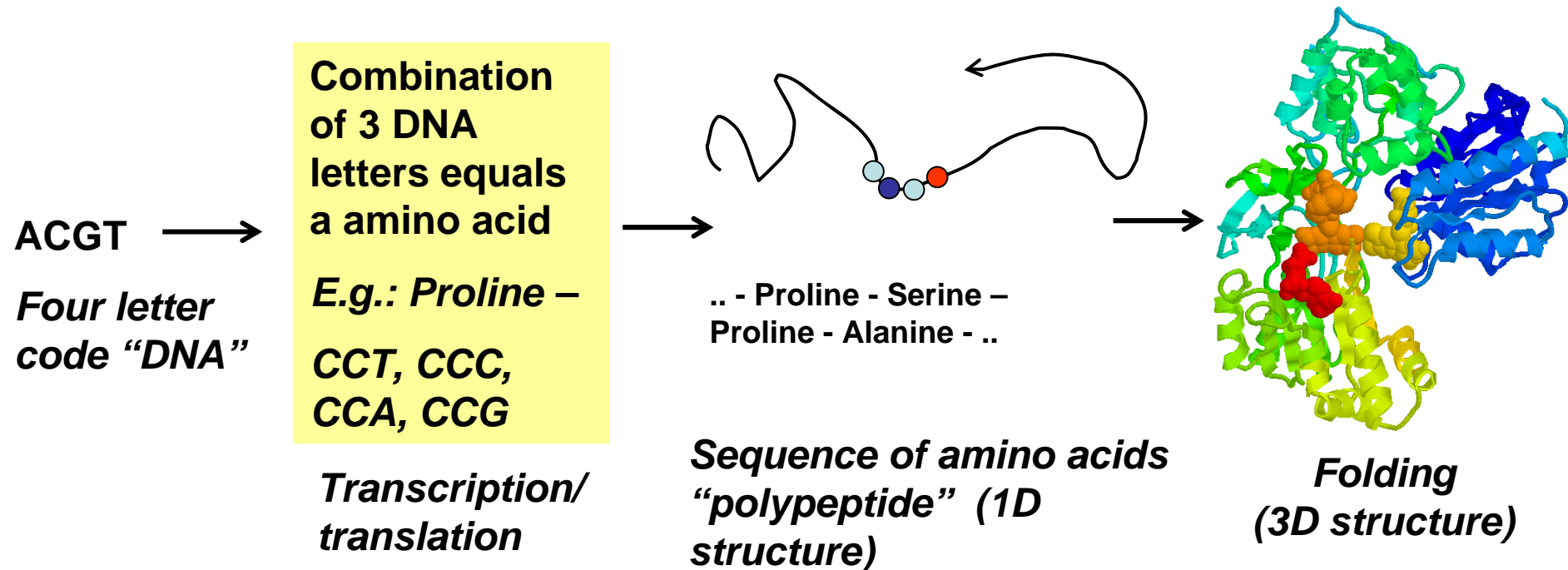


Image removed due to copyright restrictions; see image now: [http://www.nanowerk.com/spotlight/id2878\\_1.jpg](http://www.nanowerk.com/spotlight/id2878_1.jpg). Source: Fig. 2.17 in Buehler, Markus J. *Atomistic Modeling of Materials Failure*. Springer, 2008.

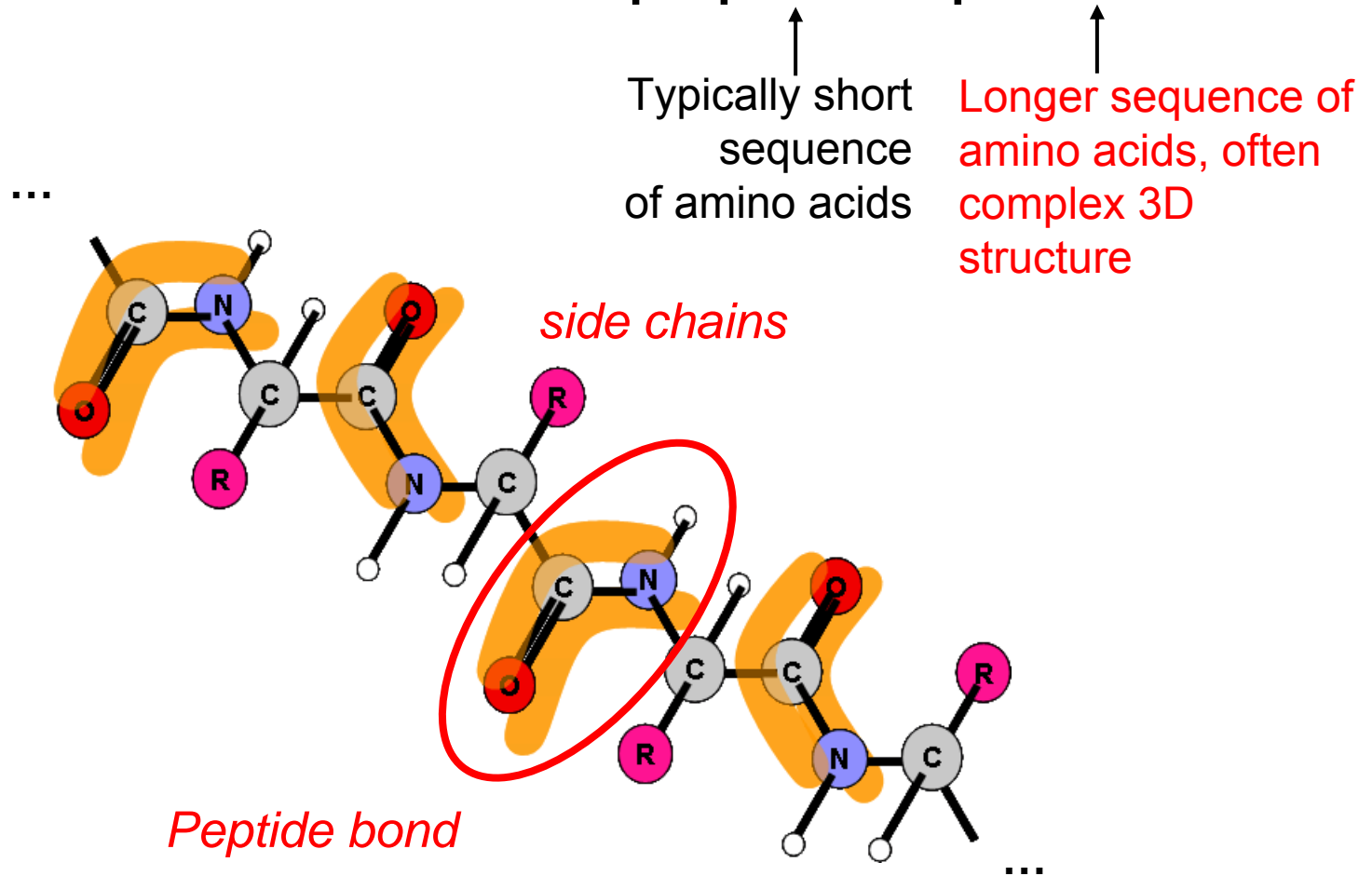
# How protein materials are made – the genetic code

- Proteins: Encoded by DNA (three “letters”), utilize 20 basic building blocks (amino acids) to form polypeptides
- Polypeptides arrange in complex folded 3D structures with specific properties

**1D structure transforms into complex 3D folded configuration**



# Chemical structure of peptides/proteins



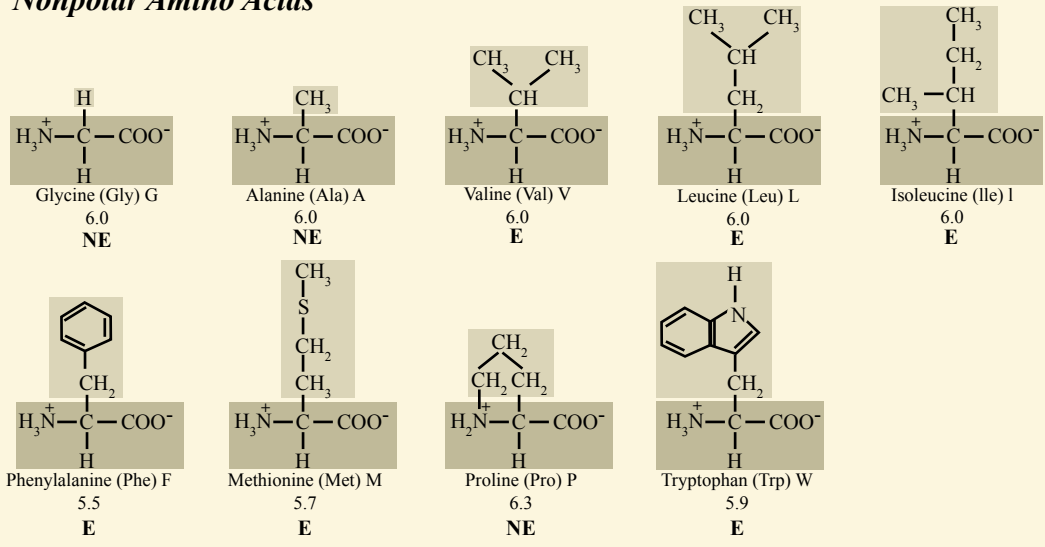
© source unknown. All rights reserved. This content is excluded from our Creative Commons license. For more information, see <http://ocw.mit.edu/fairuse>.

R = side chain, one of the 20 natural amino acids

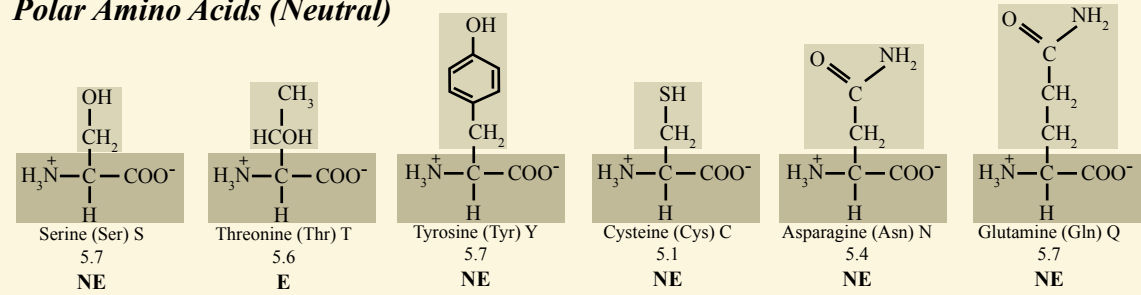
**20 natural amino acids differ in their side chain chemistry**

R

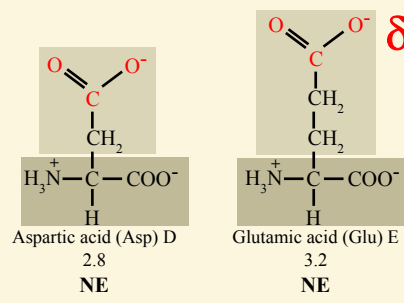
### Nonpolar Amino Acids



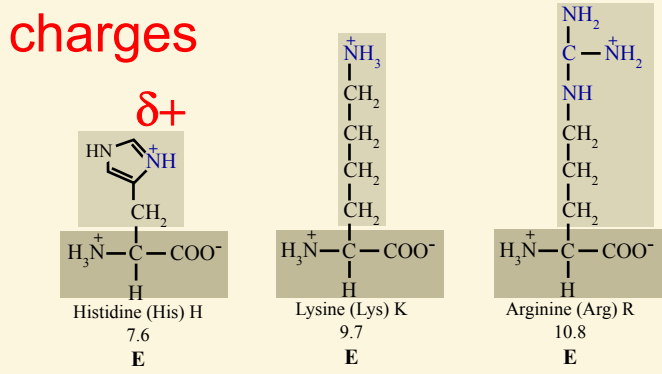
### Polar Amino Acids (Neutral)



### Acidic Amino Acids



### Basic Amino Acids



δ- charges

δ+

Forms peptide bond →

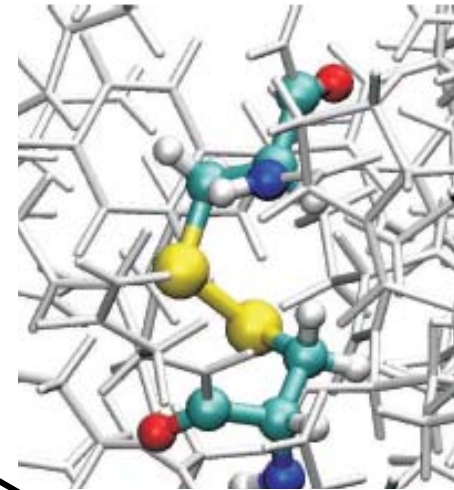
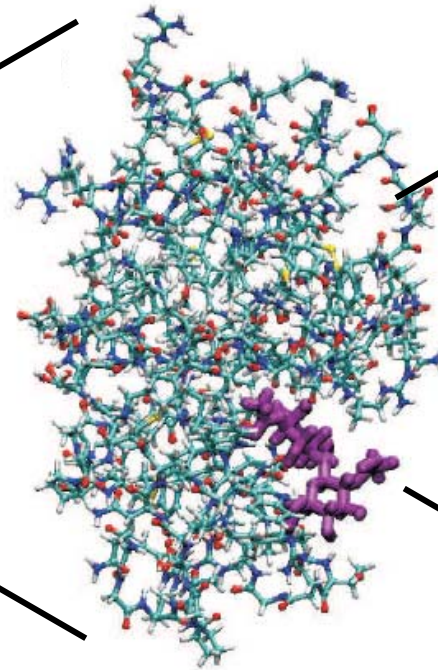
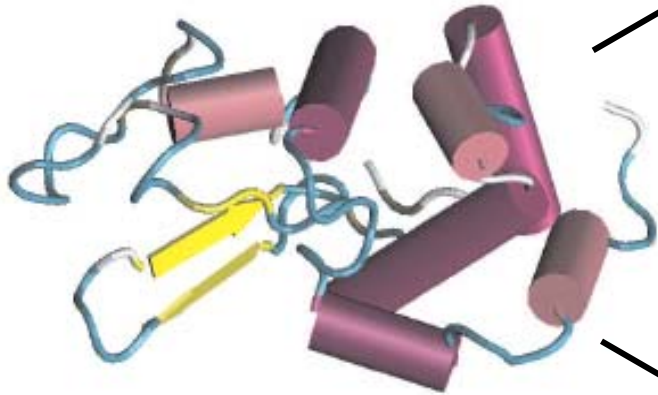
There are 20 natural amino acids

Difference in side chain, R

# Chemistry, structure and properties are linked

## Chemical structure

## Cartoon



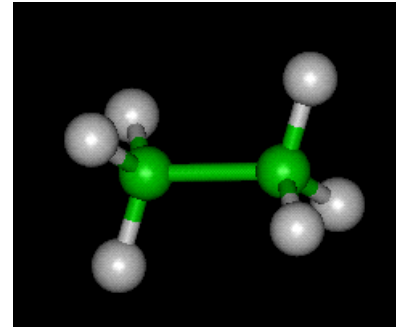
## Presence of various chemical bonds:

- Covalent bonds (C-C, C-O, C-H, C-N..)
- Electrostatic interactions (charged amino acid side chains)
- H-bonds (e.g. between H and O)
- vdW interactions (uncharged parts of molecules)

# Concept: split energy contributions

$$U_{total} = U_{Elec} + U_{Covalent} + U_{Metallic} + U_{vdW} + U_{H-bond}$$

*(Note:  $U_{Covalent}$  is circled in red in the original image. A red arrow points from the circle to the text "=0 for proteins".)*



Ethane  
 $C_2H_6$

## Covalent bond described as

1. Bond stretching part (energy penalty for bond stretching)
2. Bending part (energy penalty for bending three atoms)
3. Rotation part (energy penalty for bond rotation,  $N \geq 4$ )

Consider ethane molecule as “**elastic structure**”

$$U_{Covalent} = U_{stretch} + U_{bend} + U_{rotate}$$

# Force fields for organics: Basic approach

$$U_{total} = U_{Elec} + U_{Covalent} + U_{Metallic} + U_{vdW} + U_{H-bond}$$

=0 for proteins

$$U_{Covalent} = U_{stretch} + U_{bend} + U_{rot}$$

$$\left\{ \begin{array}{l} \phi_{stretch} = \frac{1}{2} k_{stretch} (r - r_0)^2 \\ U_{stretch} = \sum_{\text{pairs}} \phi_{stretch} \end{array} \right.$$

$$\left\{ \begin{array}{l} \phi_{bend} = \frac{1}{2} k_{bend} (\theta - \theta_0)^2 \\ U_{bend} = \sum_{\text{triplets}} \phi_{bend} \end{array} \right.$$

$$\left\{ \begin{array}{l} \phi_{rot} = \frac{1}{2} k_{rot} (1 - \cos(\mathcal{G})) \\ U_{rot} = \sum_{\text{quadruplets}} \phi_{rot} \end{array} \right.$$

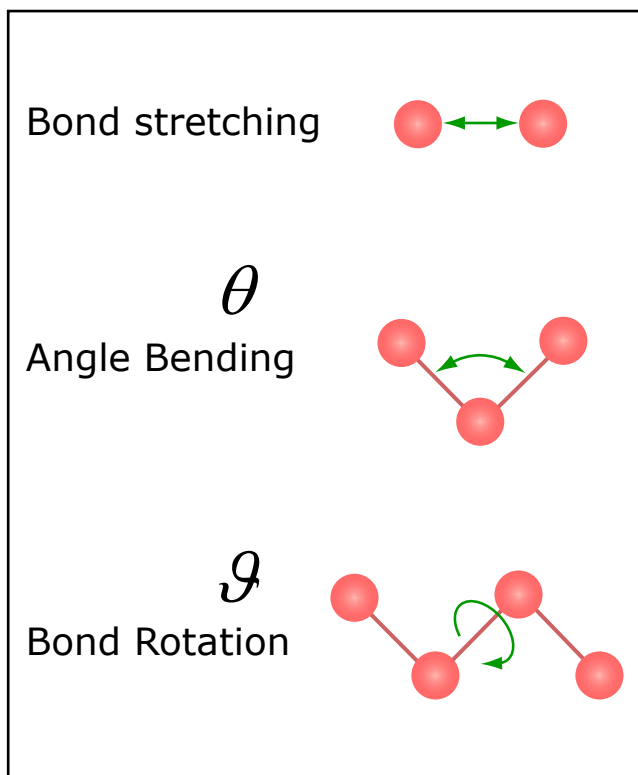
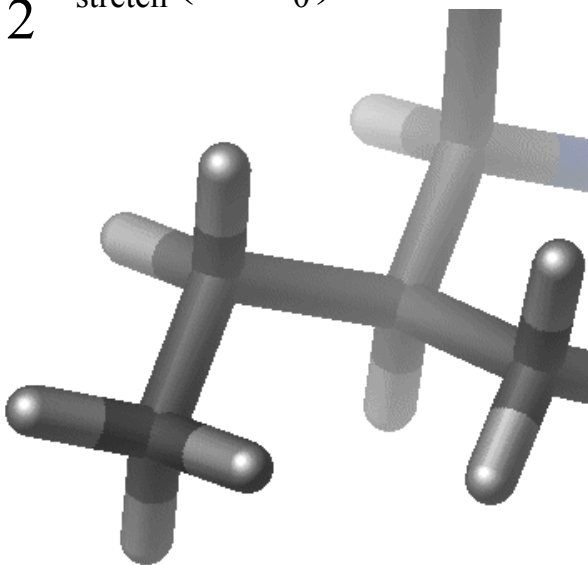


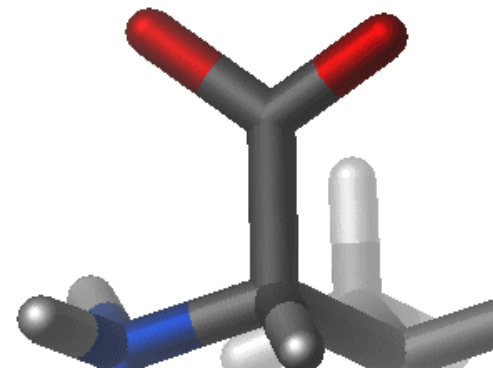
Image by MIT OpenCourseWare.

# Model for covalent bonds

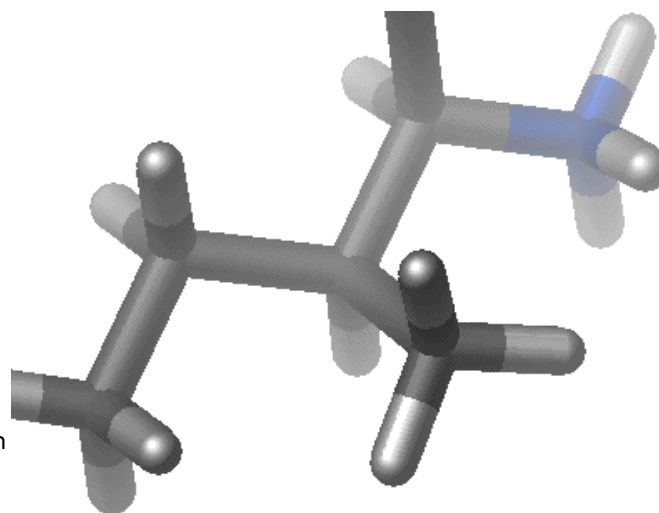
$$\phi_{\text{stretch}} = \frac{1}{2} k_{\text{stretch}} (r - r_0)^2$$



$$\phi_{\text{bend}} = \frac{1}{2} k_{\text{bend}} (\theta - \theta_0)^2$$



$$\phi_{\text{rot}} = \frac{1}{2} k_{\text{rot}} (1 - \cos(\mathcal{G}))$$



Courtesy of the EMBnet Education & Training Committee. Used with permission.

Images created for the CHARMM tutorial by Dr. Dmitry Kuznetsov (Swiss Institute of Bioinformatics) for the EMBnet Education & Training committee (<http://www.embnet.org>)

[http://www.ch.embnet.org/MD\\_tutorial/pages/MD.Part2.html](http://www.ch.embnet.org/MD_tutorial/pages/MD.Part2.html)



# Force fields for organics: Basic approach

$$U_{total} = U_{Elec} + U_{Covalent} + U_{Metallic} + U_{vdW} + U_{H-bond}$$

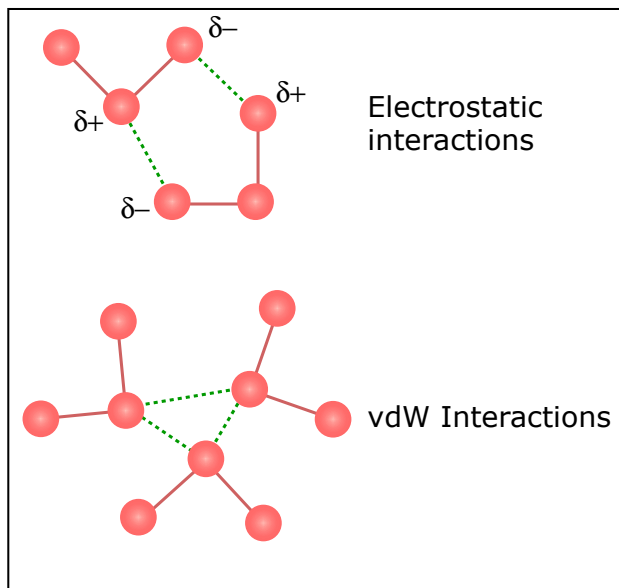
$U_{Elec}$  (circled in red)  
 $U_{Covalent}$  (checked with a blue checkmark)  
 $U_{Metallic}$  (crossed out with a red slash and labeled "=0 for proteins")

$q_i$   
 $q_j$

partial charges  
↓

$U_{Elec}$  :Coulomb potential  $\phi(r_{ij}) = \frac{q_i q_j}{\epsilon_1 r_{ij}}$

electrostatic constant  $\epsilon_1$       distance  $r_{ij}$



Coulomb forces  $F(r_{ij}) = -\frac{q_i q_j}{\epsilon_1 r_{ij}^2}$

$\epsilon_1 = 4\pi\epsilon_0$        $\epsilon_0 = 1.602 \times 10^{-19} \text{ C}$

# Force fields for organics: Basic approach

$$U_{total} = U_{Elec} + U_{Covalent} + U_{Metallic} + U_{vdW} + U_{H-bond}$$

*(Note: Blue checkmarks are present above  $U_{Elec}$  and  $U_{Covalent}$  in the original image.)*

=0 for proteins

$U_{vdW}$

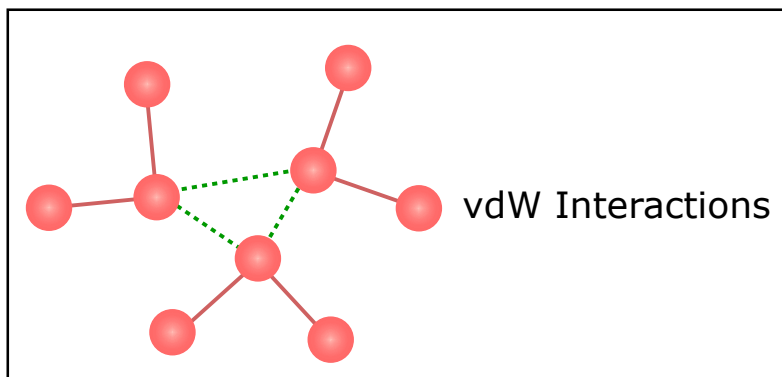


Image by MIT OpenCourseWare.

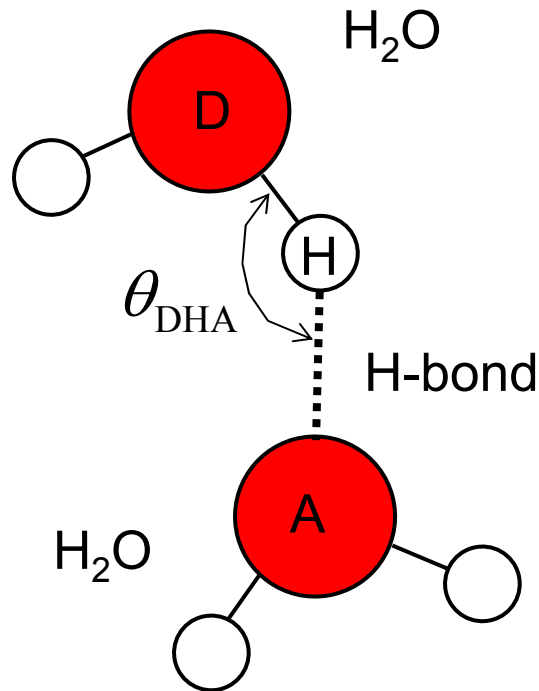
$$U_{vdW} : \quad \text{LJ potential} \quad \phi(r_{ij}) = 4\epsilon \left[ \left( \frac{\sigma}{r_{ij}} \right)^{12} - \left( \frac{\sigma}{r_{ij}} \right)^6 \right]$$

*LJ potential is particularly good model for vdW interactions (Argon)*

# H-bond model

$$U_{total} = U_{Elec} + U_{Covalent} + U_{Metallic} + U_{vdW} + U_{H-bond}$$

✓ ✓ =0 for proteins ✓



$U_{H-bond}$

Evaluated between acceptor (A) /donor(D) pairs

*Between electronegative atom and a H-atom that is bonded to another electronegative atom*

*Slightly modified LJ, different parameters*

$$U_{H-bond} : \phi(r_{ij}) = D_{H-bond} \left[ 5 \left( \frac{R_{H-bond}}{r_{ij}} \right)^{12} - 6 \left( \frac{R_{H-bond}}{r_{ij}} \right)^{10} \right] \cos^4(\theta_{DHA})$$

$r_{ij}$  = distance between D-A

# Summary

$$U_{total} = U_{Elec} + U_{Covalent} + U_{Metallic} + U_{vdW} + U_{H-bond}$$

=0 for proteins

$$U_{Elec} : \quad \text{Coulomb potential} \quad \phi(r_{ij}) = \frac{q_i q_j}{\epsilon_1 r_{ij}}$$

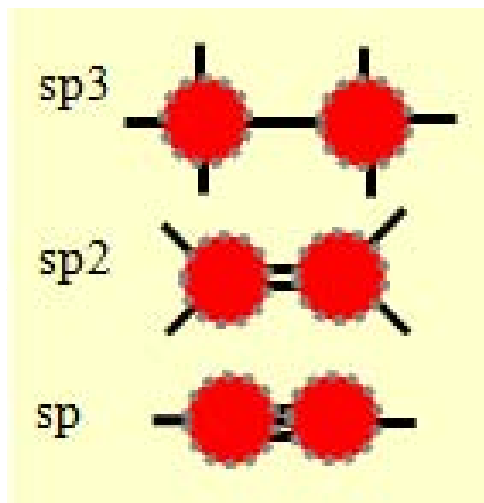
$$U_{Covalent} = U_{stretch} + U_{bend} + U_{rot} \quad \left\{ \begin{array}{l} \phi_{stretch} = \frac{1}{2} k_{stretch} (r - r_0)^2 \\ \phi_{bend} = \frac{1}{2} k_{bend} (\theta - \theta_0)^2 \\ \phi_{rot} = \frac{1}{2} k_{rot} (1 - \cos(\mathcal{G})) \end{array} \right.$$

$$U_{vdW} : \quad \text{LJ potential} \quad \phi(r_{ij}) = 4\epsilon \left[ \left( \frac{\sigma}{r_{ij}} \right)^{12} - \left( \frac{\sigma}{r_{ij}} \right)^6 \right]$$

$$U_{H-bond} : \quad \phi(r_{ij}) = D_{H-bond} \left[ 5 \left( \frac{R_{H-bond}}{r_{ij}} \right)^{12} - 6 \left( \frac{R_{H-bond}}{r_{ij}} \right)^{10} \right] \cos^4(\theta_{DHA})$$

# The need for atom typing

- **Limited transferability** of potential expressions: Must use different potential for different chemistry
- Different chemistry is captured in **different “tags”** for atoms: **Element type** is expanded by **additional information** on particular chemical state
- Tags specify if a C-atom is in **sp<sup>3</sup>**, **sp<sup>2</sup>**, **sp** or in aromatic state (that is, to capture resonance effects)
- **Example atom tags:** CA, C\_1, C\_2, C\_3, C..., HN, HO, HC, ...

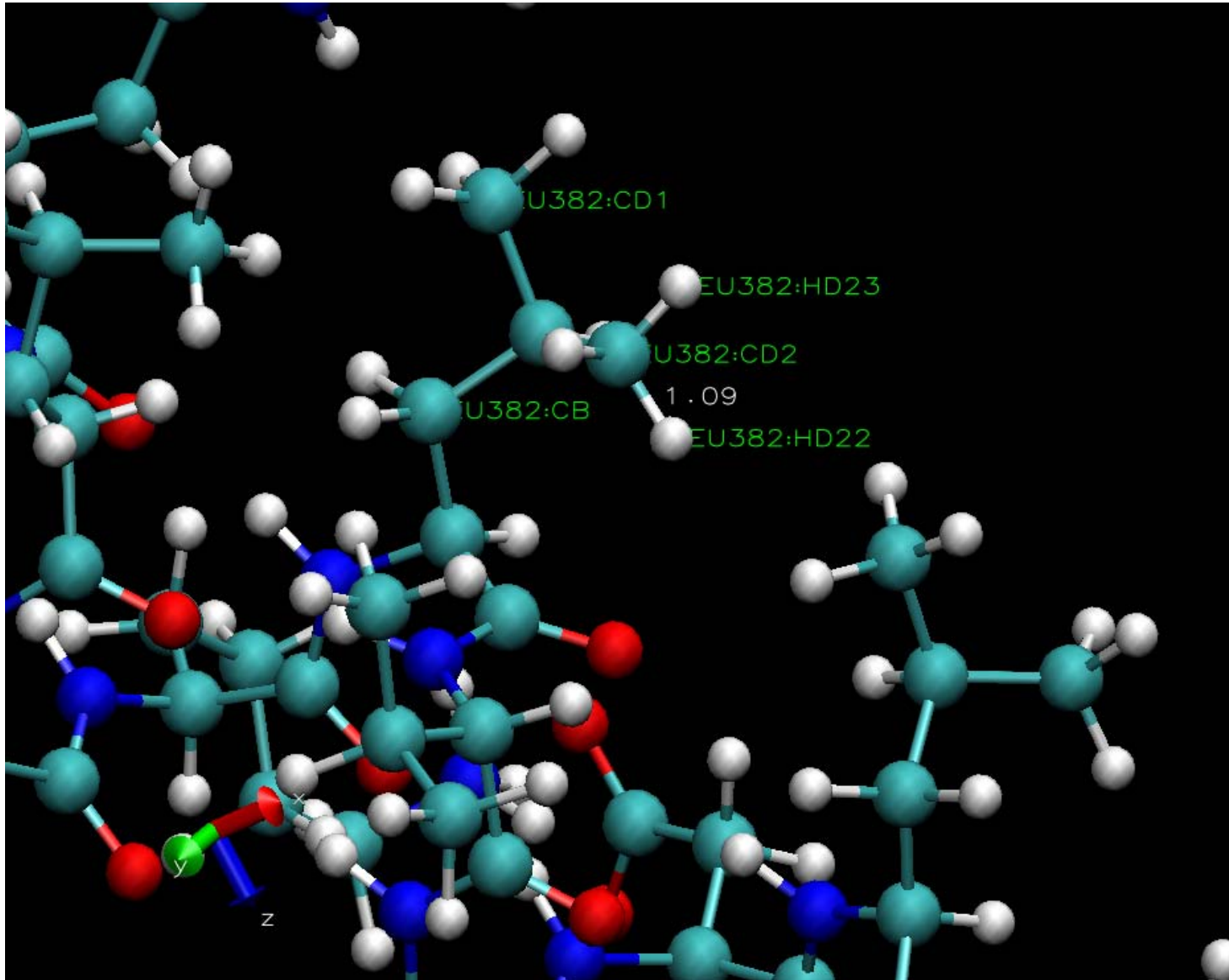


# Atom typing in CHARMM

Example of the RTF for the Alanine residue:

```
RESI ALA0.00
GROUP
ATOM NNH1-0.47 ! |
ATOM HNH 0.31 ! HN-N
ATOM CACT1 0.07 ! | HB1
ATOM HAHB 0.09 ! | /
GROUP !HA-CA--CB-HB2
ATOM CBCT3-0.27 ! | \
ATOM HB1HA 0.09 ! | HB3
ATOM HB2HA 0.09 ! O=C
ATOM HB3HA 0.09 ! |
GROUP !
ATOM CC 0.51
ATOM OO-0.51
BONDCB CA N HN N CA
BOND C CA C +N CA HA CB HB1 CB HB2 CB HB3
DOUBLE O C
IMPR N -C CA HN C CA +N O
DONOR HN N
ACCEPTOR O C
IC -C CA *N HN 1.3551 126.4900 180.0000 115.4200 0.9996
IC -C N CA C 1.3551 126.4900 180.0000 114.4400 1.5390
IC N CA C +N 1.4592 114.4400 180.0000 116.8400 1.3558
IC +N CA *C O 1.3558 116.8400 180.0000 122.5200 1.2297
IC CA C +N +CA 1.5390 116.8400 180.0000 126.7700 1.4613
IC N C *CA CB 1.4592 114.4400 123.2300 111.0900 1.5461
IC N C *CA HA 1.4592 114.4400 -120.4500 106.3900 1.0840
IC C CA CB HB1 1.5390 111.0900 177.2500 109.6000 1.1109
IC HB1 CA *CB HB2 1.1109 109.6000 119.1300 111.0500 1.1119
IC HB1 CA *CB HB3 1.1109 109.6000 -119.5800 111.6100 1.1114
```

# VMD analysis of protein structure



# Common empirical force fields for organics and proteins

## **Class I (experiment derived, simple form)**

- CHARMM **pset #3**
- CHARMM (Accelrys)
- AMBER
- OPLS/AMBER/Schrödinger
- ECEPP (free energy force field)
- GROMOS

*Harmonic terms;  
Derived from  
vibrational  
spectroscopy, gas-  
phase molecular  
structures  
Very system-  
specific*

## **Class II (more complex, derived from QM)**

- CFF95 (Biosym/Accelrys)
- MM3
- MMFF94 (CHARMM, Macromodel...)
- UFF, DREIDING

*Include anharmonic  
terms  
Derived from QM,  
more general*

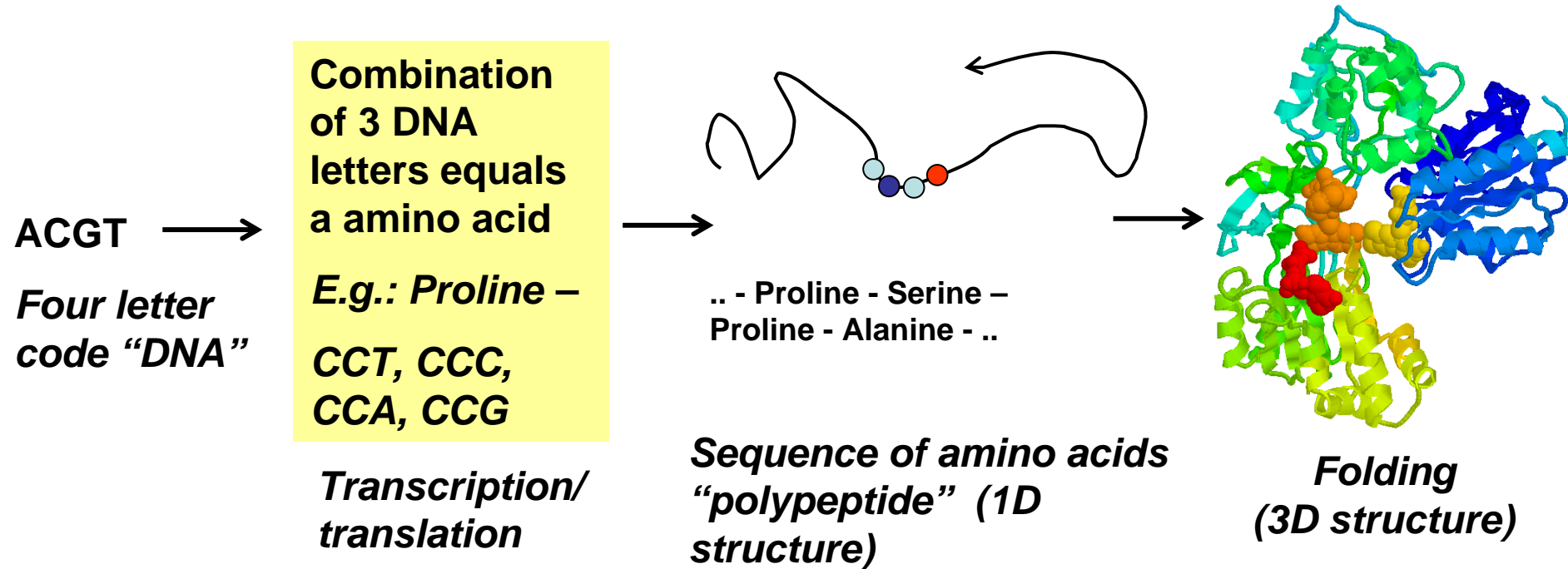


# CHARMM force field

- Widely used and accepted model for protein structures
- Programs such as NAMD have implemented the CHARMM force field

**Problem set #3, nanoHUB stretchmol module, study of a protein domain that is part of human vimentin intermediate filaments**

# Application – protein folding



**Goal of protein folding simulations:**  
Predict folded 3D structure based on polypeptide sequence

# Movie: protein folding with CHARMM

- *de novo* Folding of a *Transmembrane fd Coat Protein*  
<http://www.charmm-gui.org/?doc=gallery&id=23>

*Polypeptide chain*

Images removed due to copyright restrictions.

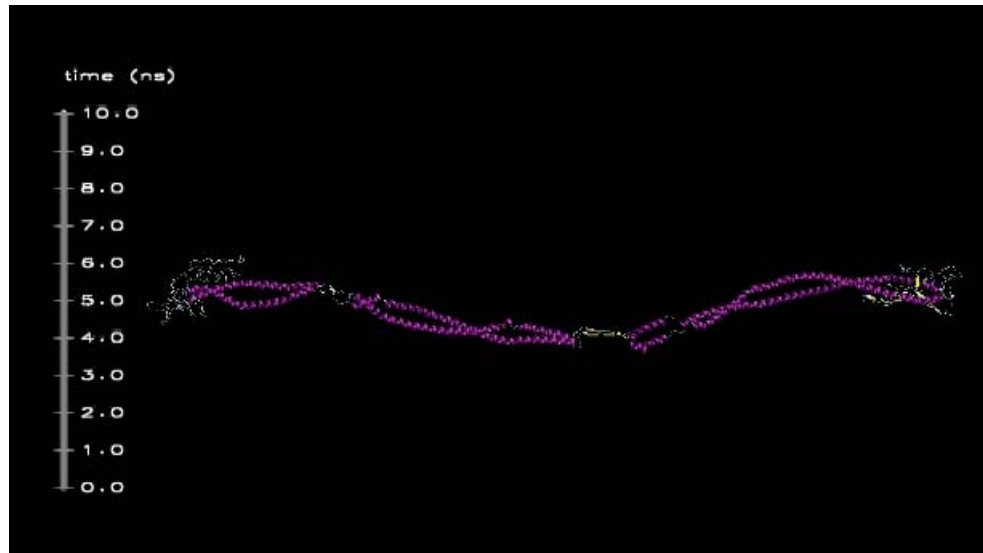
Screenshots from protein folding video, which can be found here:

<http://www.charmm-gui.org/?doc=gallery&id=23>.

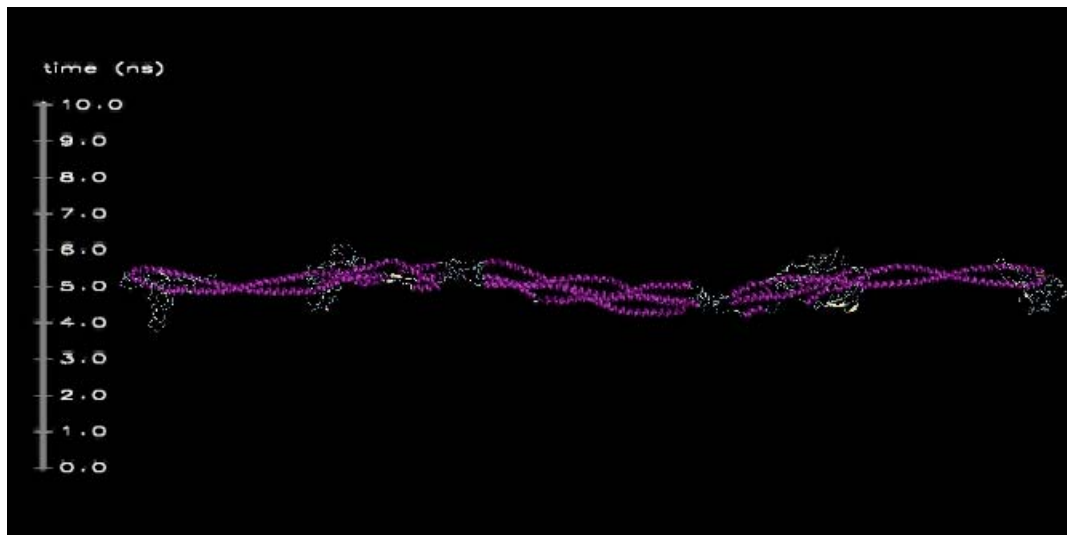
## **Quality of predicted structures quite good**

Confirmed by comparison of the **MSD deviations** of a room temperature ensemble of conformations from the replica-exchange simulations and **experimental structures** from both **solid-state NMR** in lipid bilayers and solution-phase NMR on the protein in micelles)

# Movies in equilibrium (temperature 300 K)



Dimer



Tetramer  
(increased effective  
bending stiffness,  
interaction via overlap  
& head/tail domain)

## 2. Single molecule mechanics

*Structure and mechanics of  
protein, DNA, etc. molecules*

# Cooking spaghetti



Photo courtesy of [HatM](#) on Flickr.

*stiff rods*



Public domain image.

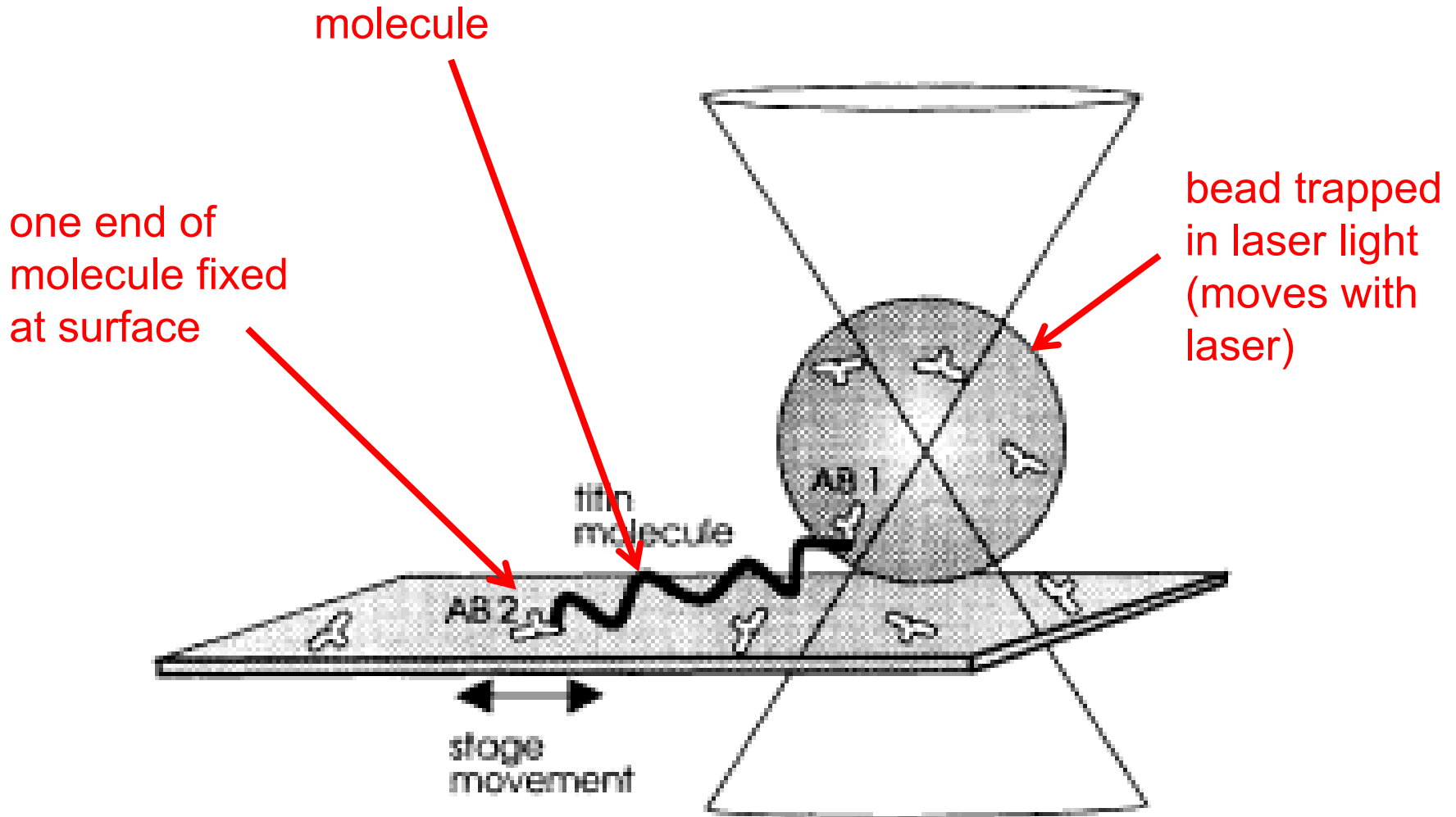
*cooking*



Photo courtesy of [HatM](#) on Flickr.

*soft, flexible rods  
(like many protein  
molecules)*

# Single molecule tensile test – “optical tweezer”



Reprinted by permission from Macmillan Publishers Ltd: Nature.  
Source: Tskhovrebova, L., J. Trinick, et al. "Elasticity and Unfolding of Single Molecules of the Giant Muscle Protein Titin." *Nature* 387, no. 6630 (1997): 308- 12. © 1997.

# Example 1: Elasticity of tropocollagen molecules

300 nm length



*Entropic elasticity leads to strongly nonlinear elasticity*



Photo courtesy of [HatM](#) on Flickr.

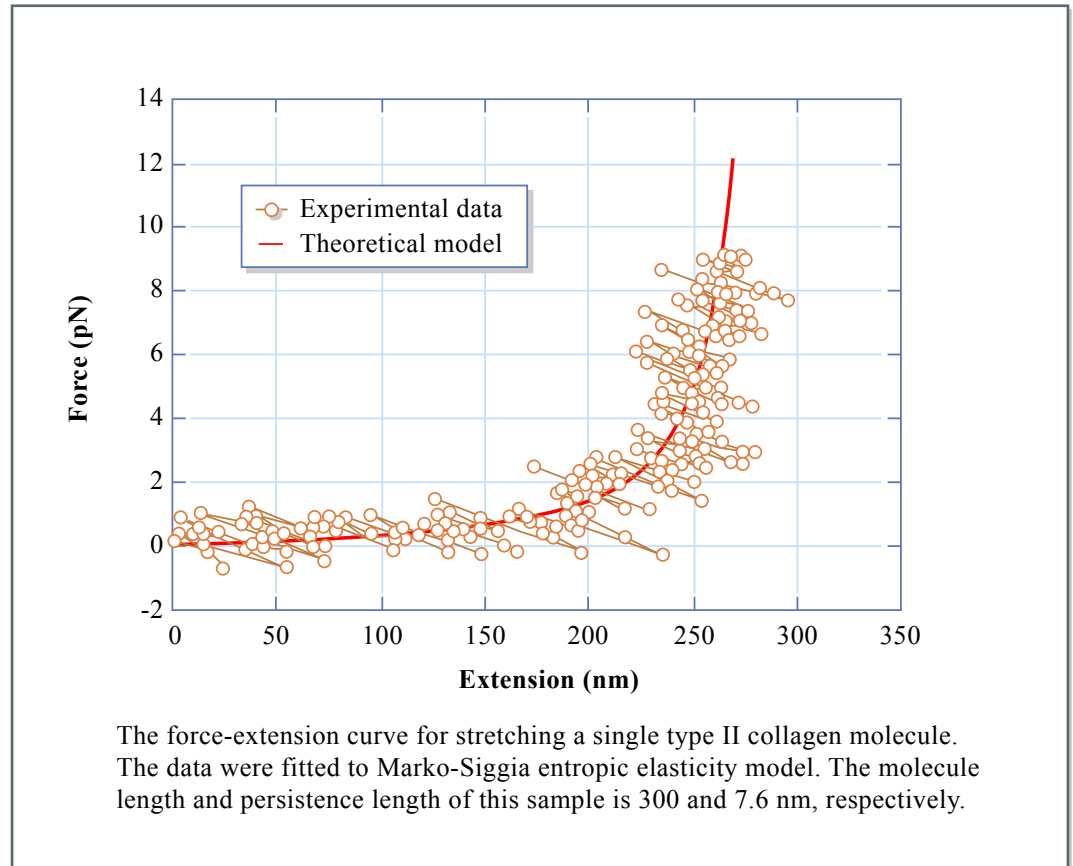
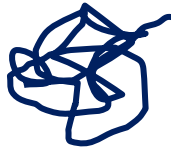


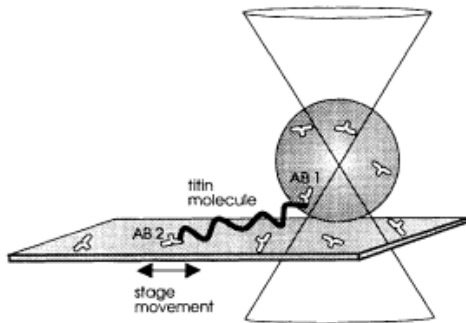
Image by MIT OpenCourseWare.



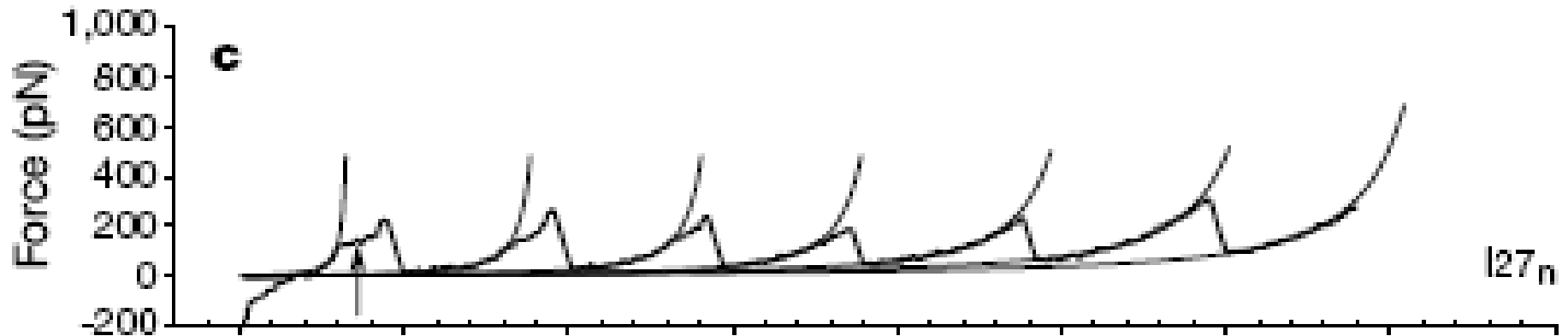
# Example 2: Single protein molecule mechanics

## Optical tweezers experiment

Protein structure (I27 multidomain titin in muscle)



Reprinted by permission from Macmillan Publishers Ltd: Nature.  
Source: Tskhovrebova, L., J. Trinick, et al. "Elasticity and Unfolding of Single Molecules of the Giant Muscle Protein Titin." *Nature* 387, no. 6630 (1997): 308-12. © 1997.



Reprinted by permission from Macmillan Publishers Ltd: Nature.

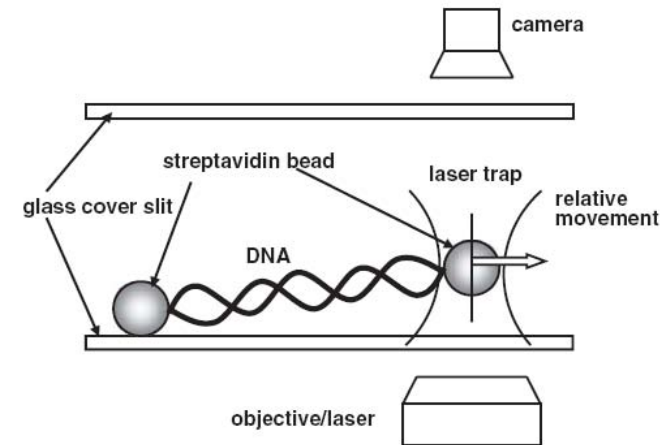
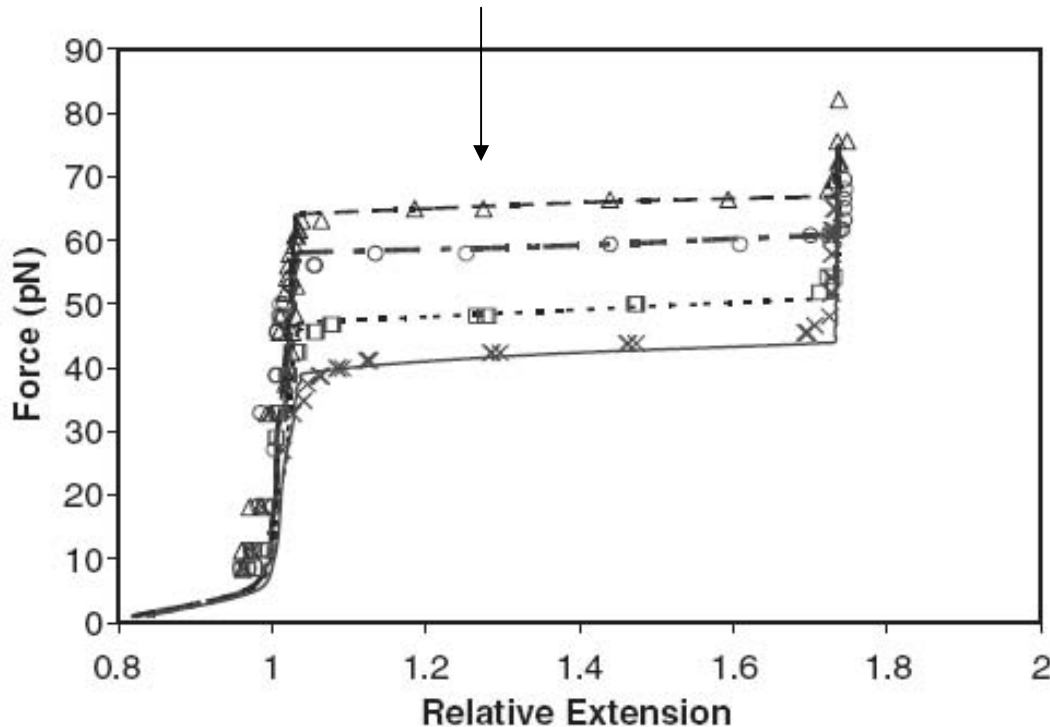
Source: Marszalek, P., H. Lu, et al. "Mechanical Unfolding Intermediates in Titin Modules." *Nature* 402, no. 6757 (1999): 100-3. © 1999.

<http://www.nature.com/nature/journal/v387/n6630/pdf/387308a0.pdf>

<http://www.nature.com/nature/journal/v402/n6757/pdf/402100a0.pdf>

# Example 3: Single DNA molecule mechanics

plateau regime (breaking of bonds)



Courtesy of Elsevier, Inc., <http://www.sciencedirect.com>. Used with permission.

Plots of stretching force against relative extension of the single DNA molecule (experimental results)

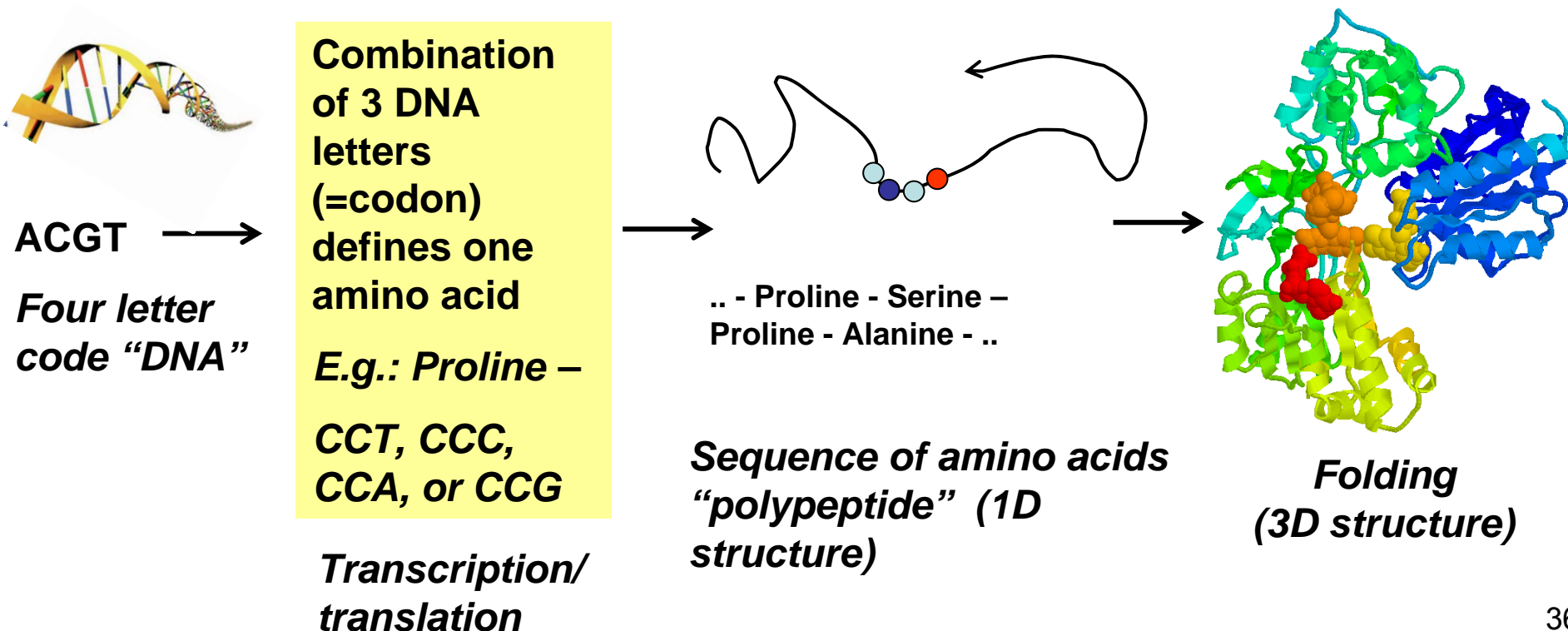
# *Structural makeup of protein materials*

*Although very **diverse**, all protein materials have **universal** “protocols” of how they are made*

# How protein materials are made—the genetic code

- Proteins: Encoded by DNA (three “letters”), utilize 20 basic building blocks (amino acids) to form polypeptides
- Polypeptides arrange in complex folded 3D structures with specific properties

**1D structure transforms into complex 3D folded configuration**



# Alpha-helix (abbreviated as AH)

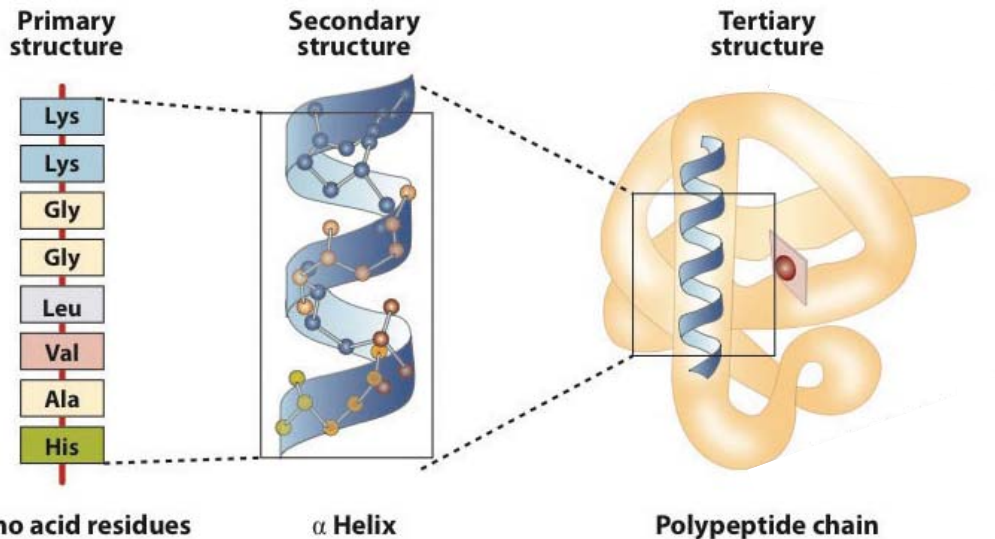
**Concept: hydrogen bonding (H-bonding)**

e.g. between O and H in H<sub>2</sub>O

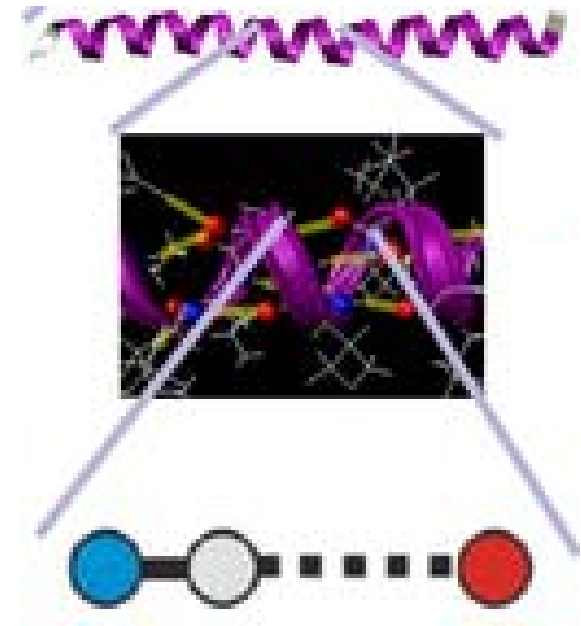
Between N and O in proteins

**Drives formation of helical structures**

AHs found in: **hair, cells, wool, skin, etc.**

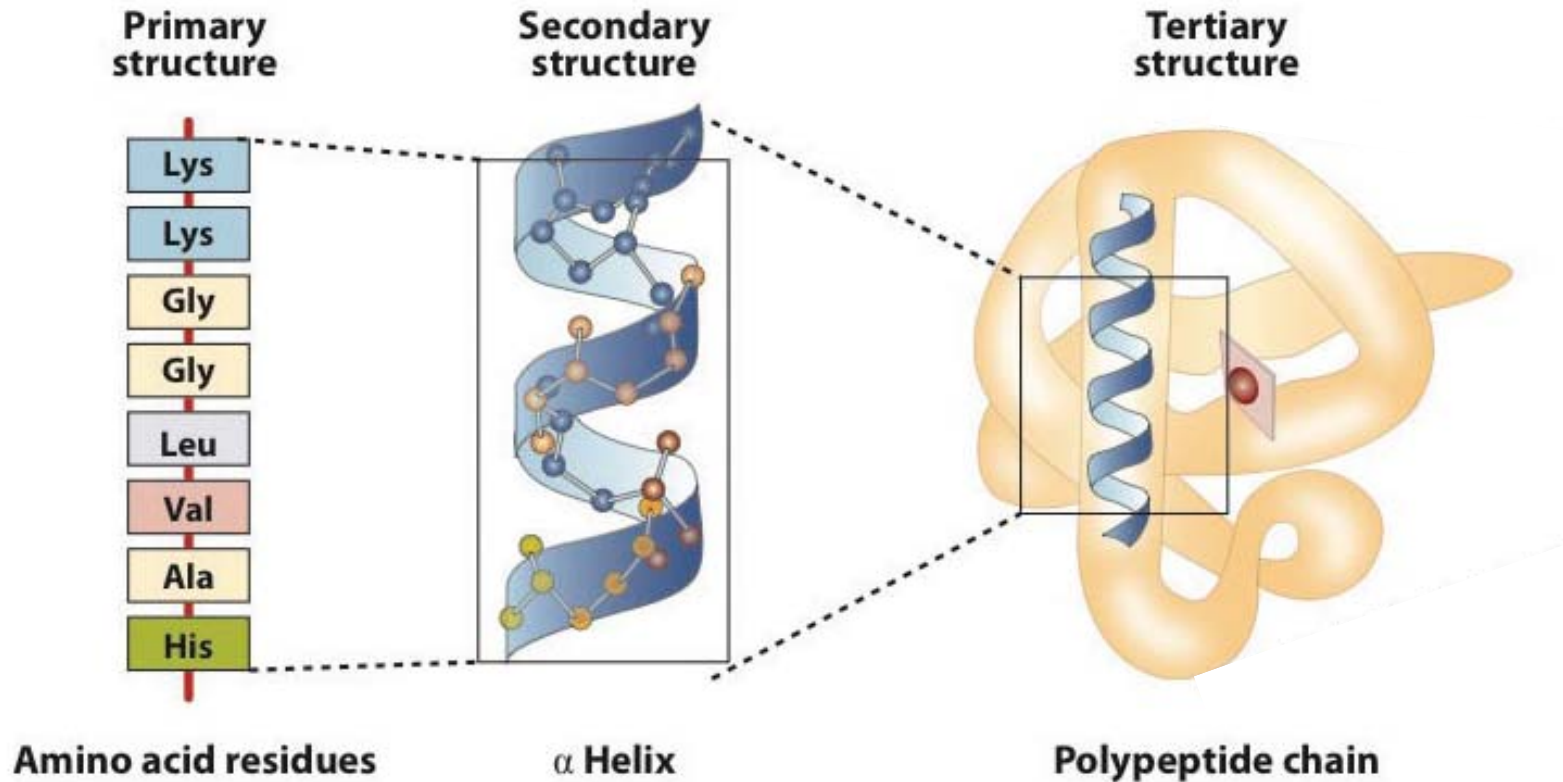


Adapted from Ball, D., Hill, J., et al. *The Basics of General, Organic, and Biological Chemistry*. Flatworld Knowledge, 2011. Courtesy of Flatworld Knowledge.



Source: Qin, Z., L. Kreplak, and M. Buehler. "Hierarchical structure controls nanomechanical properties of vimentin intermediate filaments." *PLoS ONE* (2009). License CC BY.

# Primary, secondary, tertiary structure



Adapted from Ball, D., Hill, J., and R. Scott. *The Basics of General, Organic, and Biological Chemistry*. Flatworld Knowledge, 2011. Courtesy of Flatworld Knowledge.

# Beta-sheets (abbreviated as BS)

## *Beta-sheet*

Images removed due to copyright restrictions.

Found in many mechanically relevant proteins

Spider silk

Fibronectin

Titin (muscle tissue)

Amyloids (Alzheimer's disease)

# Amyloid proteins (Alzheimer's disease)

Please see Fig. 8 from [http://web.mit.edu/mbuehler/www/papers/final\\_JCTN\\_preprint.pdf](http://web.mit.edu/mbuehler/www/papers/final_JCTN_preprint.pdf).



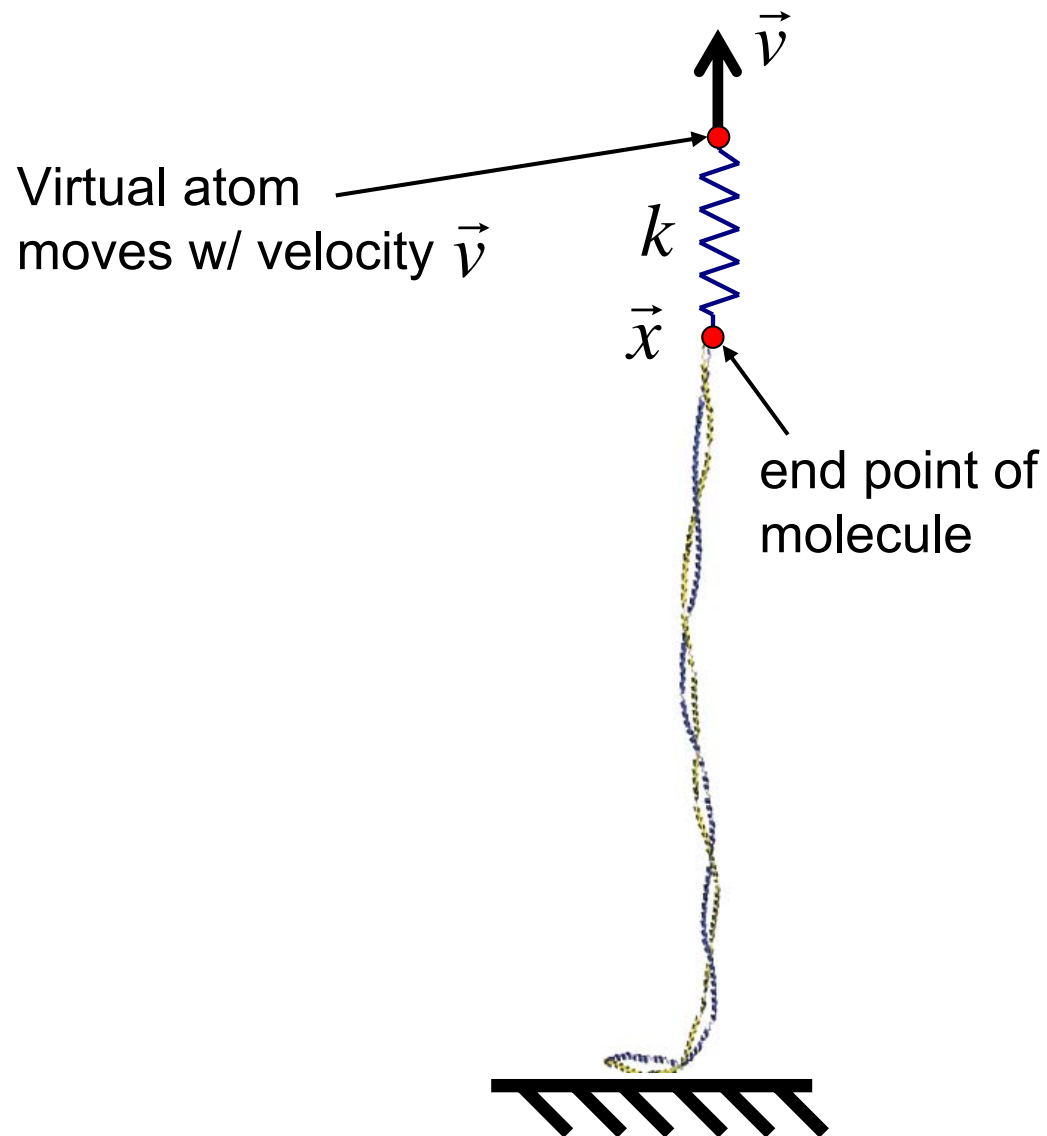
### 3. Fracture of protein domains – Bell model

*How to apply load to a molecule*

*(in molecular dynamics  
simulations)*

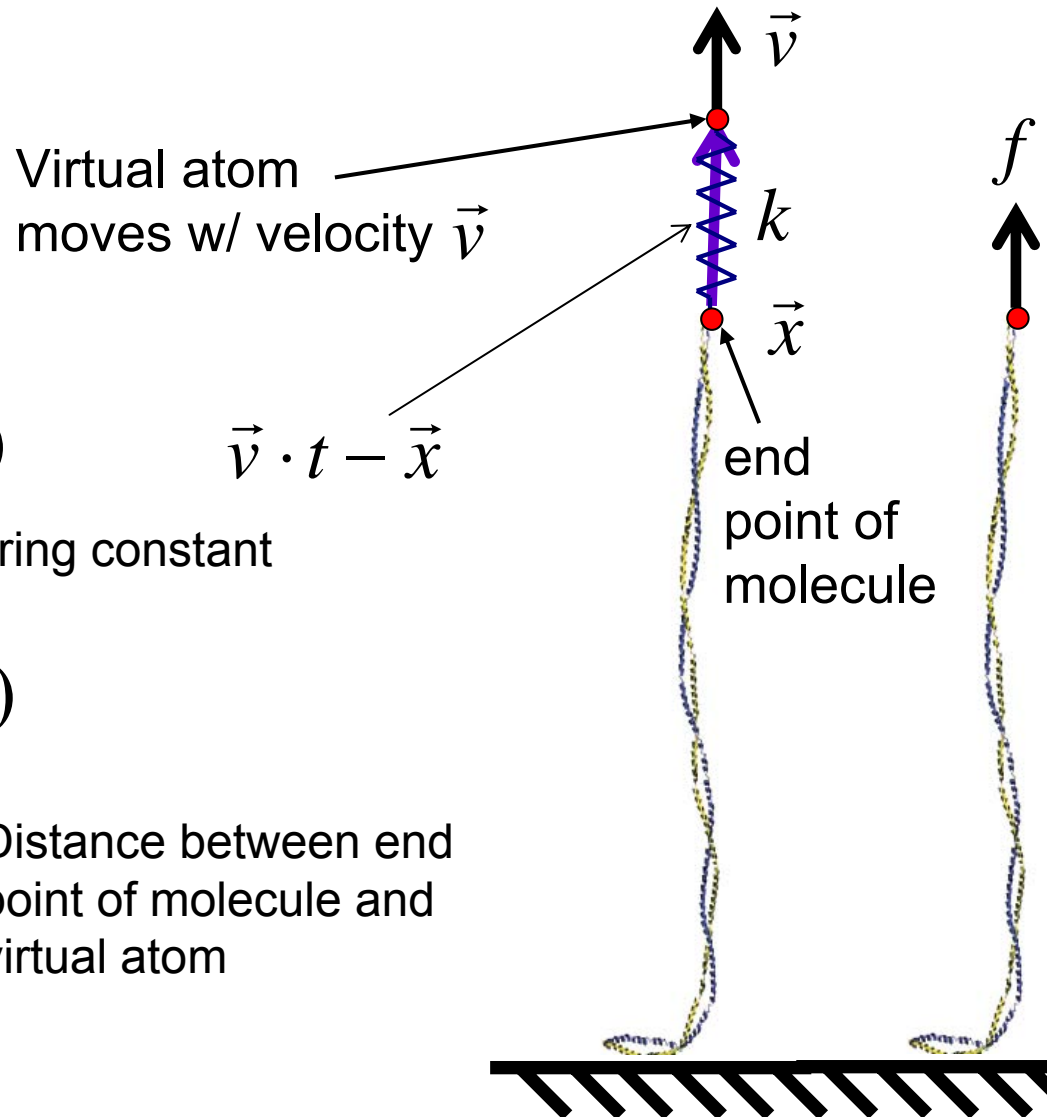
# Steered molecular dynamics (SMD)

*Steered molecular dynamics used to apply forces to protein structures*



# Steered molecular dynamics (SMD)

*Steered molecular dynamics used to apply forces to protein structures*



$$f = k(v \cdot t - x)$$

SMD spring constant

$$\vec{f} = k(\vec{v} \cdot t - \vec{x})$$

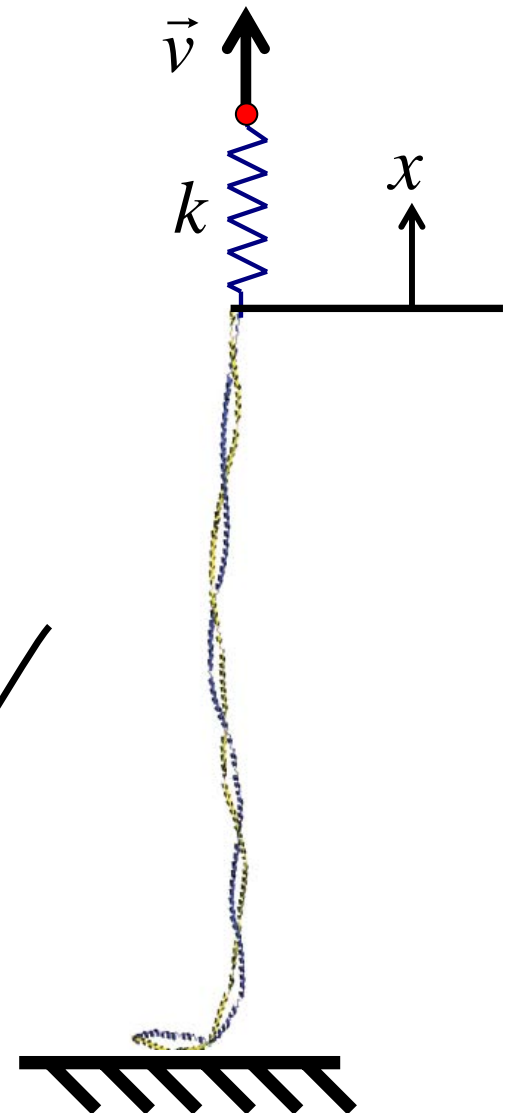
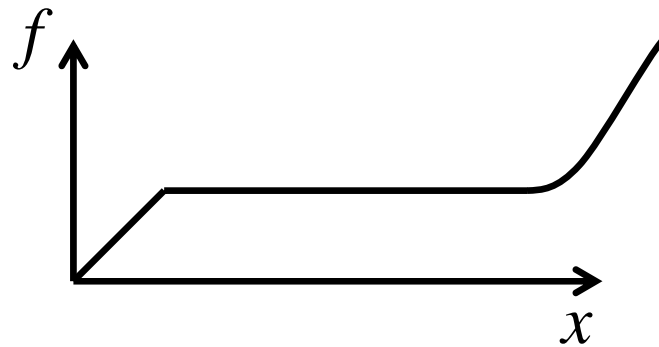
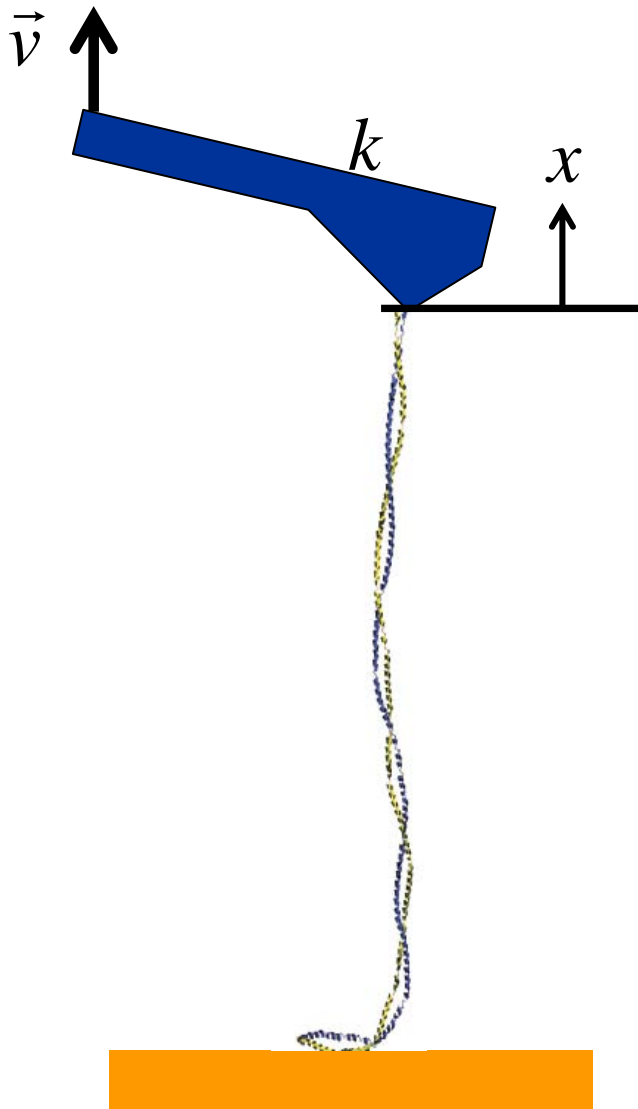
time

Distance between end point of molecule and virtual atom

SMD deformation speed vector

# SMD mimics AFM single molecule experiments

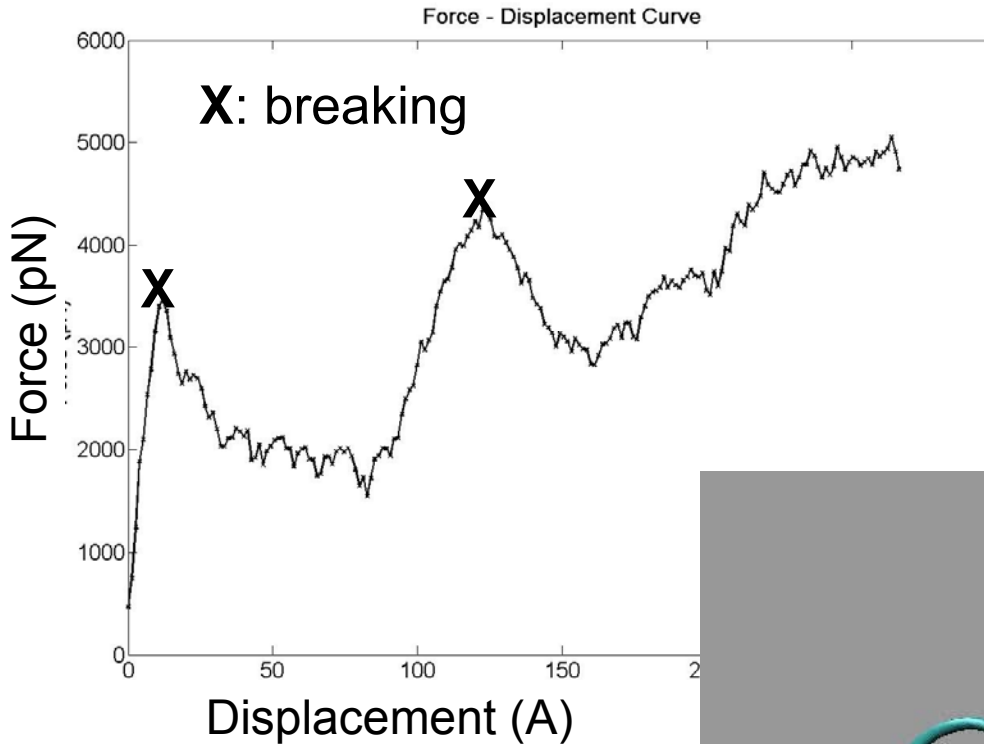
*Atomic force microscope*



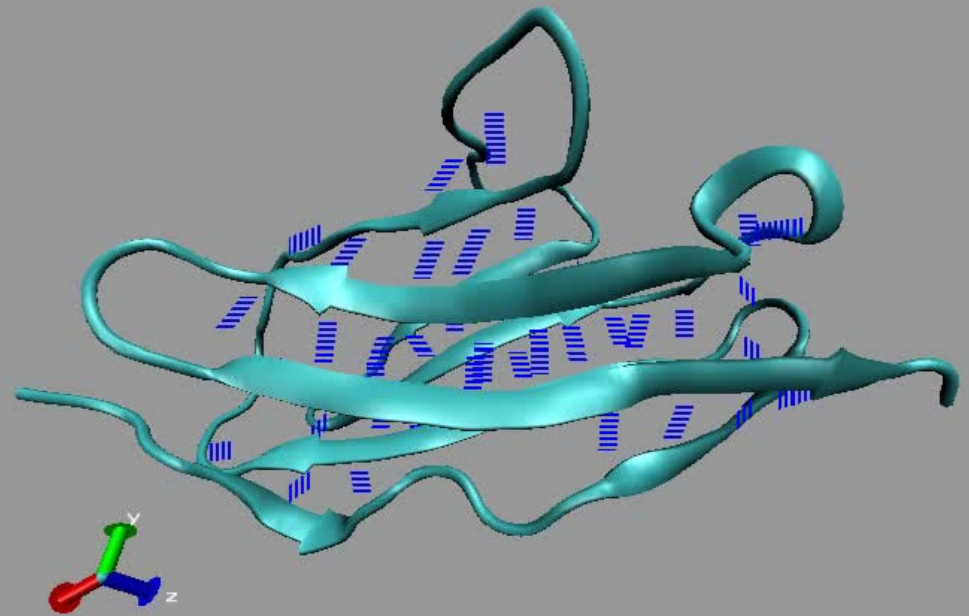
*SMD is a useful approach to probe the nanomechanics of proteins (elastic deformation, “plastic” – permanent deformation, etc.)*

*Example: titin unfolding (CHARMM force field)*

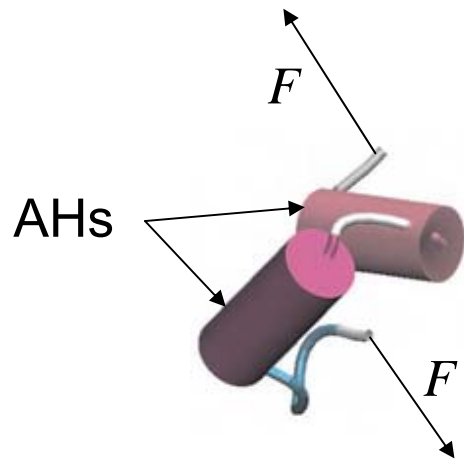
# Unfolding of titin molecule



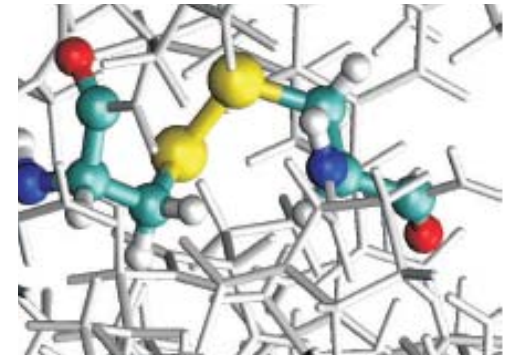
Titin I27 domain: Very resistant to unfolding due to parallel H-bonded strands



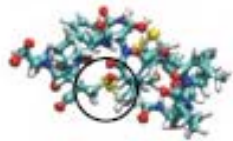
# Protein unfolding - ReaxFF



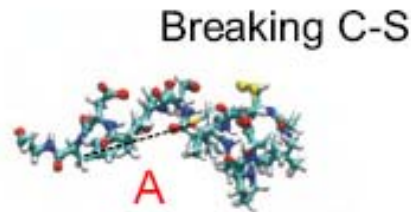
PnIB 1AKG



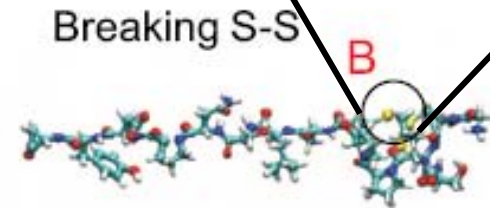
(a)



(b)



(c)



(d)



(e)

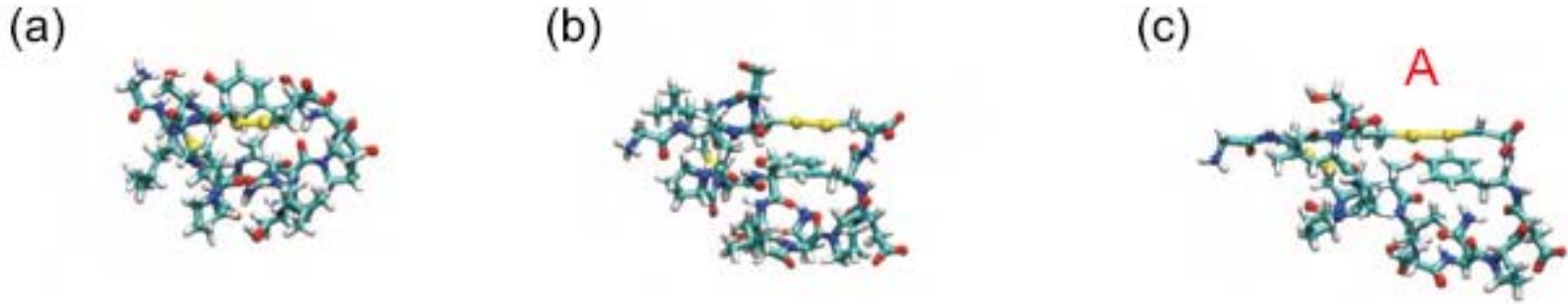


ReaxFF modeling

Breaking C-C



# Protein unfolding - CHARMM

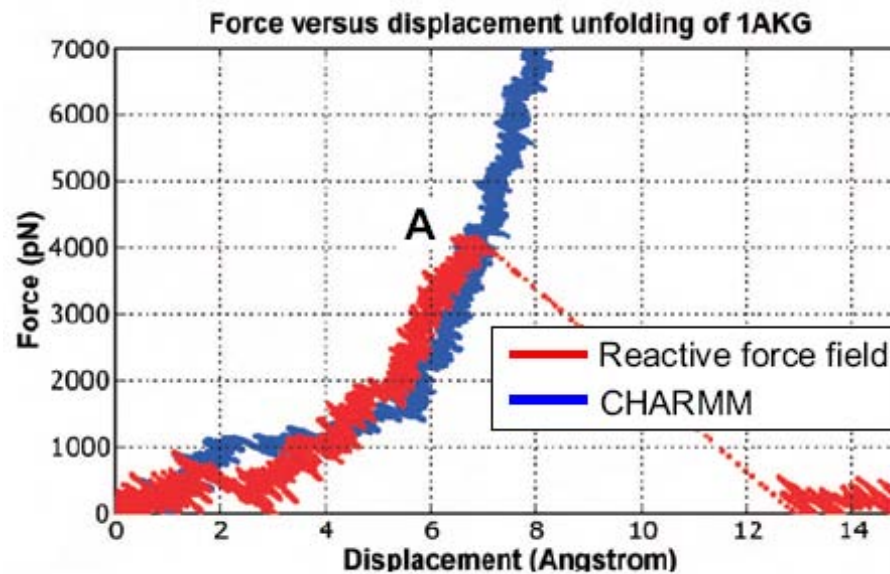
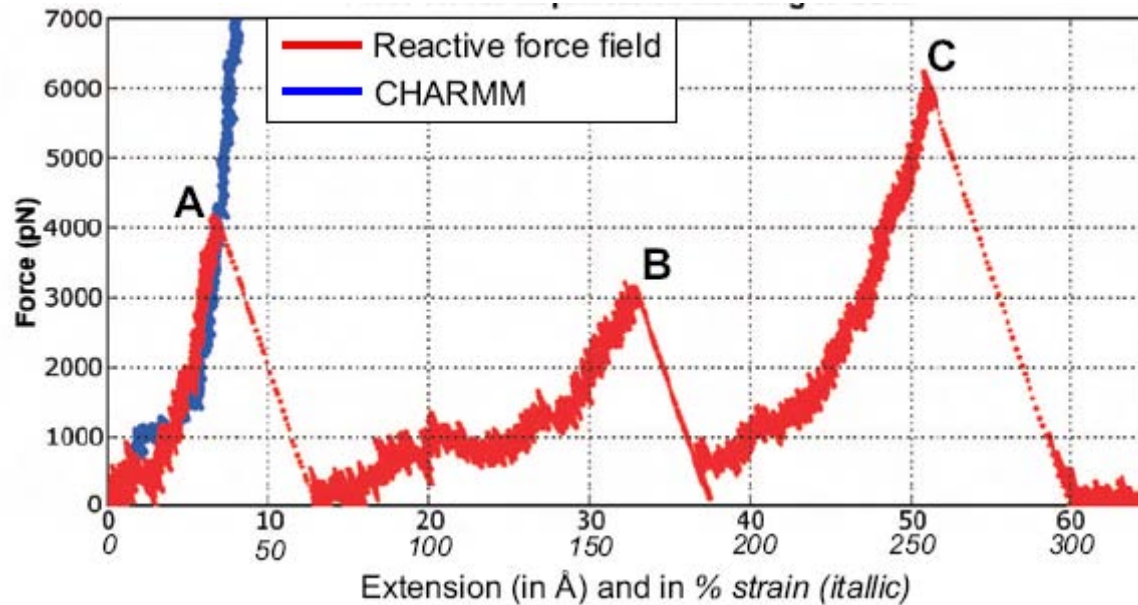


Covalent bonds don't break



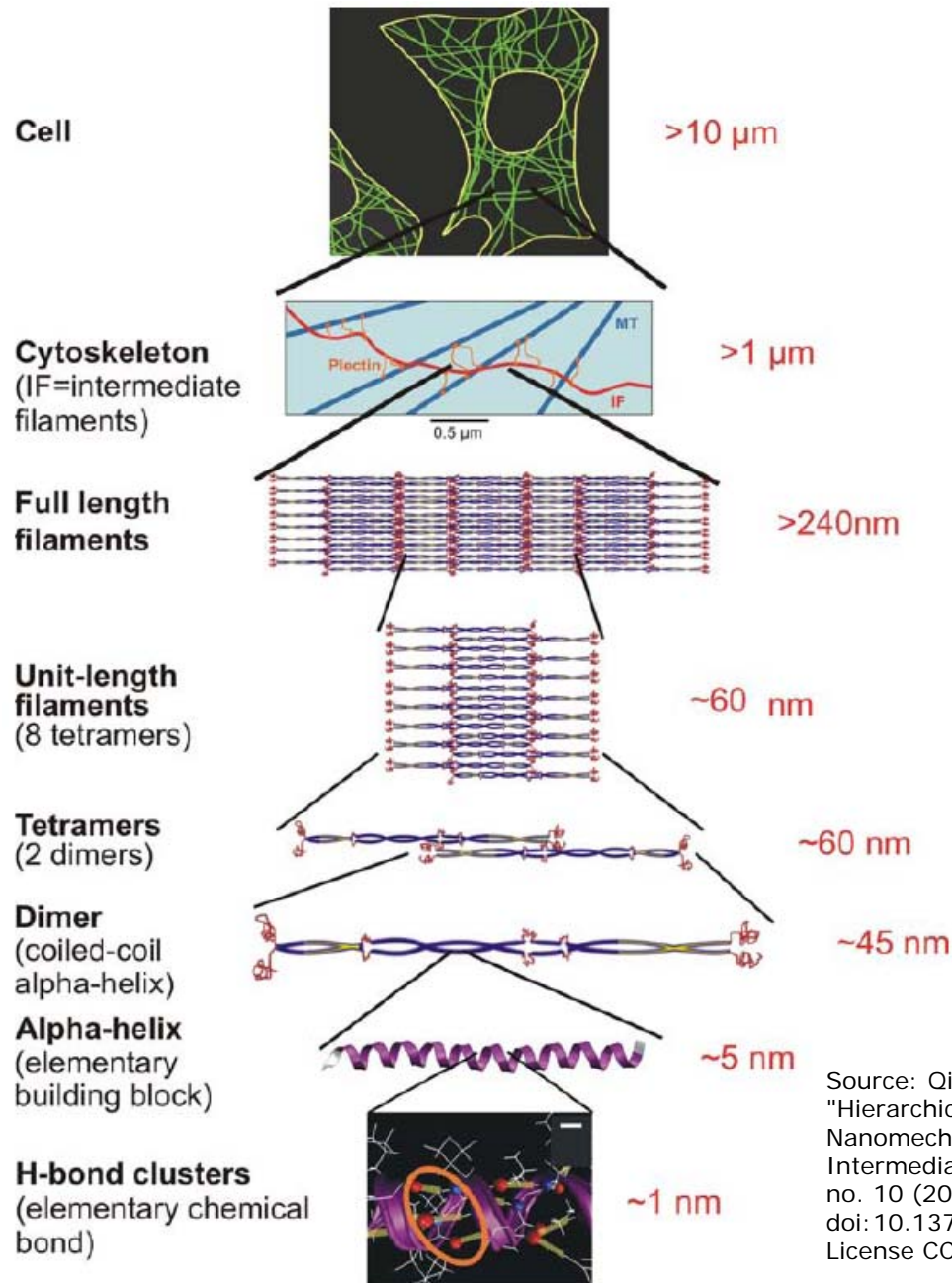
CHARMM modeling

# Comparison – CHARMM vs. ReaxFF

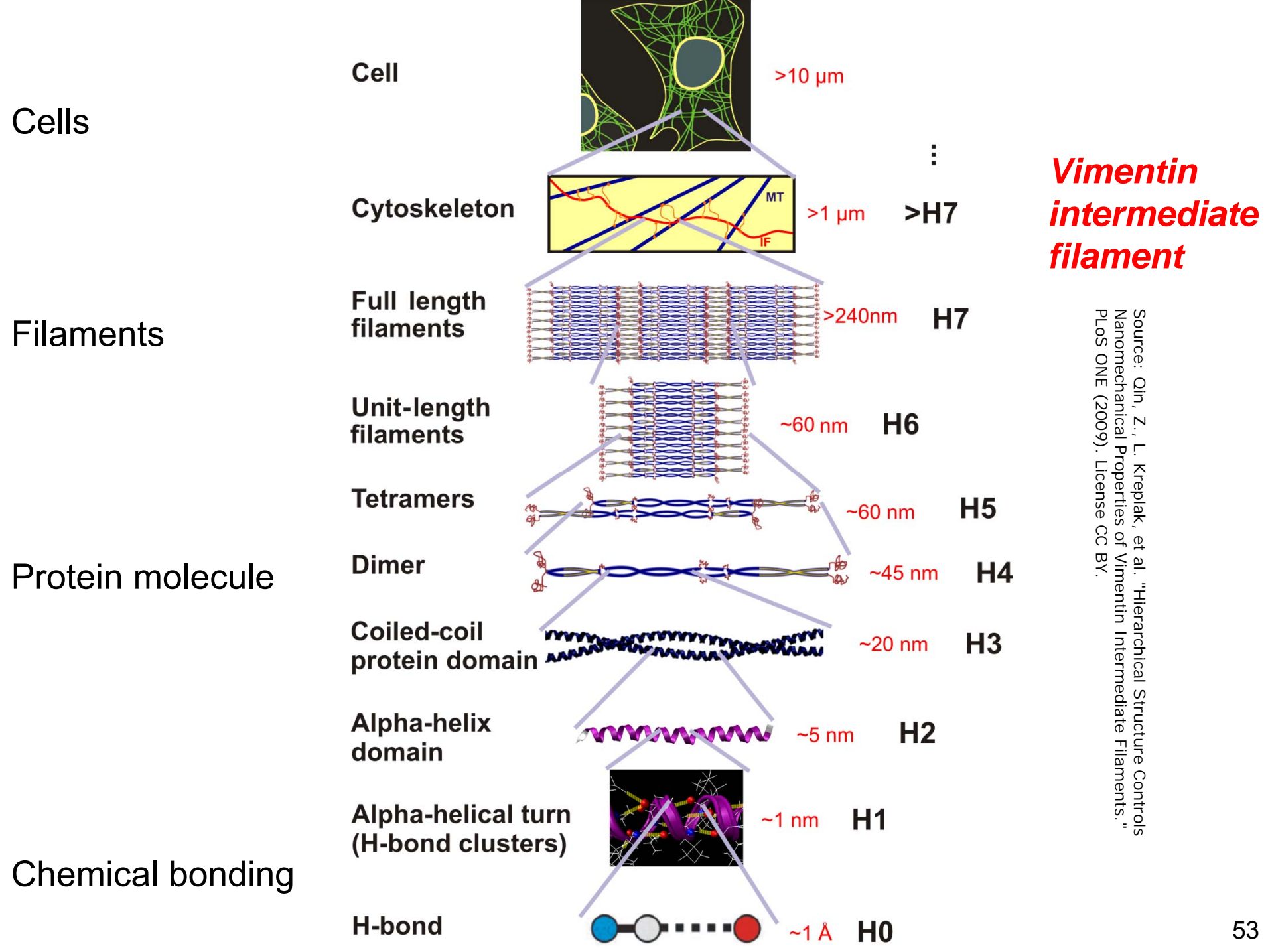


## *Application to alpha-helical proteins*

# Vimentin intermediate filaments

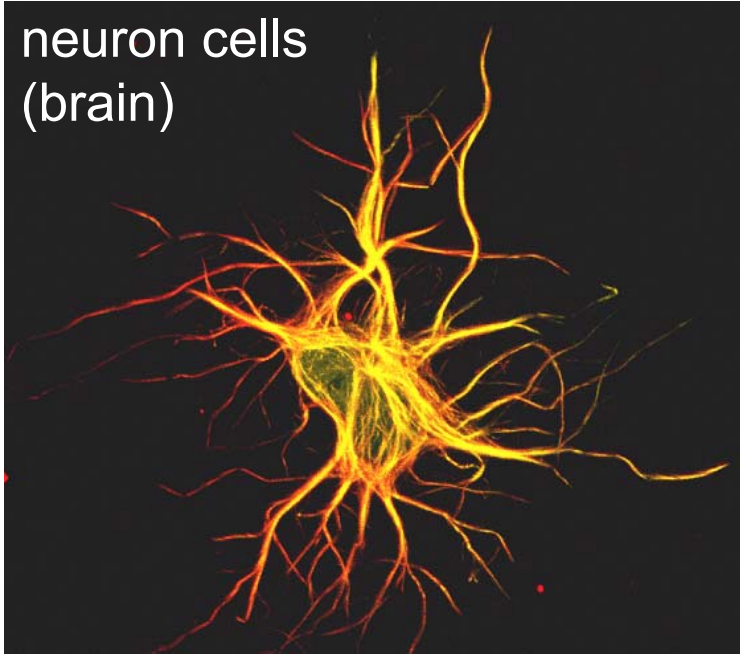


Source: Qin, Z., L. Kreplak, et al. "Hierarchical Structure Controls Nanomechanical Properties of Vimentin Intermediate Filaments." *PLoS ONE* 4, no. 10 (2009). doi:10.1371/journal.pone.0007294. License CC BY.



# Intermediate filaments – occurrence

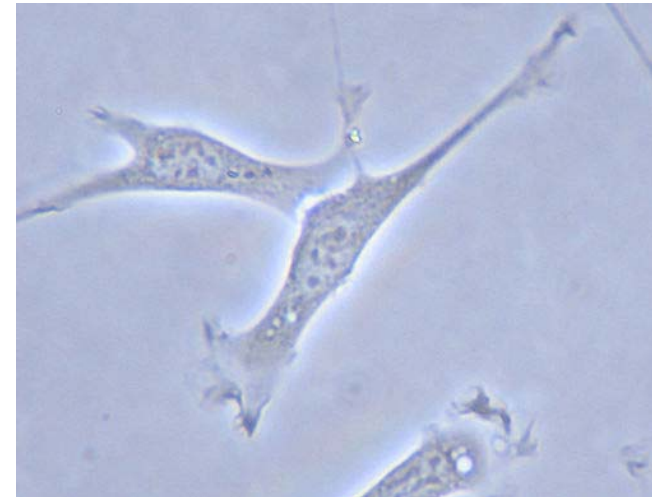
neuron cells  
(brain)



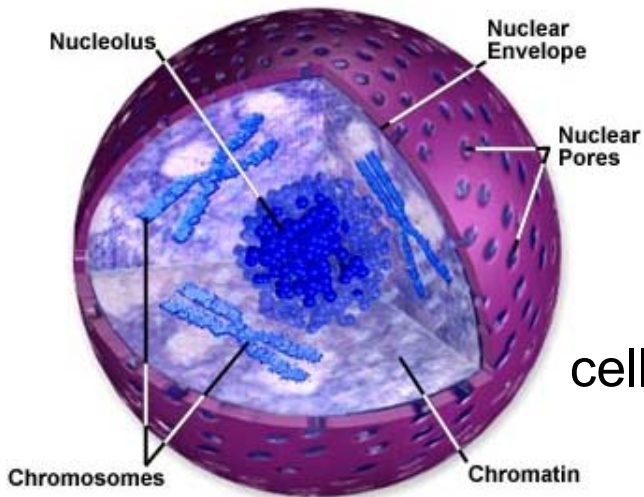
hair, hoof



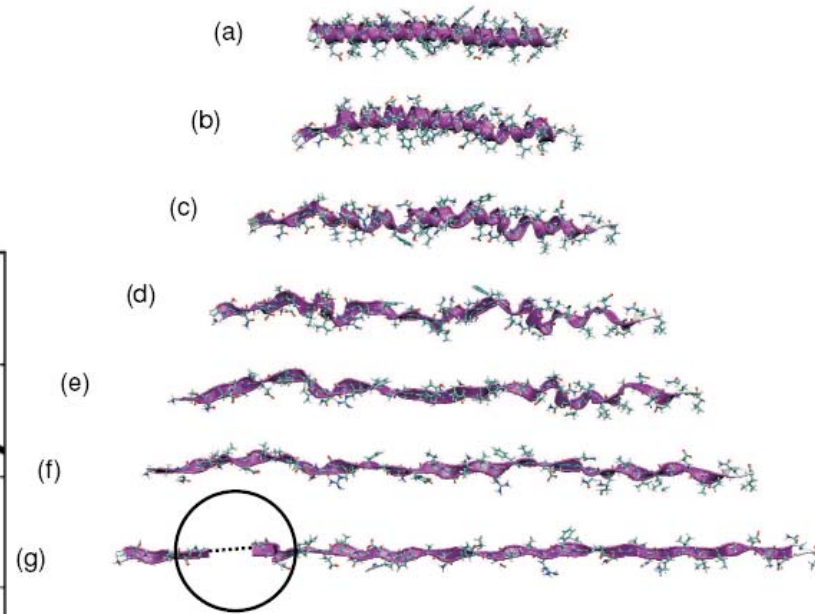
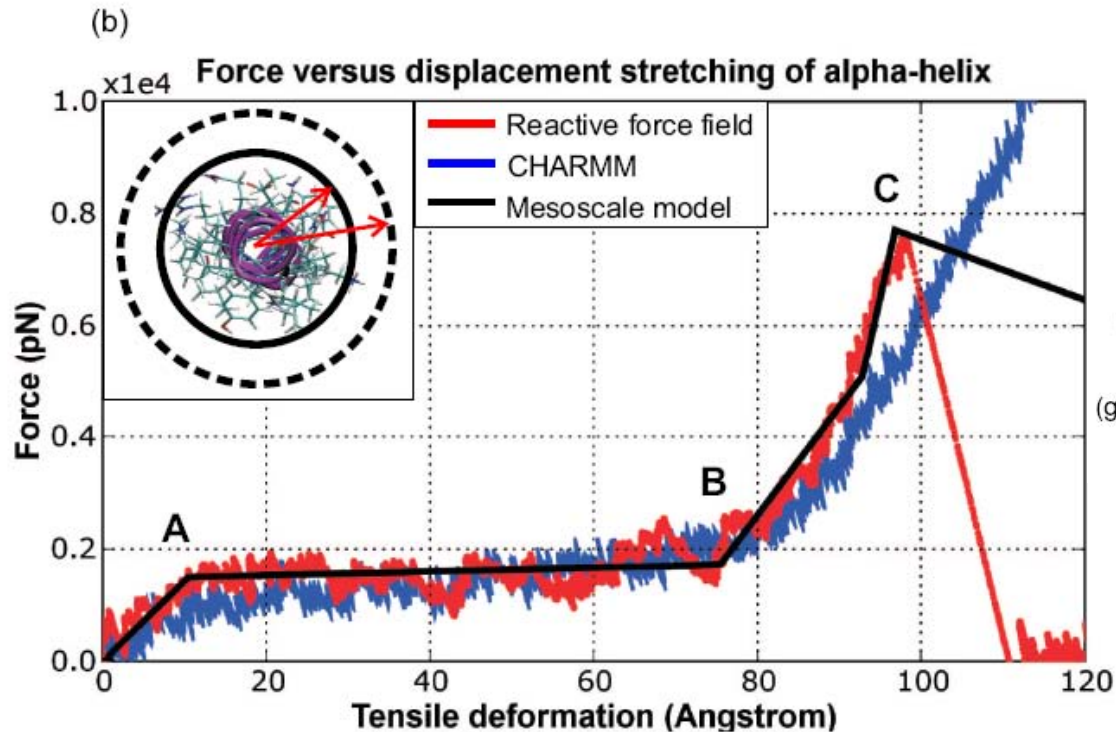
fibroblast cells  
(make collagen)



cell nucleus



# Alpha-helical protein: stretching



*ReaxFF modeling of AH stretching*

A: First H-bonds break (turns open)

B: Stretch covalent backbone

C: Backbone breaks

*What about varying pulling speeds?*



# Variation of pulling speed

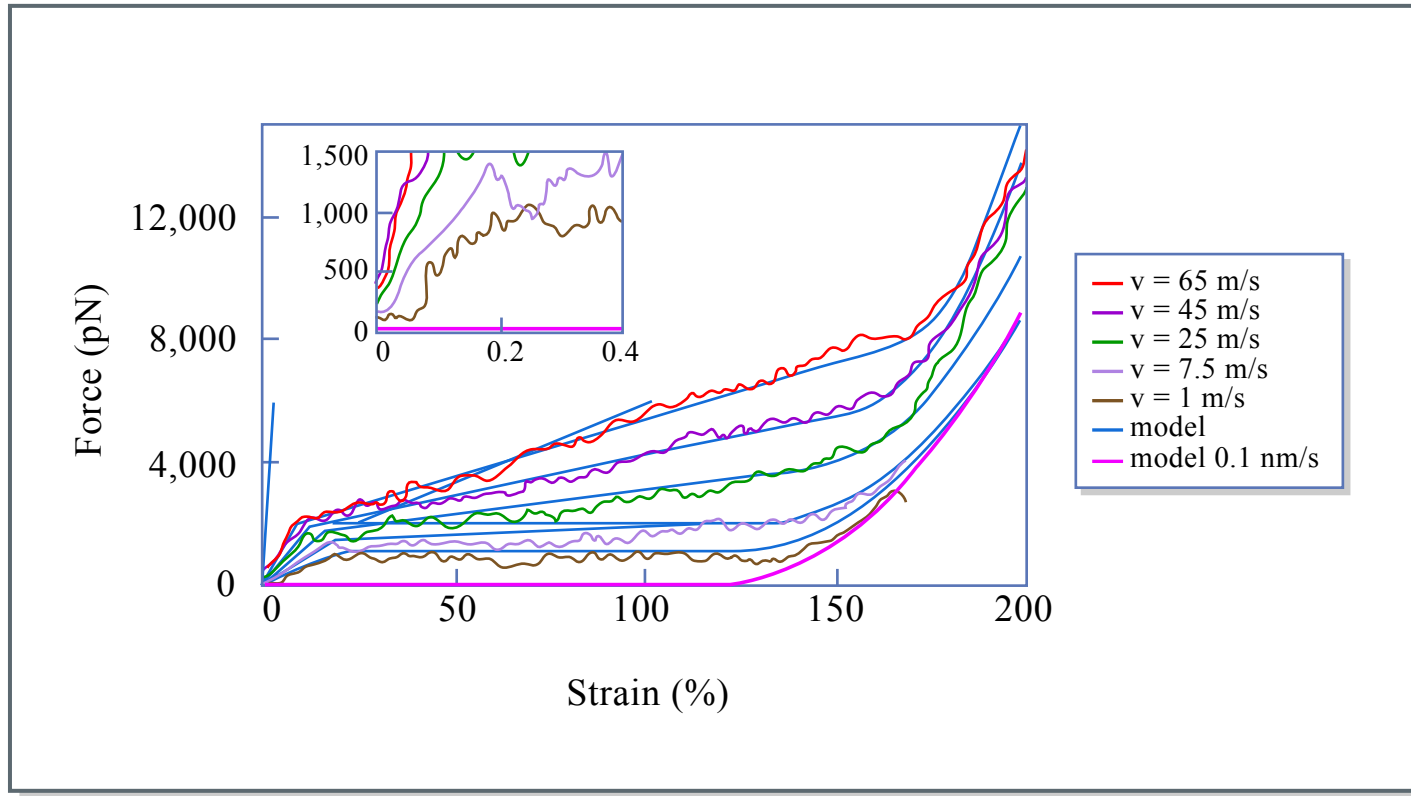
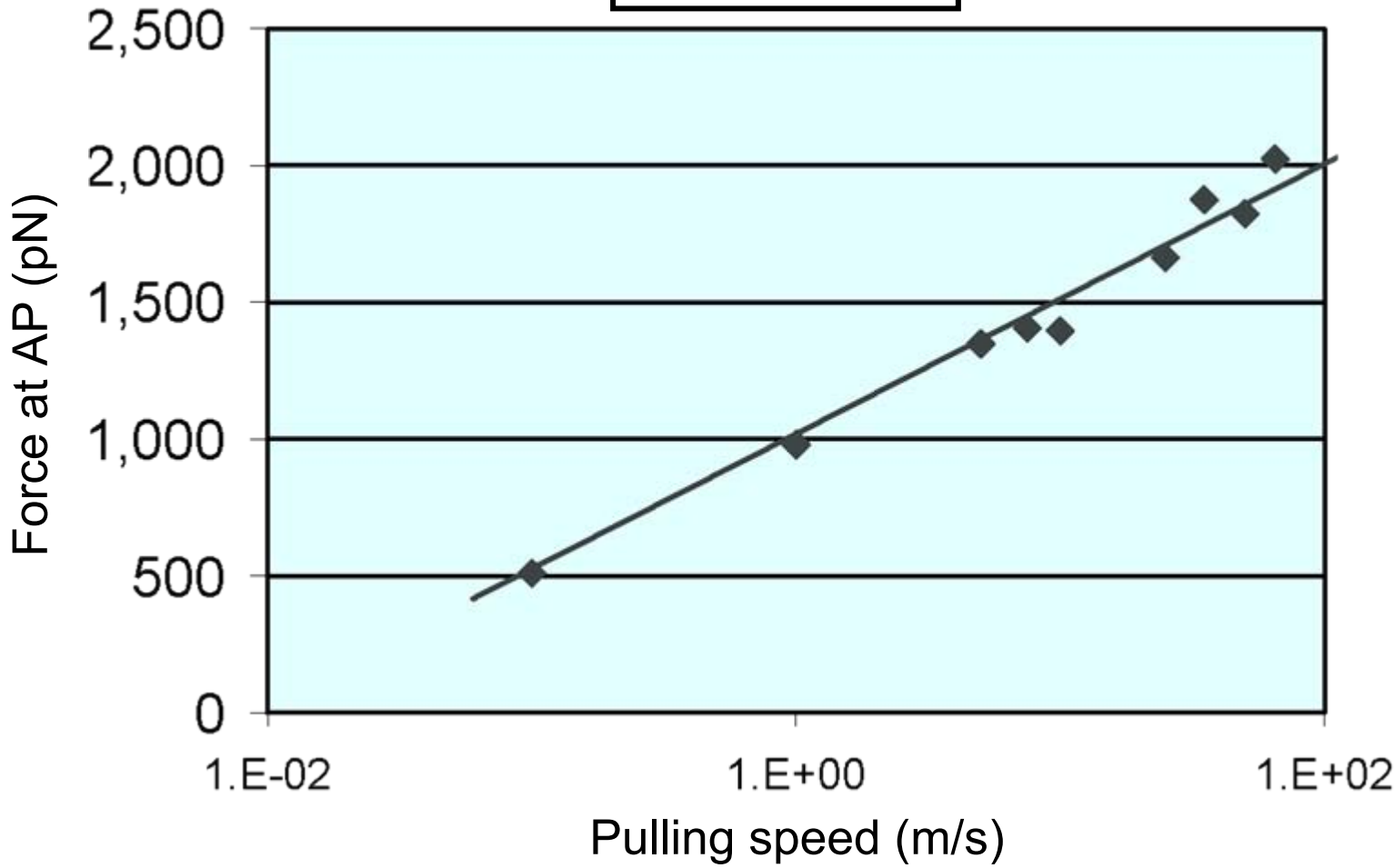


Image by MIT OpenCourseWare. After Ackbarow and Buehler, 2007.

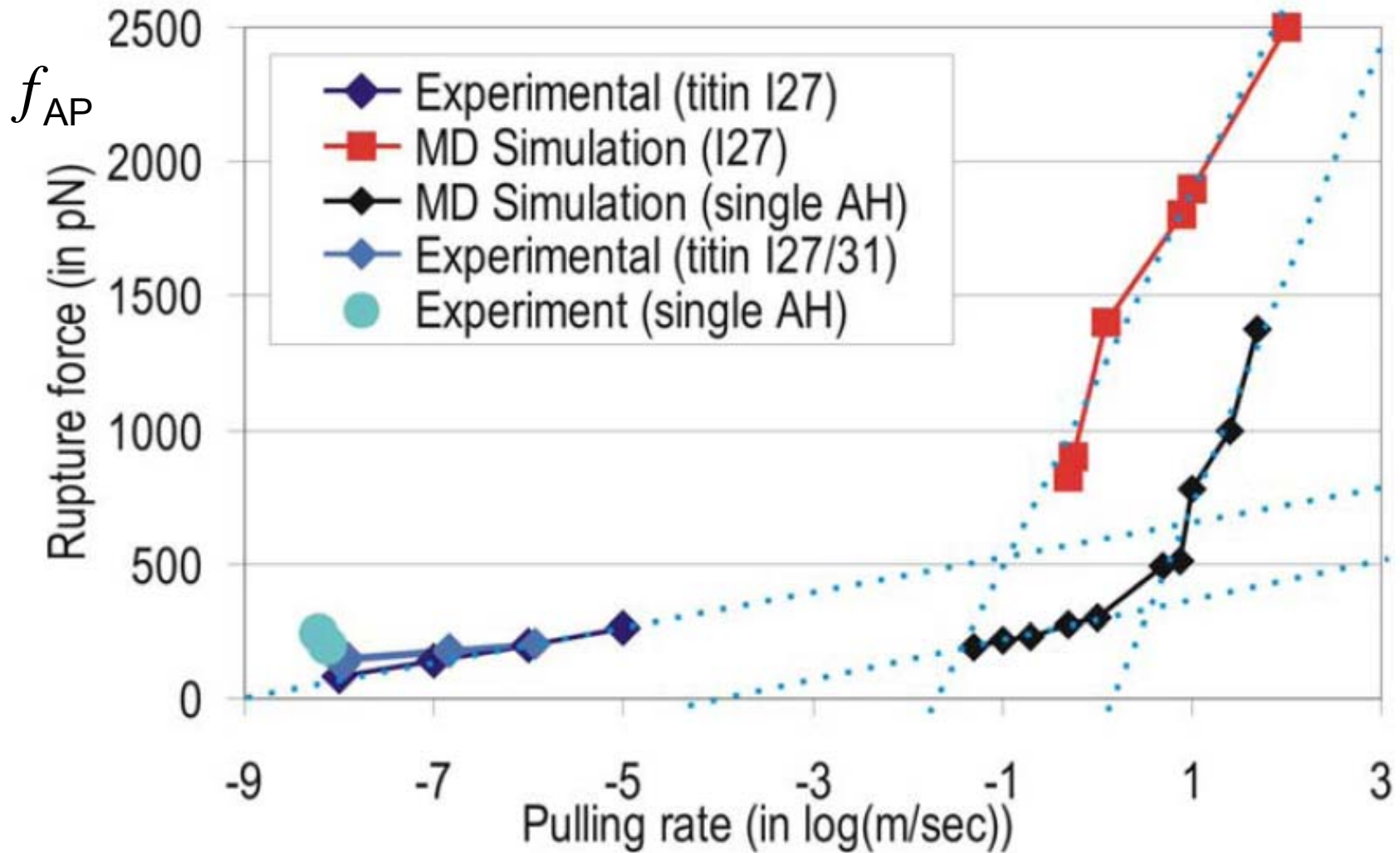
Force at angular point  $f_{AP}$  = fracture force

$$f_{AP} \sim \ln v$$



*General results...*

# Rupture force vs. pulling speed



Reprinted by permission from Macmillan Publishers Ltd: Nature Materials.

Source: Buehler, M., and Y. Yung. "Chemomechanical Behaviour of Protein Constituents." *Nature Materials* 8, no. 3 (2009): 175-88. © 2009.

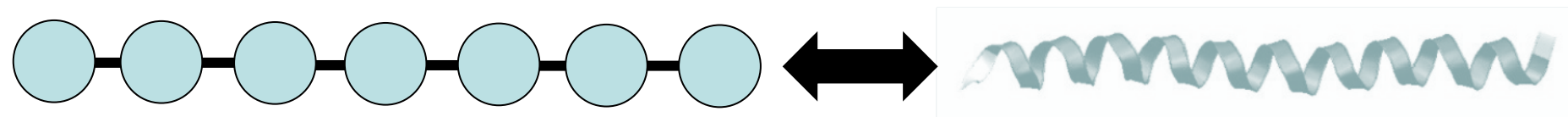
*How to make sense of these results?*

# A few fundamental properties of bonds

- Bonds have a “**bond energy**” (energy barrier to break)
- **Arrhenius relationship** gives probability for energy barrier to be overcome, given a temperature

$$p = \exp\left(-\frac{E_b}{k_B T}\right)$$

- All bonds **vibrate at frequency  $\omega$**



# Bell model

Probability for bond rupture (Arrhenius relation)

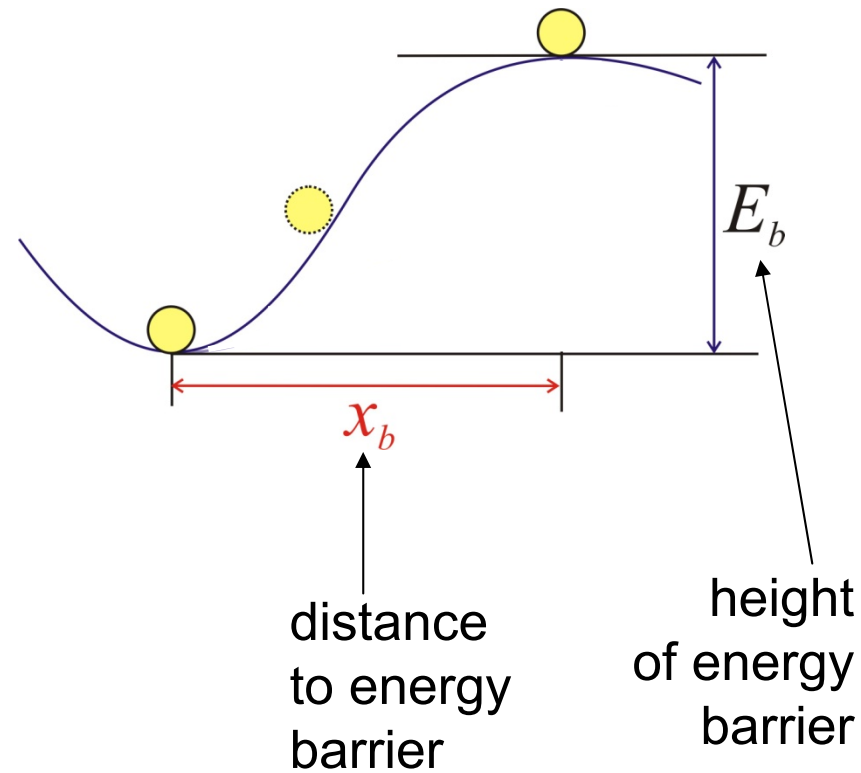
$$p = \exp\left(-\frac{E_b}{k_B T}\right)$$

Boltzmann constant

temperature



“bond”



# Bell model

Probability for bond rupture (Arrhenius relation)  $f = f_{AP}$

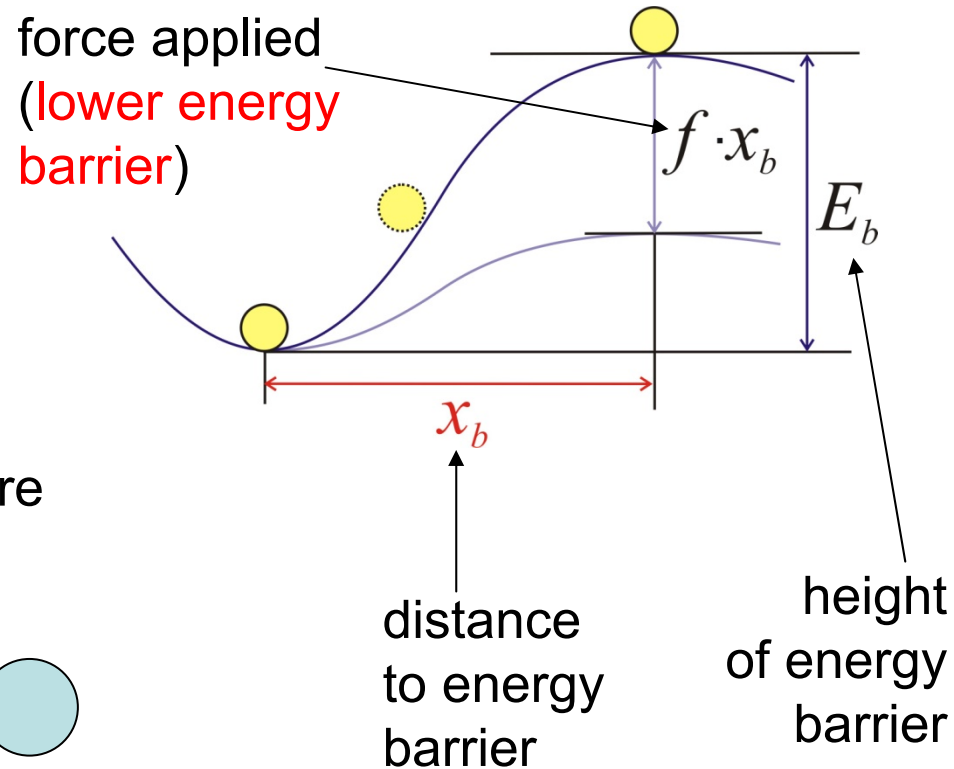
$$p = \exp\left(-\frac{E_b - f \cdot x_b}{k_B T}\right)$$

Boltzmann constant

temperature



“bond”





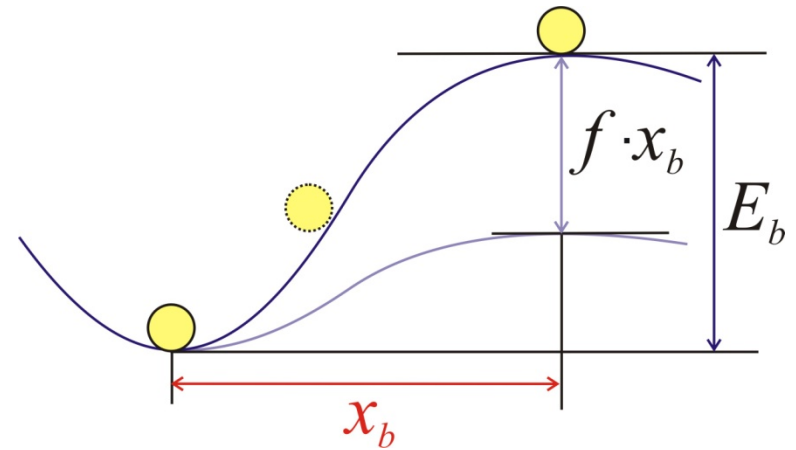
# Bell model

Probability for bond rupture (Arrhenius relation)

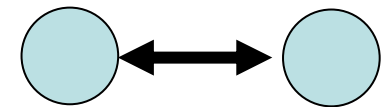
$$p = \exp\left(-\frac{E_b - f \cdot x_b}{k_B T}\right)$$

**Off-rate** = probability times vibrational frequency

$$\chi = \omega_0 \cdot p$$



$$\omega_0 = 1 \times 10^{13} \text{ 1/sec}$$



bond vibrations

# Bell model

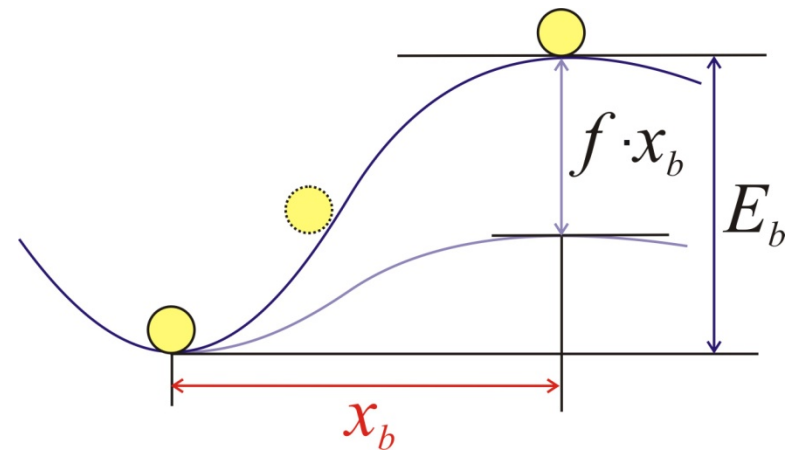
Probability for bond rupture (Arrhenius relation)

$$p = \exp\left(-\frac{E_b - f \cdot x_b}{k_B T}\right)$$

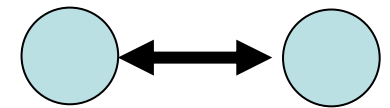
**Off-rate** = probability times vibrational frequency

$$\chi = \omega_0 \cdot p = \omega_0 \cdot \exp\left(-\frac{(E_b - f \cdot x_b)}{k_b \cdot T}\right)$$

*“How often bond breaks per unit time”*



$$\omega_0 = 1 \times 10^{13} \text{ 1/sec}$$



bond vibrations

# Bell model

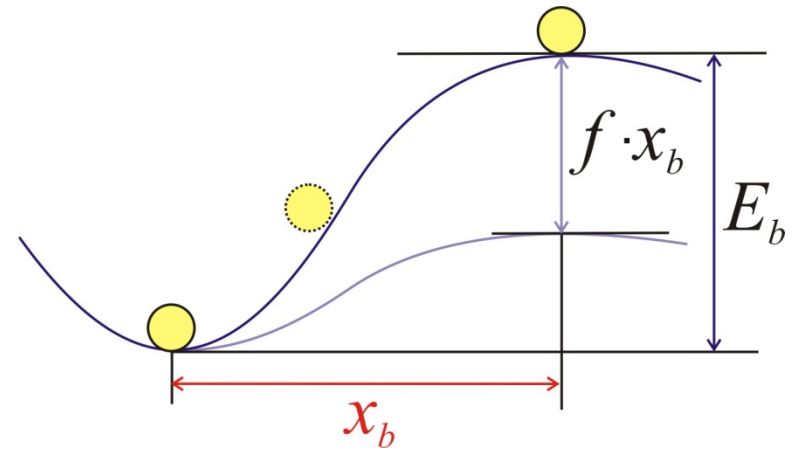
Probability for bond rupture (Arrhenius relation)

$$p = \exp\left(-\frac{E_b - f \cdot x_b}{k_B T}\right)$$

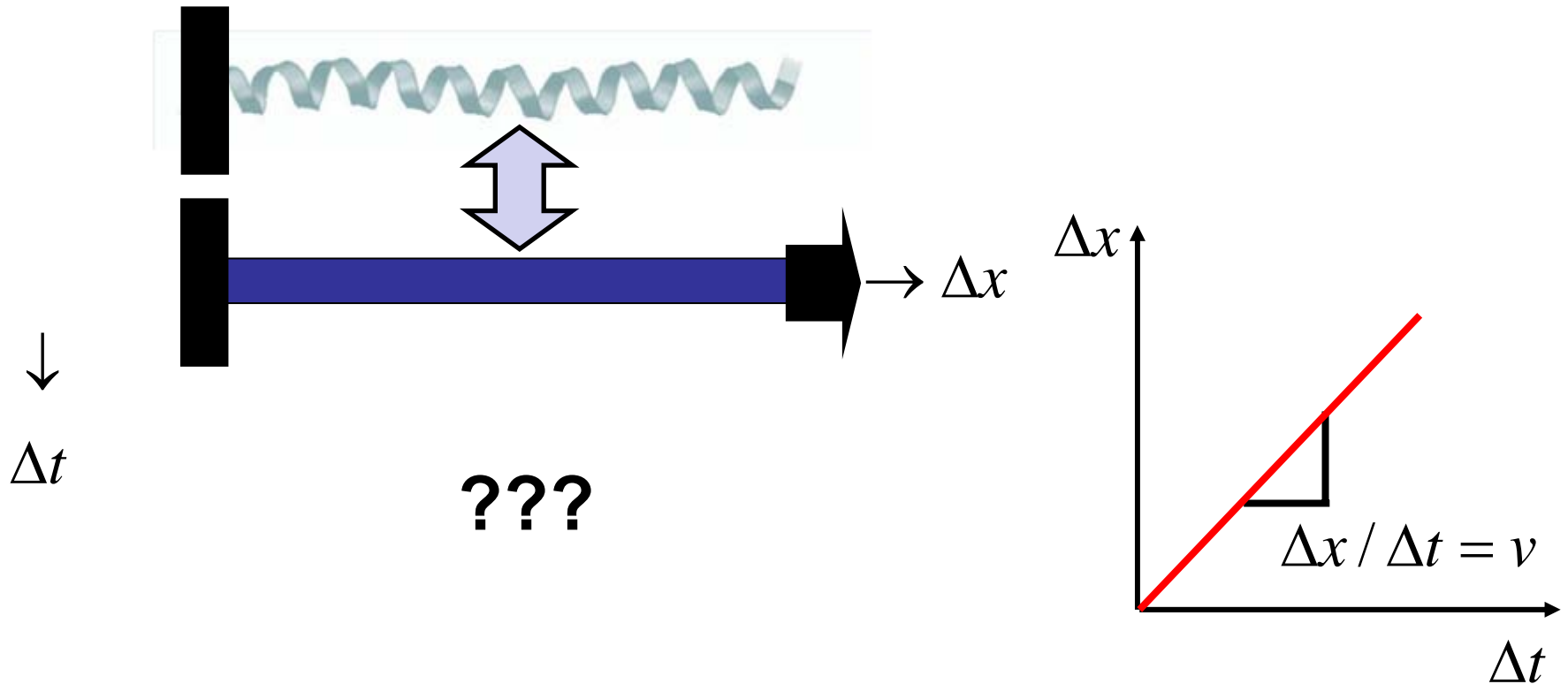
**Off-rate** = probability times vibrational frequency

$$\chi = \omega_0 \cdot p = \omega_0 \cdot \exp\left(-\frac{(E_b - f \cdot x_b)}{k_b \cdot T}\right) = \frac{1}{\tau} \quad \omega_0 = 1 \times 10^{13} \text{ 1/sec}$$

$\tau$  = **bond lifetime**  
(inverse of off-rate)

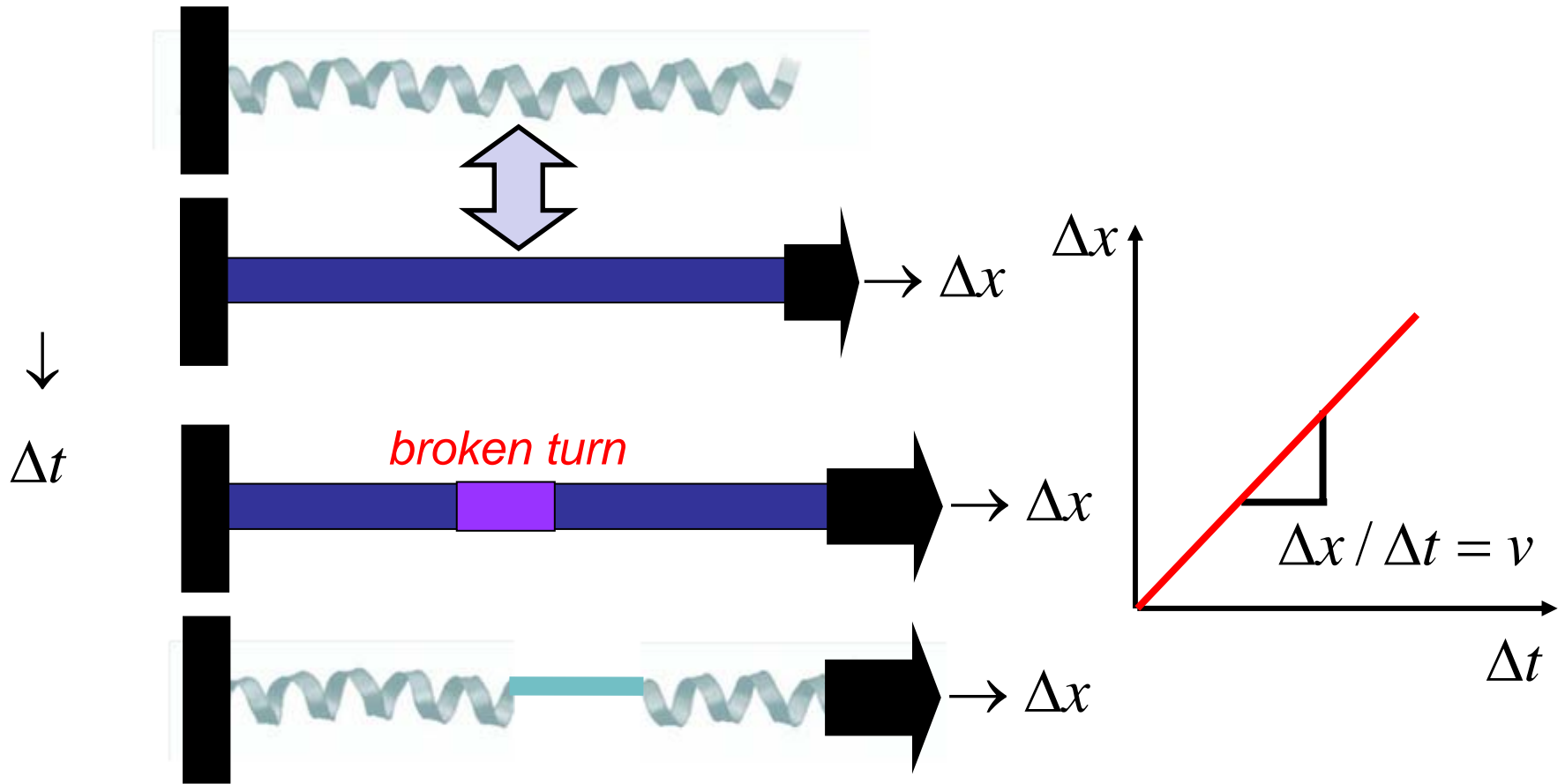


# Bell model



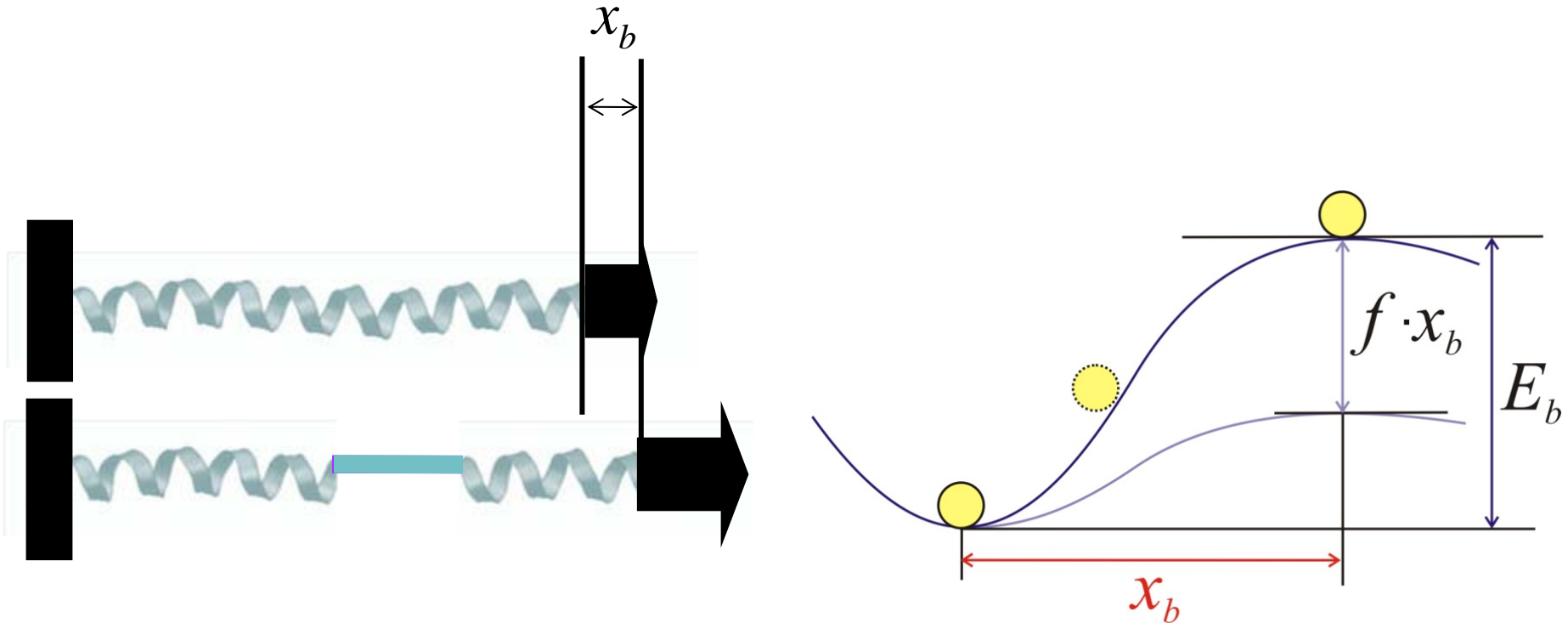
$$\Delta x / \Delta t = v \quad \text{pulling speed (at end of molecule)}$$

# Bell model



$$\Delta x / \Delta t = v \quad \text{pulling speed (at end of molecule)}$$

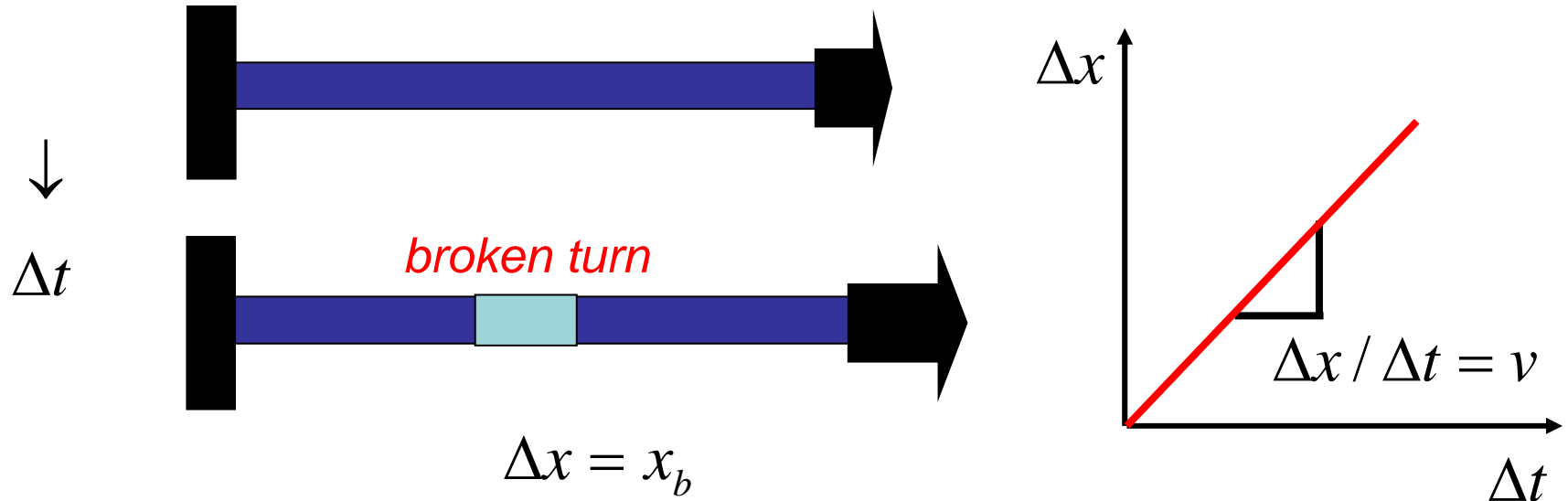
# Structure-energy landscape link



$$\Delta x = x_b$$

$$\Delta t = \tau \quad \tau = \left[ \omega_0 \cdot \exp\left( -\frac{(E_b - f \cdot x_b)}{k_b \cdot T} \right) \right]^{-1}$$

# Bell model



Bond breaking at  $x_b$  (lateral applied displacement):

$$\underbrace{\chi \cdot x_b}_{= 1/\tau} = \omega_0 \cdot \exp\left(-\frac{(E_b - f \cdot x_b)}{k_b \cdot T}\right) \cdot x_b = \Delta x / \Delta t = v \uparrow$$

pulling speed

# Bell model

$$\omega_0 \cdot \exp\left(-\frac{(E_b - f \cdot x_b)}{k_b \cdot T}\right) \cdot x_b = \nu$$

Solve this expression for  $f$ :



# Bell model

$$\omega_0 \cdot \exp\left(-\frac{(E_b - f \cdot x_b)}{k_b \cdot T}\right) \cdot x_b = v$$

Solve this expression for  $f$ :

$$-\frac{(E_b - f \cdot x_b)}{k_b \cdot T} + \ln(\omega_0 \cdot x_b) = \ln v \quad \leftarrow \ln(..)$$

$$-E_b + f \cdot x_b = k_b \cdot T (\ln v - \ln(\omega_0 \cdot x_b))$$

$$f = \frac{E_b + k_b \cdot T (\ln v - \ln(\omega_0 \cdot x_b))}{x_b} = \frac{k_b \cdot T}{x_b} \ln v + \frac{k_b \cdot T}{x_b} \left( \frac{E_b}{k_b \cdot T} - \ln(\omega_0 \cdot x_b) \right)$$

$$f = \frac{k_b \cdot T}{x_b} \ln v - \frac{k_b \cdot T}{x_b} \left( \ln(\omega_0 \cdot x_b) - \frac{E_b}{k_b \cdot T} \right)$$

$$f = \frac{k_b \cdot T}{x_b} \ln v - \frac{k_b \cdot T}{x_b} \ln \left( \omega_0 \cdot x_b \cdot \exp\left(-\frac{E_b}{k_b \cdot T}\right) \right)$$

# Simplification and grouping of variables

*Only system parameters,  
[distance/length]*

$$f(v; x_b, E_b) = \frac{k_b \cdot T}{x_b} \cdot \ln v - \frac{k_b \cdot T}{x_b} \cdot \ln \left( \underbrace{\omega_0 \cdot x_b \cdot \exp\left(-\frac{E_b}{k_b \cdot T}\right)}_{=: v_0} \right)$$
$$=: v_0 = \omega_0 \cdot x_b \cdot \exp\left(-\frac{E_b}{k_b \cdot T}\right)$$

# Bell model

$$\omega_0 \cdot \exp\left(-\frac{(E_b - f \cdot x_b)}{k_b \cdot T}\right) \cdot x_b = v$$

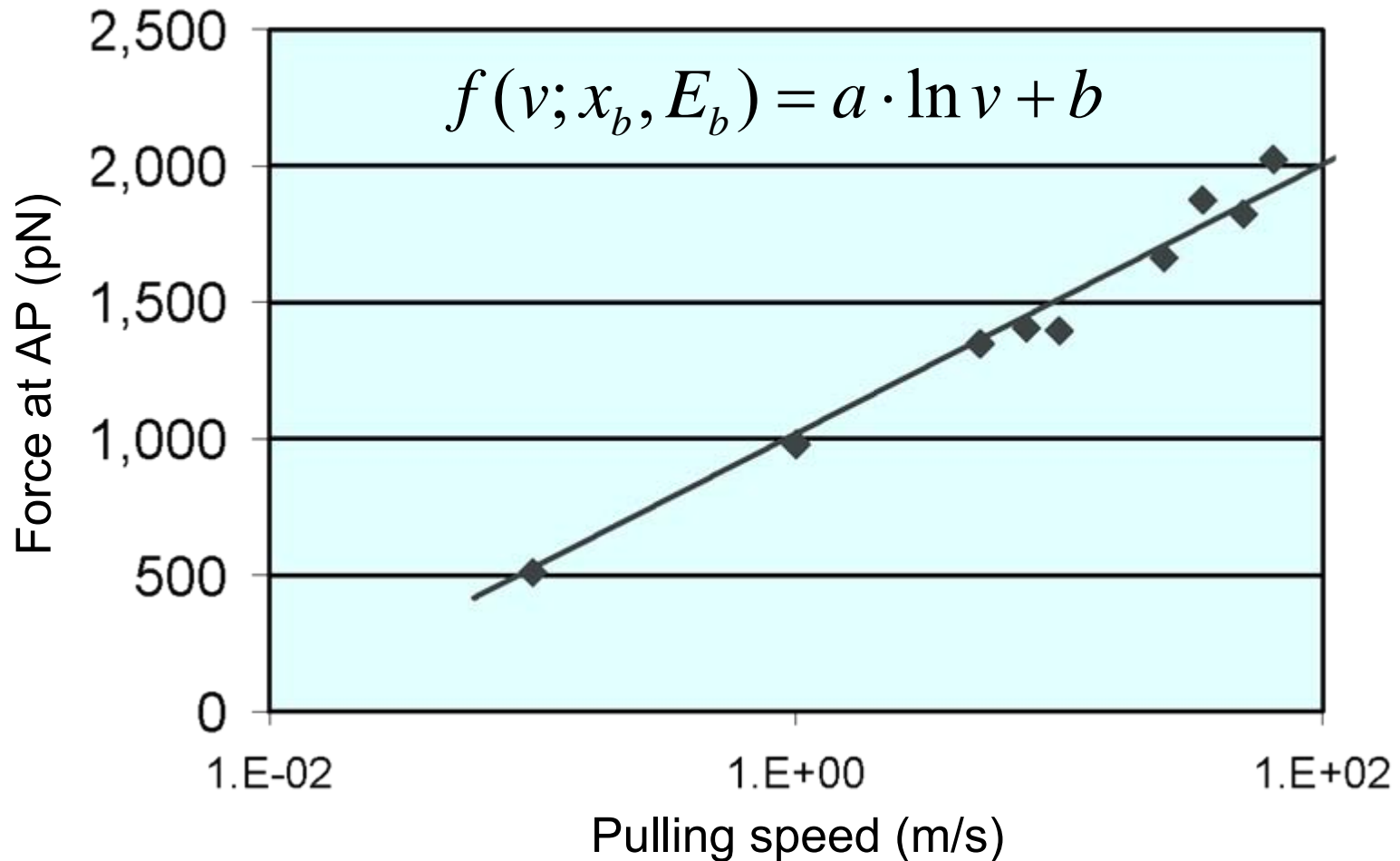
Results in:

$$f(v; x_b, E_b) = \frac{k_b \cdot T}{x_b} \cdot \ln v - \frac{k_b \cdot T}{x_b} \cdot \ln v_0 = a \cdot \ln v + b$$

$$a = \frac{k_B \cdot T}{x_b}$$

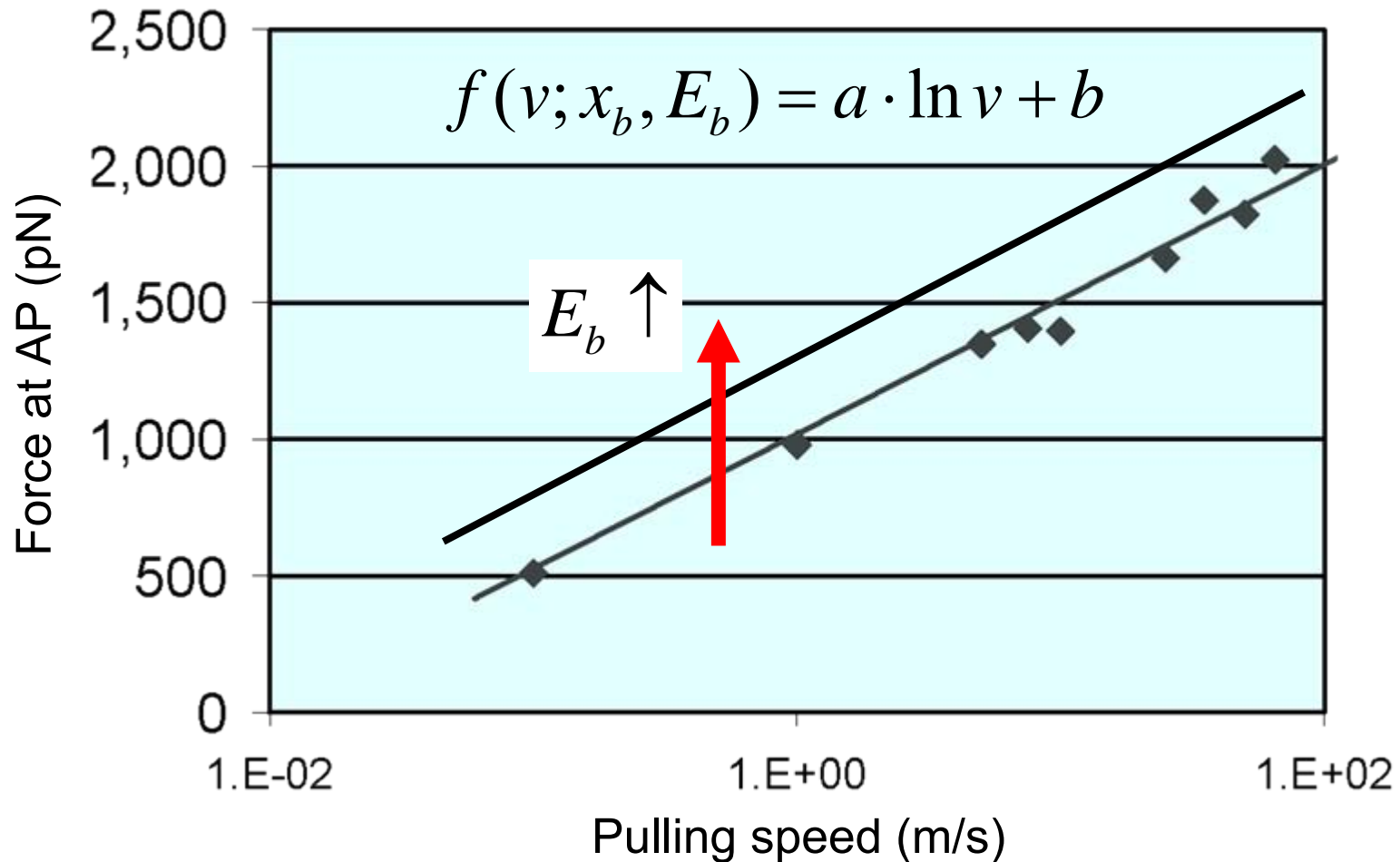
$$b = -\frac{k_B \cdot T}{x_b} \cdot \ln v_0$$

$f \sim \ln v$  behavior of strength



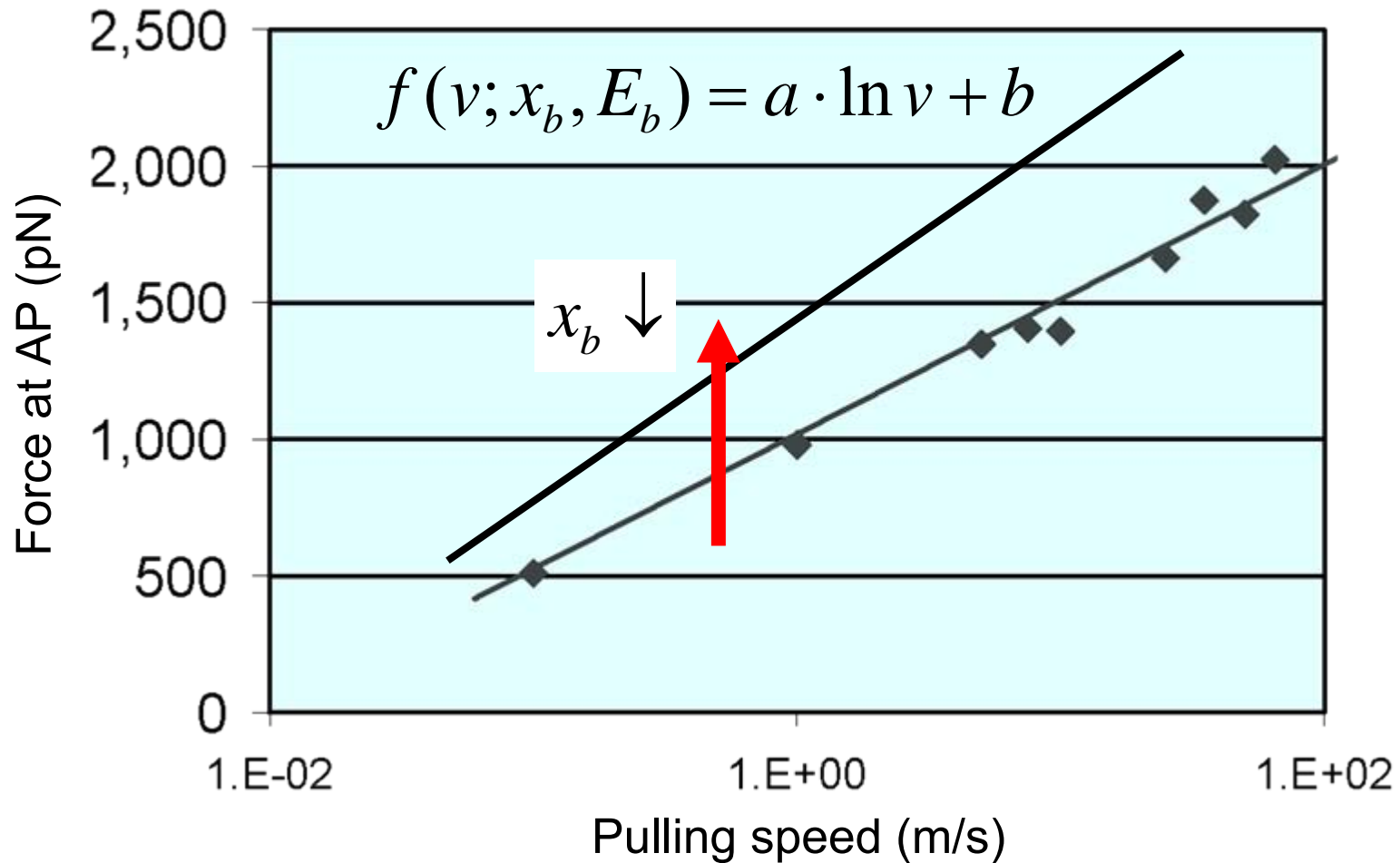
$E_b = 5.6$  kcal/mol and  $x_b = 0.17 \text{ \AA}$  (results obtained from fitting to the simulation data)

# Scaling with $E_b$ : shifts curve



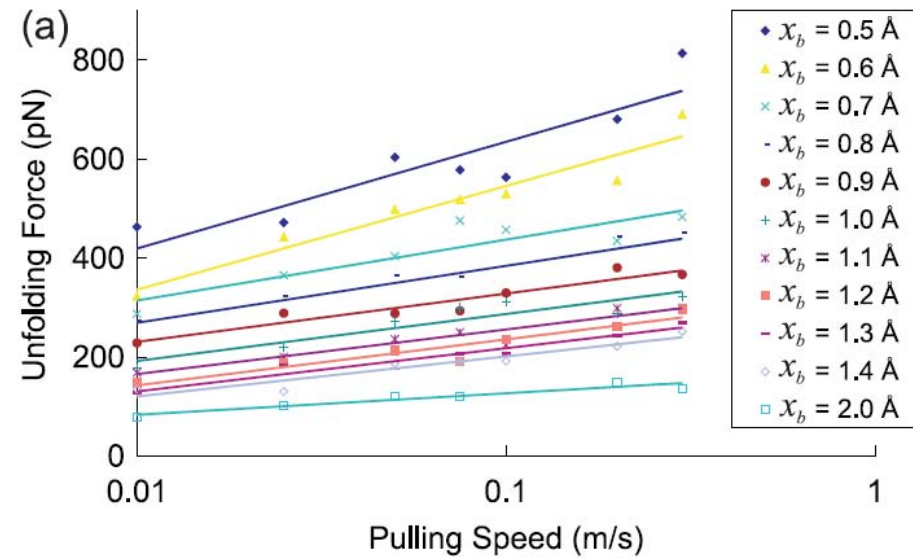
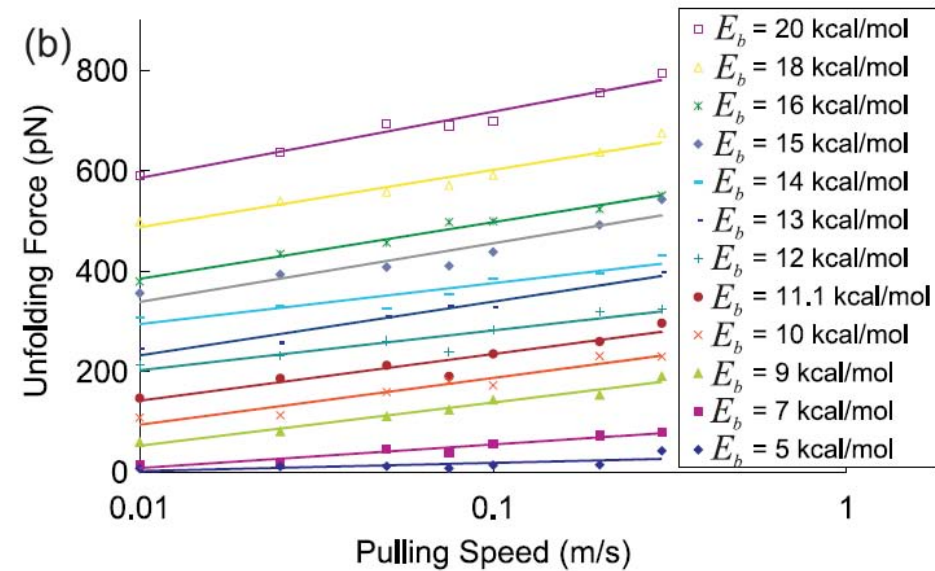
$$a = \frac{k_B \cdot T}{x_b} \quad b = -\frac{k_B \cdot T}{x_b} \cdot \ln v_0 \quad v_0 = \omega_0 \cdot x_b \cdot \exp\left(-\frac{E_b}{k_b \cdot T}\right)$$

# Scaling with $x_b$ : changes slope

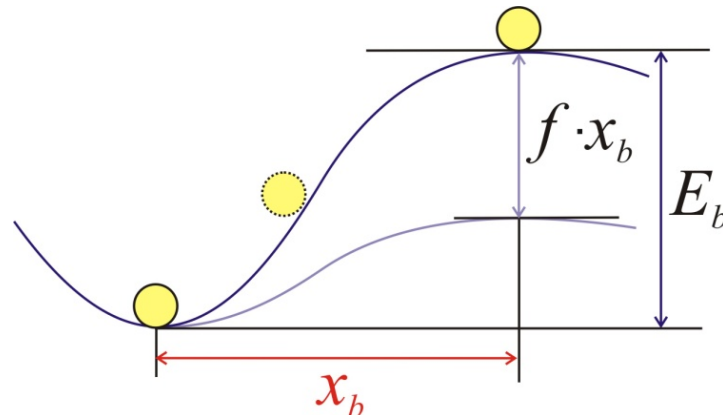


$$a = \frac{k_B \cdot T}{x_b} \quad b = -\frac{k_B \cdot T}{x_b} \cdot \ln v_0 \quad v_0 = \omega_0 \cdot x_b \cdot \exp\left(-\frac{E_b}{k_b \cdot T_{78}}\right)$$

# Simulation results



Courtesy of IOP Publishing, Inc. Used with permission. Source: Fig. 3 from Bertaud, J., Hester, J. et al. "Energy Landscape, Structure and Rate Effects on Strength Properties of Alpha-helical Proteins." *J Phys.: Condens. Matter* 22 (2010): 035102. doi:10.1088/0953-8984/22/3/035102.



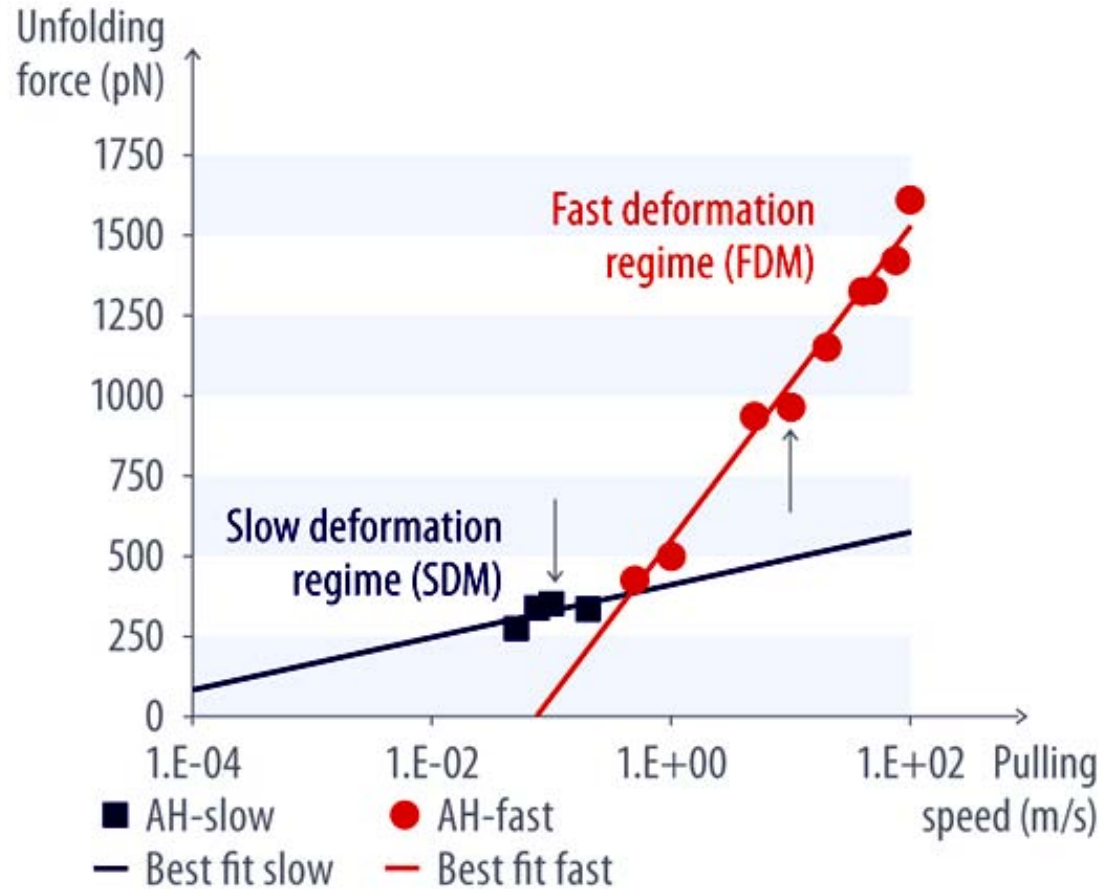
*Mechanisms associated with protein  
fracture*



# Change in fracture mechanism



Single AH structure



**FDM:** Sequential HB breaking

**SDM:** Concurrent HB breaking (3..5 HBs)

**Simulation span: 250 ns**  
**Reaches deformation speed O(cm/sec)**

Courtesy of National Academy of Sciences, U. S. A. Used with permission. Source: Ackbarow, Theodor, et al. "Hierarchies, Multiple Energy Barriers, and Robustness Govern the Fracture Mechanics of Alpha-helical and Beta-sheet Protein Domains." *PNAS* 104 (October 16, 2007): 16410-5. Copyright 2007 National Academy of Sciences, U.S.A.

# Analysis of energy landscape parameters

Table 1. Summary of the differences between the SDM and FDM, for AH1, AH2, and BS

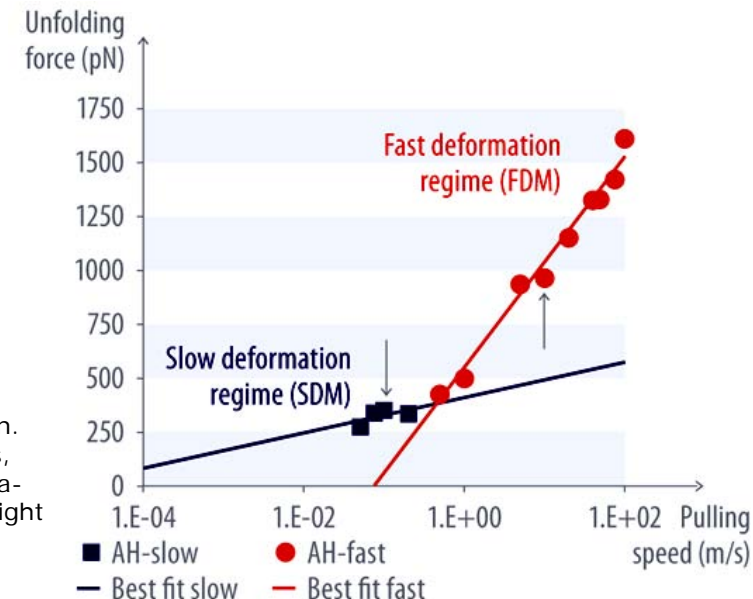
Parameter	AH1 (AH2) domain		BS domain	
	SDM	FDM	SDM	FDM
Pulling speed, m/s	$v < 0.4$ (4)	$v > 0.4$ (4)	$v < 10$	$v > 10$
Unfolding force, pN	$F < 350$ (400)	$F > 350$ (400)	$F < 4,800$	$F > 4,800$
$E_b$ , kcal/mol	11.1 (9.11)	4.87 (3.08)	11.08	1.82
$x_b$ , Å	1.2 (1.19)	0.2 (0.11)	0.138	0.019
HB-breaking mechanism	Simultaneous	Sequential	Simultaneous	Sequential

The values in parentheses in the AH columns represent the results for AH2.

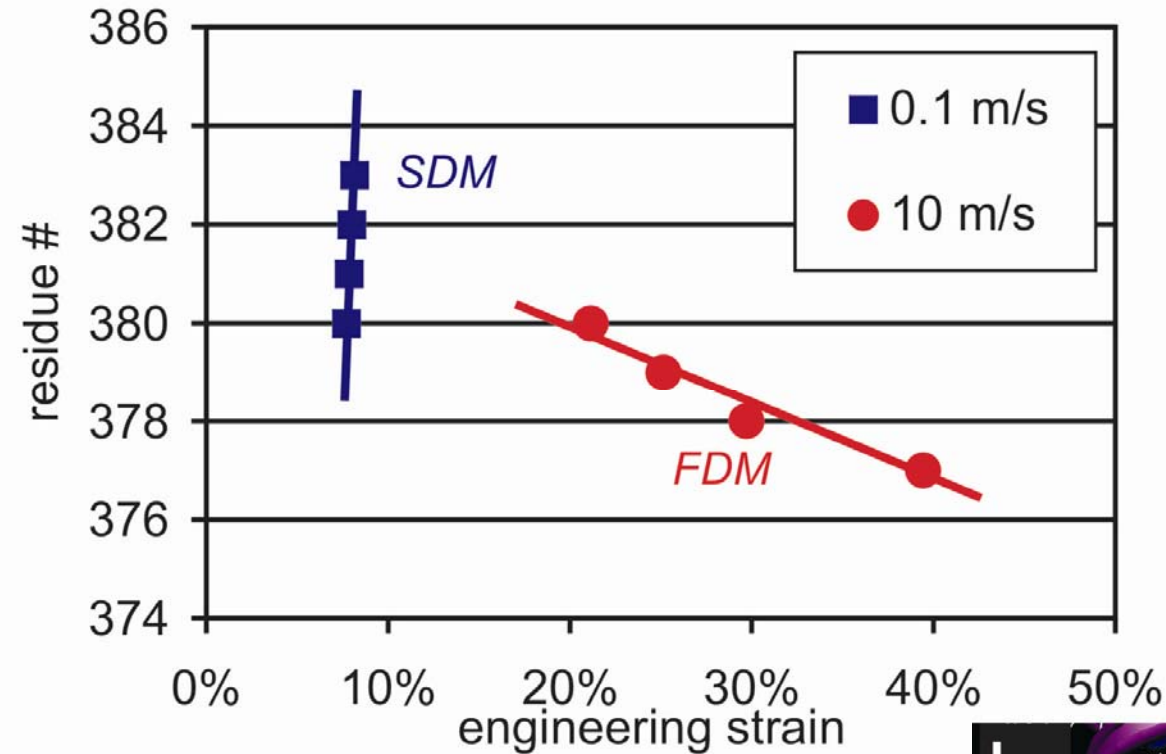
Energy single H-bond:  $\approx 3-4$  kcal/mol

***What does this mean???***

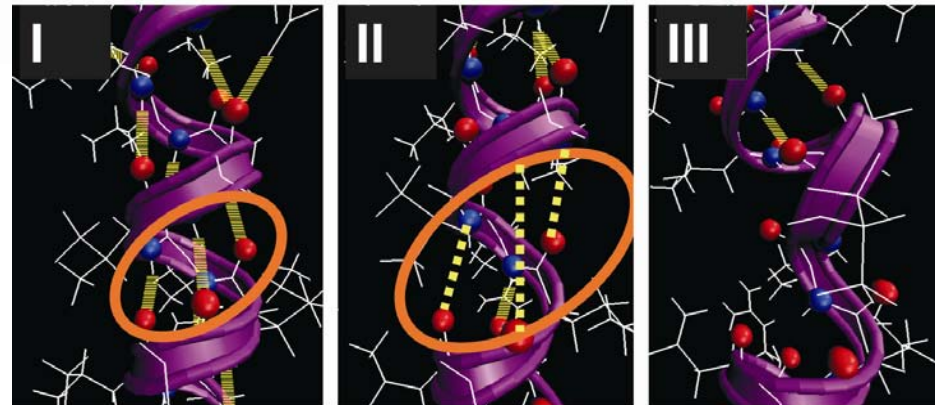
Courtesy of National Academy of Sciences, U. S. A. Used with permission. Source: Ackbarow, Theodor, et al. "Hierarchies, Multiple Energy Barriers, and Robustness Govern the Fracture Mechanics of Alpha-helical and Beta-sheet Protein Domains." *PNAS* 104 (October 16, 2007): 16410-5. Copyright 2007 National Academy of Sciences, U.S.A.



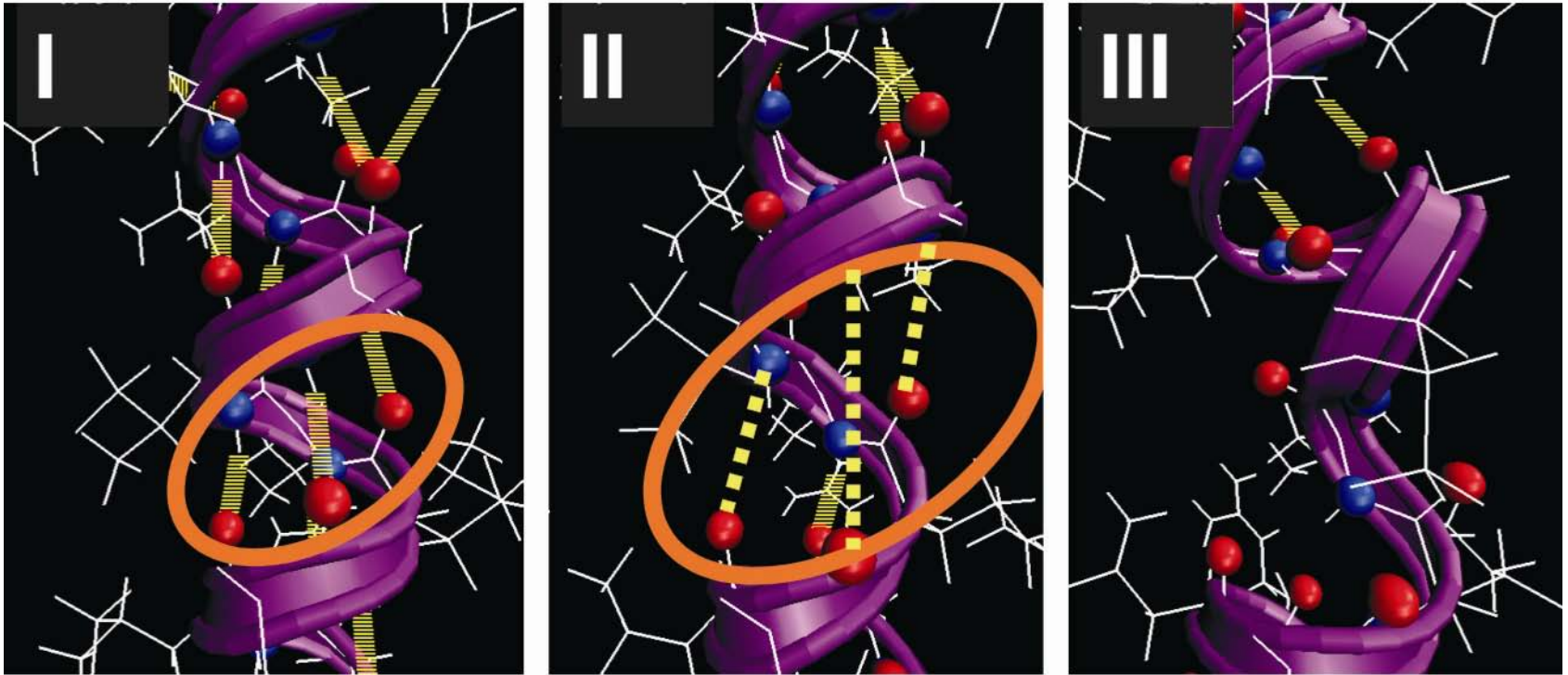
# H-bond rupture dynamics: mechanism



Courtesy of National Academy of Sciences, U. S. A. Used with permission.  
Source: Ackbarow, Theodor, et al. "Hierarchies, Multiple Energy Barriers, and Robustness Govern the Fracture Mechanics of Alpha-helical and Beta-sheet Protein Domains." *PNAS* 104 (October 16, 2007): 16410-5. Copyright 2007 National Academy of Sciences, U.S.A.



# H-bond rupture dynamics: mechanism



Courtesy of National Academy of Sciences, U. S. A. Used with permission.  
Source: Ackbarow, Theodor, et al. "Hierarchies, Multiple Energy Barriers, and Robustness Govern the Fracture Mechanics of Alpha-helical and Beta-sheet Protein Domains." *PNAS* 104 (October 16, 2007): 16410-15.  
Copyright 2007 National Academy of Sciences, U.S.A.

I: All HBs are intact

II: Rupture of 3 HBs – simultaneously; **within  $\tau \approx 20$  ps**

III: Rest of the AH relaxes – slower deformation...

MIT OpenCourseWare  
<http://ocw.mit.edu>

3.021J / 1.021J / 10.333J / 18.361J / 22.00J Introduction to Modeling and Simulation  
Spring 2011

For information about citing these materials or our Terms of use, visit: <http://ocw.mit.edu/terms>.