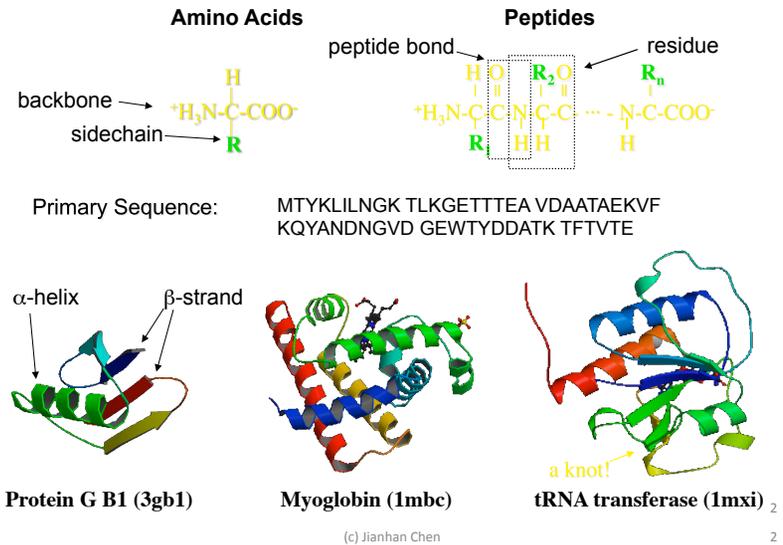


Molecular Interactions and Biomolecular Structures; Computer Modeling

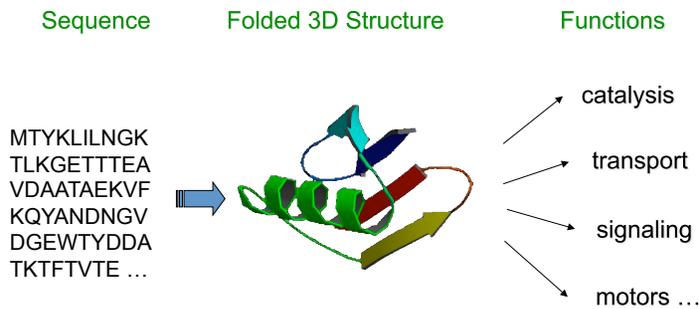
Main References: 1. Chapter 3 of van Holde
 2. Second half of Chapter 9 of Tinoco (pages 493-516)

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Hierarchical Organization of Proteins

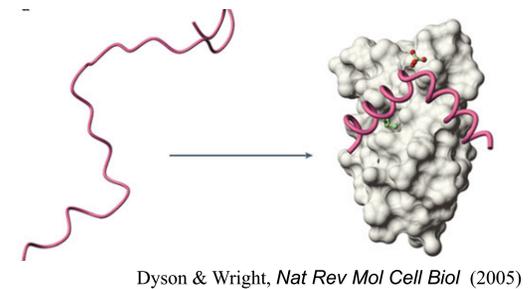


Structure-Function Paradigm



- Structural Genomics (NMR, X-ray)
- Protein structure predictions

Intrinsic Disorder & Cellular Functions



- **Intrinsically Disordered Proteins (IDPs):** functional proteins that can exist as dynamic ensembles of disordered structures under physiological conditions.
- Over 30% of eukaryotic proteins are predicted to be disordered.
- Critical in cellular regulation and signal transduction.
- Allow high specificity with low affinity; structural plasticity for binding diversity
- Particular importance in cancer and protein misfolding diseases.

Determinant of Structure (or Lack of It)

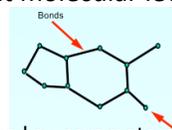
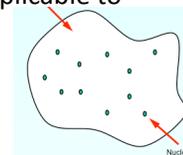
- Probability of observing a particular structure (conformation) is determined by its stability (as defined by the free energy)
 - Thermodynamics and statistical mechanics!
- No single structure is *the* structure
 - It is all about probability (statistical mechanics!)
 - Motions and flexibility are important too
- The stability depends on a range of factors
 - Intramolecular interactions
 - Bonded: chemical bonds, angles, *dihedrals* etc
 - **Nonbonded**: “weak” interactions
 - Charged-charged, van der Waals (dispersion and repulsion)
 - Intermolecular interactions: nonbonded/weak interactions
 - Cellular environment: solvent (water), membrane, salt, pH etc
 - Association with other biomolecules, small molecules, ions, etc

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Quantum Mechanics vs. Molecular Mechanics

- Quantum mechanics: “exact” and most applicable to understand chemical reactions
 - Separate nuclei and electrons
 - Too expensive, and not sufficiently accurate
 - Not relevant as many biological processes
- Molecular mechanics: classical mechanics at molecular level
 - Classical treatment of all atoms
 - No electron, no chemistry
 - Allows description of large molecules
 - Experimental methods available to determine the key parameters in a molecular mechanical treatment
- Hybrid QM/MM
 - QM for the active site (where reaction occurs) and MM for the rest
 - Accurate treatment of MM/QM Boundary is a problem

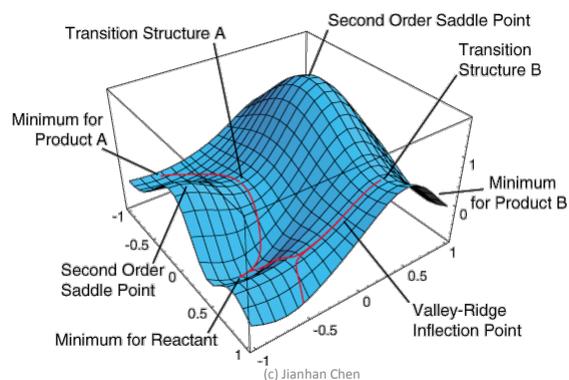


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Classical Mechanics

- Total energy: $E = K + V$
 - Kinetic energy ($K = mv^2/2$), potential energy V (i.e., force field)
- Newton’s second law of motion: $F = m a$
 - Relation of force and potential energy: $F = -\delta V/\delta r$



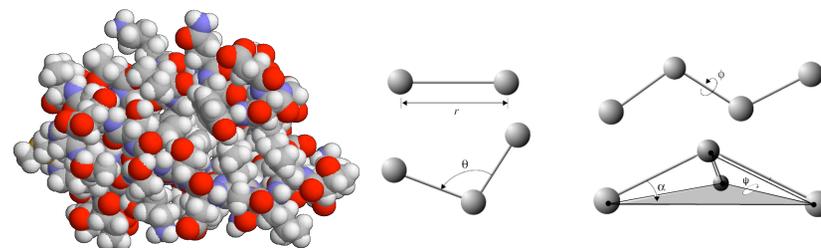
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Molecular Potentials

- Basic form: $V = V_{\text{bonding}} + V_{\text{nonbonding}}$

$$= (\sum V_{\text{bond}} + \sum V_{\text{angle}} + \sum V_{\text{dihe}}) + \Sigma(V_{\text{elec}} + V_{\text{vdw}})$$
 - The potential energy is a function of all coordinates.
 - Additivity, empirical, transferability

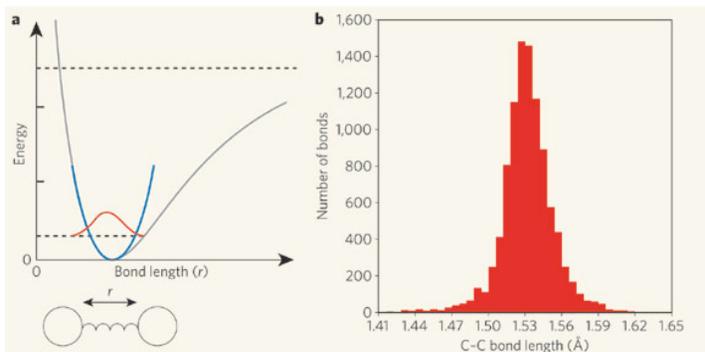


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Bonds and Angles

- $V_{\text{bond}} = k_{\text{bond}} (r - r_0)^2$
 - Harmonic approximation
 - OK for biomolecules
- $V_{\text{angle}} = k_{\text{angle}} (\theta - \theta_0)^2$

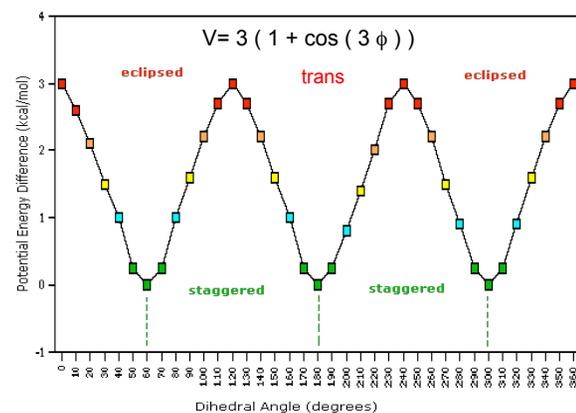


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Dihedral Potentials

- $V_{\text{dihe}} = k_{\text{dihe}} \cdot [1 + \cos(n\phi - \delta)]$

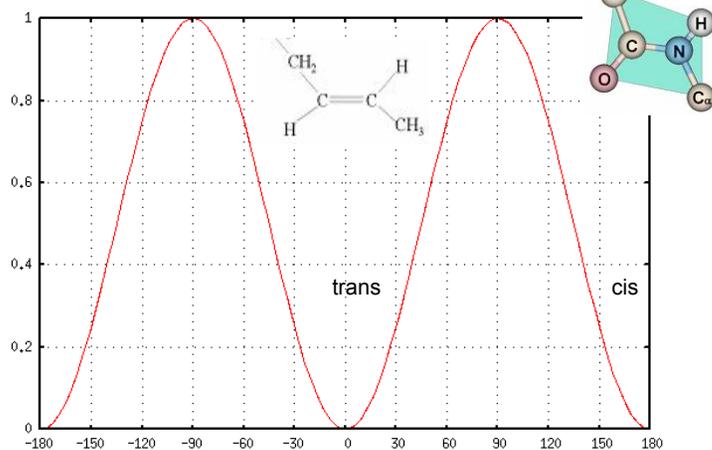


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Double Bonds: $n=2, \delta=-180$

- $V = k (1 + \cos(2\phi - 180))$

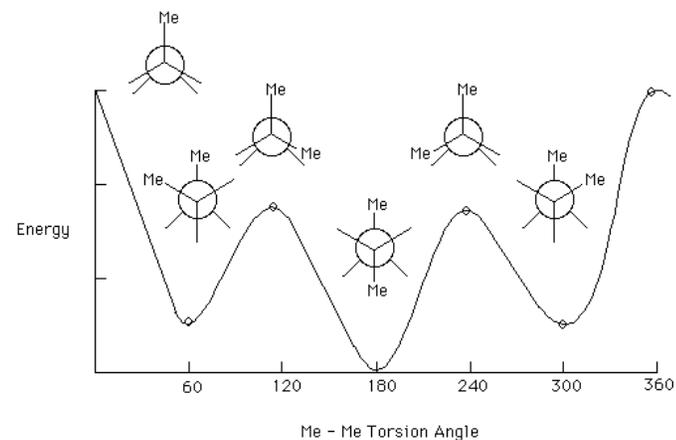


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Realistic Dihedral Potentials

- Actual dihedral potentials often have contributions with multiple periodicities

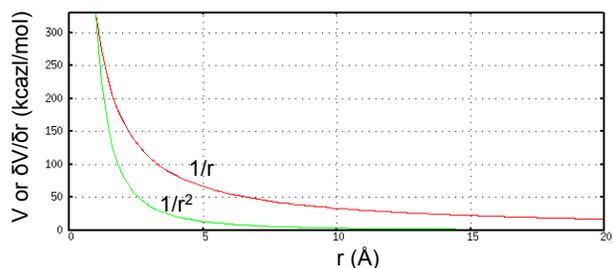
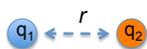


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Electrostatic Interactions

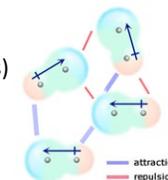
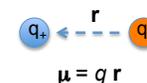
- $V_{\text{elec}} = q_1 q_2 / 4\pi\epsilon_0 r$ Coulomb's Law
 - ϵ_0 : permittivity constant of vacuum
- A simplified form: $V_{\text{elec}} = 332 q_1 q_2 / r$
 - Where q is unit of electron charge, r is in Å and V in kcal/mol.
- Dielectric medium: $V_{\text{elec}} = 332 q_1 q_2 / \epsilon r$
 - ϵ is dielectric constant (relative permittivity).
 - $\epsilon=78$ for water under lab conditions (300K, 1atm)



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Dipole-Dipole Interactions

- Dipole moment: arise from charge separations
 - measure the “polarity” of a molecule (or fragment)
- Dipole-dipole interactions
 - Fully included if all charges treated explicitly
 - Offer simplifications (by reducing the number of terms)



$$V_{dd} = \frac{\mu_A \cdot \mu_B}{|r_{AB}|^3} - \frac{3(\mu_A \cdot r_{AB})(\mu_B \cdot r_{AB})}{|r_{AB}|^5}$$

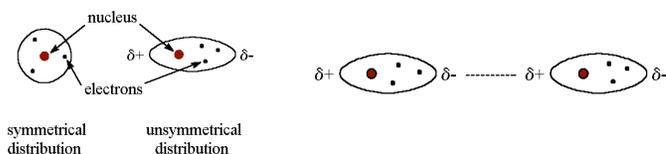
- Decays faster: $1/r^3$ dependence
- Special cases: parallel and perpendicular orientations

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van der Waals Interactions

- London dispersion: attractive forces that arise from temporary dipoles (induced dipole-induced dipole interactions)



- van der Waals repulsion: all atoms repel at short distances
- A common function form: $V_{\text{vdw}} = -A/r^6 + B/r^{12}$
- **Lennard-Jones** potential function (12-6)

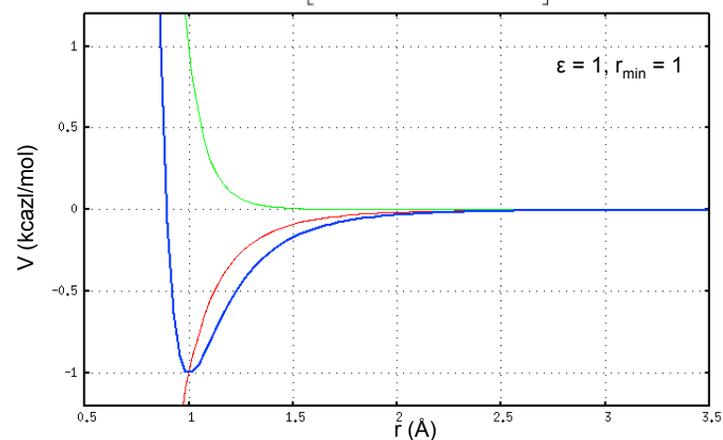
$$V(r) = \epsilon \left[\left(\frac{r_{\text{min}}}{r} \right)^{12} - 2 \left(\frac{r_{\text{min}}}{r} \right)^6 \right]$$

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Lennard-Jones Potential

$$V(r) = \epsilon \left[\left(\frac{r_{\text{min}}}{r} \right)^{12} - 2 \left(\frac{r_{\text{min}}}{r} \right)^6 \right]$$

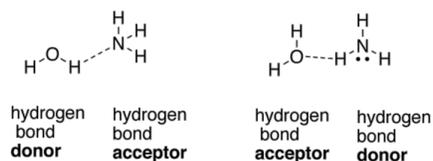


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Hydrogen Bonds

- Very important in macromolecule structures
- Primarily a dipole-dipole interaction, but arguably with some covalent nature (electron sharing in so-called low barrier HBs)



- The strength of HBs vary greatly and depend on the environments (dielectric screening)
- The functional form for HB is unclear.
 - Often mimicked by Lennard-Jones potential
 - At present, often treated with electrostatic + vdW

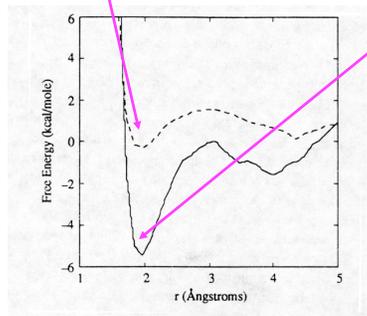
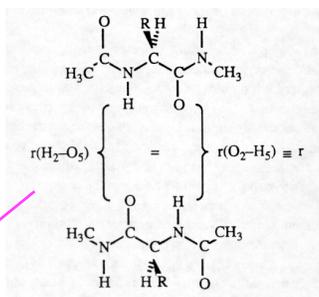
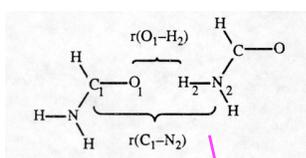
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What is a hydrogen bond worth?

Secondary Structure	Stability per H-bond	Model	Reference State
Antiparallel β -sheet	-2.8	[Ac-ala-NHMe] ₂	Infinite separation
Ala-gly Type II turn	-0.6	Ac-ala-gly-NHMe	Extended
Amide H-bond	-0.3	[formamide] ₂	Infinite separation
1 st helical H-bond	-0.2	Ac-(ala) ₂ -NHMe	extended
2 nd helical H-bond	-0.4/-1.0	Ac-(ala) ₂ -NHMe	extended
Ala-gly Type I turn	2.6	Ac-ala-gly-NHMe	extended
Pro-gly Type I turn	2.6	Ac-pro-gly-NHMe	extended

β -sheets can have exceptional stability

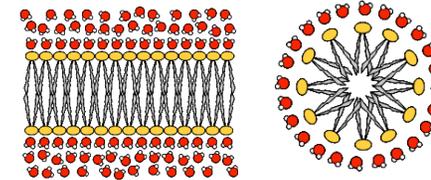
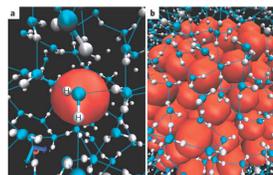


Small barrier and minimum associated with "naked" hydrogen bond, much more significant for beta-sheet model

Tobias and Brooks CPL (1990)

Hydrophobic Effects

- The property that nonpolar solutes aggregate in water
- Arise from a combination of elemental physical effects
 - Difference in strengths solute-water and water-water interactions
 - Difference in shapes (sizes) of solutes and water
 - Various entropic contributions
- One of the key driving forces for self-assembly in biology
 - Biological membrane, micelle formation, protein folding ...
 - Complex temperature dependence: cold denaturation of proteins
 - Very difficult to describe theoretically!



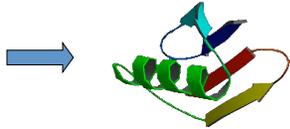
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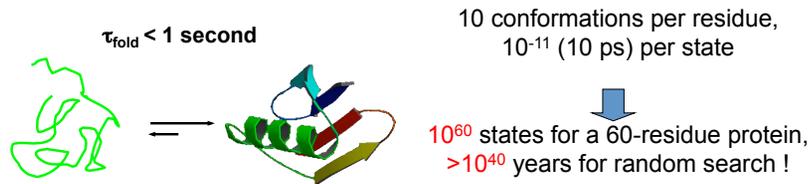
The Protein Folding Problem

- How does the primary Sequence specify the native fold?
(Afinsin, Science, 1973)

MTYKLLINGK TLKGETTTEA
VDAATAEKVF KQYANDNGVD
GEWTYDDATK TFTVTE



- Levinthal's Paradox: how protein folds this fast?



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Determinant of Protein Structure

- Principles known, but a long way to go in quantification
- Key stabilizing physical interactions (hydrogen bonds, hydrophobic effects, etc) known
 - Relative "importance" and quantification not clear
- Reasonable success in practice of structure prediction and computational protein design
 - Largely based on statistical knowledge of known structures
- Much more to learn
 - Quantitative nature
 - Mechanisms of folding
 - Misfolding and aggregation
 - Protein dynamics



<http://predictioncenter.org/>

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Biological Energy Scales

- Chemical bonds: C-H -105 kcal/mol, C=C 172 kcal/mol
- Ionic hydration: Na^+ -93 kcal/mol, Ca^{2+} -373 kcal/mol
- Hydrogen bonds: O...H -5 kcal/mol (*in vacuum*), can be much weaker in solution or protein environment
- Protein stability: $\sim -2-10$ kcal/mol (*in solution*)
- Protein-DNA binding: $\sim -5-20$ kcal/mol ($\sim 200 \text{ \AA}^2$ contact)

A quantitative model of proteins need to be able to predict several kcal/mol differences in (free) energy!

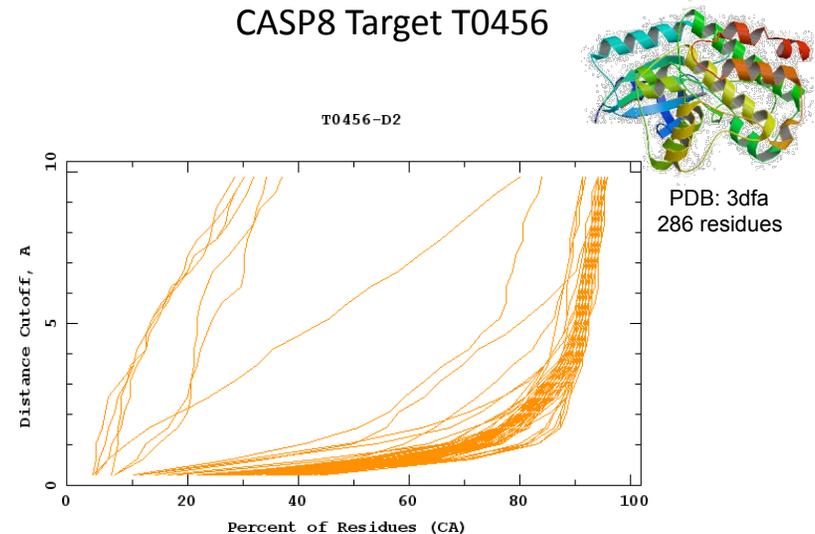
This small energies result from a summation of many atom pairs (10^6-10^8)! Plus, entropic effects.

This is extremely difficult, if ever possible!

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CASP8 Target T0456

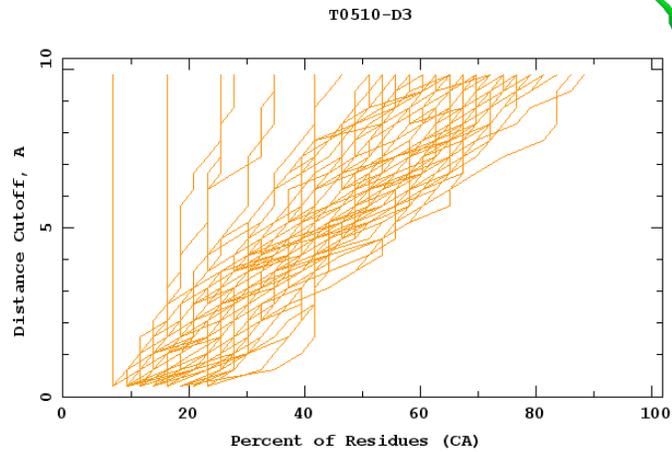
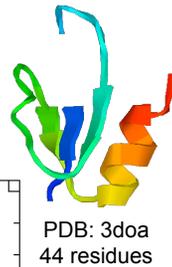


<http://www.predictioncenter.org/casp8/results.cgi>

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CASP8 Target T0510



<http://www.predictioncenter.org/casp8/results.cgi>

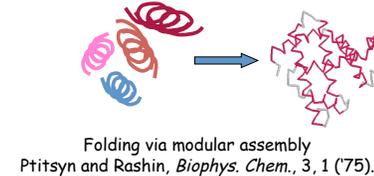
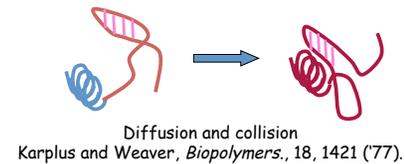
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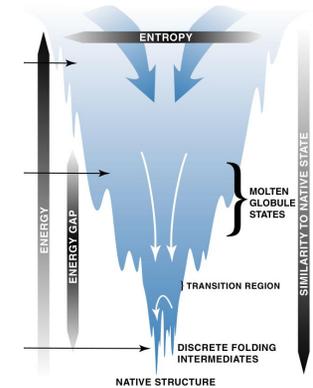
How proteins fold?

“Classical” understandings

- Diffusion-collision
- Hierarchical folding
- Assembly of foldons



The Energy Landscape Theory (arguably the prevailing theory)



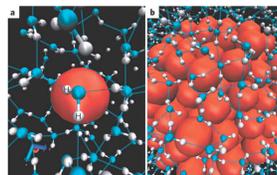
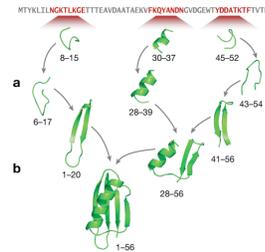
Wolynes et al., *Science* (1995).

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Two Excellent Readings

- “The protein folding problem”, Dill et al., *Annu. Rev. Biophys.* 2008, 37:289-316
 - A good overview of current understanding of protein folding
 - The zipping and assembly hypothesis is interesting, but as a prediction method the success has been limited
- “Interfaces and the driving force of hydrophobic assembly”, Chandler, *Nature* 2005, 437:640-647
 - One of the most readable and informative reviews on current understanding of hydrophobic effects



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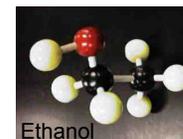
Basic Components of Modeling

Force Field

A set of basic model units and associated rules.

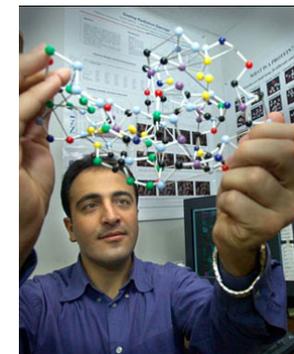


A pioneering ball and stick atomic model set, 1860s



Sampling

The process of finding the optimal assembly of the basic model units.

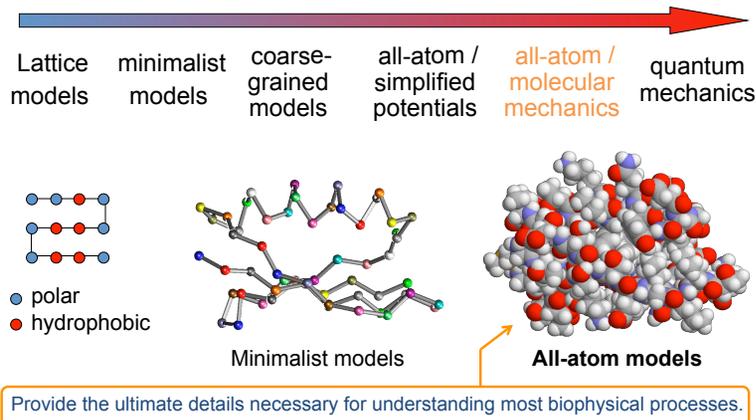


<http://www.sesame.org.jo/publication/NSLS.aspx>

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Molecular Models at Multiple Scales

increasing details and predicting power
increasing difficulty and computational cost



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Molecular Mechanics

Classical Energy Functions

$$V_{MM} = \sum_{\text{bonds}, i} \frac{1}{2} k_i^b \cdot (b_i - b_i^0)^2$$

$$+ \sum_{\text{angles}, i} \frac{1}{2} k_i^\theta \cdot (\theta_i - \theta_i^0)^2$$

$$+ \sum_{\text{torsions}, i} k_i^\phi \cdot [1 + \cos(n_i \phi_i - \delta_i)]$$

$$+ \sum_{\text{atoms}, i < j} \left\{ \epsilon_{mir}^{ij} \left[\left(\frac{r_{min}^{ij}}{r_{ij}} \right)^{12} - 2 \left(\frac{r_{min}^{ij}}{r_{ij}} \right)^6 \right] + \frac{q_i q_j}{\epsilon r_{ij}} \right\}$$

“Force Field”
CHARMM
Amber
OPLS
...

Molecular Dynamics (MD)

$$m_i \ddot{r}_i = F_i = -\nabla V_i$$

Monte Carlo (MC)

$$P(\delta r) = \exp(-\Delta V/kT)$$

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CHARMM param22 Force Field

- **Topology** file: define the building blocks (atoms, connectivities)

```

atom types
  MASS 1 H 1.00800 ! polar H
  MASS 2 HC 1.00800 ! N-ter H
  MASS 3 HA 1.00800 ! nonpolar H
  ...

residue blocks
  RESI ALA 0.00
  GROUP
  ATOM N NH1 -0.47 !
  ATOM HN H 0.31 ! HN-N
  ATOM CA CT1 0.07 ! HB1
  ATOM HA HB 0.09 !
  GROUP
  ATOM CB CT3 -0.27 ! HA-CA--CB-HB2
  ATOM HB1 HA 0.09 ! HB3
  ATOM HB2 HA 0.09 ! O=C
  ATOM HB3 HA 0.09 !
  GROUP
  ATOM C C 0.51
  ATOM O O -0.51

connectivity
  BOND CB CA N HN N CA O C
  BOND C CA C +N CA HA CB HB1 CB HB2 CB HB3
  IMPR N -C CA HN C CA +N O
  DONOR HN N
  ...
  
```

name type charge

excerpted from: top_all22_prot.inp

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CHARMM param22 Force Field

- **Parameter** file: define the parameters of interactions

```

...
BONDS
C C 600.000 1.3350 ! ALLOW ARO HEM
! Heme vinyl substituent (KK, from propene (JCS))
CA CA 305.000 1.3750 ! ALLOW ARO
! benzene, JES 8/25/89
...
ANGLES
CA CA CA 40.000 120.00 35.00 2.41620 ! ALLOW ARO
! JES 8/25/89
CE1 CE1 CT3 48.00 123.50 !
! for 2-butene, yin/adm jr., 12/95
...
DIHEDRALS
C CT1 NH1 C 0.2000 1 180.00 ! ALLOW PEP
! ala dipeptide update for new C VDW Rmin, adm jr., 3/3/93c
C CT2 NH1 C 0.2000 1 180.00 ! ALLOW PEP
! ala dipeptide update for new C VDW Rmin, adm jr., 3/3/93c
...
NONBONDED nbxmod 5 atom cdie1 shift vatom vdistance vswitch -
cutnb 13.0 ctofnb 12.0 ctonnb 10.0 eps 1.0 e14fac 1.0 wmin 1.5
! adm jr., 5/08/91, suggested cutoff scheme
C 0.000000 -0.110000 2.000000 ! ALLOW PEP POL ARO
! NMA pure solvent, adm jr., 3/3/93
CA 0.000000 -0.070000 1.992400 ! ALLOW ARO
! benzene (JES)
  
```

excerpted from: par_all22_prot.inp

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Parameterization of Force Fields

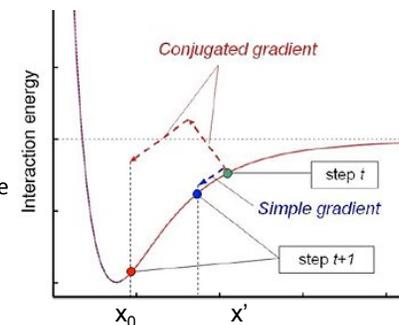
- Bonded terms: spectroscopy or quantum mechanics
- Lennard-Jones: Small molecular crystals
- Electrostatic: quantum mechanics (fit monopoles to electrostatic potential)
- Many challenges in practice
 - which (model) molecules: availability, representative or not
 - how many atomic classes: transferability and tractability
 - Which properties to parameterize for?
 - Correlation of parameters
 - Higher order/new terms or not?
 - Electron polarization, non-additivity, ...
 - water, water, and water
- At the end, do they add up? (cancellation of errors)

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Energy Minimization

- Minimization follows gradient of potential to identify stable points on energy surface
 - Let $V(x) = k(x-x_0)^2$
 - Begin at x' , how do we find x_0 if we don't know $V(x)$ in detail?
 - How can we move from x' to x_0 ?
 - **Steepest descent (SD)**:
 - $x' \rightarrow x' = x + \delta$
 - $\delta = -dx \partial V(x) / \partial x = -dx k(x-x_0)$
 - This moves us, depending on the step size dx , toward x_0 .
 - On a simple harmonic surface, we will reach the minimum, x_0 , i.e. converge, in a certain number of steps related to dx .



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Molecular Dynamics

- Objective: $\{r_1(t), \dots, r_N(t)\} \rightarrow \{r_1(t+\Delta t), \dots, r_N(t+\Delta t)\}$ $f = ma$
- Basic idea: solve Newton's equation of motion numerically
 - Given current coordinates (x), velocities (v)
 - Forces can be calculated based on coordinates (from $f = -\partial V/\partial x$)
 - $x(t+\Delta t) = x(t) + v(t) \Delta t$
 - $v(t+\Delta t) = v(t) + f(t)/m \Delta t$
 - Repeat above operations
- More accurate integrators (better energy conservation)
 - Verlet Algorithm (Verlet J. Chem. Phys. 1967)
 - consider Taylor's expansions:

$$x(t \pm \Delta t) = x(t) \pm v(t) \Delta t + 1/2m f(t) \Delta t^2 \pm 1/6 d^3x/dt^3 \Delta t^3 + O(\Delta t^4)$$
 Adding expansion $x(t+\Delta t)$ and $x(t-\Delta t)$ and rearrange:

$$x(t+\Delta t) = 2x(t) - x(t-\Delta t) + f(t)/m \Delta t^2 + O(\Delta t^4)$$
 Subtracting expansion $x(t+\Delta t)$ and $x(t-\Delta t)$ and rearrange:

$$v(t) = [x(t+\Delta t) - x(t-\Delta t)] / (2\Delta t) + O(\Delta t^3)$$

velocities lag

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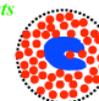
Solvent and Periodic Boundary Conditions

Vacuum



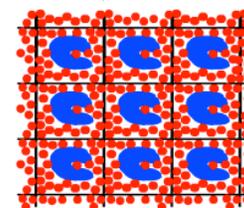
- Surface effects (surface tension)
- No dielectric screening

Droplets



- Still surface effects (at water – vacuum interface)
- Only partial dielectric screening
- Evaporation of the solvent

Periodic: system is surrounded by copies of itself



- Advantage:**
- No surface effects
- Disadvantage:**
- Artificial periodicity
 - High effective concentration

van Gunsteren Angew Chem Int Ed (2006)

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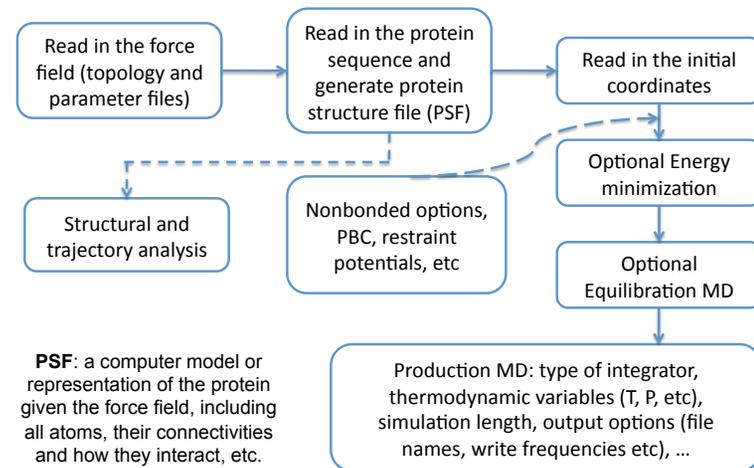
Controlling Thermodynamic Variables

- MD generate statistical ensembles that connect microscopic details to macroscopic/thermodynamic properties
- NVE (microcanonical - Entropy rules!)
- NVT (Canonical - Helmholtz free energy is relevant, A)
 - temperature $T = \sum m \langle v^2 \rangle / (3k_B)$
- NPT (Isothermal-isobaric - Gibbs free energy is relevant, G)
 - $P = \text{kinetic} + \text{virial contributions}$
- Thermostats, barostats, etc., allow one to choose appropriate ensembles
 - Following Nose', Hoover, Evans and others...
 - See Brooks, Curr. Opin. Struct. Biol., 5, 211(1995)]

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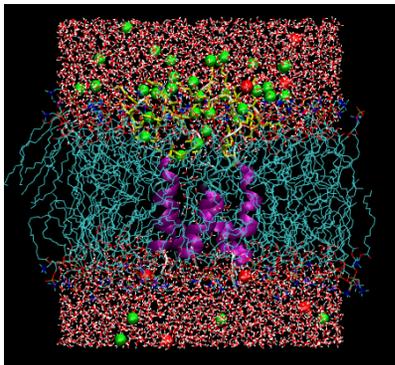
Basic Flow of a MD Simulation



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Why is MD so slow?



Channel-forming peptides in a fully solvated membrane bilayer; Channel: 1795 atoms; All: 26254 atoms

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Simulated Time

1 ns (10^{-9} s)
(500,000 MD steps)

CPU Time

~200 hours (10^6 s)

Wall Time

~1 days (10^5 s) / 8 CPUs

- very small time step required
 - $\delta t \sim \text{fs}$ (10^{-15} s)
- interactions between thousands of atoms need to be computed

Biological Time Scale

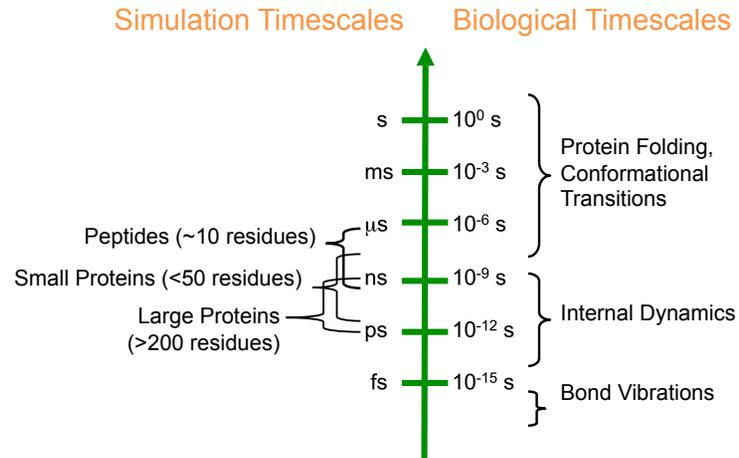
- Bond vibrations 1 fs (10^{-15} s)
- Sugar repuckering 1 ps (10^{-12} s)
- DNA bending 1 ns (10^{-9} s)
- Domain movement 1 ms (10^{-6} s)
- Base pair opening 1 ms (10^{-3} s)
- Transcription 2.5 ms / nucleotide
- Protein synthesis 6.5 ms / amino acid
- Protein folding ~ 10 s (speed limit: μs)
- RNA lifetime ~ 300 s

Simulation time should exceed the time scale of interest by ~ 10 -fold !

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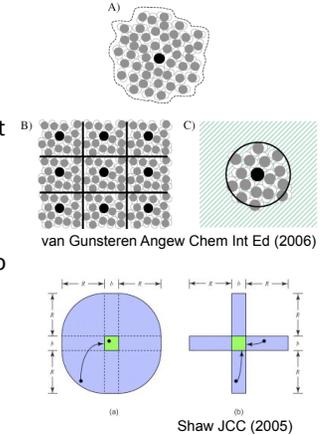
Gap in Timescales



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Practical Considerations

- Long-range forces
 - Using cut-off to reduce the number of nonbonded atom pairs ($\sim 12\text{-}15\text{\AA}$)
 - Electrostatic decays slowing ($1/r$) and cut off does not work well; Particle Mesh Eward (PME) is needed.
- Parallel execution
 - Partition various regions of the system to different CPUs
 - Need to communicate information between nodes; this is a bottleneck
- Simplifications of the model
- Enhanced sampling techniques

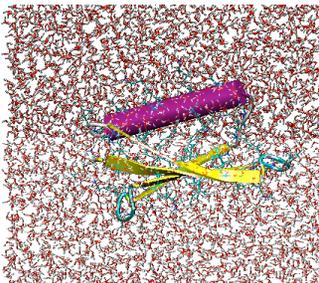


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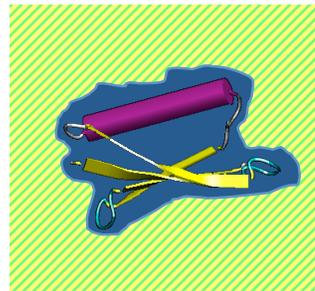
Implicit Solvent

- Solvent increases the system size about 10-fold
- It is possible to describe the mean influence of water w/o explicitly including water



Explicit solvent
Protein: 56 residues (855 atoms)
Solvent: 5411 waters (16233 atoms)

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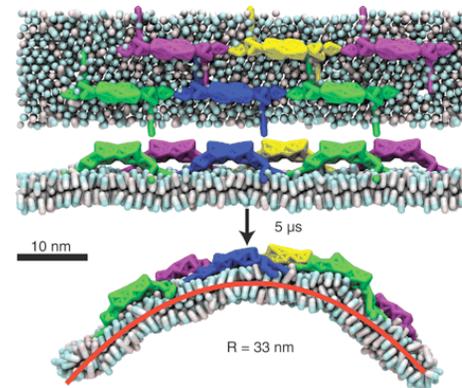


Implicit solvent
Hybrid macroscopic (solvent) /
microscopic (solute)

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Coarse-Grained Models

- Rely on reduced representation and/or simplified interaction schemes to access larger length and time scales



Klein and Shinoda, Science (2008)

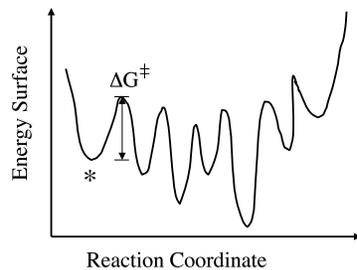
Biomembrane sculpting by protein-BAR domains

The simulation shown in the figure was carried out using a box with dimensions $100 \times 16 \times 50 \text{ nm}$ and would correspond to a system of 10 million atoms. Using a shape-based CG model reduces the size to 3265 CG beads. The simulation showed that a concerted action of BAR domains arranged in a lattice results in the development of a global membrane curvature on a time scale of several μs , with the resulting curvature radius of $\sim 30 \text{ nm}$ that was observed experimentally.

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Barriers, Temperature and Timescales



$$\tau = \tau_0 \exp(\Delta G^\ddagger/kT)$$

$$\tau_0 \sim 10^{-12} \text{ s} \sim \text{ps}$$

$$T = 300 \text{ K}$$

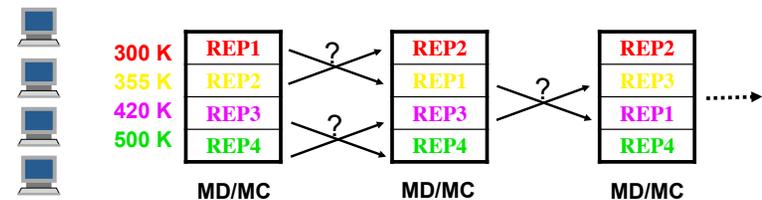
$$\Delta G^\ddagger: \begin{array}{l} 1 \text{ kcal/mol, } \tau \sim \text{ps} \\ 5 \text{ kcal/mol, } \tau \sim \text{ns} \\ 10 \text{ kcal/mol, } \tau \sim \mu\text{s} \end{array}$$

Protein energy landscape is highly complex and rugged with numerous local minima.

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Enhanced Sampling Techniques

Replica Exchange (REX)

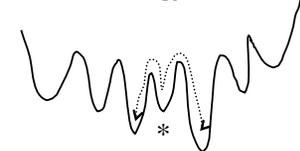


Exchange criteria

$$P_{i \leftrightarrow j} = \begin{cases} 1 & \Delta \leq 0 \\ \exp(-\Delta) & \Delta > 0 \end{cases}$$

$$\Delta = (E_i - E_j) \cdot (1/kT_j - 1/kT_i)$$

Protein Energy Surface



Sugita and Okamoto, *CPL* (1999); MMTSB Tool Set: <http://mmtsb.scripps.edu>

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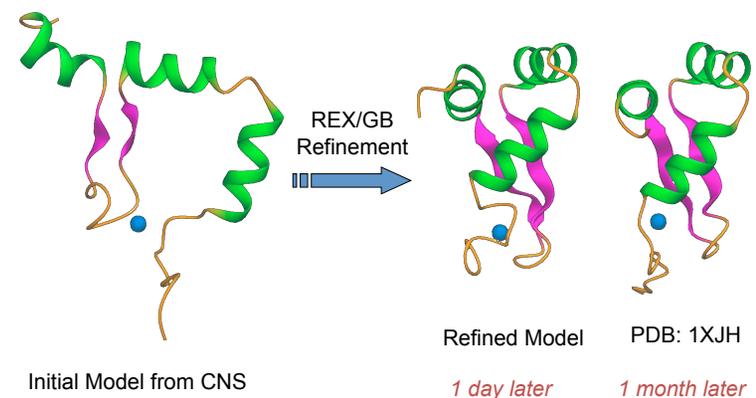
Applications of Modeling

- Main advantages
 - Offer atomistic spatial resolution and femtosecond time resolution
 - Allow probing the system in many nontrivial ways that are not possible or too dangerous experimentally
 - Often much cheaper than doing the experiment itself
 - Can be applied at very large scales (computers are cheap)
 - Can provide theoretical frameworks for experimental studies
- A few prototypical areas
 - Protein structure prediction and calculation
 - Virtual screening and rational drug design
 - Simulation of important systems: mechanisms
 - Interpretation of (static) experimental data
 - Protein misfolding and aggregation
 - Biomolecular engineering: design of new enzymes etc
 - ...

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NMR Structure Refinement



Chen et al., *JACS* (2004); Chen et al., *J. Biomol NMR* (2004).

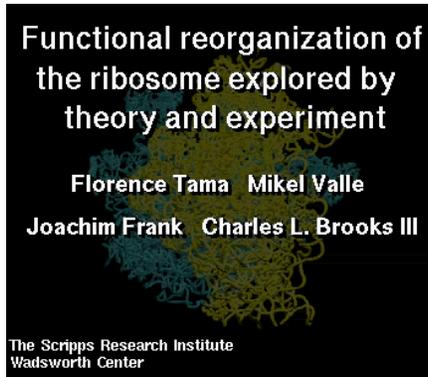
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Functional Motions of Ribosome

“This movie depicts a ratchet-like rearrangement of the 70S ribosome. The rotation of the 30S ribosomal subunit relative to the 50S subunit shows high correspondence to motion captured in cryo-EM maps of the ribosome and postulated to be a key mechanical step in the translocation of the mRNA•tRNAs complex.”

<http://brooks.chem.lsa.umich.edu/>

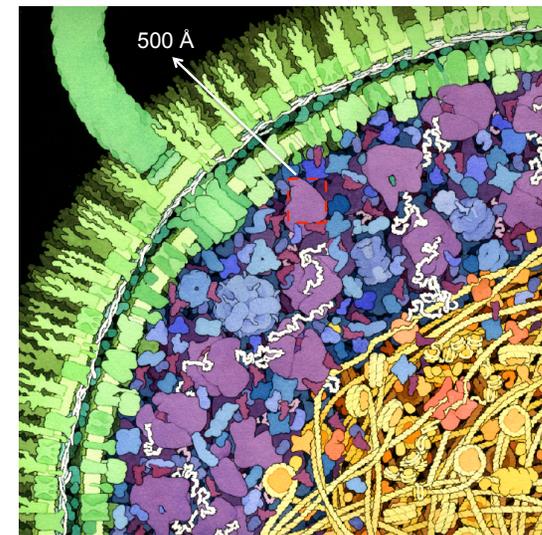


Tama et al. Proc Nat Acad Sci, **100** 9319 (2003).

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What do we need to consider?



see also, Bionanotechnology D.S. Goodsell 2004 Wiley

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