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**Mechanical stability of  
proteins and virus capsids:**

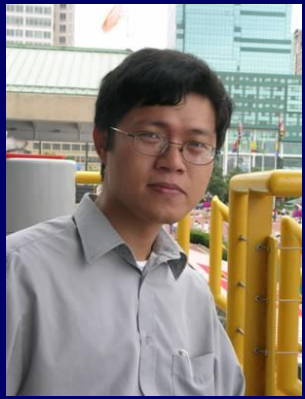


**Coarse-grained structure based  
models**

Developed in response to limitations of all-atom models, more qualitative



*Since 1999*



**Trinh Xuan Hoang**  
Institute of Physics,  
Hanoi, Vietnam



**Piotr Szymczak,**  
Institute of Theoretical  
Physics, Warsaw  
Univeristy, Poland



**Mark O. Robbins,**  
Johns Hopkins  
University,  
Baltimore, USA



**Michal  
Wojciechowski,**



**Szymon  
Niewieczera**



**Joanna I.  
Sułkowska**



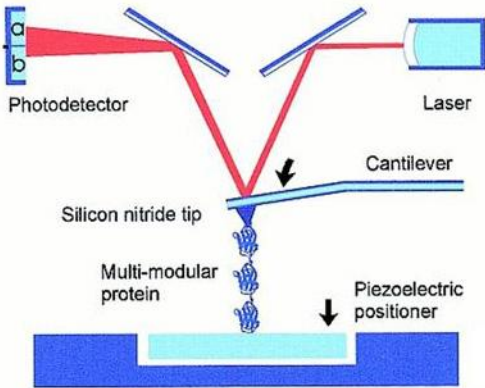
**Piotr Sułkowski,**  
Insitute of Nuclear  
Physics, Warsaw, Poland



**Mateusz  
Sikora**

**S. Filipek (Warsaw), K. Krzyśko (Warsaw), H. Janovjak (Berkeley), P. Marszałek (Duke), A. Pastore (London), M. Carrion-Vazquez (Madrid)**

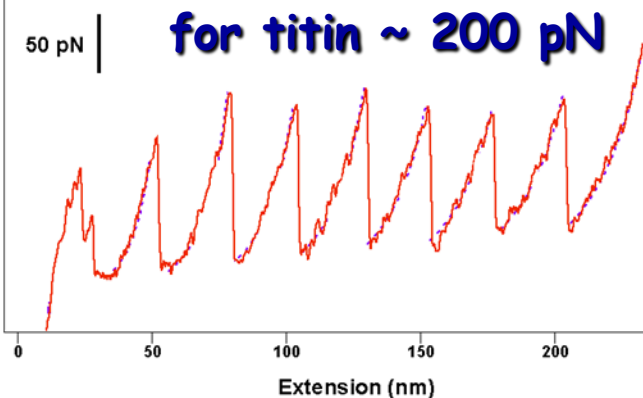
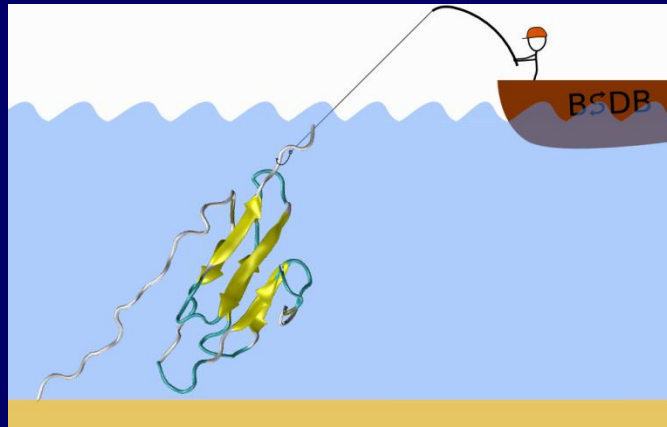
## Atomic force microscope



# STRETCHING OF SINGLE MOLECULES

An adequate force is needed to generate rupture to learn about the structure

Characteristic scale  
of the force:  $F_{max}$



Stretching  
of bridge  
pylons

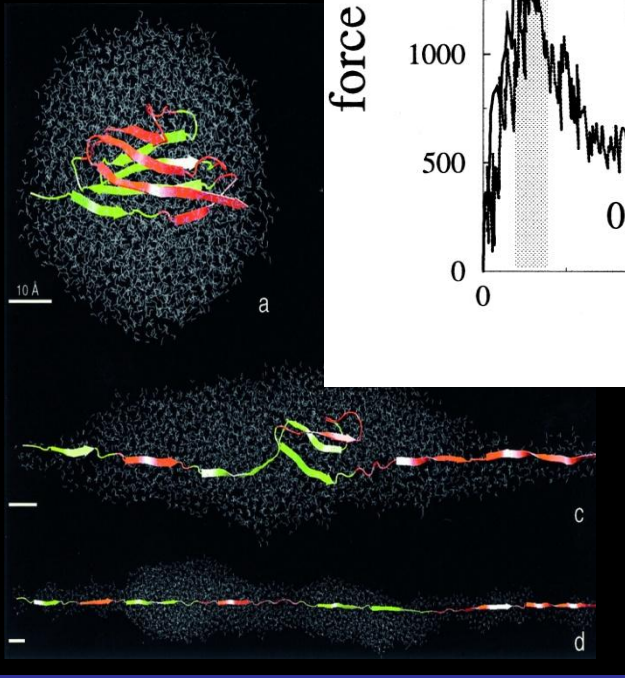
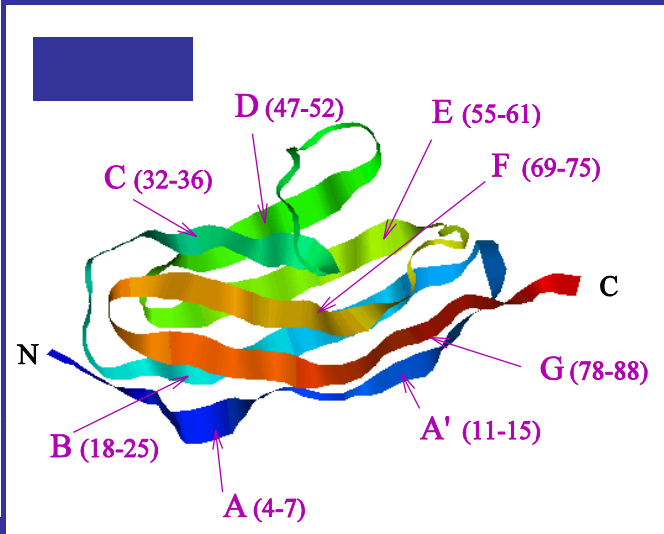
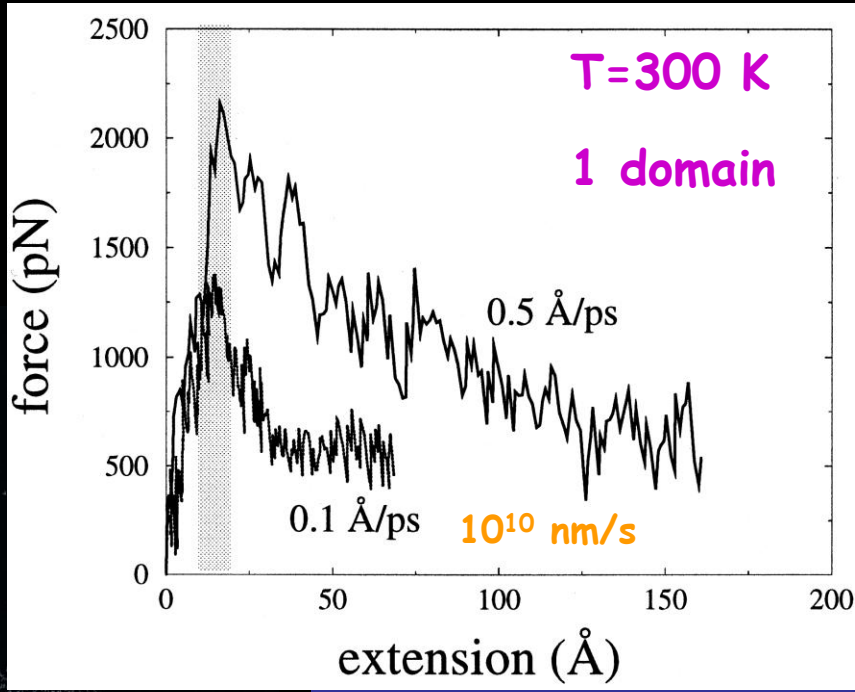
No rupture



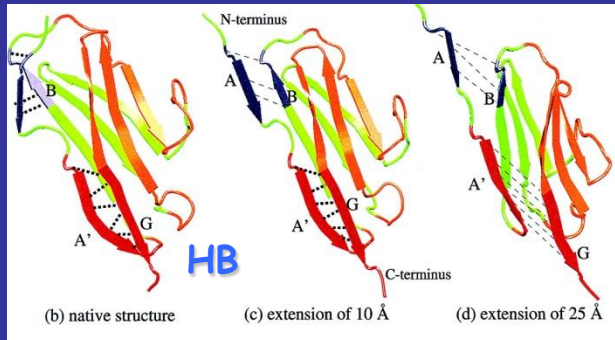
# ALL-ATOM SIMULATIONS: titin

Lu Schulten 2000 (Paci Karplus 2000)

typically 10-100 ns time scales



Pabon, Amzel 2006 - quasistatic ~500 pN



**Difficult:**  
 processes involving large conformational changes  
 comparative studies of many proteins



# STRUCTURE-BASED MODELS OF PROTEINS

*TAKE HOMOPOLYMERS -  
chains of tethered beads:*

$C^\alpha$

*ADD ATTRACTION  
BETWEEN SOME BEADS to  
shape the homopolymers into  
the backbones of proteins*

Idea: N. Go &  
H. Abe 1981

First MD implementation in a "minimalist model":  
J. Honeycutt & D. Thirumalai 1992

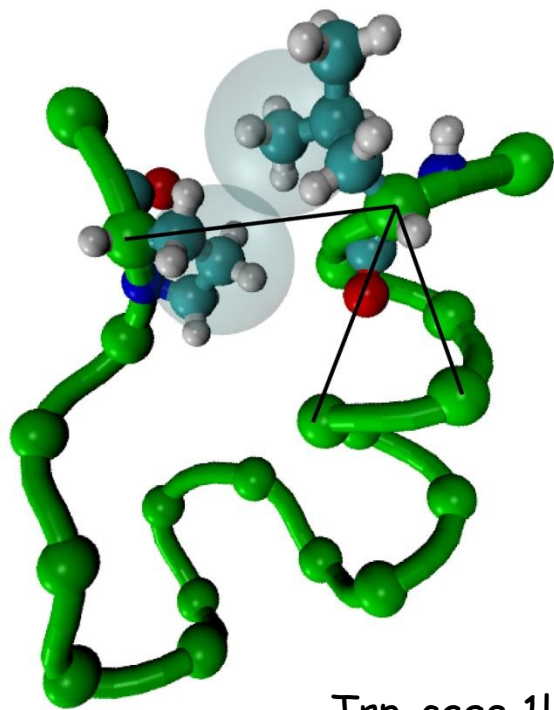


# NATIVE CONTACTS

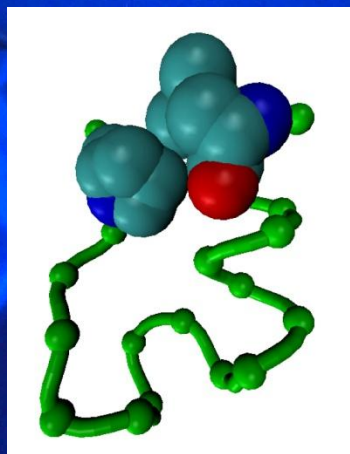
Defined by the conformation of the native state

Tsai Taylor Chothia Gerstein 1999

Overlap of the van der Waals spheres of the heavy atoms



Trp-cage 1l2y





# GEOMETRY-BASED MODEL



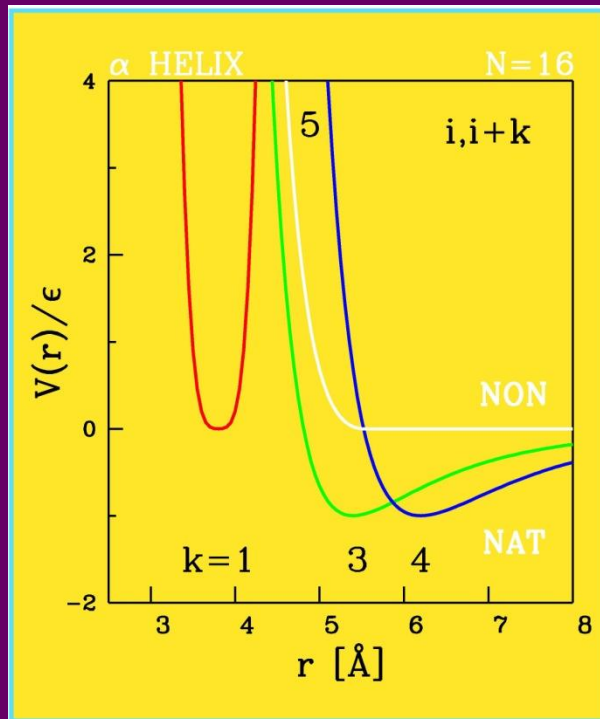
$$E_p(\{\mathbf{r}_i\}) = V^{BB} + V^{\text{NAT}} + V^{\text{NON}} + V^S$$

$V^{BB}$  – TETHERING of consecutive beads at  $3.8 \text{ \AA} = d_0$

$$V^{\text{NAT}} = \sum_{i < j}^{\text{NAT}} 4\epsilon \left[ \left( \frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left( \frac{\sigma_{ij}}{r_{ij}} \right)^6 \right]$$

$\epsilon$ : 1.6 kcal/mol ~ 800 K

Room T:  $0.35 \epsilon$



$\sigma_{ij}$  calculated based on the  $C_i^{\alpha} - C_j^{\alpha}$  native distance

Non-native: repulsive  
with  $\sigma=4\text{\AA}$

Disulfide bonds like peptide bonds

$V^S$ : angular terms locally favoring the native shape of the backbone: local stiffness

# MOLECULAR DYNAMICS

$$m\ddot{\mathbf{r}} = -\gamma\dot{\mathbf{r}} + F_c + \Gamma$$

$$\langle \Gamma(0)\Gamma(t) \rangle = 2\gamma k_B T \delta(t)$$

$$\tau = \sqrt{ma^2/\epsilon} \sim 3ps \quad (\text{small } \gamma)$$

$$a = 5\text{\AA} \approx \langle \sigma_{ij} \rangle \quad m=118m_p$$

$$F_c = -\nabla_r E_p$$

**Brownian Dynamics**  
if the inertia term  
is neglected

*Langevin noise as a  
thermostat and as an  
emulator of water*

**Large friction**  
**Finite bead size**

modify the effective time scale  $\tau$

Veitshans, Klimov,  
Thirumalai 1997:  $\tau \sim 3ns$

$$\tau \sim 1 \text{ ns}$$

diffusional time to  
move by  $\sim 5 \text{ \AA}$

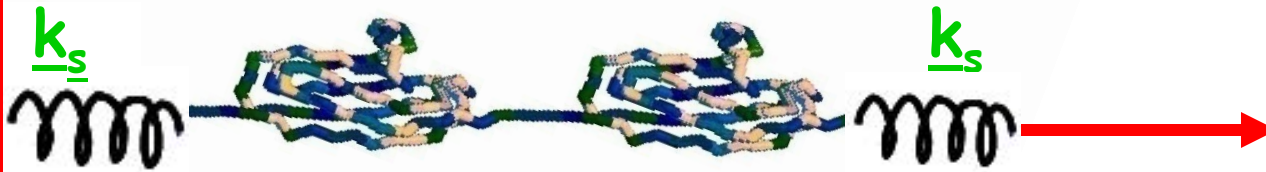
when comparing with experiments

$$\text{Use } \gamma = 2m/\tau$$



$v_p = 0.005 \text{ \AA}/\tau \sim 10^6 \text{ nm/s}$

experiment  $< 10^4 \text{ nm/s}$



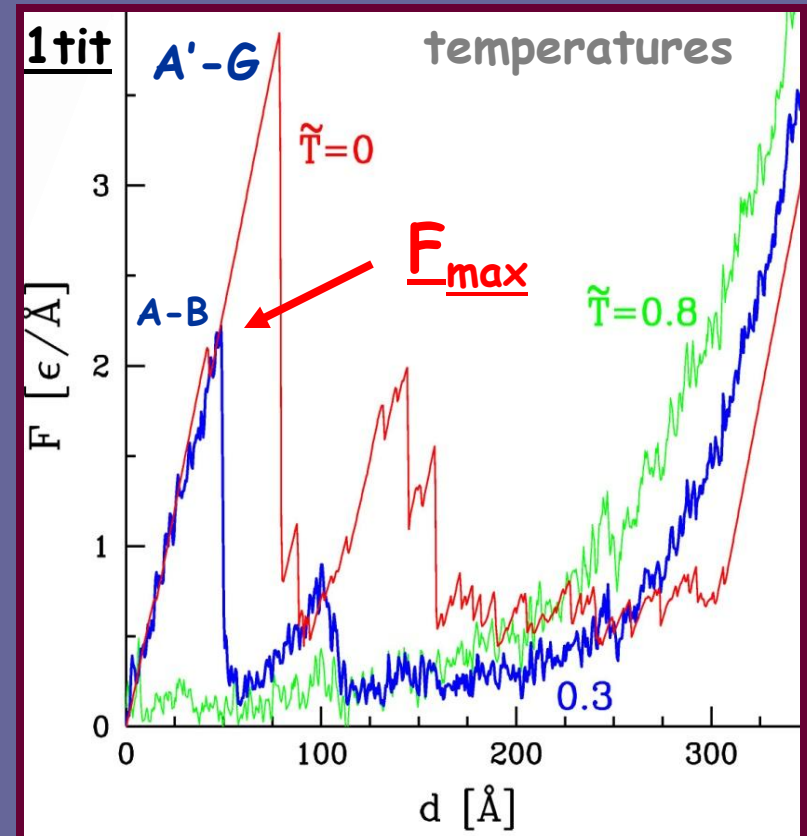
soft:  $k_s = 0.12 \text{ \epsilon}/\text{\AA}^2 \sim 0.08 \text{ N/m}$

stiff:  $k_s = 30 \text{ \epsilon}/\text{\AA}^2$

logarithmic shifts with  $v_p$

one domain

$F_{\max}$  depends on  $T$



# OTHER GO-LIKE MODELS

$$\text{model} = \{ V^{\text{NAT}}, S, M, E, C^{\alpha}/C^{\beta} \}$$

504 variants enumerated, 62 studied

native contact potential

6-12, 10-12, Morse ...

local backbone stiffness

Chirality or Angular (bond & dihedral)

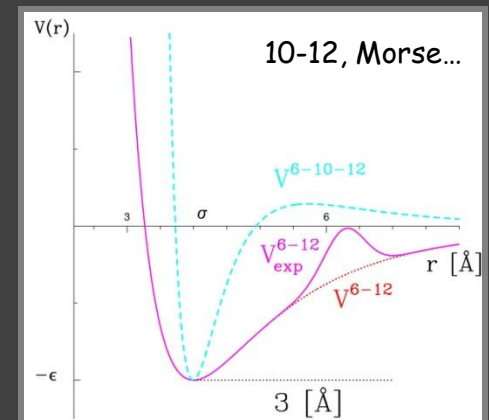
contact map

cutoff, vdW, CSU

energy scale

uniform or not, hydrogen bonds different ...

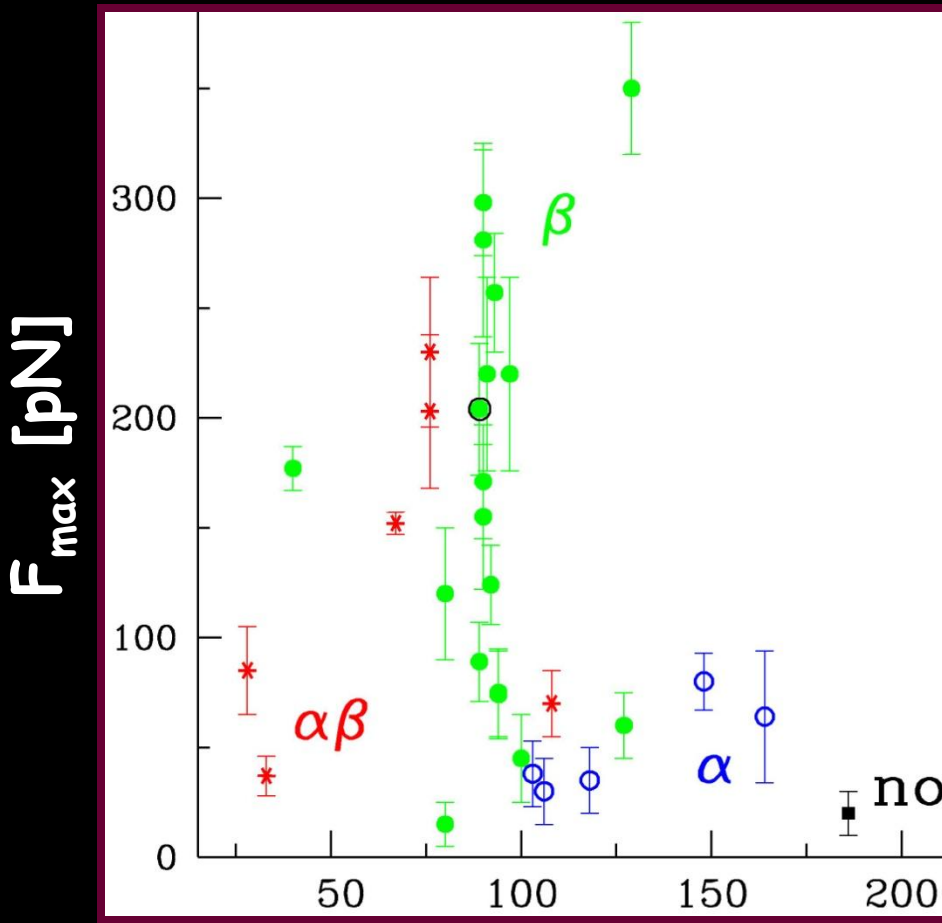
if side groups represented by  $C^{\beta}$



**WHICH MODEL IS OPTIMAL?**



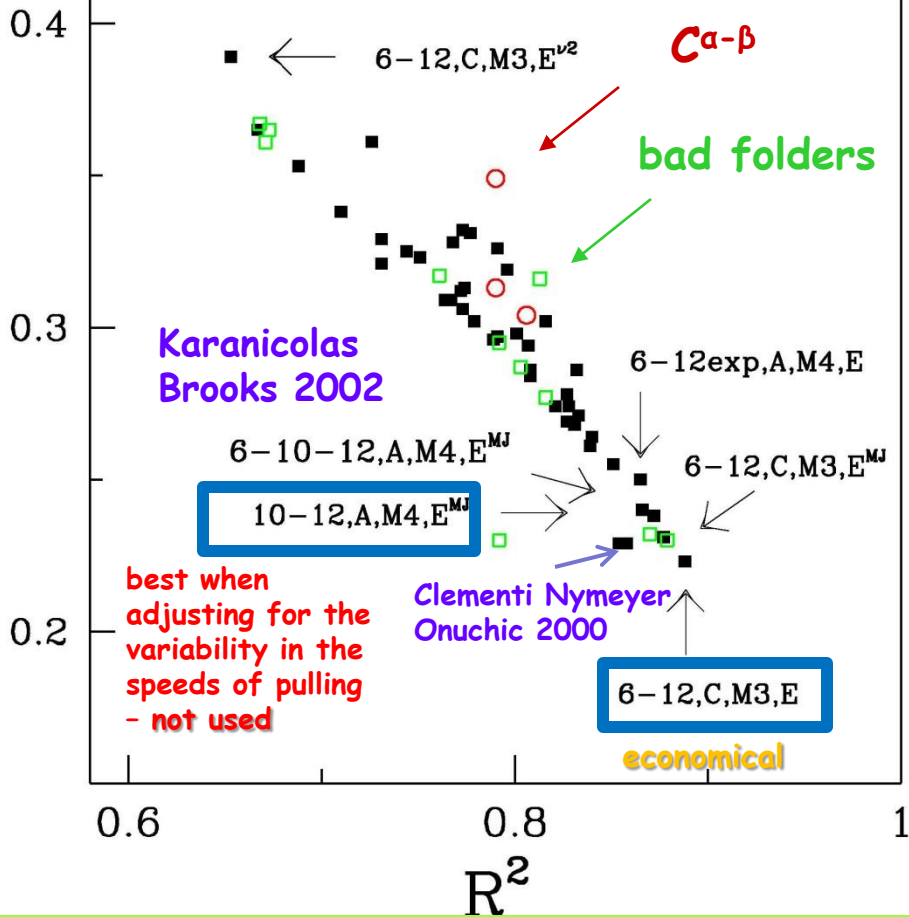
# USE: Experimental results on stretching at constant speed



Unlike folding - stretching starts around the native conformation: good for testing Go-like models

All-atom simulations on ~ 22 proteins

{ VNAT, S, M, E, C<sup>α</sup>/C<sup>β</sup> }



D=28 proteins

$$R^2 = 1 - \sqrt{\frac{1}{D} \sum_{\lambda=1}^D \left( \frac{F_{\lambda}^t - F_{\lambda}^e}{F_{\lambda}^e} \right)^2}$$

t - theoretical e - experimental

$$W_{\lambda+1} = \frac{F_{\lambda+1}^t - F_{\lambda}^e}{F_{\lambda}^e}$$

$$w_{\lambda+1} = \frac{F_{\lambda+1}^e - F_{\lambda}^e}{F_{\lambda}^e}$$

predicted

actual

$$U = \sqrt{\frac{\sum_{\lambda=1}^{D-1} (W_{\lambda+1} - w_{\lambda+1})^2}{\sum_{\lambda=1}^{D-1} (w_{\lambda+1})^2}}$$

Theil

Karanicolas Brooks:  $\epsilon$  in hydrogen bonds, Miyazawa-Jernigan-like modulation in other contacts

Like the Autumn leaves, they're all pretty, but this one is my favorite





# Validation of the Go model for stretching

Constant speed pulling

$$v=0.005 \text{ \AA}/\tau \sim 500\,000 \text{ nm/s}$$

$$R^2=0.89$$

extrapolation to  
experimental speeds  
& more points

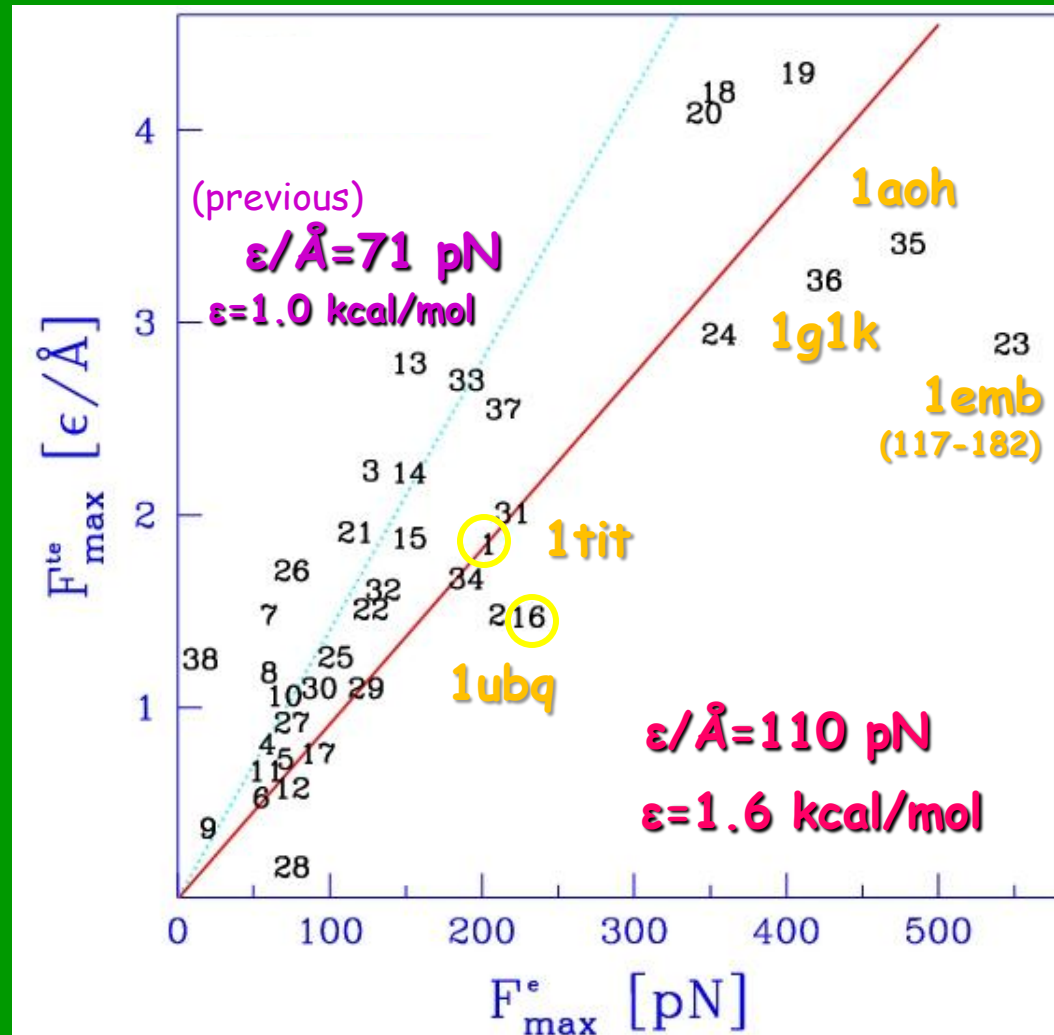
$$R^2=0.83 \quad U=0.28$$

$$@ T=0.3\epsilon/k_B$$

linkage dependence

Model 6-12,C,M3,E

uniform  $\epsilon$





Simplified Go-like models: big proteins, many domains, variations of parameters, near-experimental speed  $v_p$

Protein Data Bank: 29385 structures on July 26 2005

54807 - on December 18 2008

A need for systematic studies across the PDB to generate understanding and explore the possibilities

J. Fernandez

What proteins are strong and why?

How does  $F_{\max}$  correlate with structure?

CATH-based  
structure  
classification

Class (4)  
Architecture  
Topology  
Homology

SCOP-based  
classification

Class (10)  
Fold  
Superfamily  
Family  
Protein

Hierarchy

# Three theoretical surveys of proteins, within the uniform $\epsilon$ Go-like model, - stretching at constant speed

**I:** 7 510 proteins with  $40 \leq N \leq 150$ : set S7510  
Model 6-12,C,M2,E

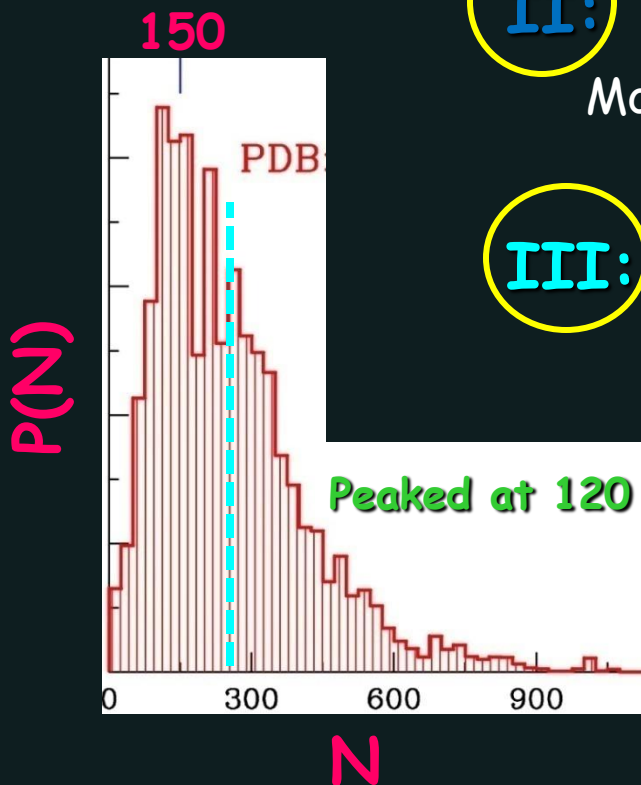
239 with  $150 < N \leq 851$

J. Phys.: Cond. Matt. 2007

7 749

**II:** 7 510 proteins with  $40 \leq N \leq 150$   
Model 6-12,C,M3,E (the better variant) Biophys. J. 2008

**III:** 17 134 proteins with  $40 \leq N \leq \underline{250}$   
Model 6-12,C,M3,E  
PLoS Computational Biology 2009



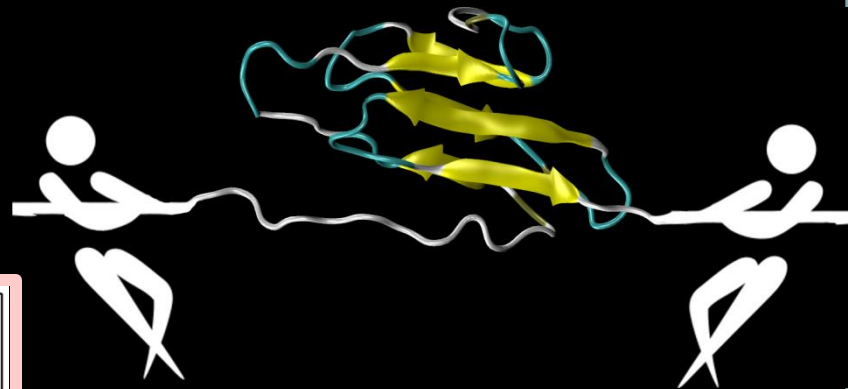
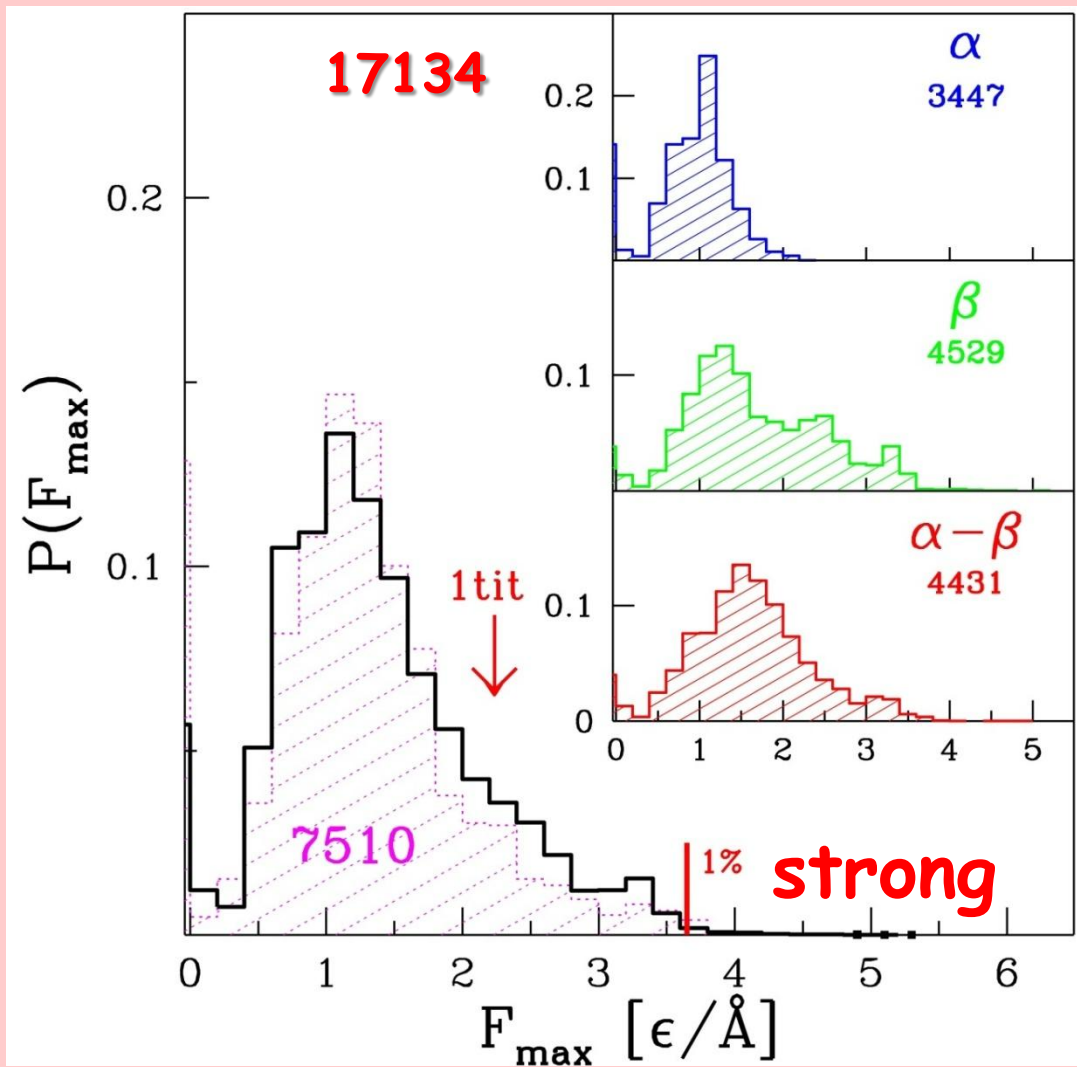
with J. Sułkowska and M. Sikora



# Probability distribution of $F_{\max}$

$\leq 250$

CLASS



no strong  $\alpha$  proteins

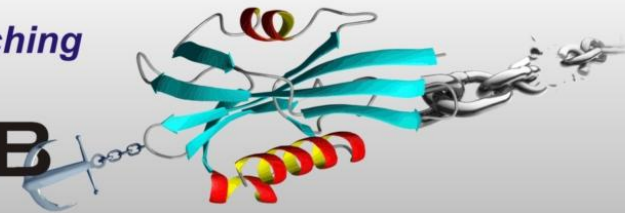
Pulling by the termini



All 17 134 in

Bio-molecule Stretching  
Database

BSDB



# THE PREDICTED LIST

[info.ifpan.edu.pl/BSDB/](http://info.ifpan.edu.pl/BSDB/)

n	PDBid	N	$F_{max}$ [e/Å]	$L_{max}$ [Å]	$\lambda$	CATH	SCOP
1	1bmp	104	10.2	23.2	0.01	2.10.90.10	g.17.1.2
2	1qty	95	8.9	72.1	0.11	2.10.90.10	b.1.1.4
3	2bhk	119	7.3	26.5	0.67		
4	1lxi	104	7.3	22.5	0.01		g.17.1.2
5	1cz8	107	6.4	76.5	0.13	2.10.90.10	b.1.1.1
6	2gh0	219	5.8	25.9	0.06		
7	1wq9	100	5.5	72.0	0.10	2.10.90.10	g.17.1.1
8	1flt	107	5.5	75.6	0.12	2.10.90.10	b.1.1.4
9	1fzv	117	5.4	90.4	0.12	2.10.90.10	g.17.1.1
10	2gyz	100	5.4	14.4	0.01		
11	1rew	103	5.3	21.7	0.01	2.10.90.10	g.7.1.3
12	1m4u	139	5.3	52.1	0.07	2.10.90.10	g.17.1.2
13	1vpf	94	5.3	68.1	0.11	2.10.90.10	g.17.1.1
14	1c4p	137	5.1	106.0	0.12	3.10.20.180	d.15.5.1
15	1qqr	138	5.0	110.3	0.12	3.10.20.180	d.15.5.1
16	3bmp	114	5.0	33.0	0.03	2.10.90.10	g.17.1.2
17	1j8s	193	4.9	77.9	0.03	2.60.40.1370	b.2.3.3
18	1wq8	96	4.9	82.6	0.11	2.10.90.10	g.17.1.1
19	1j8r	193	4.8	77.7	0.03	2.60.40.1370	b.2.3.3
20	1f3y	165	4.8	284.7	0.43	3.90.79.10	d.113.1.1
36	1aoh	147	4.3	77.1	0.01	2.60.40.680	b.2.2.2
3144	1ubq	76	2.2	47.9	0.04	3.10.20.90	d.15.1.1
3580	1tit	89	2.1	55.3	0.04	2.60.40.10	b.1.1.4

Strongest found in the  
previous survey

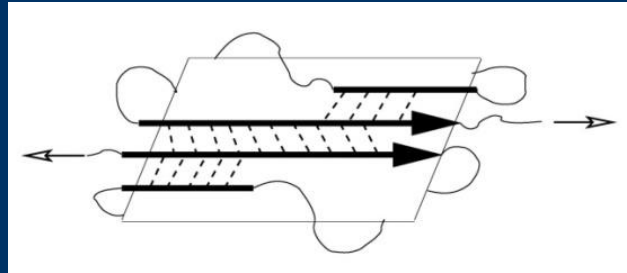
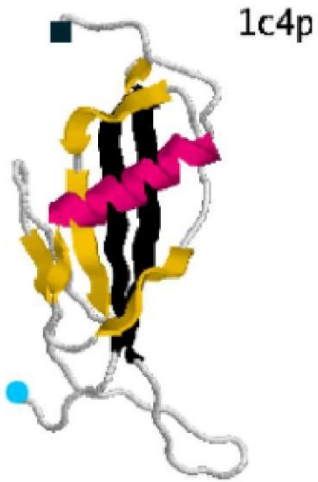
470 pN

$\lambda$  - relative peak position in terms of the end-to-end distance  $L$



# The predominant source of strength in short proteins

shearing of hydrogen-bonded parallel  $\beta$ -strands



1c4p (14) & 1qqr (15):  $\beta$  domain of streptokinase  
(blood clotting - different functions)

Scaffoldins: structural proteins of the  
cellulosome (degradation of cellulose):

(36) 1aoh (c7A) from *Clostridium thermocellum*

measured

480 pN

predicted

470

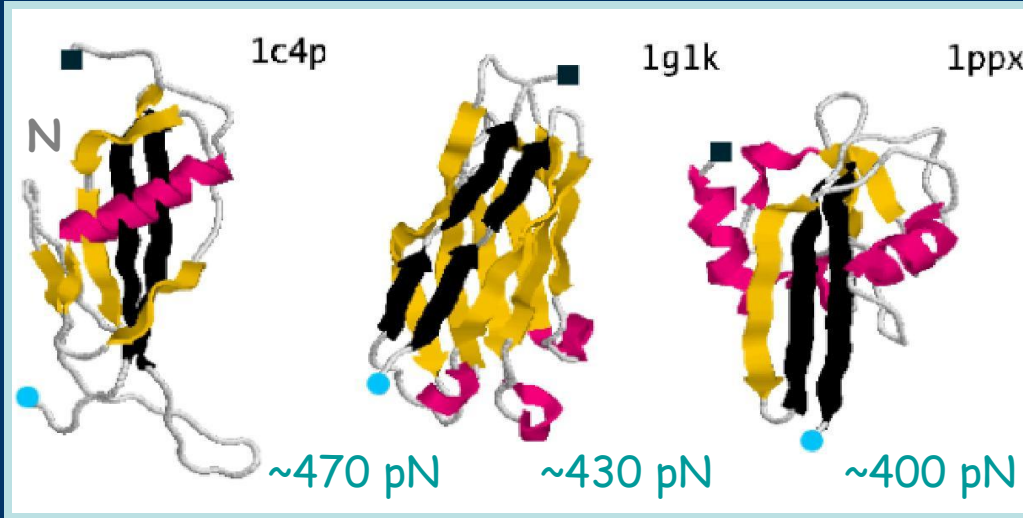
(78) 1g1k (c1C) from *Clostridium celluloticum*

425 pN

350

Valbuena ... Carrion-Vazquez, 2009

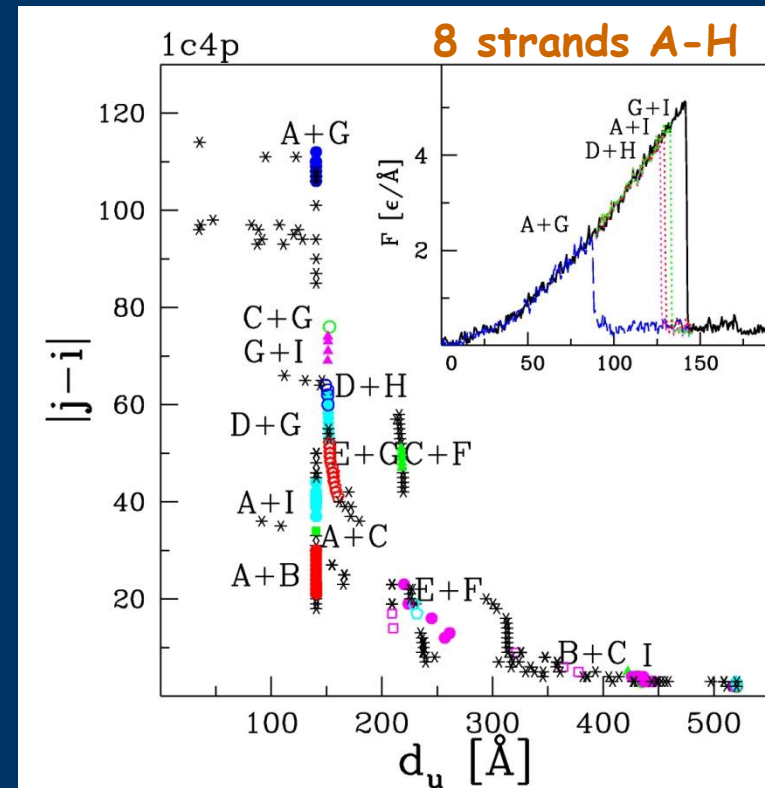
# shearing of hydrogen-bonded parallel $\beta$ -strands



the relevant  $\beta$ -strands shown in black

Strength depends on the length of the mechanical clamp and on the environment of the clamp

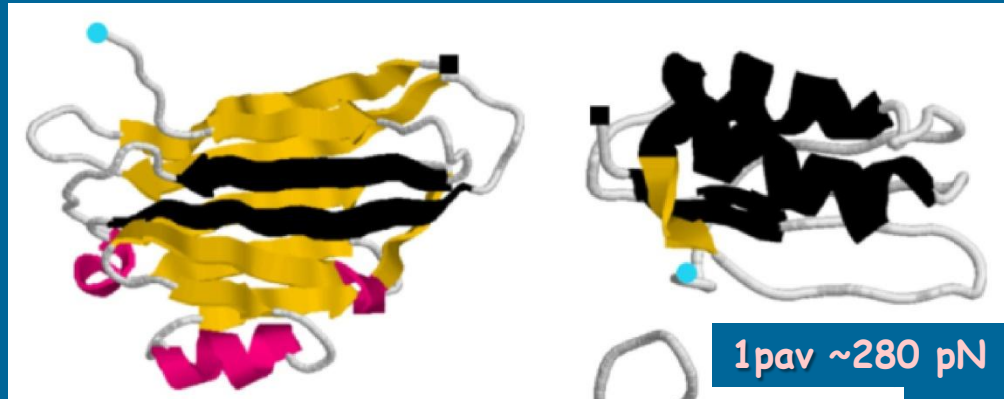
Unfolding scenario diagram - more detailed than Q - fraction of the total number of native contacts



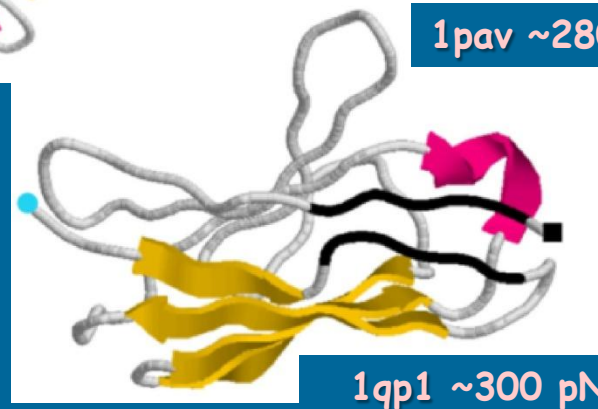


# Other kinds of mechanical clamps

Antiparallel  
 $\beta$ -strands



Unstructured  
clamps



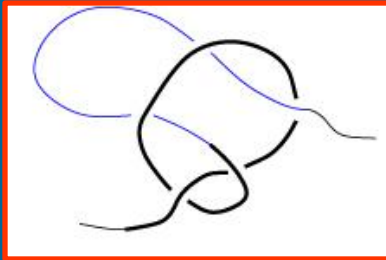
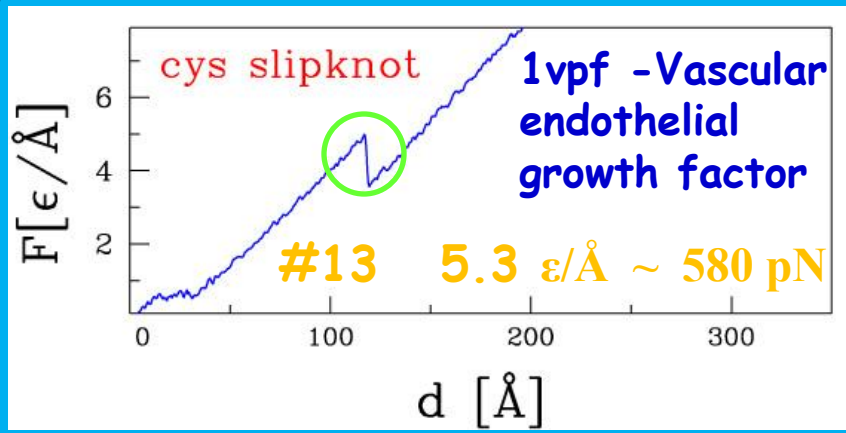
A Box  
structure:  
two  
antiparallel  
strands  
and two  
antiparallel  
helices

Delocalized clamps

disulphide bridges  
unusual entanglements

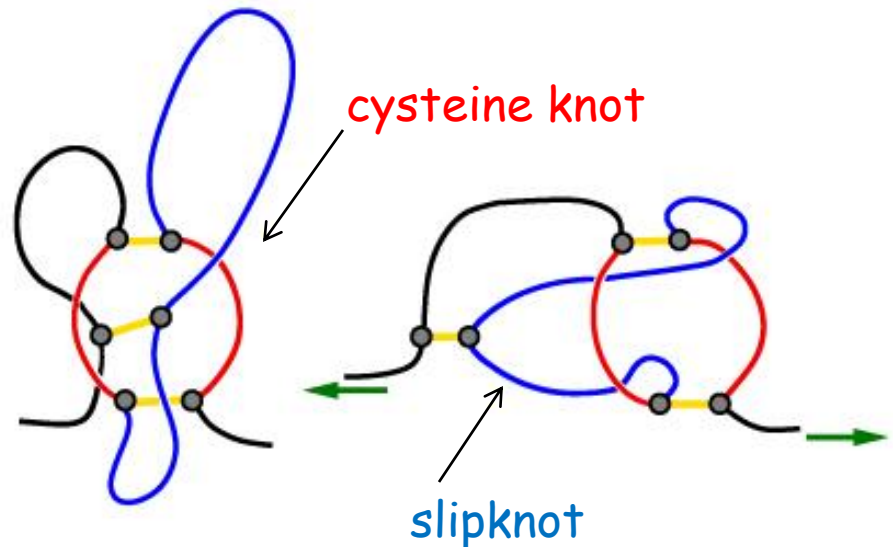
# CYSTEINE SLIPKNOTS

1vpf: vascular endothelial growth factor  
Cellular component: extracellular region



native slipknot

## Slipknot resulting from pulling



1100 pN in 1bmp (#1)

Bone morphogenetic protein-7

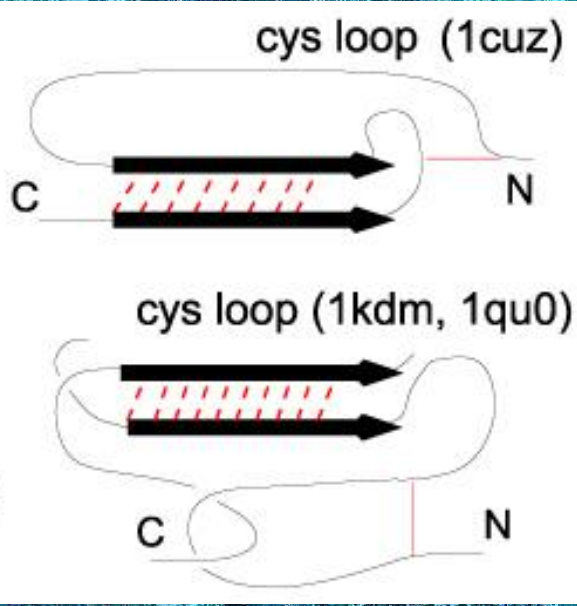
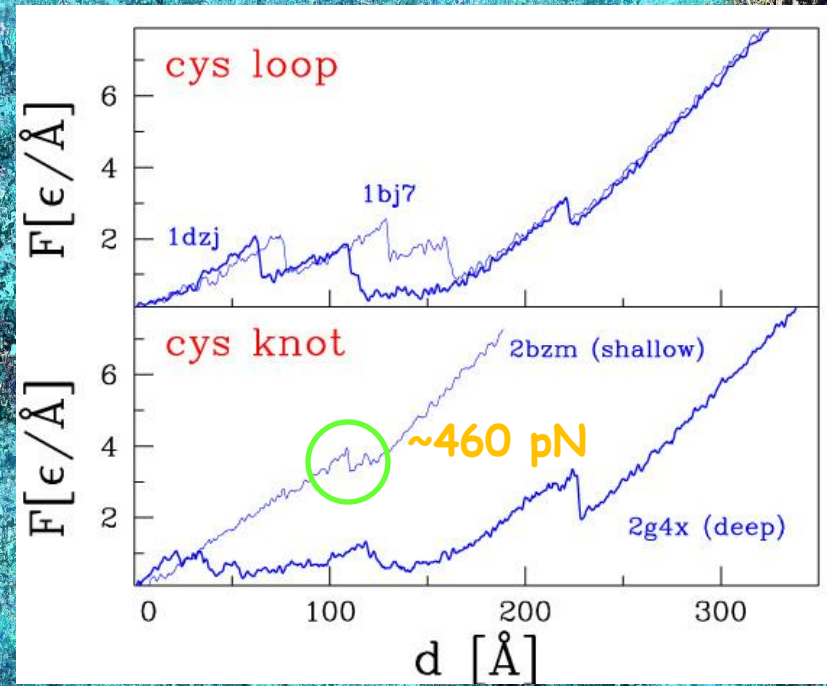
Function: growth factor activity

Cellular component: protein binding

From Genetic Ontology



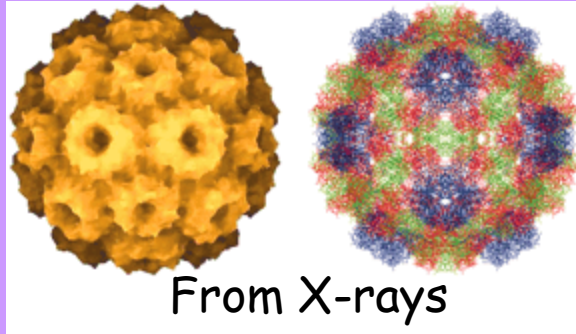
# Other force clamps involving disulphide bridges



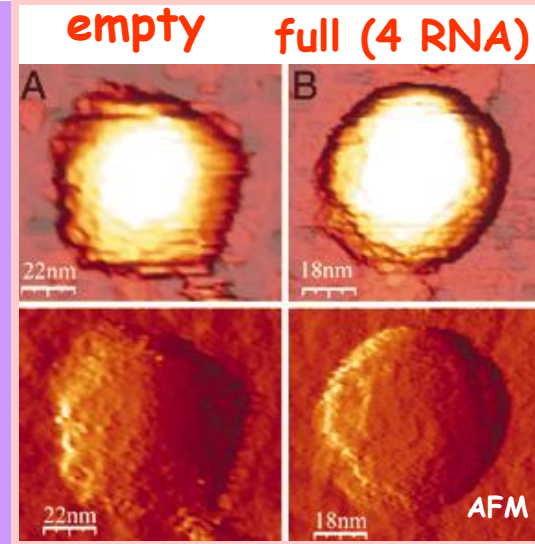


# NANOINDENTATION OF VIRUS CAPSIDS

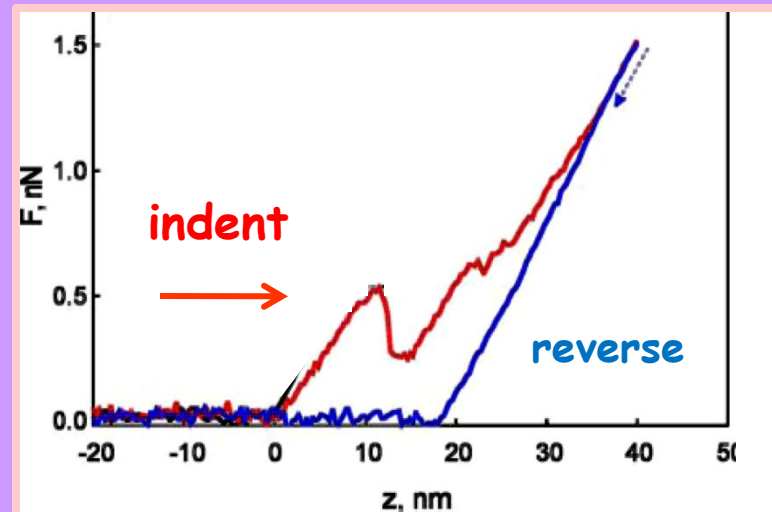
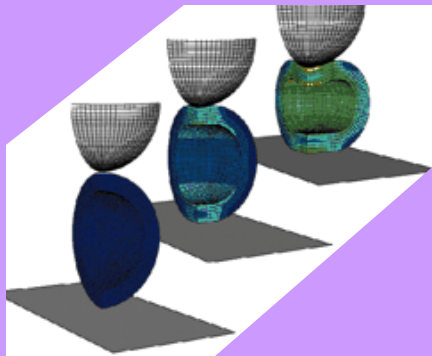
Self-assembled nanostructures consisting of a protein shell to protect the genetic material inside



**CCMV** - cowpea (black-eyed pea) chlorotic mottle virus

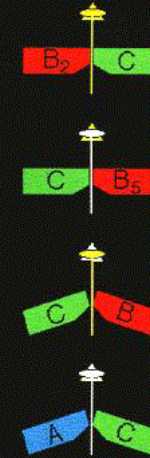
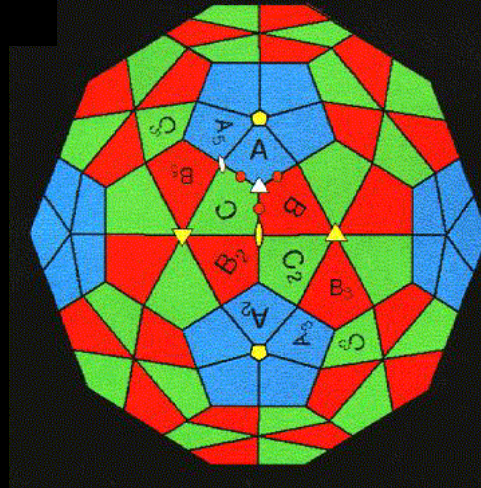
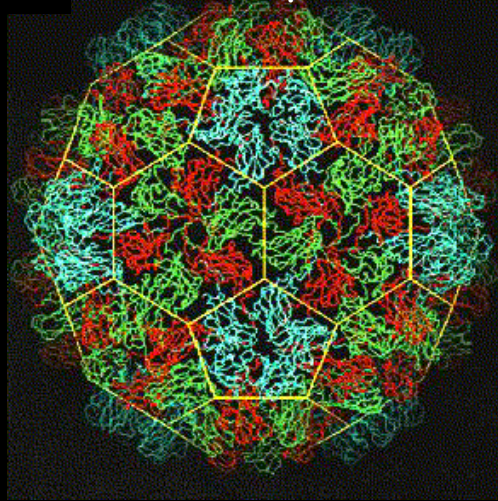


Michel, Ivanovska, Gibbons, Klug, Knobler, Wuite, Schmidt; Bruinsma - 2006



with M. O. Robbins

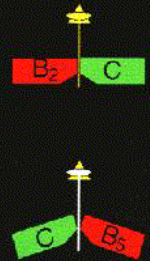
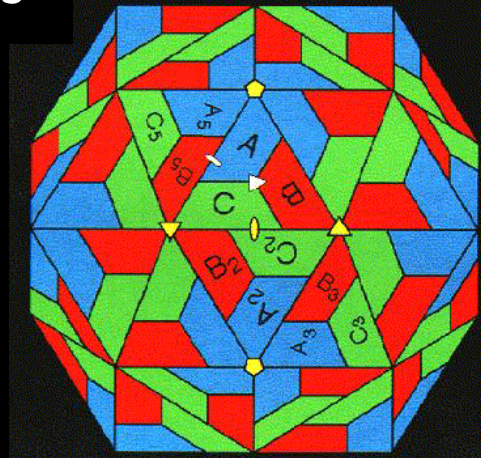
**CCMV** cowpea chlorotic mottle virus



a truncated  
icosahedron  
model 20

28 620  $C^\alpha$  atoms, 62460 contacts

**CPMV** cowpea mosaic virus

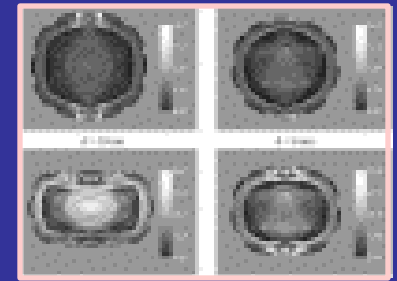
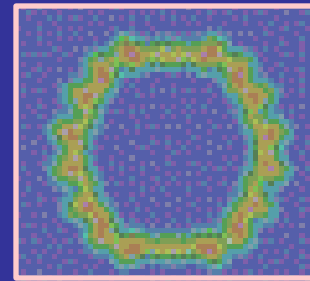
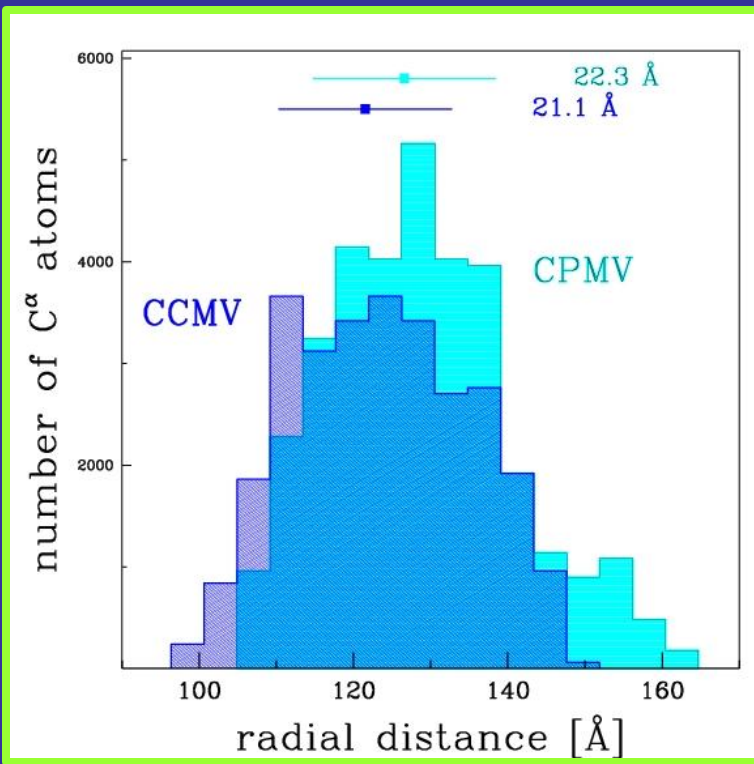


a rhombic  
triacontahedron  
model 30

33 480  $C^\alpha$  atoms, 90420 contacts

Both ~ 300 000 heavy atoms

180 sequentially identical chains that self assemble



Model of a nonuniform elastic shell: Gibbons & Klug 2008

Roughly consistent with experimental behavior

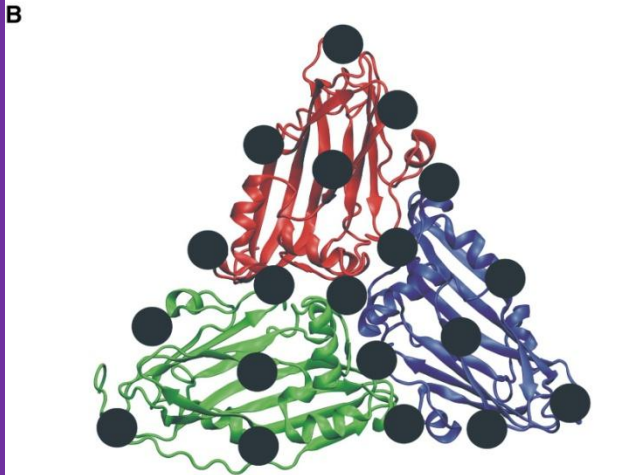
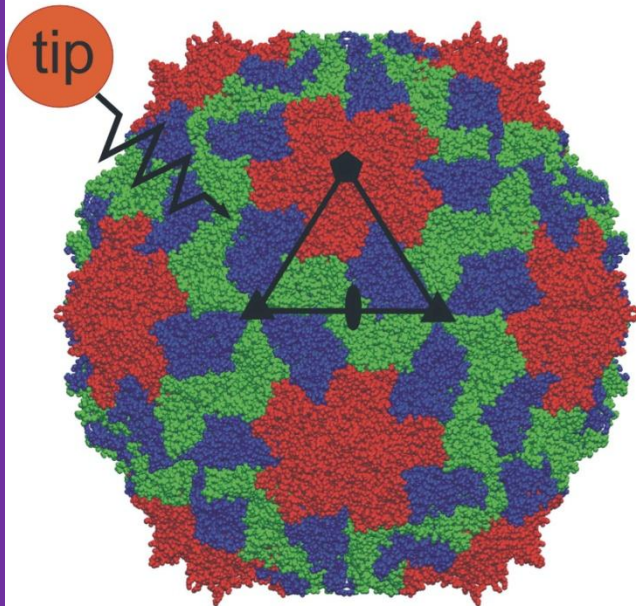
Hard to distinguish bonds within the proteins from bonds between proteins.

Hard to parametrize the buckling instability at higher forces

No thermal fluctuations



# All-atom simulations, Zink & Grubmuller 2009



(southern bean mosaic capsid, with water)

Nanoindentation times of order 1 ns compared to experimental 10 ms or more - much faster than the structural relaxation rates

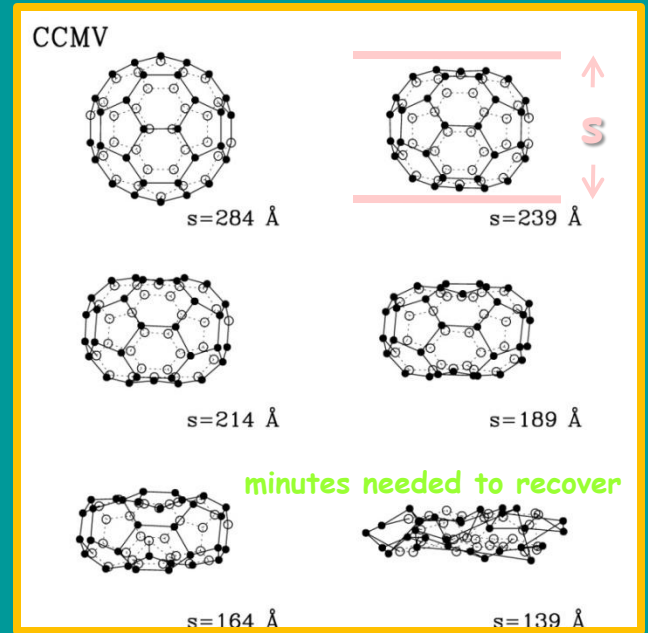
The tip represented by an atom that moves toward the center of mass. Short elastic region (1nm) followed by a rapid drop in F

The instability associated with bond breaking, but the bonds rapidly reform as the tip enters into the capsid

# Coarse-grained structure-based model

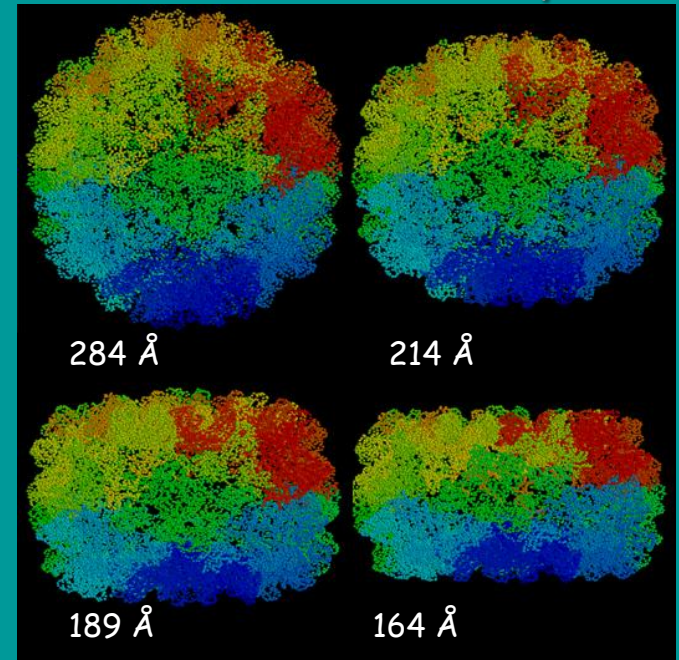
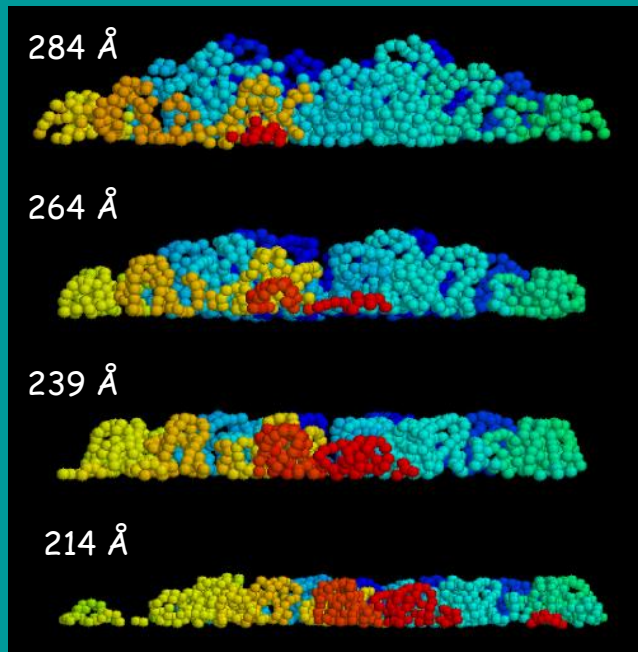
Compression by 2 plates, combined speed  $\sim 500 \mu\text{s}$ . Slow enough that stress can be transmitted across the capsid before the separation has changed substantially

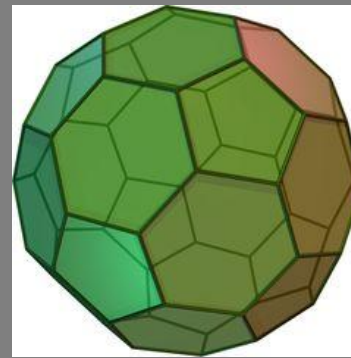
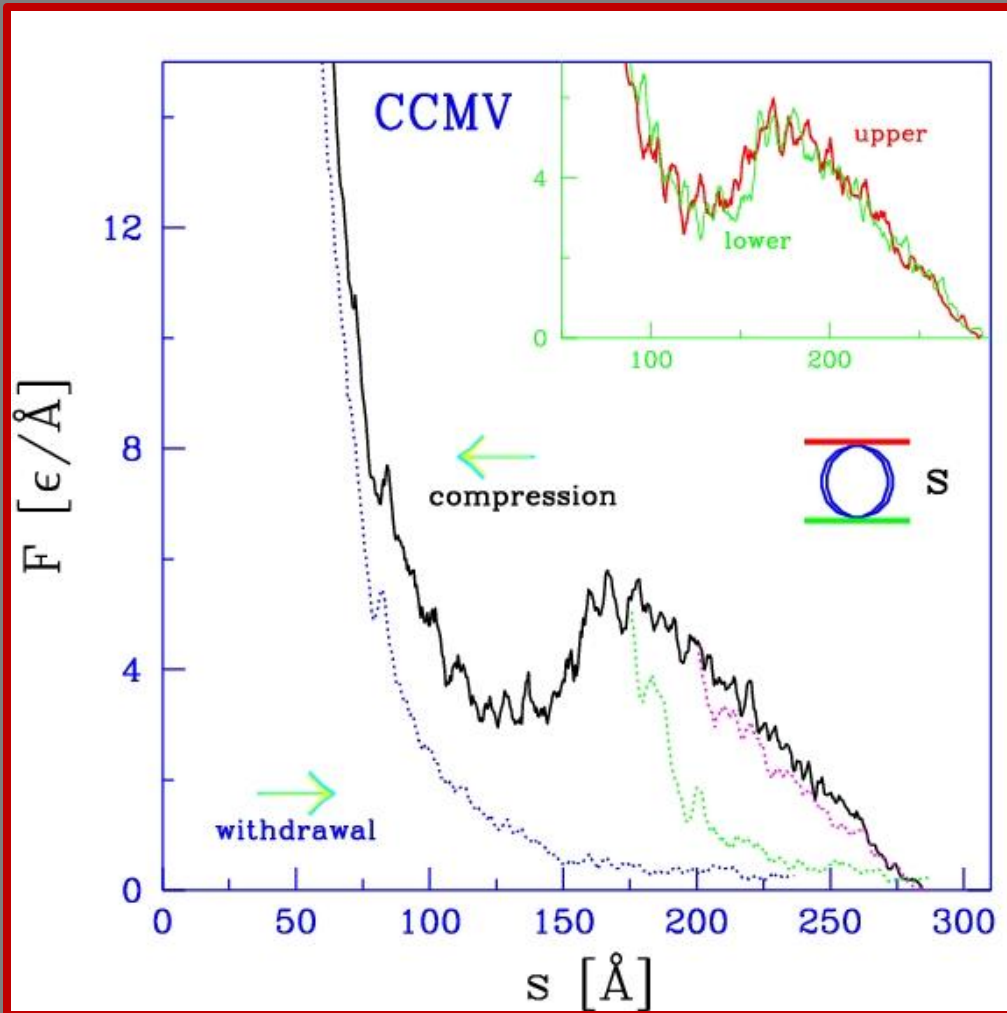
some clockwise rotation



$s$  - separation between the plates

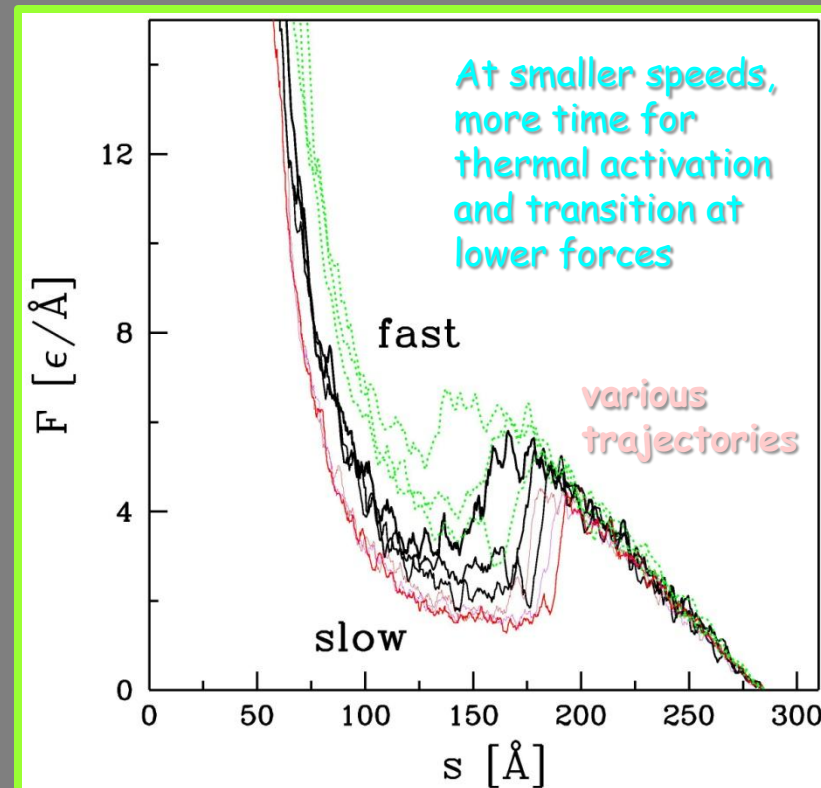
Top 2150  $C^\alpha$  atoms





Breaking of a few bonds leads to stress transfer and a cascade of additional bonds

ACTIVATED TRANSITION



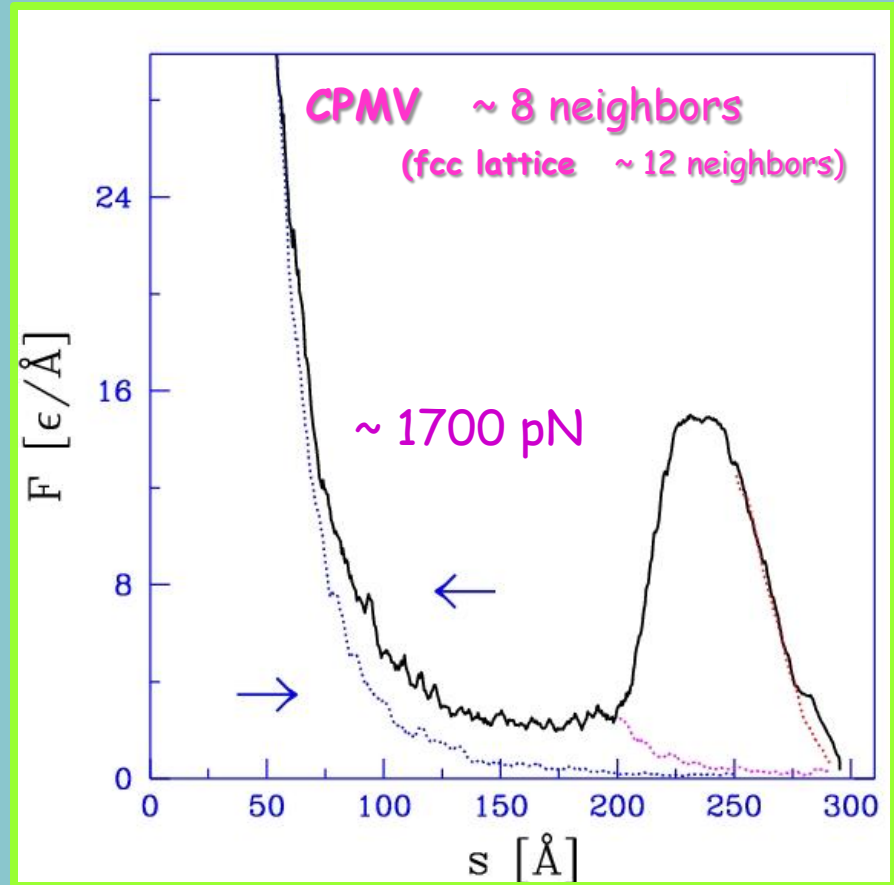
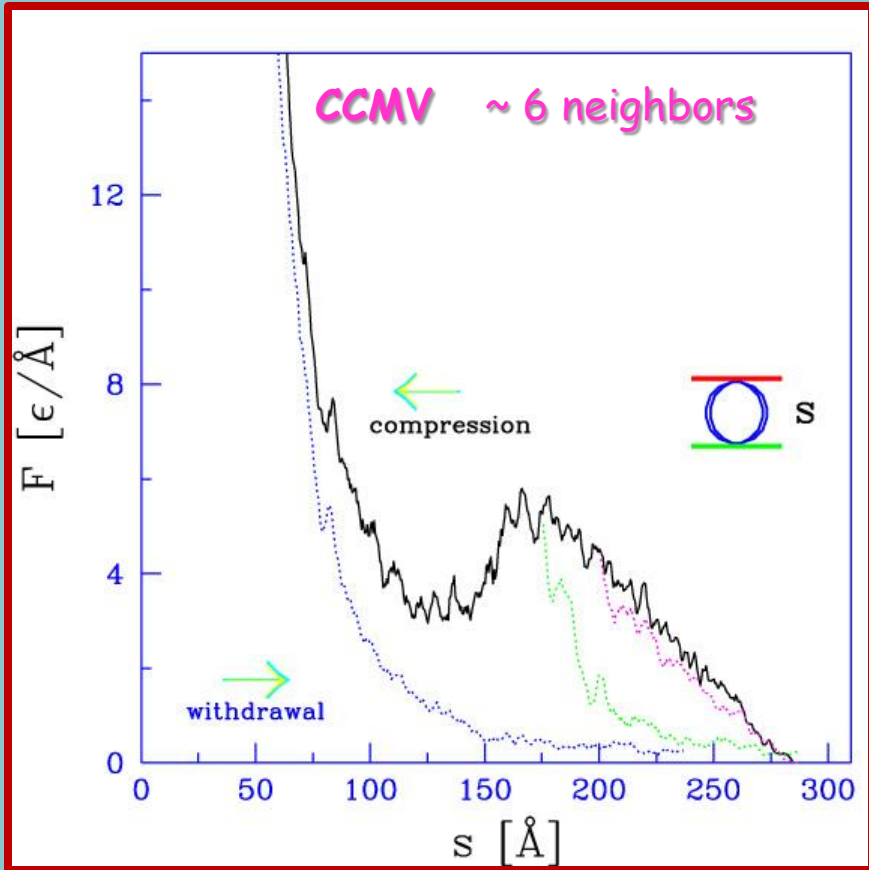
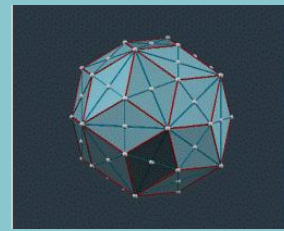
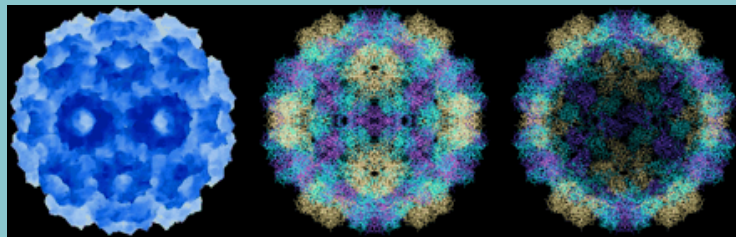
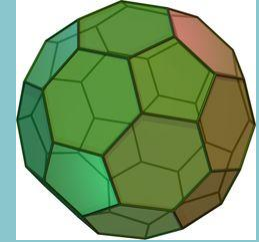
$$k \sim 0.05 \text{ } \epsilon/\text{\AA}^2 \sim 0.055 \text{ N/m}$$

$$F_m \sim 5.5 \text{ } \epsilon/\text{\AA} \sim 600 \text{ pN}$$

Experimental: 0.14 N/m & 500 pN

LJ radius in the potential  $\sim$  size of an amino acid (not atom) : softer



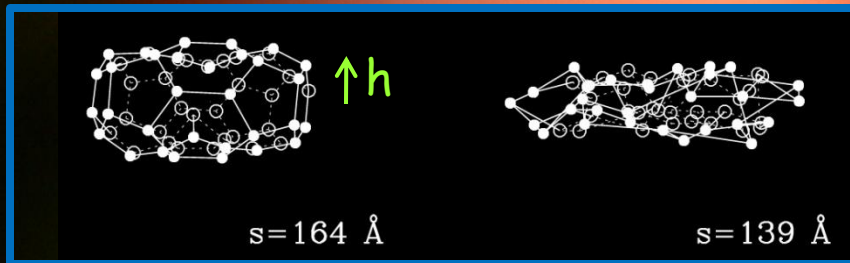
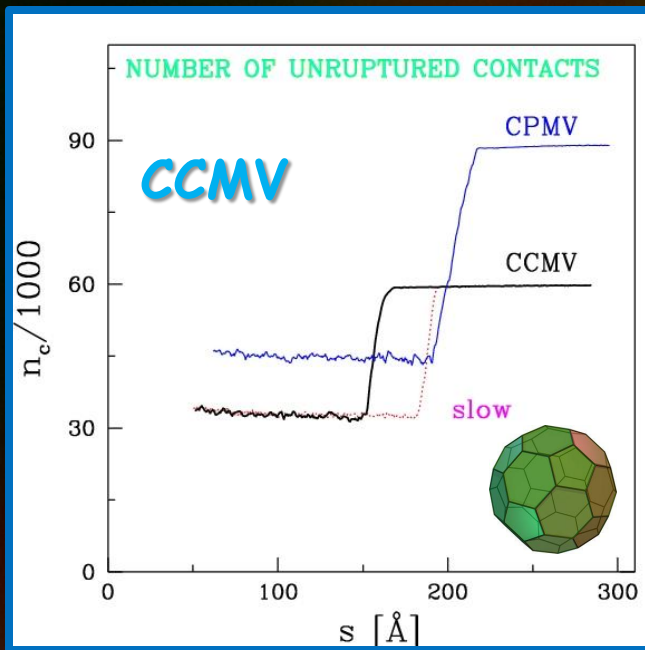


An order of magnitude bigger  $k$  &  $F_m$  3 times as big despite comparable radius and shell thickness

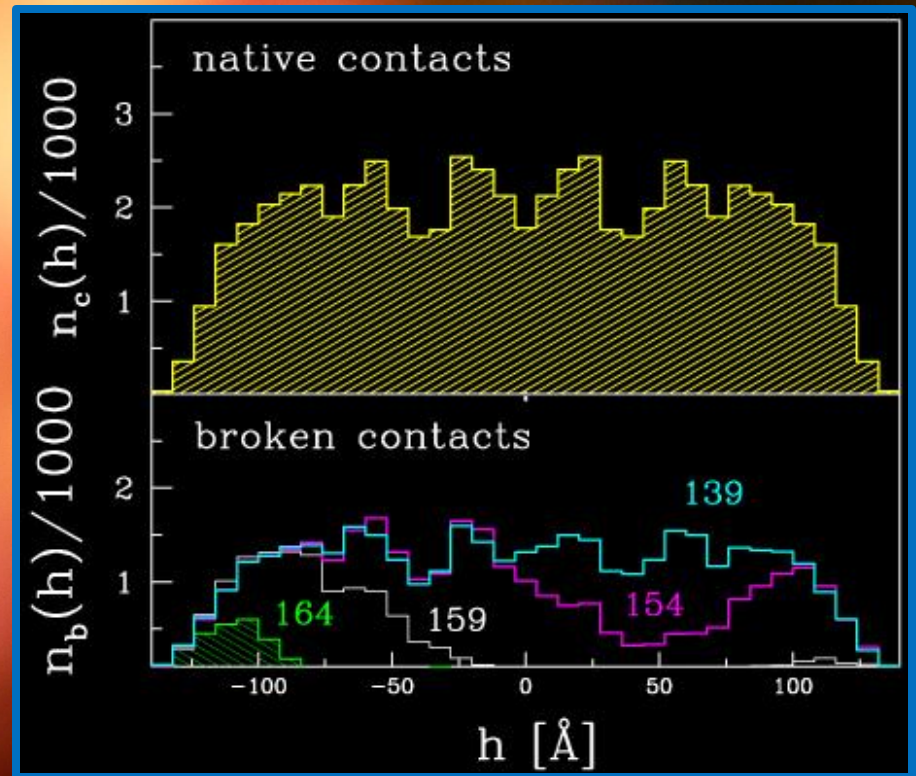
A rapid rupture of  
~1/2 of the contacts

62000

Nearly all of them are  
between the proteins



$h$ - native  $z$ -coordinate of a  $C^\alpha$  atom



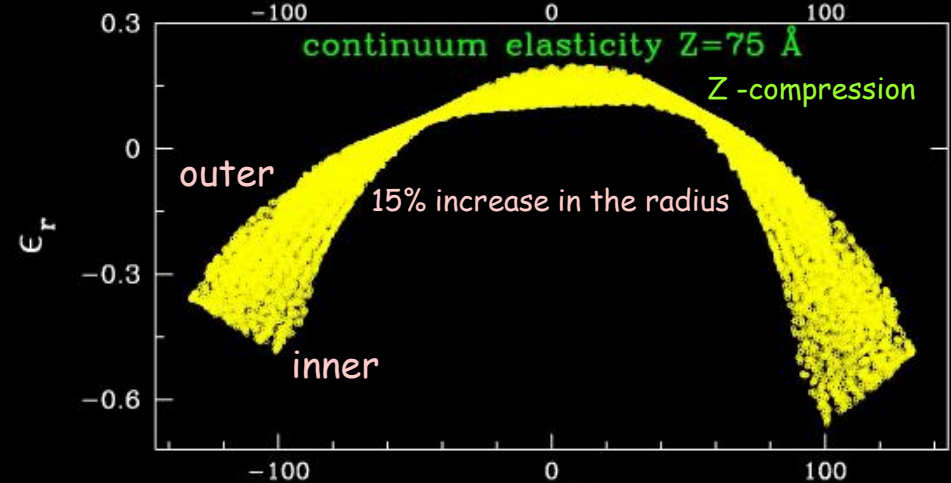
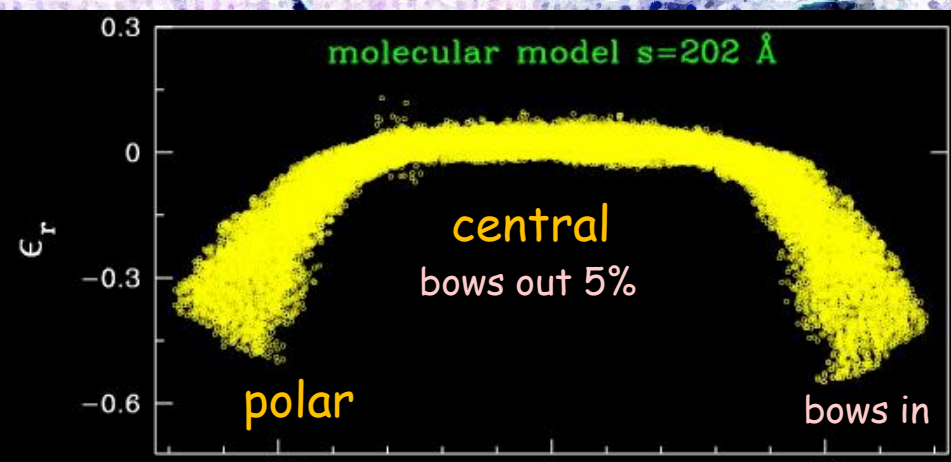
Starts at the bottom for this trajectory



# Radial strain different than for a continuum shell

$$\epsilon_r = \vec{r} \cdot \vec{dr} / \vec{r} \cdot \vec{r}$$

$\vec{r}$  the initial position relative to the center of mass  
 $\vec{dr}$  the change in this vector



A nearly constant and small expansion in the center and a rapid change in the slope for  $|h| > 60 \text{ \AA}$

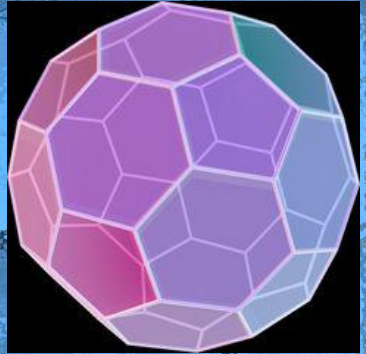
Mean rotation  $\sim 4^\circ$

Some symmetry breaking due to buckling on one side



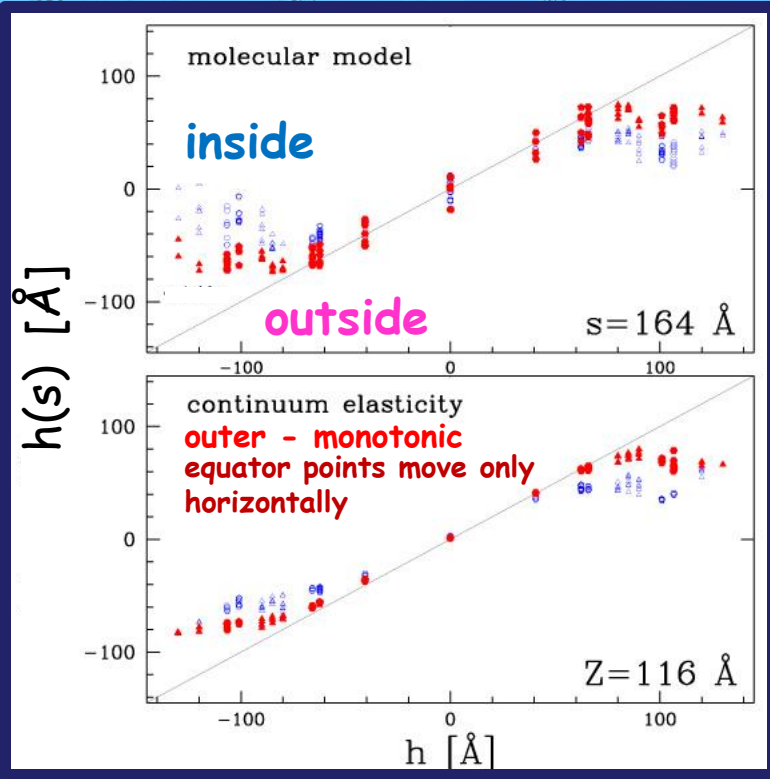
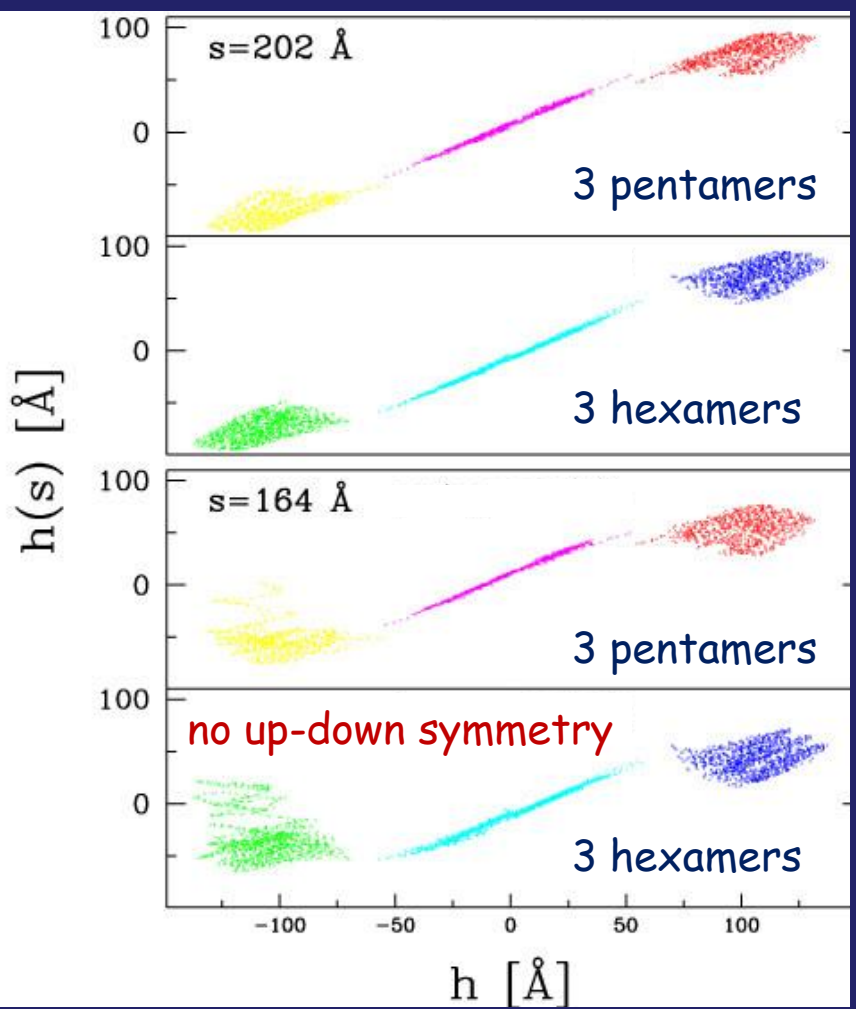
# Vertical position of atoms belonging to particular n-mers

at separation  $s$  versus native

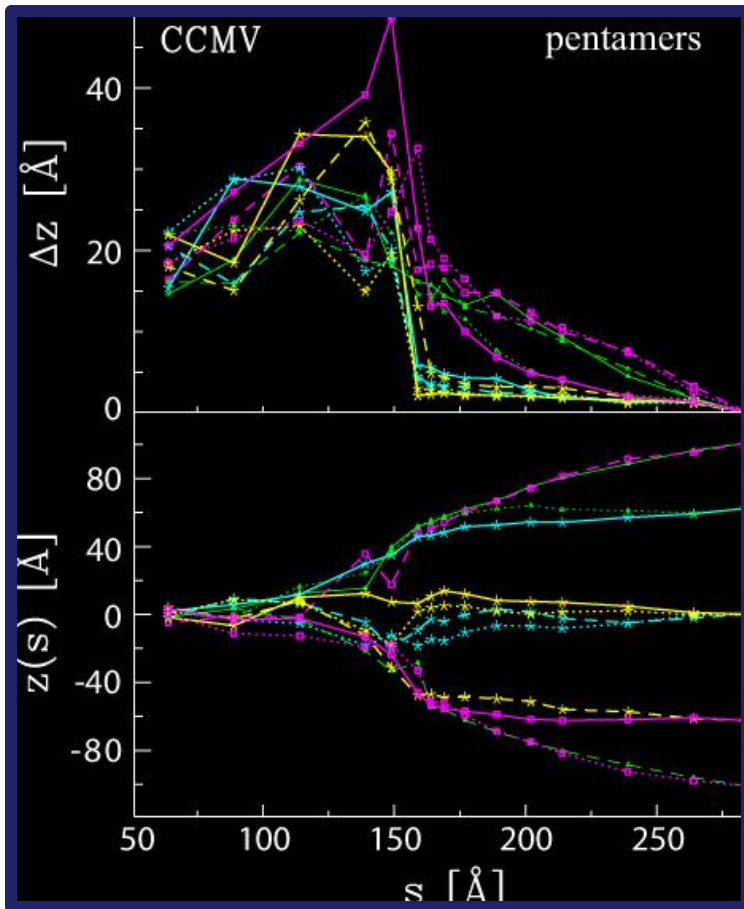


Central region nearly undeformed, slope < 1 (~0.93) due to compression

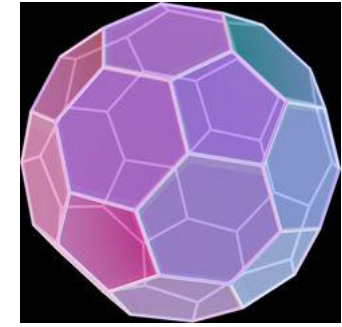
Outer n-mers pushed inwards and atoms displaced across the entire thickness. A rapid change in the surface normal



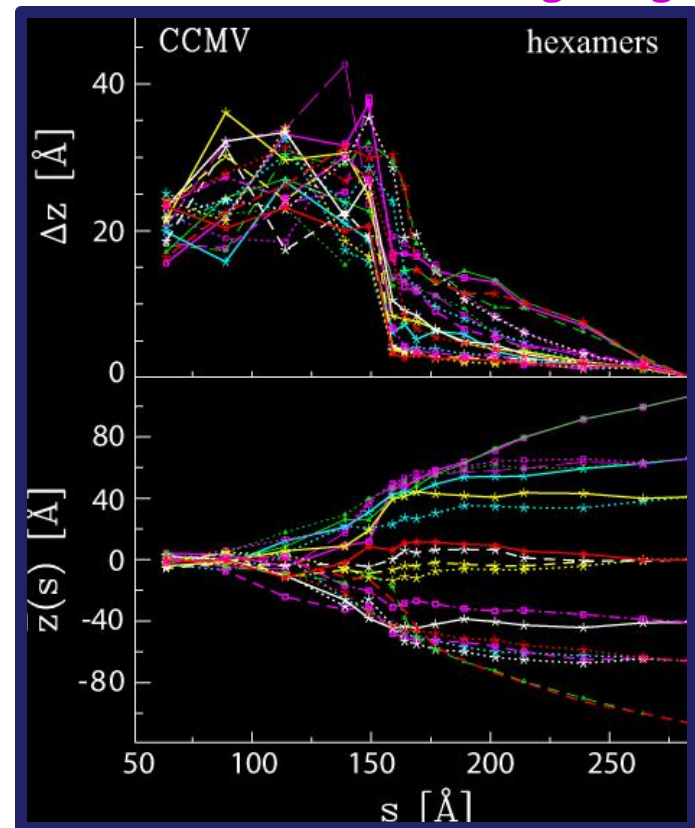
Not like an elastic shell



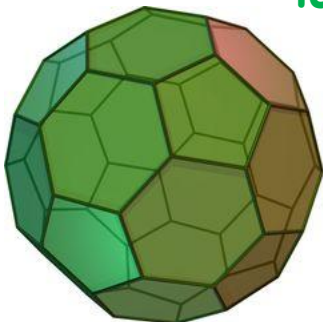
Center of mass height & rms variations for atoms belonging to particular n-mers



A smooth transition to the sandwich state with buckling: relative heights of some of the n-mers change sign



Polar n-mers undergo large rms variations





## C<sup>α</sup>-based description of empty CCMV & CPMV capsids.

Nanoindentation by a large tip modeled as compression between parallel plates.

Qualitatively consistent with continuum model. However, the details depend on the specifics of the molecular structure. A 30% increase in the number of contacts results in a 3-fold larger yield point and shorter elastic region - difficult to capture in continuum models

Elastic region followed by an irreversible activation transition to the sandwich state - related to rupturing nearly all of the bonds between capsid proteins

The molecular model undergoes a gradual symmetry breaking rotation and accomodates more strain near the walls





Simple geometry-based models miss many molecular details and yet can elucidate the microscopic picture of processes involving large conformational changes of biomolecules in an efficient way and with a large statistics of molecular dynamics trajectories.

Only certain variants of such models perform well when confronted with experimental data on stretching and also lead to folding.

(Handy for clarifying basic issues like: Thermal unfolding, on average, is reverse to folding and is unrelated to mechanical unfolding).

Scenarios represented on the time-contact order plane provide a detailed and useful description of the average time evolution.



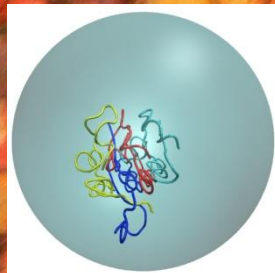
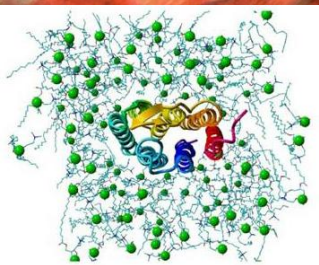
CONSTANT SPEED: survey of the PDB, determination of  $F_{\max}$ , proposed list of strong proteins, correlations with the type of structure, identification of mechanical clamps.

CONSTANT FORCE: exponential unfolding statistics below  $F_{\max}$  and lognormal above it, refolding different than in the absence of the clamp.

UNIFORM FLOW: more intermediates than in force clamps, dependence on the choice of the anchor, may offer more diagnostic data than AFM.

HYDRODYNAMIC INTERACTIONS: affect time scales of processes - facilitate folding and mechanical unravelling but hinder unravelling by flow

topoisomerase



Models ready to tackle biological systems of a larger scale