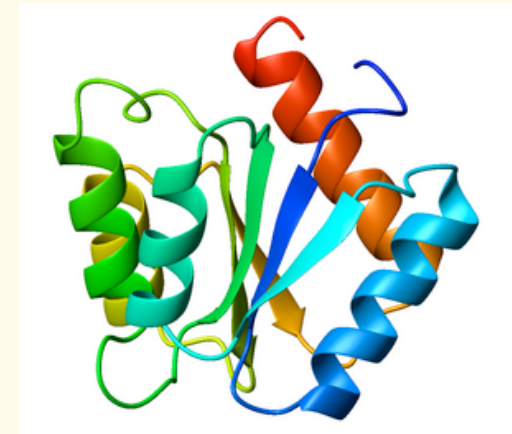
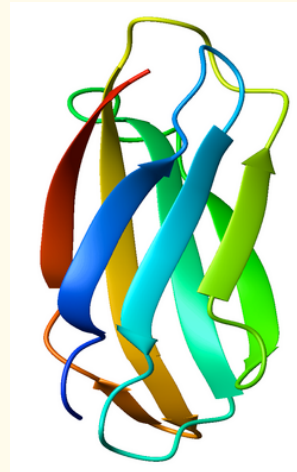
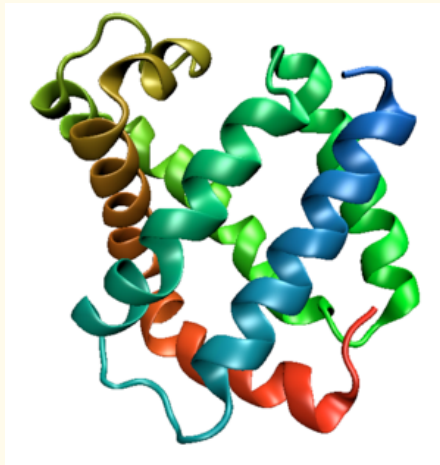


Modeling protein aggregation: from sticks to atomic representation

Anders Irbäck
Computational Biology and Biological Physics

Protein structure

- Exponentially many possible states
- Unique “native” state
- Native structure by X-ray crystallography or NMR
- Local structure: α -helices and β -sheets



Protein folding

- Protein with 100 amino acids, 3 states per amino acid
→ $3^{100} \sim 10^{47}$ possible structures
- Levinthal's paradox: a random search for the native state would take the protein longer than the age of the universe
- Forces driving folding: H bonding, hydrophobic attraction,...

Do we have

(i) sufficient knowledge of the driving forces, and

(ii) sufficiently fast computers

to be able to simulate the folding of a 100-amino acid protein?

Folding of the Top7 protein

- Computationally designed & experimentally verified protein with >90 amino acids and a novel fold
Kuhlman et al. *Science* 2003;302:1364-1368
- Folding simulations started from random initial conditions. Atomic protein representation, implicit water. General force field, Monte Carlo methods
Mohanty et al. *Proteins* 2013;81:1446-1456

Simulated structure and crystal structure

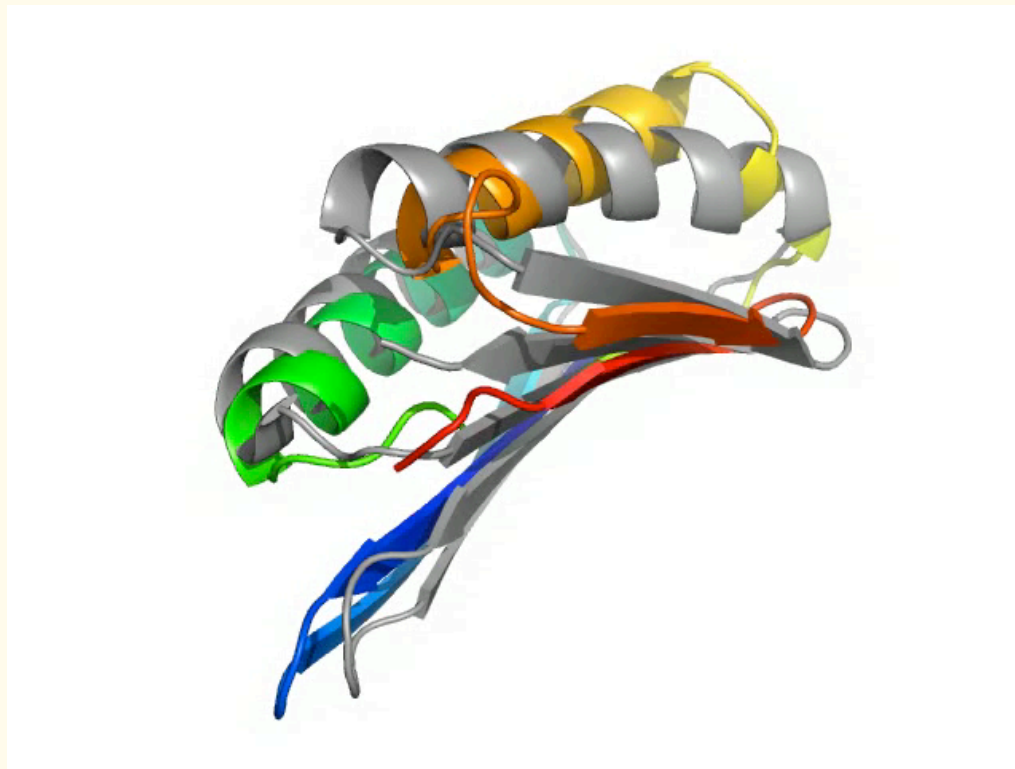
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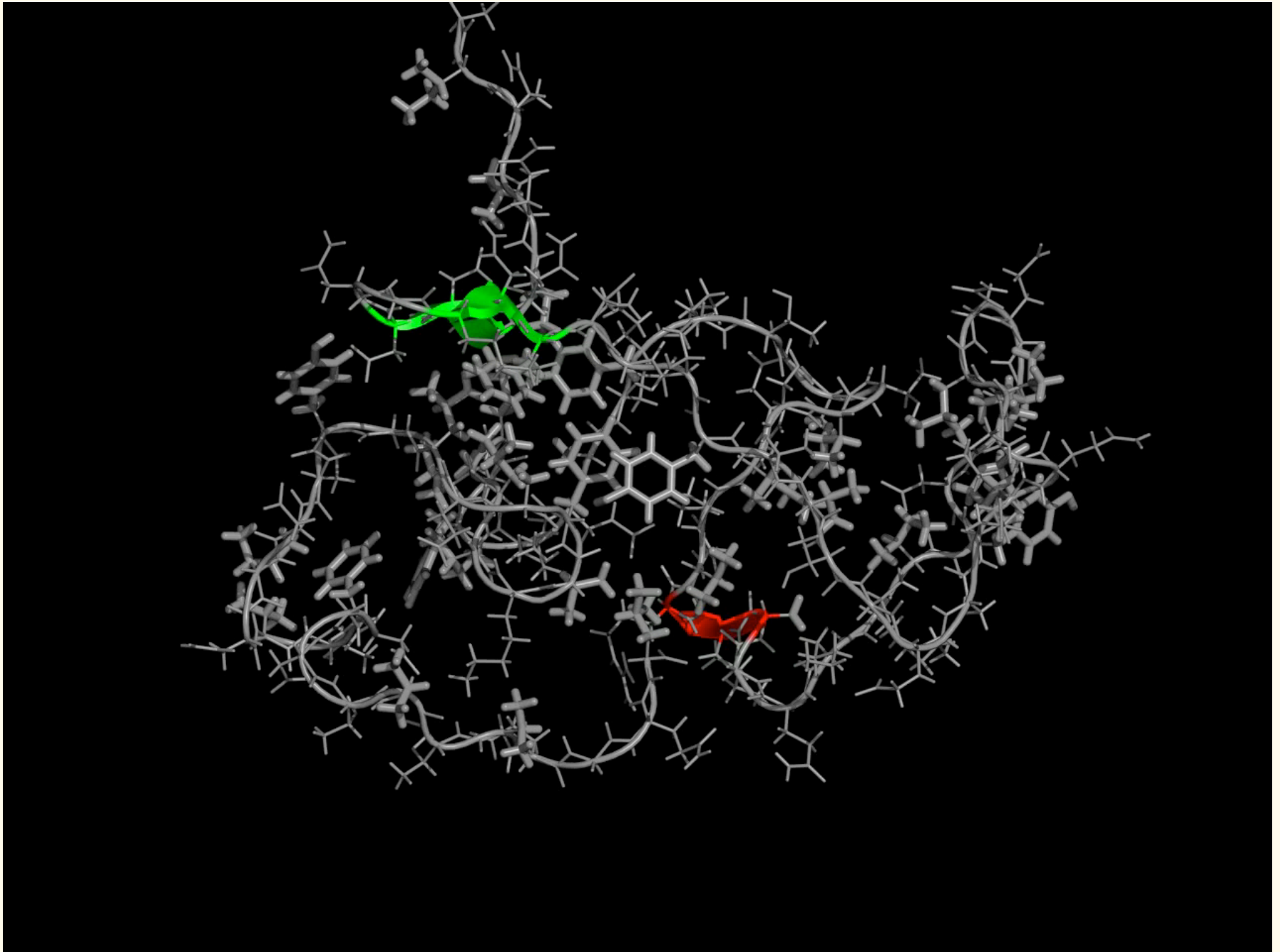


Simulated structure and crystal structure

Folding of Top7

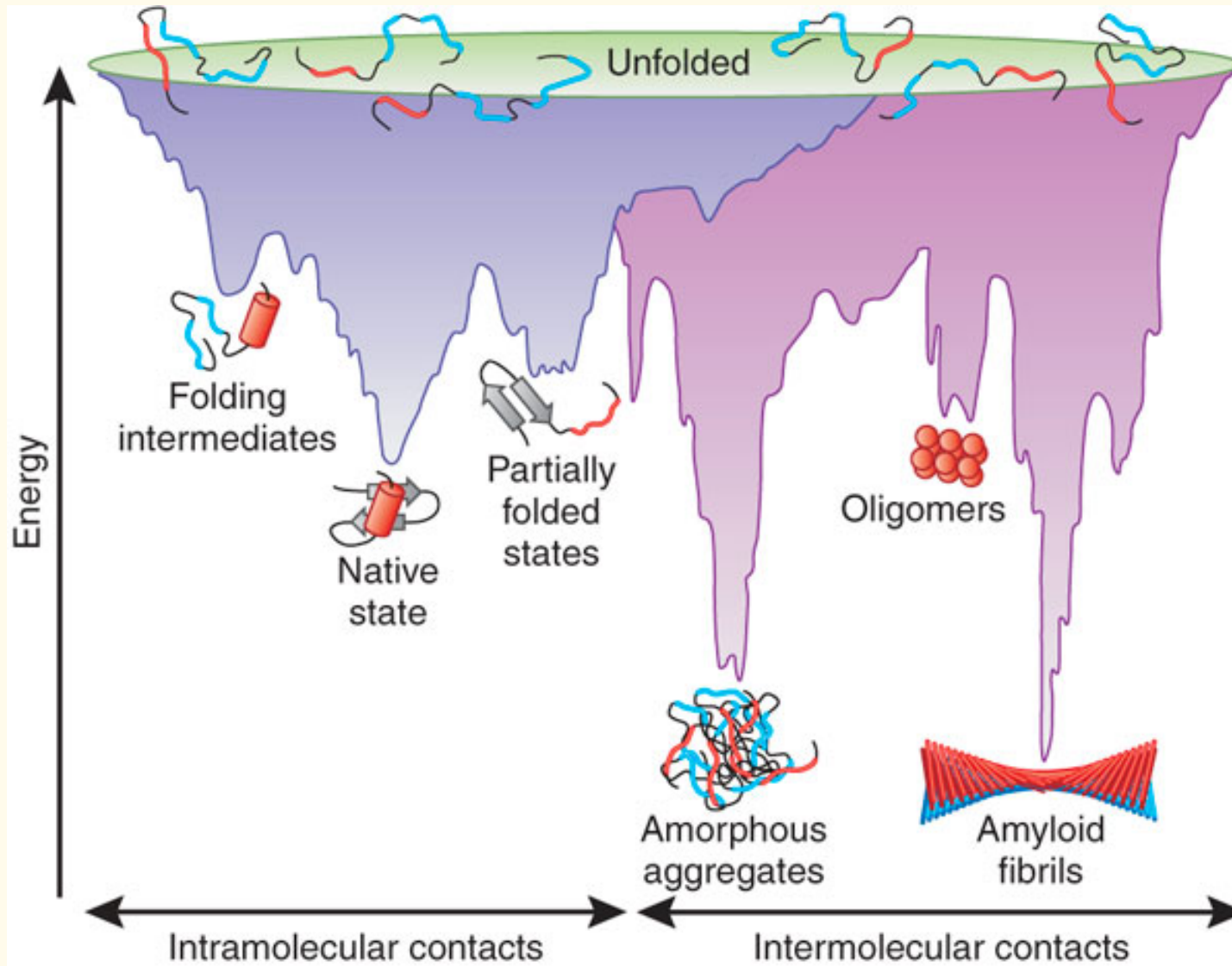
Mohanty et al. *Proteins* 2013;81:1446-1456

Folding of Top7



Mohanty et al. *Proteins* 2013;81:1446-1456

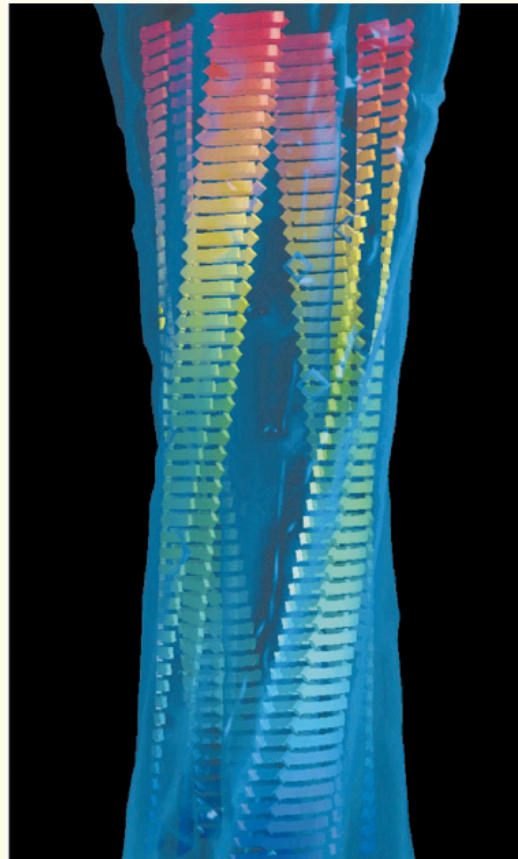
Protein aggregation



Hartl and Hayer-Hartl NSMB 2009;16:574-581

Amyloid fibrils

- Characteristic core of β -sheets
- “Universal”: formed by many proteins
- Interesting material properties
- Linked to many diseases, can be functional

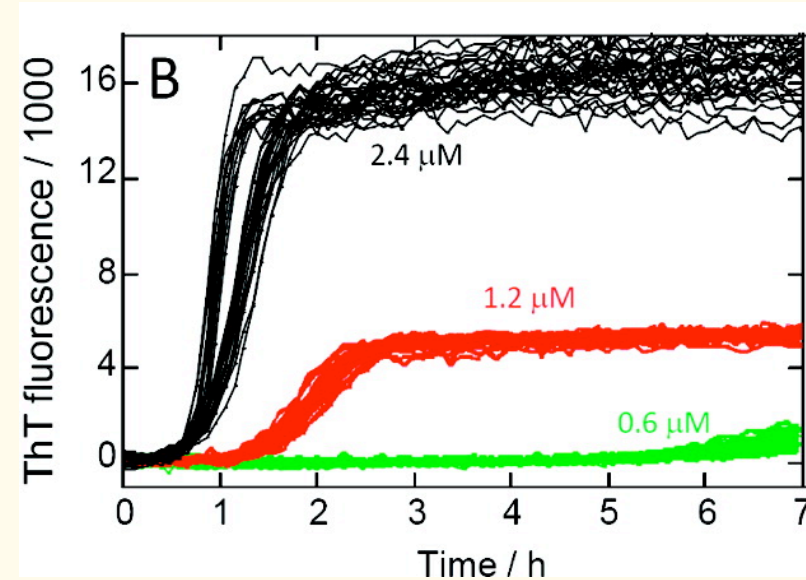


Dobson TBS 1999;24:329-332

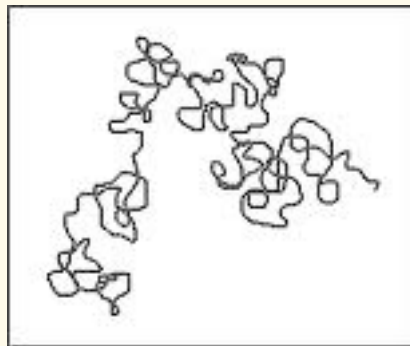
Amyloid formation

- Fibril formation occurs with sigmoidal kinetics. Critical nucleus?

Hellstrand et al. ACS Chem Neurosci 2009; 1:13-18



- Fibril growth occurs by monomer addition. Aggregation-competent form of the monomer?



?



Petkova et al. PNAS 2002;99:16742-16747

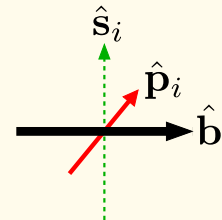
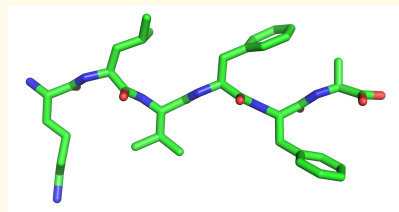
Fibril nucleation

- Experimentally difficult, transient species
 - Simulations: system size limitations
 - Simple nucleation (3D): balance volume, surface terms.
No critical size in 1D
 - Need to study the interplay between fibril length and width
 - Sigmoidal kinetics independent of sequence details
- coarse-grained modeling

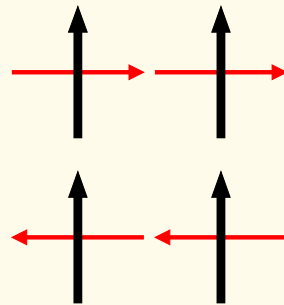
Minimalistic model for amyloid formation

- Assume internal dynamics fast and can be averaged out
- Each peptide unit-length stick, \mathbf{b} , on a cubic lattice
- H bonds in a direction \mathbf{p} perpendicular to \mathbf{b}
- Hydrophobic side $\mathbf{s} = \mathbf{b} \times \mathbf{p}$

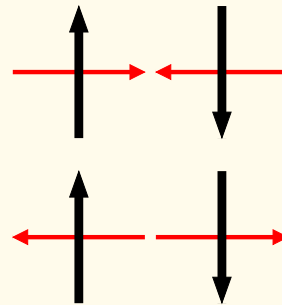
(a)



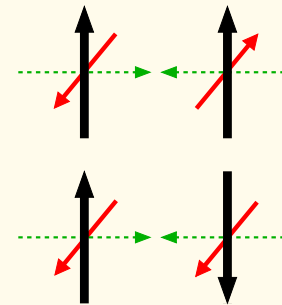
(b)



(c)



(d)

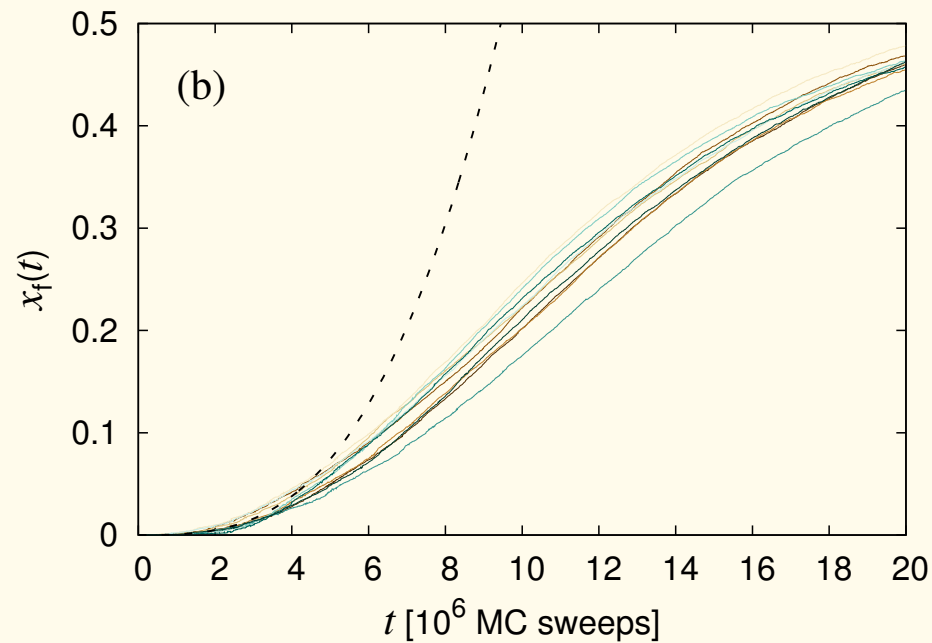


$$E_b < E_c < E_d < 0$$

A Irbäck, S Æ Jónsson, N Linnemann, B Linse, S Wallin Phys Rev Lett 2013

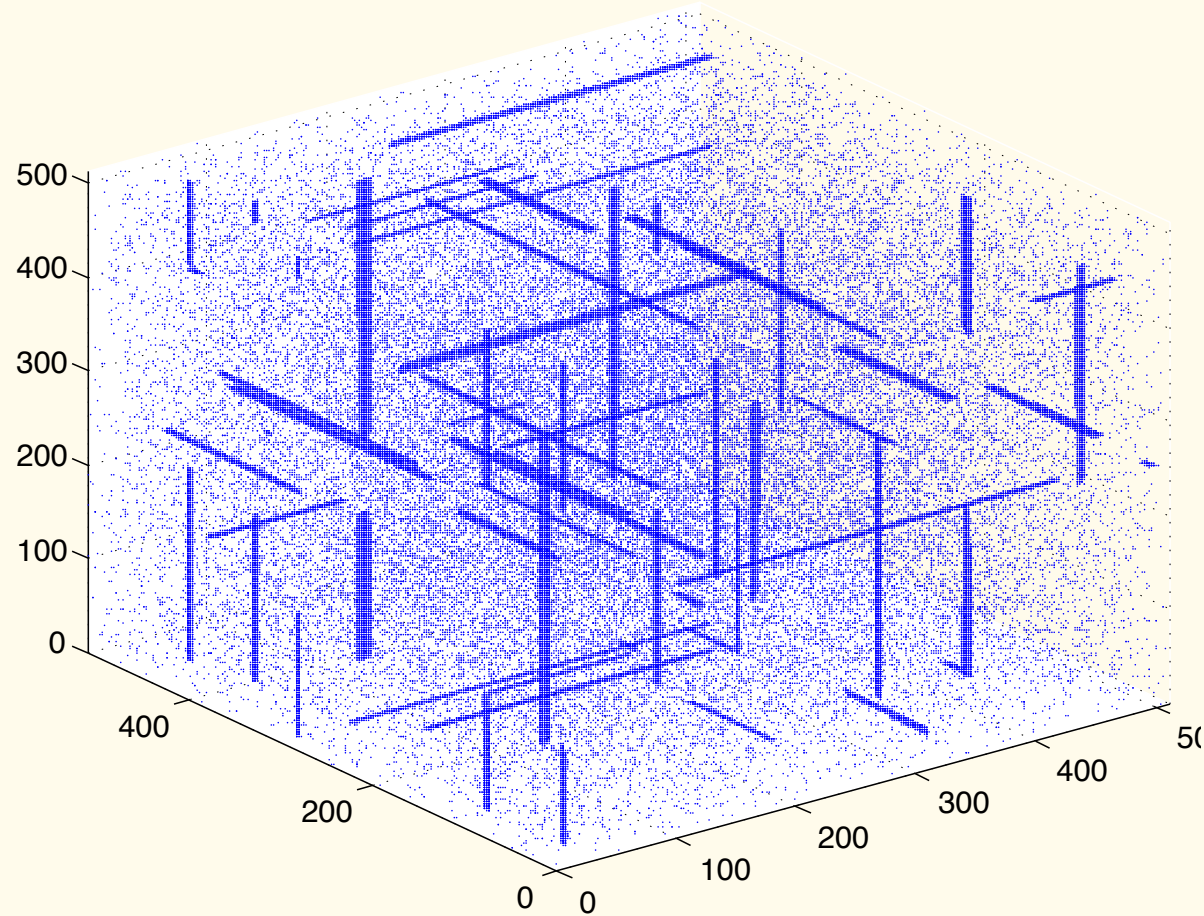
Kinetics

- Monte Carlo single-peptide moves
- >100,000 peptides, 10 runs from random initial conditions
- Total fibril mass against Monte Carlo time
- Sigmoidal kinetics



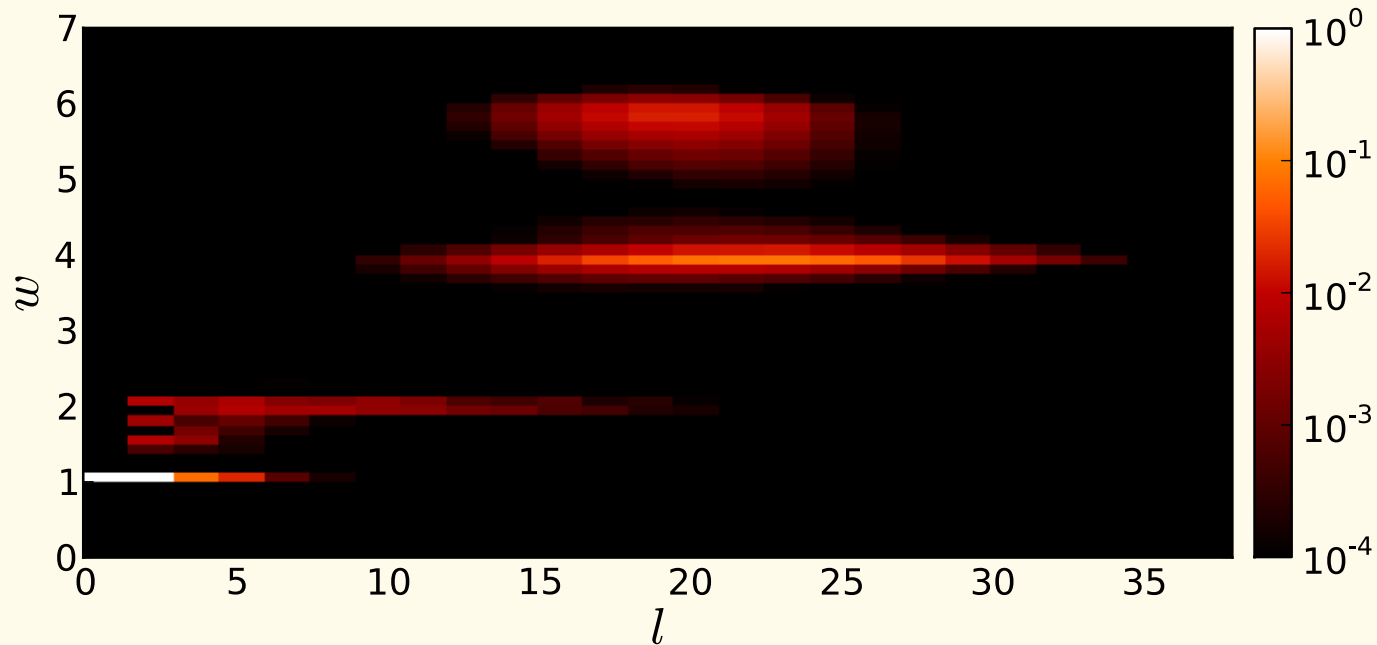
Final configuration in a kinetic run

- ~40-50 fibrils, average mass ~1400



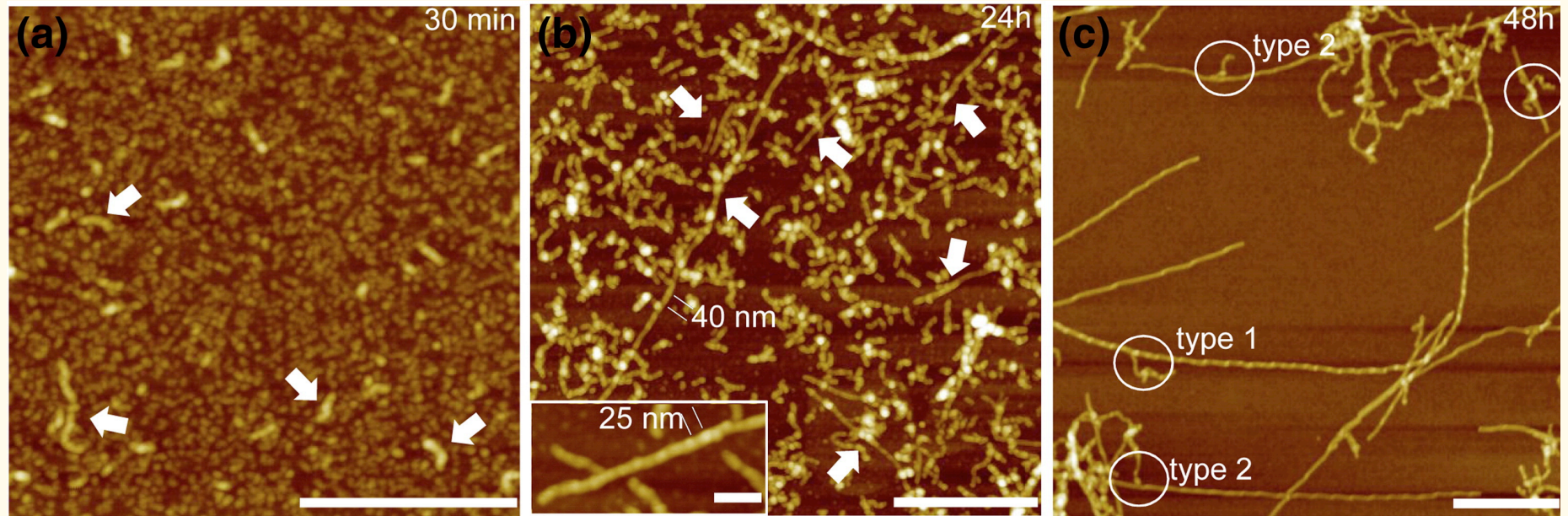
Aggregate geometry

- Equilibrium Monte Carlo simulation, 256 peptides
Cluster moves and generalized-ensemble techniques
- Aggregate length l and width w from inertia tensor
- Probability for a peptide to be part of an $l \times w$ aggregate



- To reach a given l , a minimum w is required
- Multistep process

AFM images of fibril formation



Jeong et al. JMB 2013; 425:1765-1781

Specific proteins

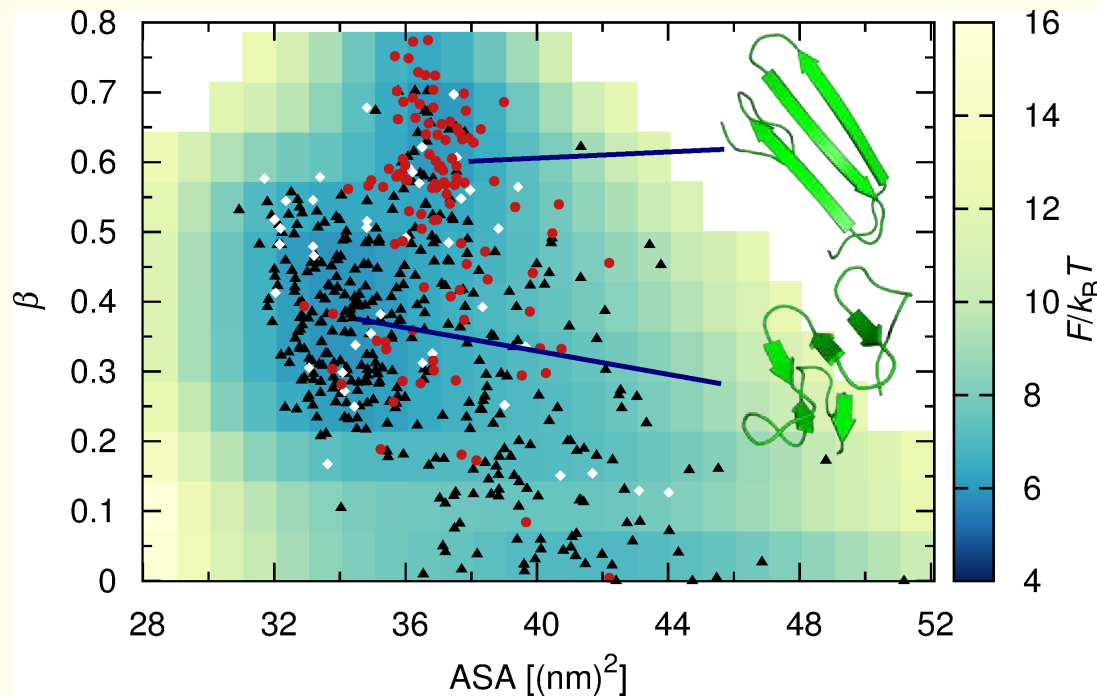
- amyloid β , $A\beta$ (Alzheimer's disease)
- α -synuclein, αS (Parkinson's disease)
- superoxide dismutase 1 (amyotrophic lateral sclerosis)
- apolipoprotein A-I

Modeling:

- all-atom protein representation, implicit solvent
- one and the same force field (same as in Top7 study)
- Monte Carlo methods

A β

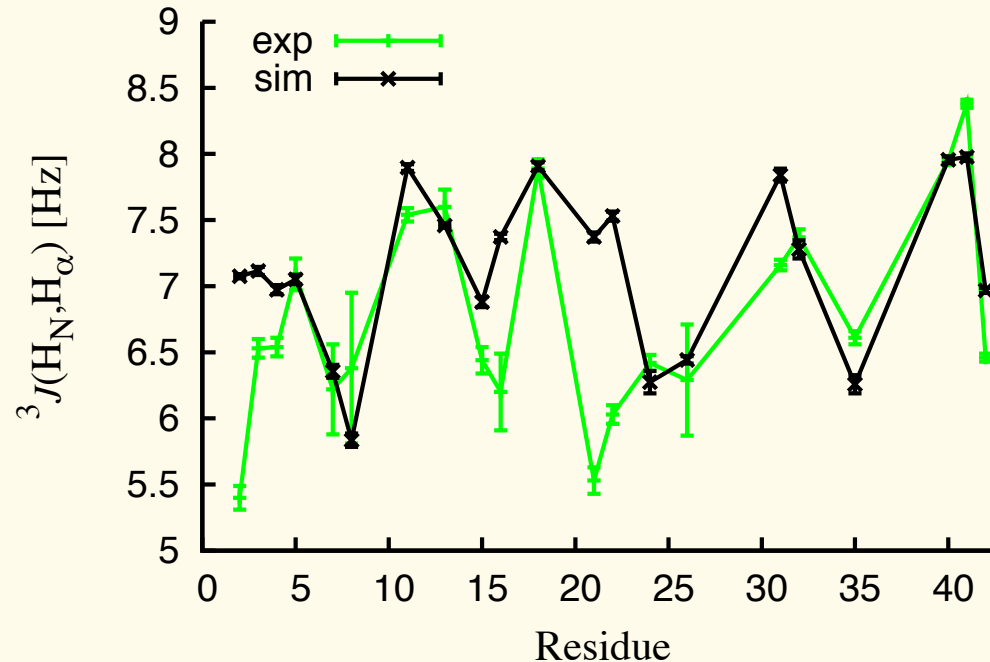
- Major constituent of Alzheimer plaques
- “Intrinsically disordered”, 42 amino acids
- Simulated free energy $F(\text{surface area}, \beta\text{-content})$:



- Typical simulations: more disorder, smaller β -content

Comparison with NMR experiments

- $^3J(\text{H}^{\text{N}}, \text{H}^{\alpha})$ -couplings: functions of a single backbone torsion angle (Karplus equation)



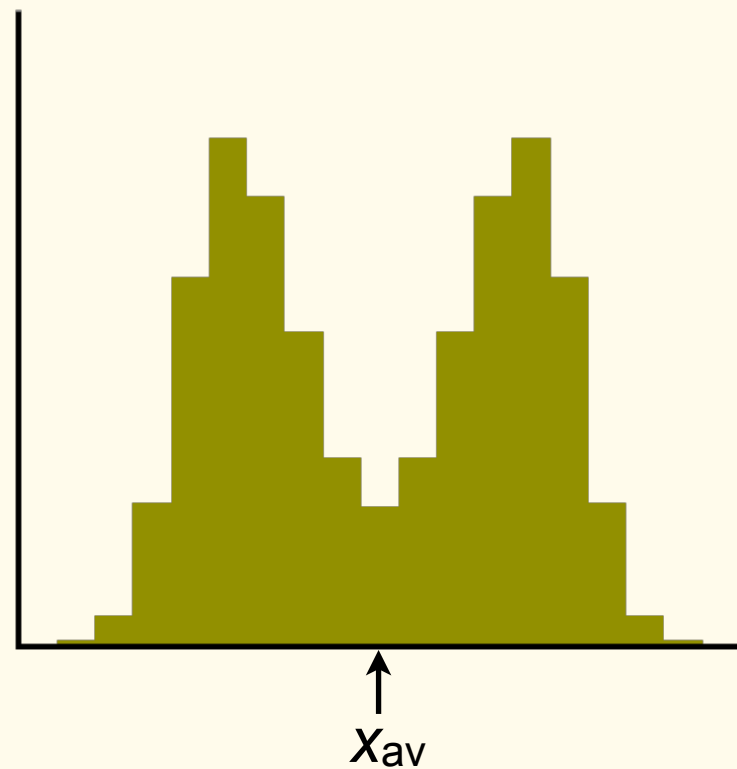
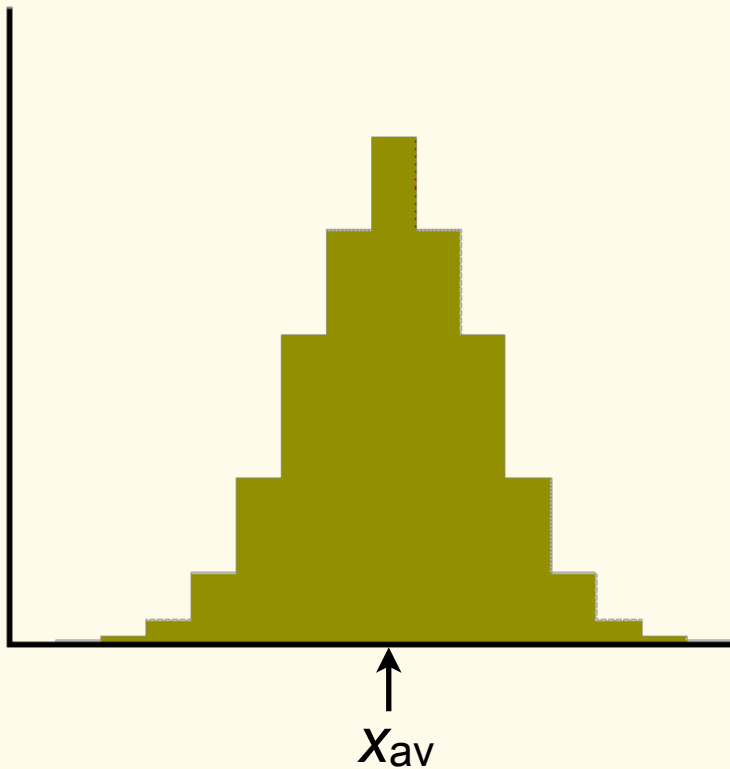
Exp.: Sgourakis et al. JMB 2007; 368:1448-1457

- Comparatively good agreement (alanine outlier)

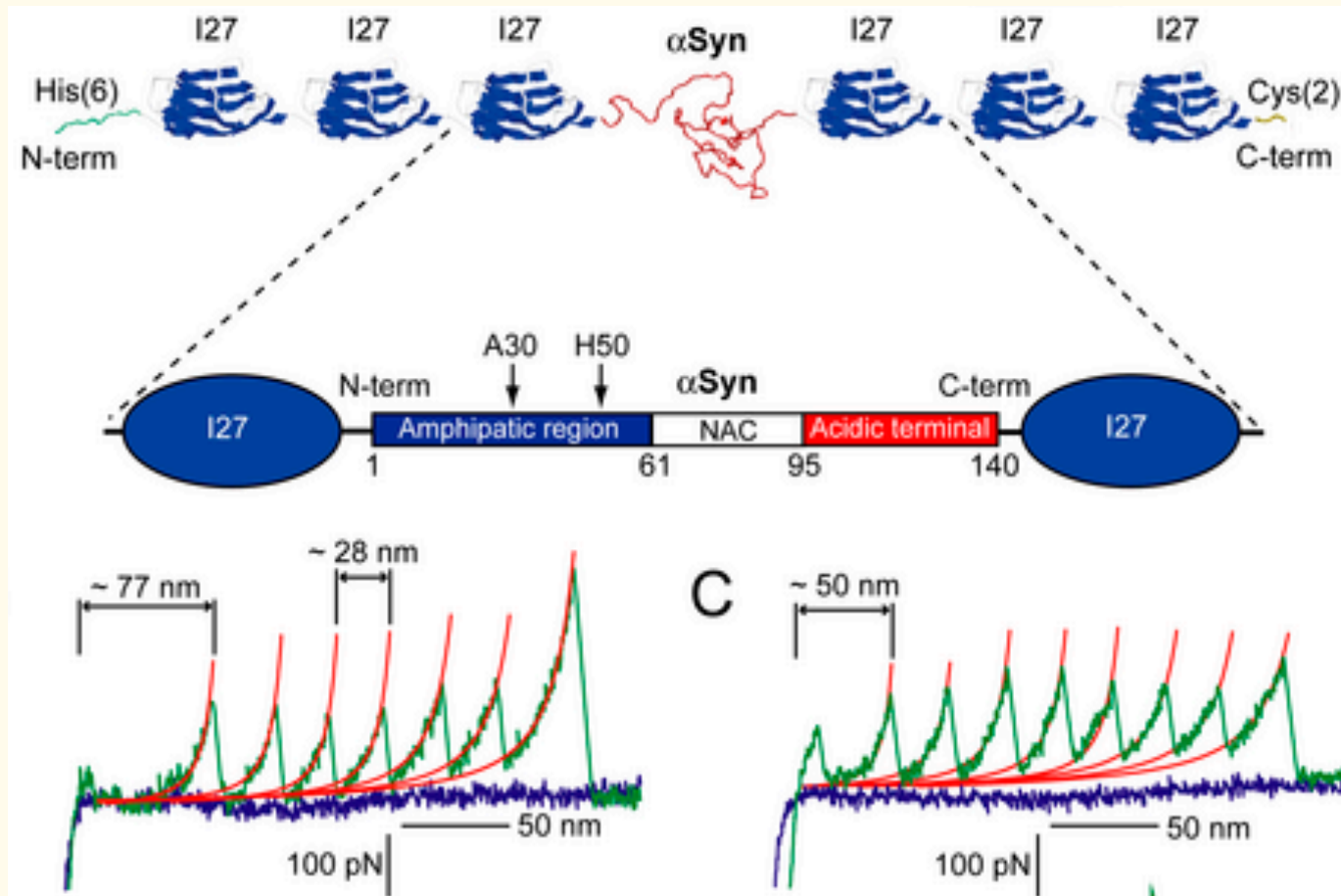
S Mitternacht, I Staneva, T Härd, A Irbäck Proteins 2010, J Mol Biol 2011

Experimental characterization of unstructured proteins

- Mainly bulk experiments, which must be interpreted with care
- Single-molecule experiments are becoming available



AFM single-molecule pulling experiments



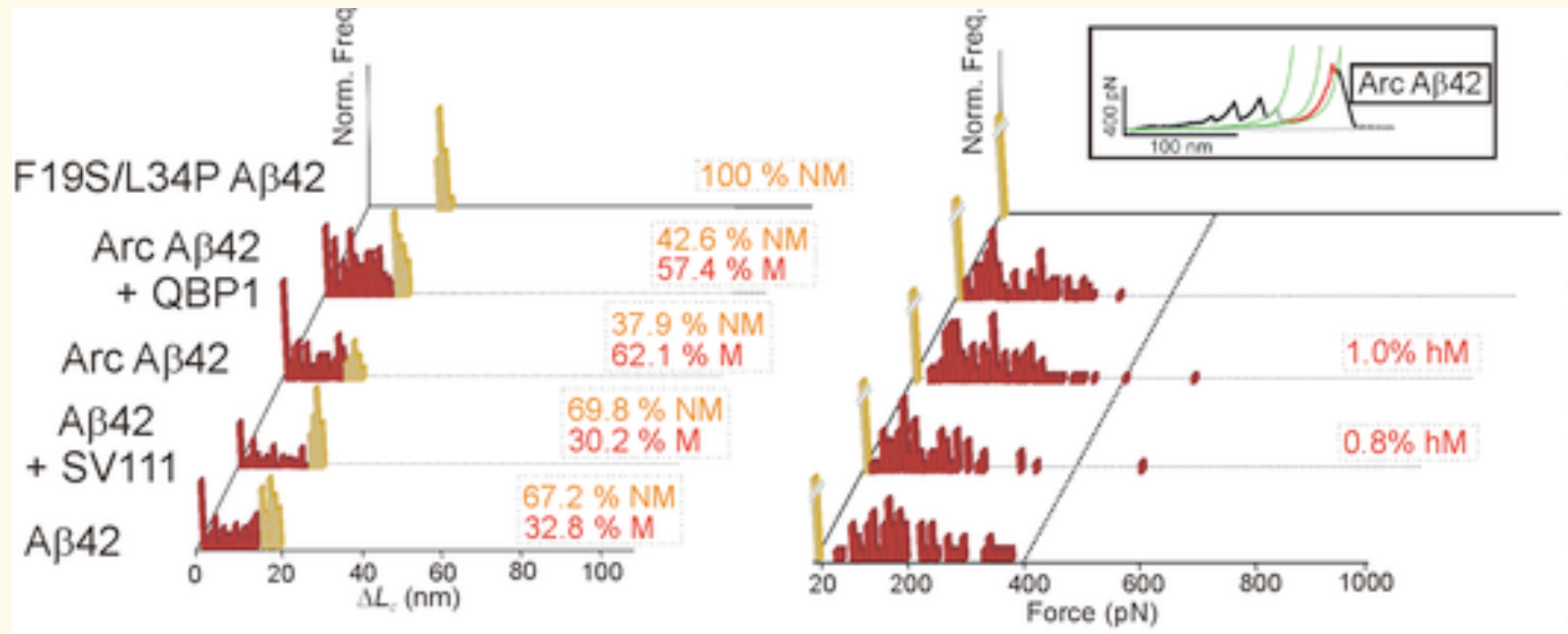
Sandal et al. PLoS Biology 2009; 6:e6

- Force versus distance
- Force peaks signal rupture events
- A β and α S: unexpected force resistance

Hervás et al. PLoS Biology 2012; 10:e1001335

AFM results for A β

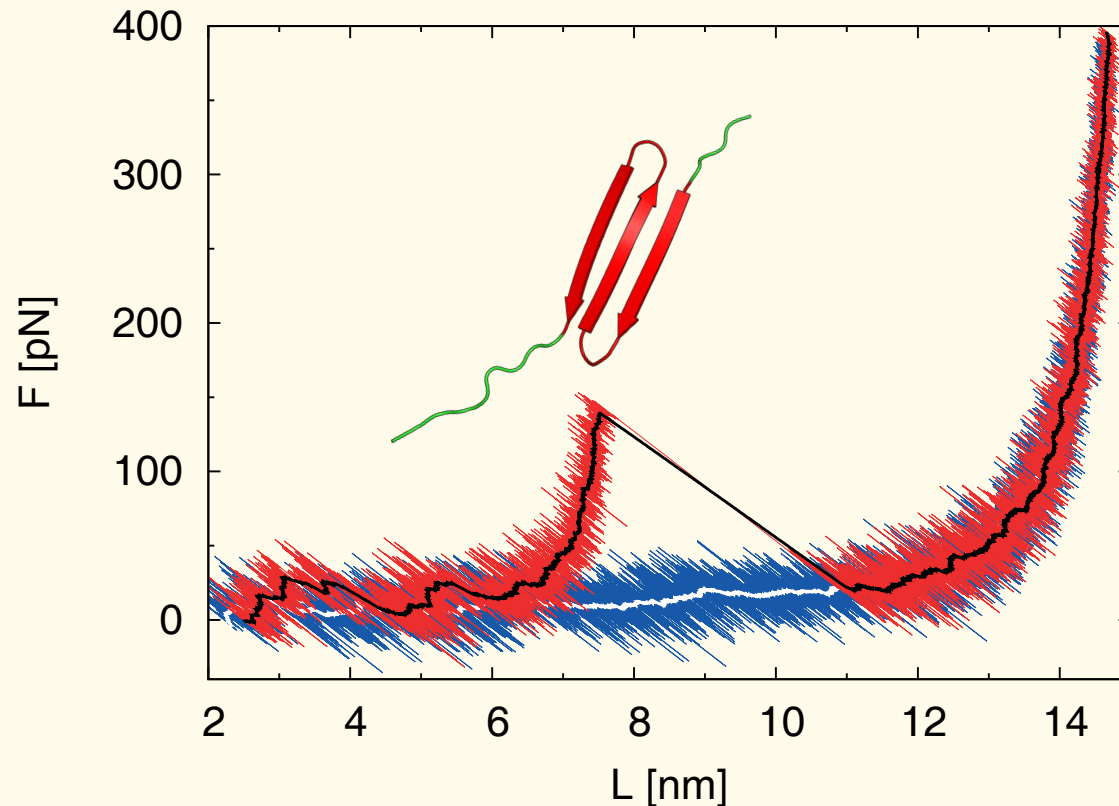
- Sometimes no resistance, sometimes rupture forces as high as those for unusually stable, folded proteins
- Can a small 42-amino acid protein like A β be that force-resistant? If so, what do the structures look like?



Hervás et al. PLoS Biology 2012; 10:e1001335

Pulling simulations of A β

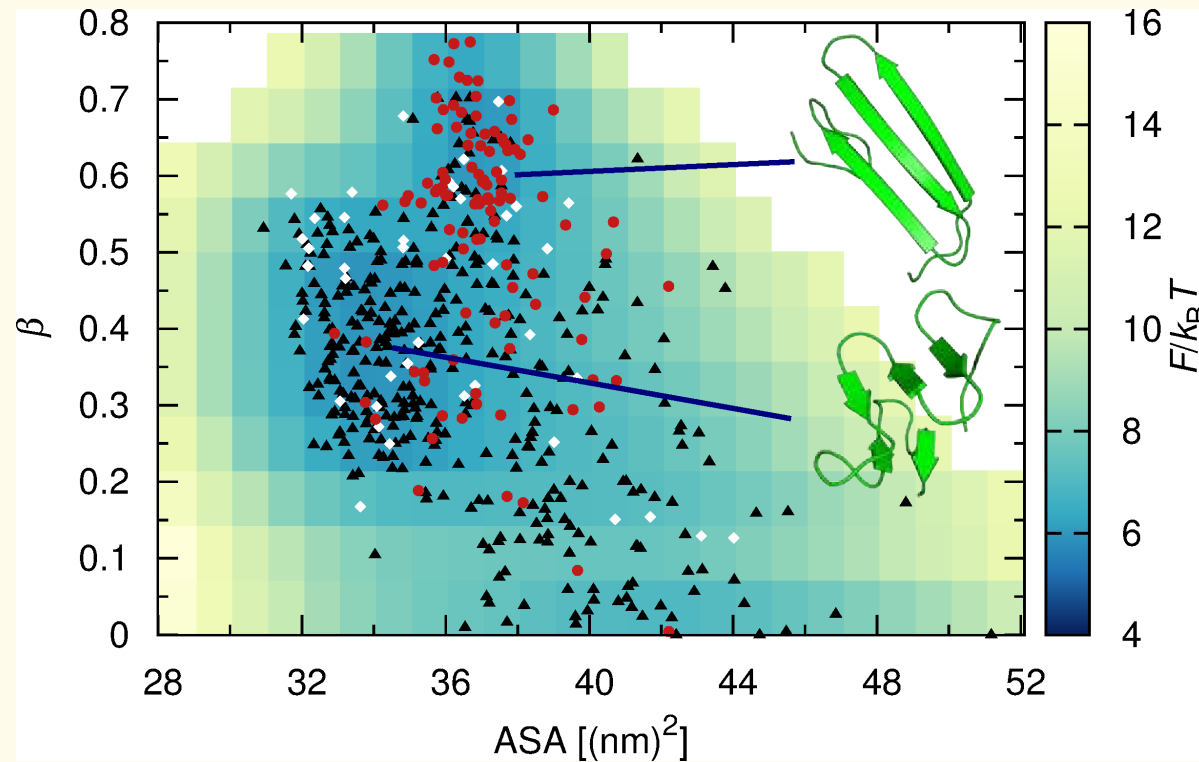
- Initial structures randomly drawn from simulated ensemble
- Two examples of force vs distance trajectories (in total >500)



S Æ Jónsson, S Mitternacht & A Irbäck Biophys J 2013

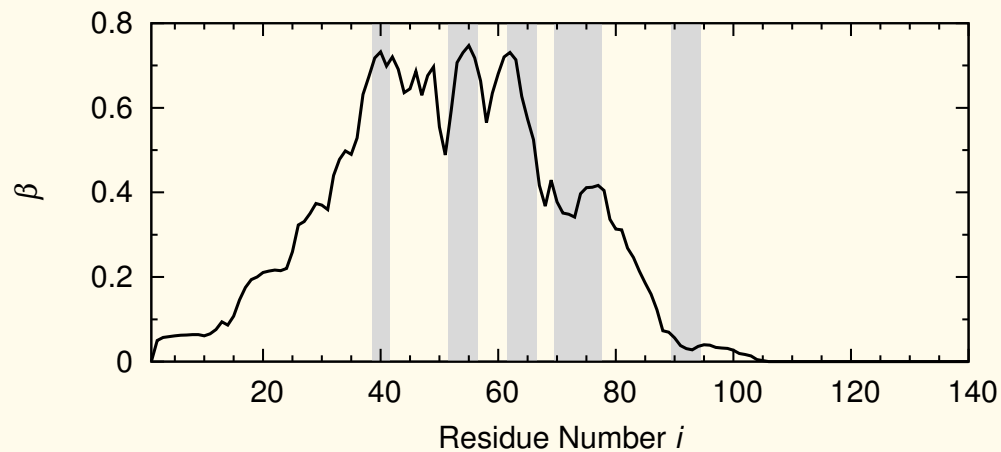
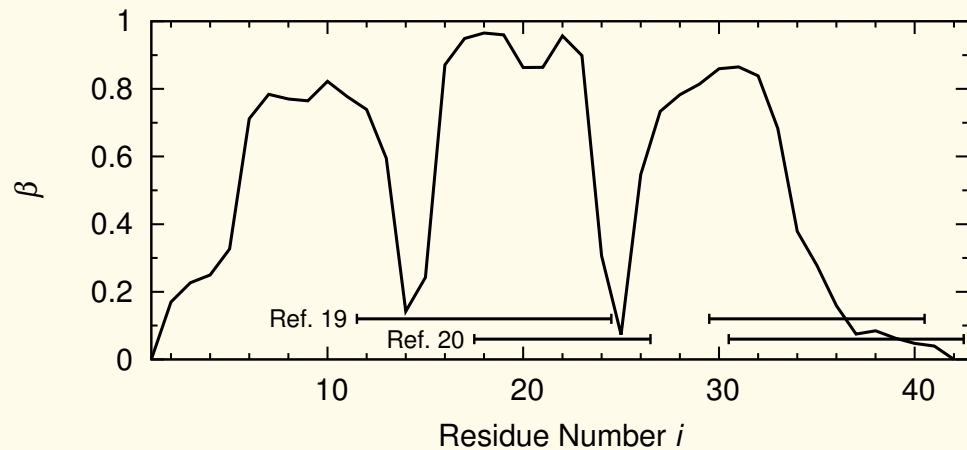
Pulling simulations of A β

- Plot symbols indicate initial structures
- The color indicates maximum rupture force. Black <20 pN, white 20-150 pN, red >150 pN

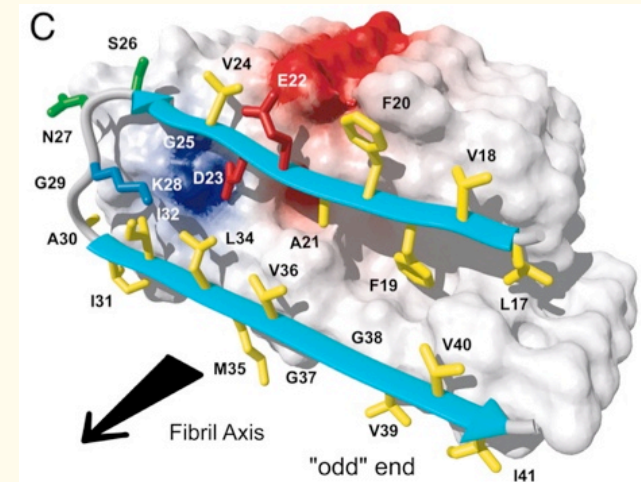


Comparison with fibril conformations

- β -structure profiles for force-resistant $A\beta$ and αS structures
- Similarities with β -strand locations in fibrils

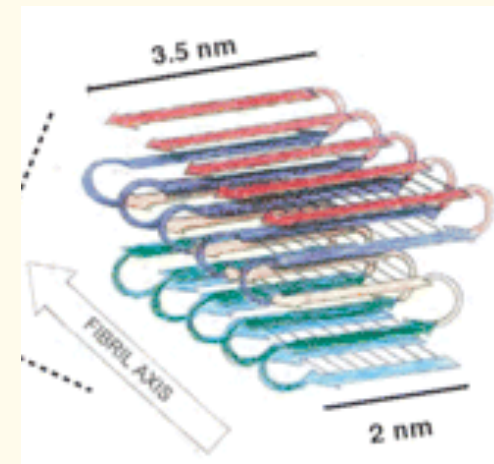


$A\beta$



Lührs et al. PNAS 2005;102:17342-17347

αS



Vilar et al. PNAS 2008; 105; 8637-8642

Summary — A β and α S studies

- A β and α S pulling simulations reproduce the surprisingly high rupture forces observed in AFM experiments
- The mechanically most resistant structures
 - share a common architecture:
a β -sheet with three strands in a meander pattern
 - show similarities with the fibril folds
- Fibril-like structures might play a key role in aggregation

To do:

- Study fibril growth (monomer + fibril template)
- Study aggregation-inhibiting small molecules