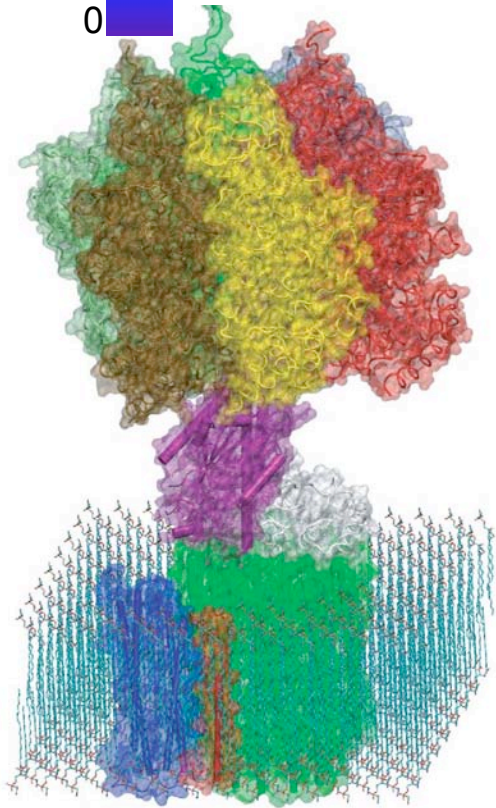
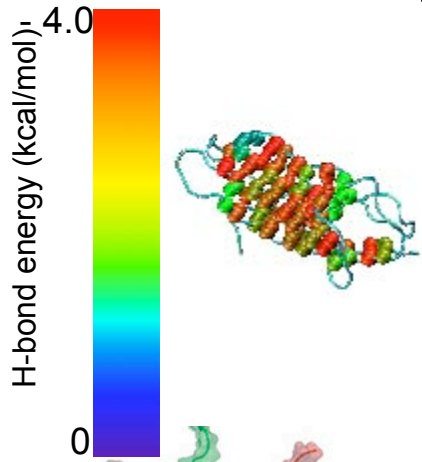
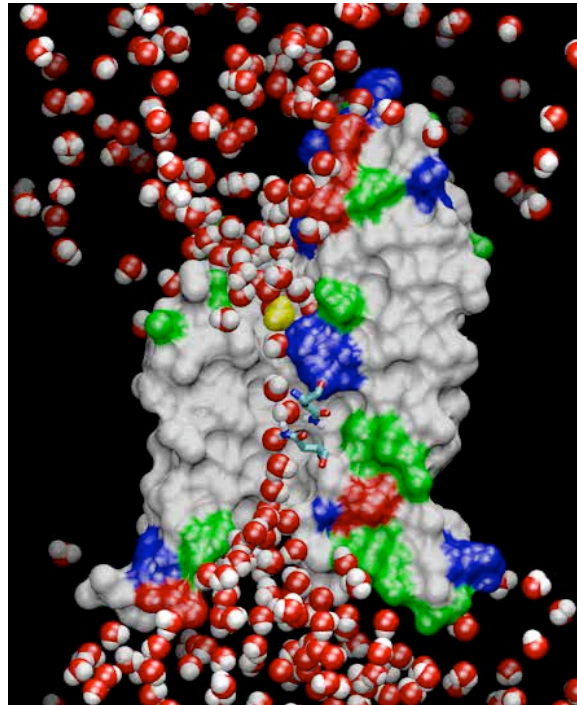


# What can be learnt from MD



ATPase, a molecular motor that synthesizes the body's weight of ATP a day



AQP filtering a bath tub of the body's water a day

Fibronectin III\_1, a mechanical protein that glues cells together in wound healing and in preventing tumor metastasis

Theoretical and Computational Biophysics Group  
University of Illinois at Urbana-Champaign



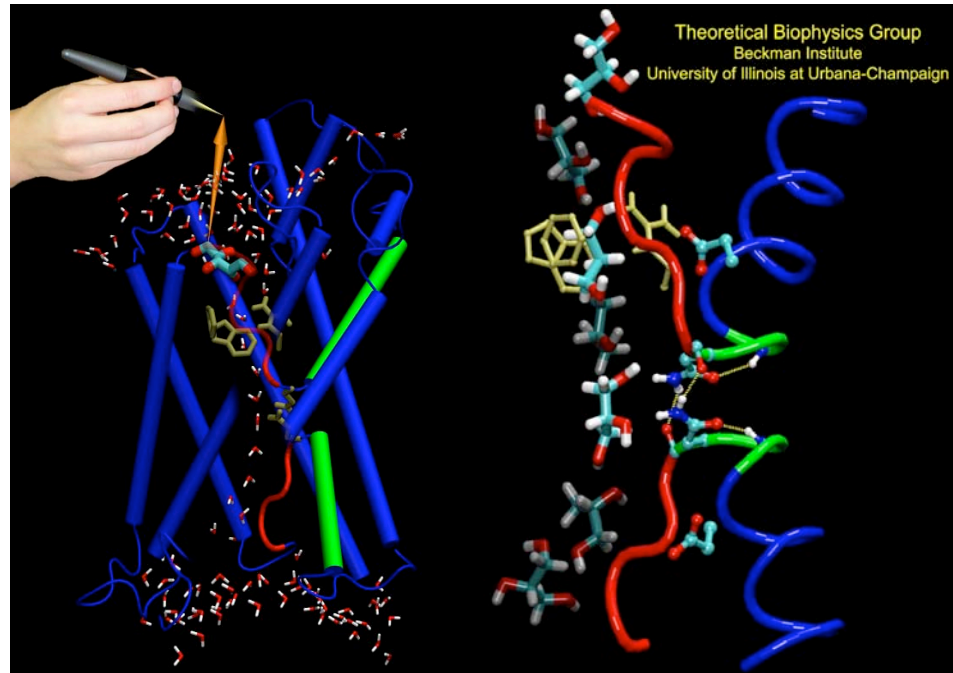
A ternary complex of DNA, lac repressor, and CAP controlling gene expression

# Putting Your Hands on a Protein with Interactive Molecular Dynamics

- **Interactive molecular dynamics** is a grid-based computational methodology that promises to revolutionize molecular biomedicine.

"If I could just get my hands on that protein!" Single molecule manipulation techniques like atomic force microscopy have brought researchers closer to this frequently expressed wish, but these techniques do not "see" the atomic level detail needed to relate mechanism to protein architectures. Only computational modeling can do this.

Aquaporins are channel proteins abundantly present in all life forms, for example, bacteria, plants, and in the kidneys, the eyes, and the brain of humans. These proteins conduct water and small molecules, but no ions, across the cell walls. Their defective forms are known to cause diseases, *e.g.*, diabetes insipidus, or cataracts. Crystallographers from the University of California at San Francisco (R. Stroud and coworkers) that discovered the structure of one type of aquaporins, aquaglyceroporins, have teamed up with the UIUC researchers to determine how these channels achieve their very high water throughput in humans as well as capture and transport key food molecules into the cells of bacteria. The team, combining 106,000 atom simulations using NAMD on NCSA and PSC machines and crystallography, explained how the proteins achieve their impressive filtering function. In a paper just accepted for publication in *Biophysics Journal*, they report the first use of **interactive molecular dynamics** to study filtering by aquaporins. Linking advanced molecular graphics with ongoing molecular dynamics simulations on NCSA's machines, and utilizing a haptic device to connect forces from a user's hand with forces in the simulation, researchers can interact with "live" proteins.



**This figure shows on the right snapshots of the passage of glycerol through the aquaporin channel and on the left a researcher pulling glycerol “by hand” through the channel with a haptic device.**

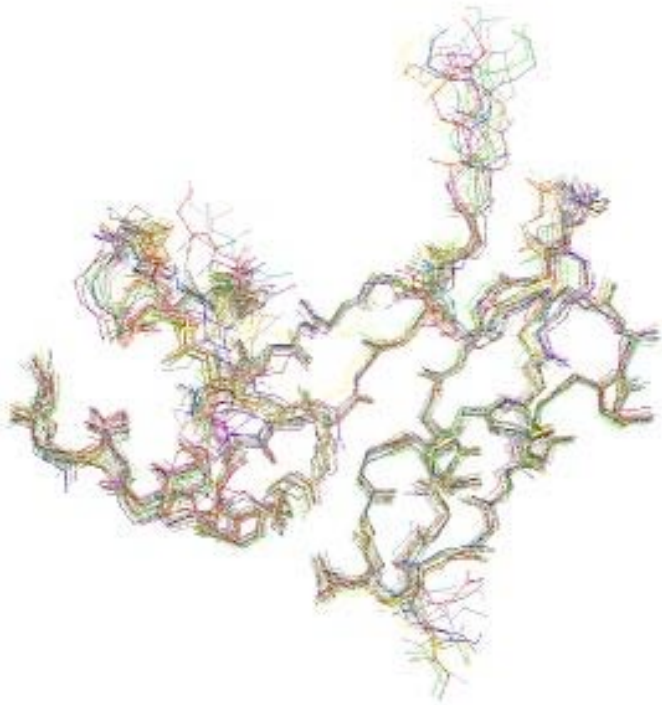
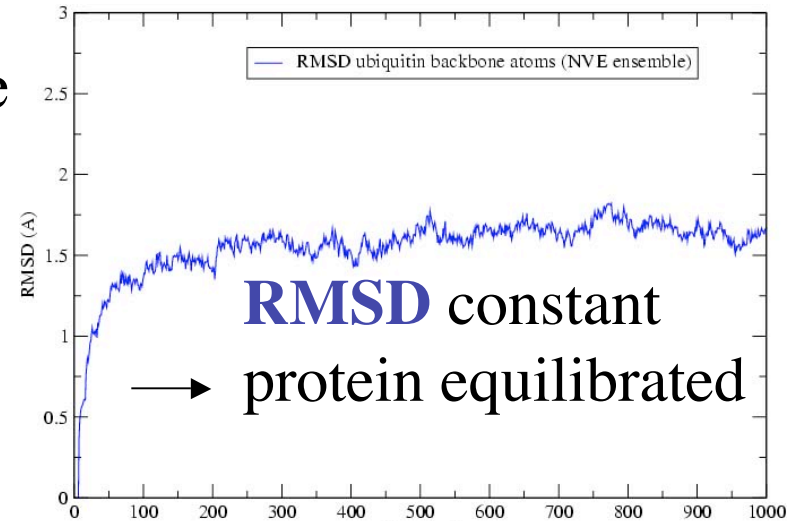
John Stone, Justin Gullingsrud, Paul Grayson, and Klaus Schulten. **A system for interactive molecular dynamics simulation.** In John F. Hughes and Carlo H. Séquin, editors, *2001 ACM Symposium on Interactive 3D Graphics*, pages 191-194, New York, 2001. ACM SIGGRAPH.

Paul Grayson, Emad Tajkhorshid, and Klaus Schulten. **Mechanisms of selectivity in channels and enzymes studied with interactive molecular dynamics.** *Biophysical Journal*, 2003. In press.

# Equilibrium Properties of Proteins

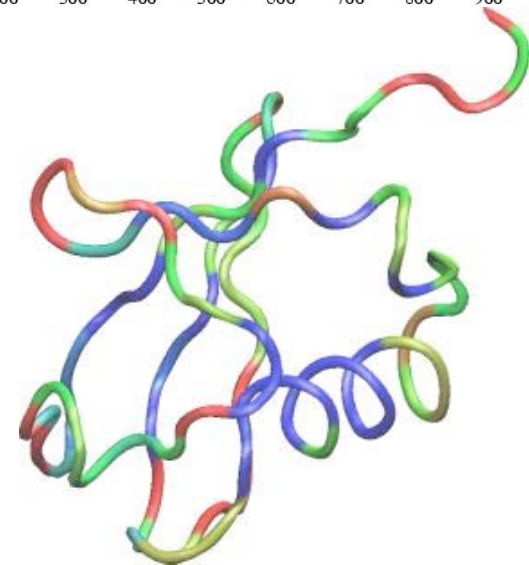
Root Mean Squared Deviation: measure for equilibration and protein flexibility

$$RMSD_{\alpha} = \sqrt{\frac{\sum_{j=1}^{N_t} \sum_{\alpha=1}^{N_{\alpha}} (\vec{r}_{\alpha}(t_j) - \langle \vec{r}_{\alpha} \rangle)^2}{N_{\alpha}}}$$



NMR structures  
aligned together to see flexibility

**Protein sequence  
exhibits  
characteristic  
permanent  
flexibility!**



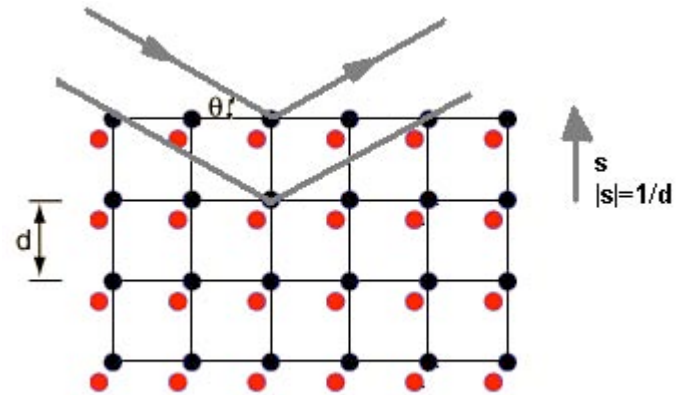
MD simulation  
The color represents mobility of the protein  
through simulation (red = more flexible)

# Temperature Factor

$$2d \sin \theta = \lambda \quad \text{Bragg's Law}$$

$$F = \sum f_j \exp(i2\pi \mathbf{r}_j \cdot \mathbf{s})$$

structure factor



More than one atom in the unit cell

$$\mathbf{r}_j = \mathbf{x}_j + \mathbf{u}_j \quad (\mathbf{x}_j: \text{equilibrium position, } \mathbf{u}_j: \text{vibrations } T > 0)$$

$$[F]_T = \langle \sum f_j \exp(2\pi i \mathbf{s} \cdot (\mathbf{u}_j + \mathbf{x}_j)) \rangle$$

averaged over time and unit cells

$$I \sim \{ [F]_T \}^2$$



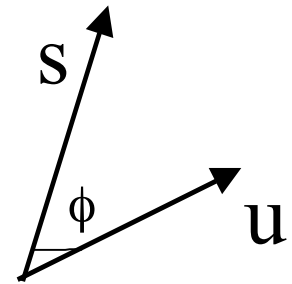
# The Atomic B Values in Protein Crystallography

$$\langle \exp (2\pi i \mathbf{s} \cdot \mathbf{u}_j) \rangle \approx 1 + 2\pi i \mathbf{s} \cdot \langle \mathbf{u}_j \rangle - 2\pi^2 \langle (\mathbf{s} \cdot \mathbf{u}_j)^2 \rangle + \dots$$

For small vibrations and symmetric potentials (like harmonic oscillator)  $\langle \mathbf{u} \rangle = 0$

$$[F]_T = \sum f_j \exp (i2\pi \mathbf{x}_j \cdot \mathbf{s}) \exp (-2\pi^2 \langle (\mathbf{u}_j \cdot \mathbf{s})^2 \rangle)$$

$$\langle (\mathbf{u}_j \cdot \mathbf{s})^2 \rangle = \mathbf{s}^2 \langle \mathbf{u}_{j\perp}^2 \rangle = (2 \sin \theta / \lambda)^2 \langle \mathbf{u}_{j\perp}^2 \rangle$$



$$[F]_T = \sum f_j \exp (i2\pi \mathbf{x}_j \cdot \mathbf{s}) \exp (-B_j^2 \sin^2 \theta / \lambda^2)$$

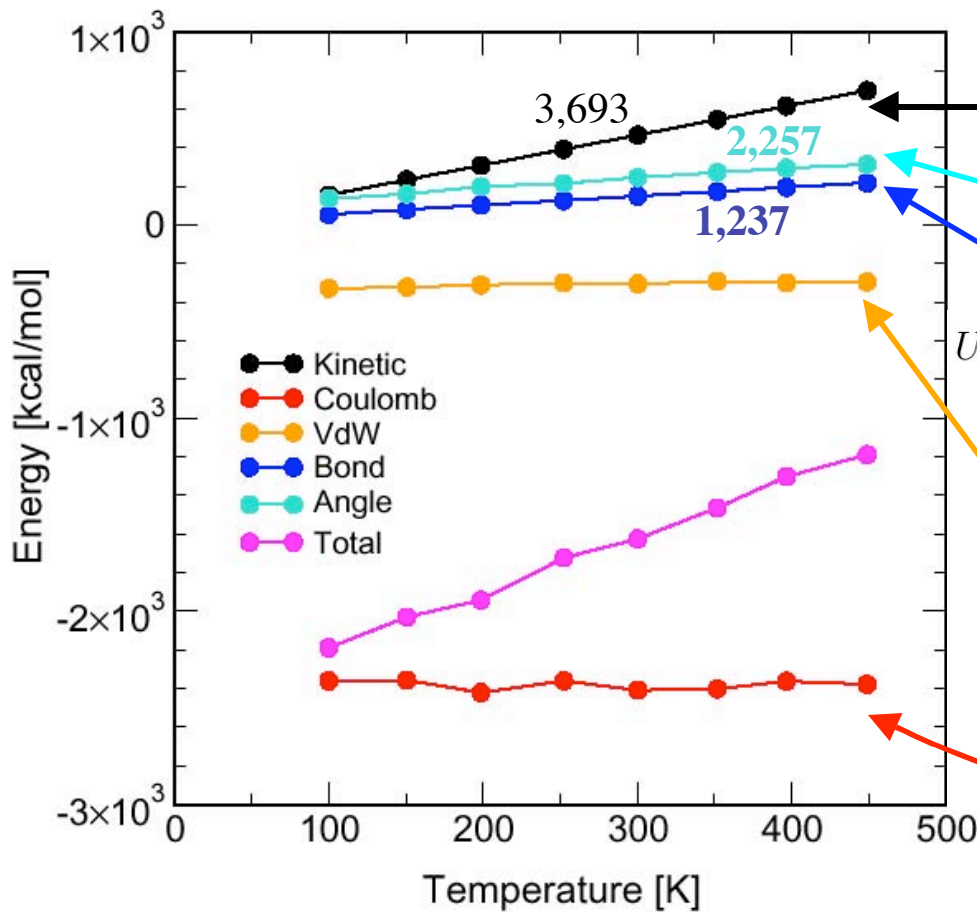
$$B_j = -8 \pi^2 \langle \mathbf{u}_j^2 \cos^2 \phi \rangle \quad \text{Temperature Factor}$$

Isotropic harmonic potential  $m, \omega$ :

$$B_j = -8/3 \pi^2 \langle \mathbf{u}^2 \rangle = -16/3 \pi^2 k_B T / m \omega^2$$

# Equilibrium Properties of Proteins

## Energies: kinetic and potential



$$\left\langle \sum_j \frac{1}{2} m_j v_j^2 \right\rangle = \frac{3}{2} N k_B T$$

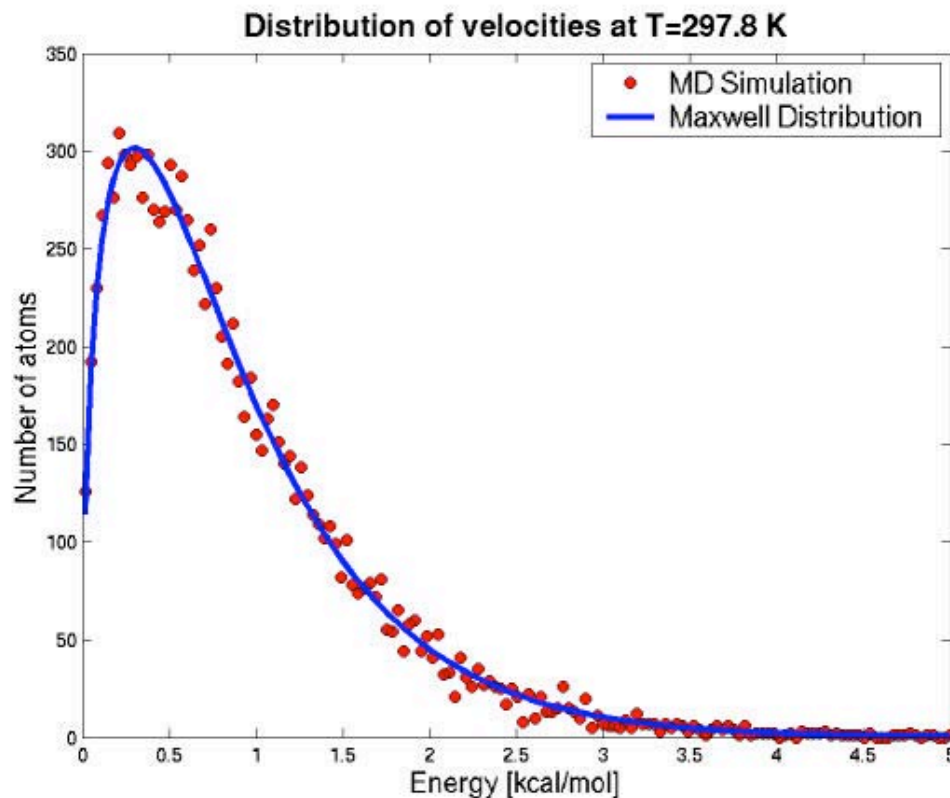
Kinetic energy (quadratic)

$$U(\vec{R}) = \underbrace{\sum_{\text{bonds}} k_i^{\text{bond}} (r_i - r_0)^2}_{U_{\text{bond}}} + \underbrace{\sum_{\text{angles}} k_i^{\text{angle}} (\theta_i - \theta_0)^2}_{U_{\text{angle}}} + \underbrace{\sum_{\text{dihedrals}} k_i^{\text{dihe}} [1 + \cos(n_i \phi_i + \delta_i)]}_{U_{\text{dihedral}}} + \underbrace{\sum_i \sum_{j \neq i} 4\epsilon_{ij} \left[ \left( \frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left( \frac{\sigma_{ij}}{r_{ij}} \right)^6 \right] + \sum_i \sum_{j \neq i} \frac{q_i q_j}{\epsilon r_{ij}}}_{U_{\text{nonbond}}}$$

Potential energy (not all quadratic)

# Maxwell-Boltzmann distribution

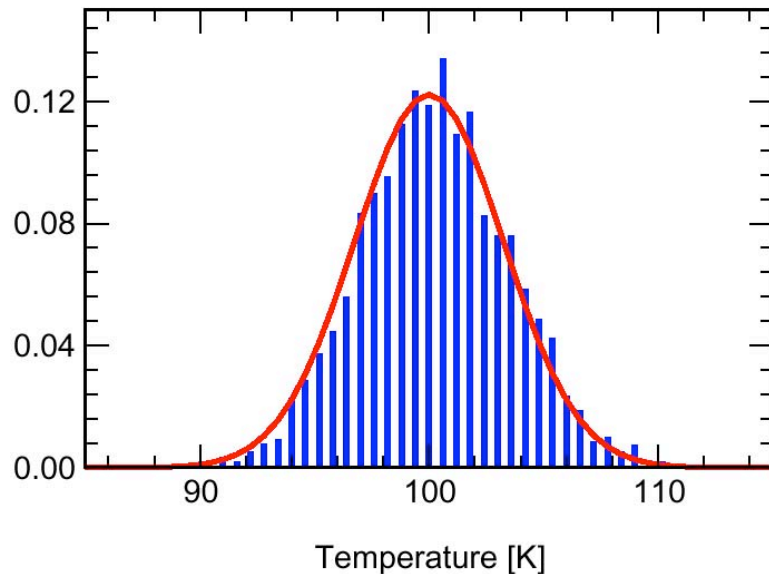
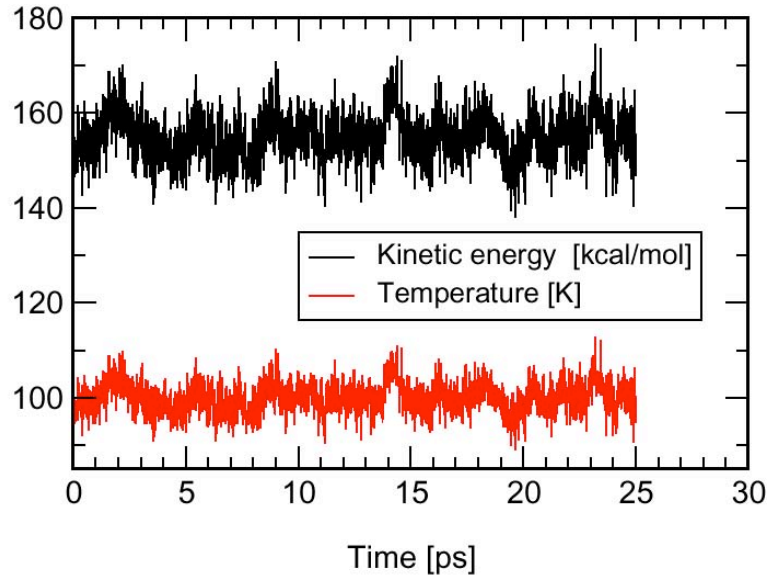
An NVT (temperature held constant) ensemble simulation at T=300K was terminated and continued as an NVE (energy constant) ensemble simulation. After an equilibration phase, the distribution of velocities from all atoms was determined (red) and fitted to the Maxwell velocity distribution (blue); the best fit corresponded to a temperature T=297.8 K.



Maxwell distribution for kinetic energies

$$f(\epsilon_k) = \frac{2}{\sqrt{\pi}} \frac{1}{(k_B T)^{\frac{3}{2}}} \sqrt{\epsilon_k} \exp\left(-\frac{\epsilon_k}{k_B T}\right)$$

# Analysis of $E_{\text{kin}}$ , $T$ (free dynamics)



## Definition of Temperature

$$\left\langle \sum_j \frac{1}{2} m_j v_j^2 \right\rangle = \frac{3}{2} N k_B T$$

$$T = \frac{2}{3N k_B} \left\langle \sum_j \frac{1}{2} m_j v_j^2 \right\rangle$$

**The atomic velocities of a protein establish a thermometer, but is it accurate?**



# Temperatur Fluctuations

Maxwell distribution

$$dP(v_n) = c \exp(-m v_n^2/2k_B T) dv_n \quad (7)$$

Individual kinetic energy  $\epsilon_n = m v_n^2/2$

$$dP(\epsilon_n) = (\pi T_0 \epsilon_n)^{-1/2} \exp(-\epsilon_n/k_B T_0) d\epsilon_n \quad (8)$$

One can derive

$$\langle \epsilon_n \rangle = T_0/2 \quad (9)$$

$$\langle \epsilon_n^2 \rangle = 3 T_0^2/4 \quad (10)$$

$$\langle \epsilon_n^2 \rangle - \langle \epsilon_n \rangle^2 = T_0^2/2 \quad (11)$$

The distribution of the total kinetic energy  $E_{kin} = \sum_j \frac{1}{2} m_j v_j^2$ , according to the central limit theorem, is approximately Gaussian

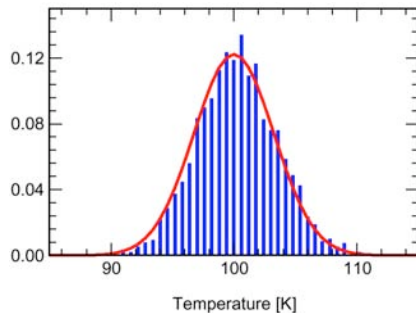
$$P(E_{kin}) = c \exp\left(\frac{-(E_{kin} - \langle E_{kin} \rangle)^2}{2 \left(\frac{3Nk_B^2 T_0^2}{2}\right)}\right) \quad (12)$$

The distribution function for the temperature ( $T = 2E_{kin}/3k_B$ ) fluctuations  $\Delta T = T - T_0$  is then

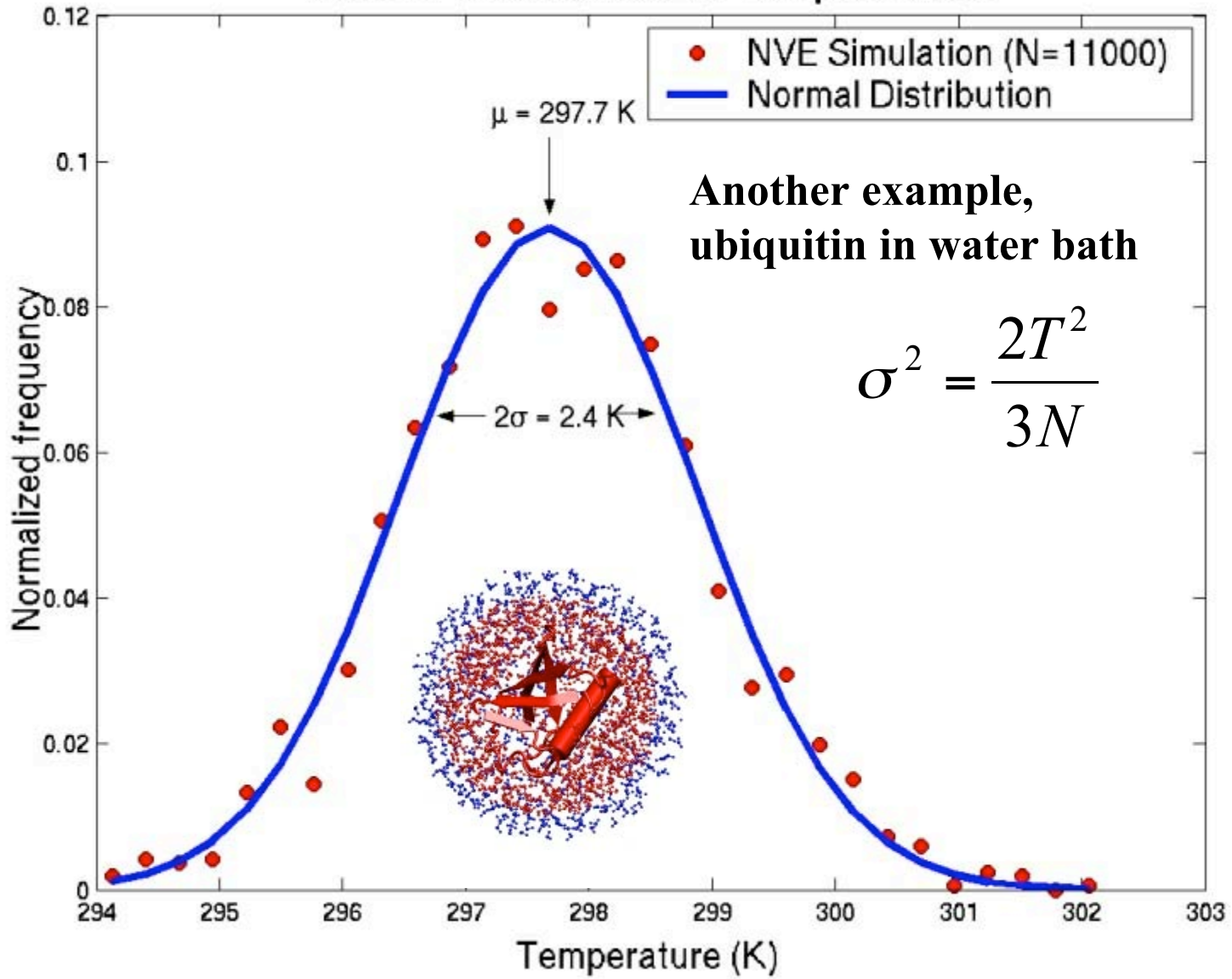
$$P(\Delta T) = c \exp[-(\Delta T)^2/2\sigma^2], \quad \sigma^2 = 2T^2/3N \quad (13)$$

For  $T_0 = 100\text{K}$  and  $N = 557$ , this gives  $\sigma = 3.6$ .

**The atomic velocity thermometer is inaccurate due to the finite size of a protein!**



## Normal Distribution of Temperatures

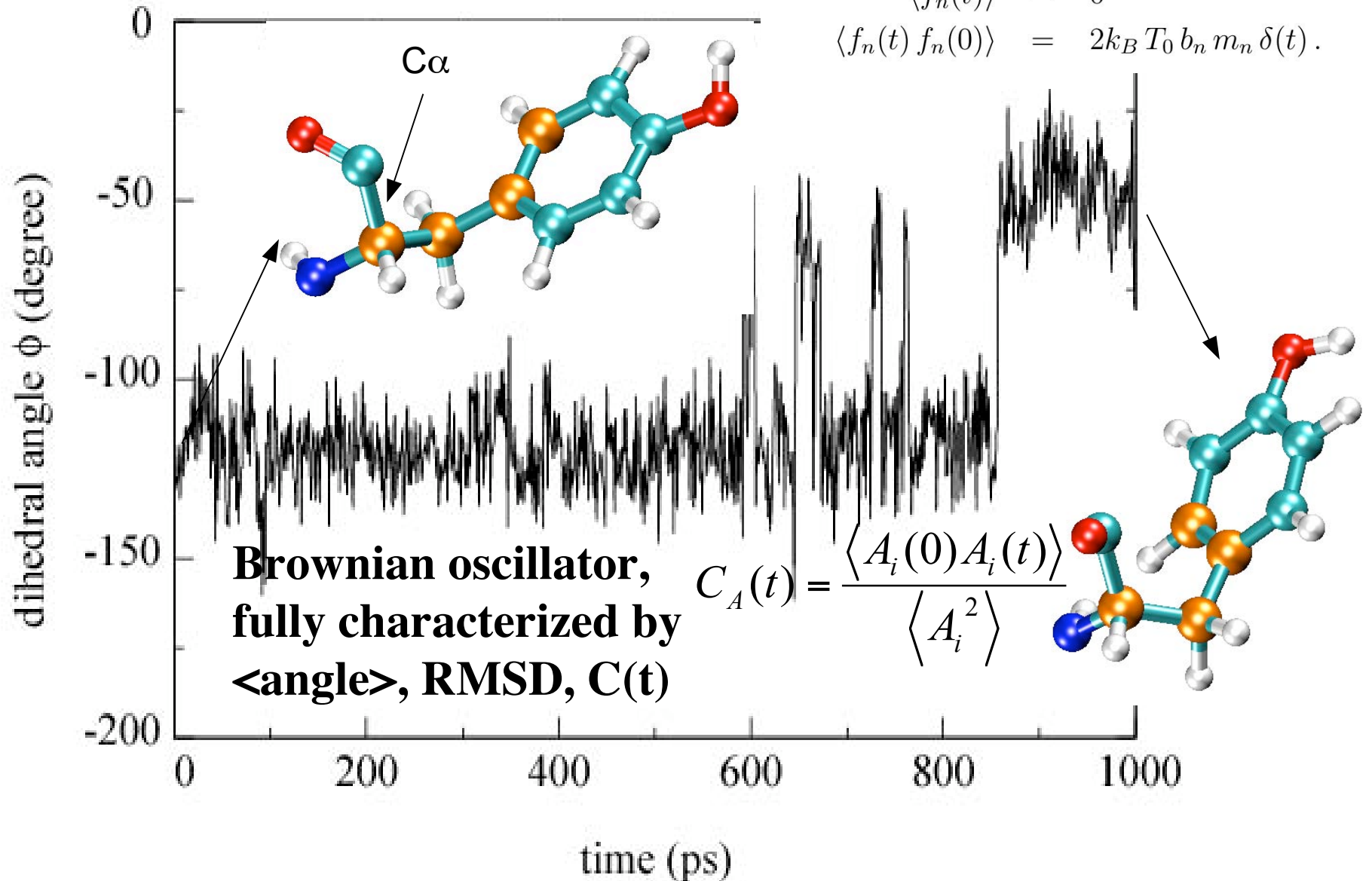


**Show BPTI trajectory**

# Dihedral Angle

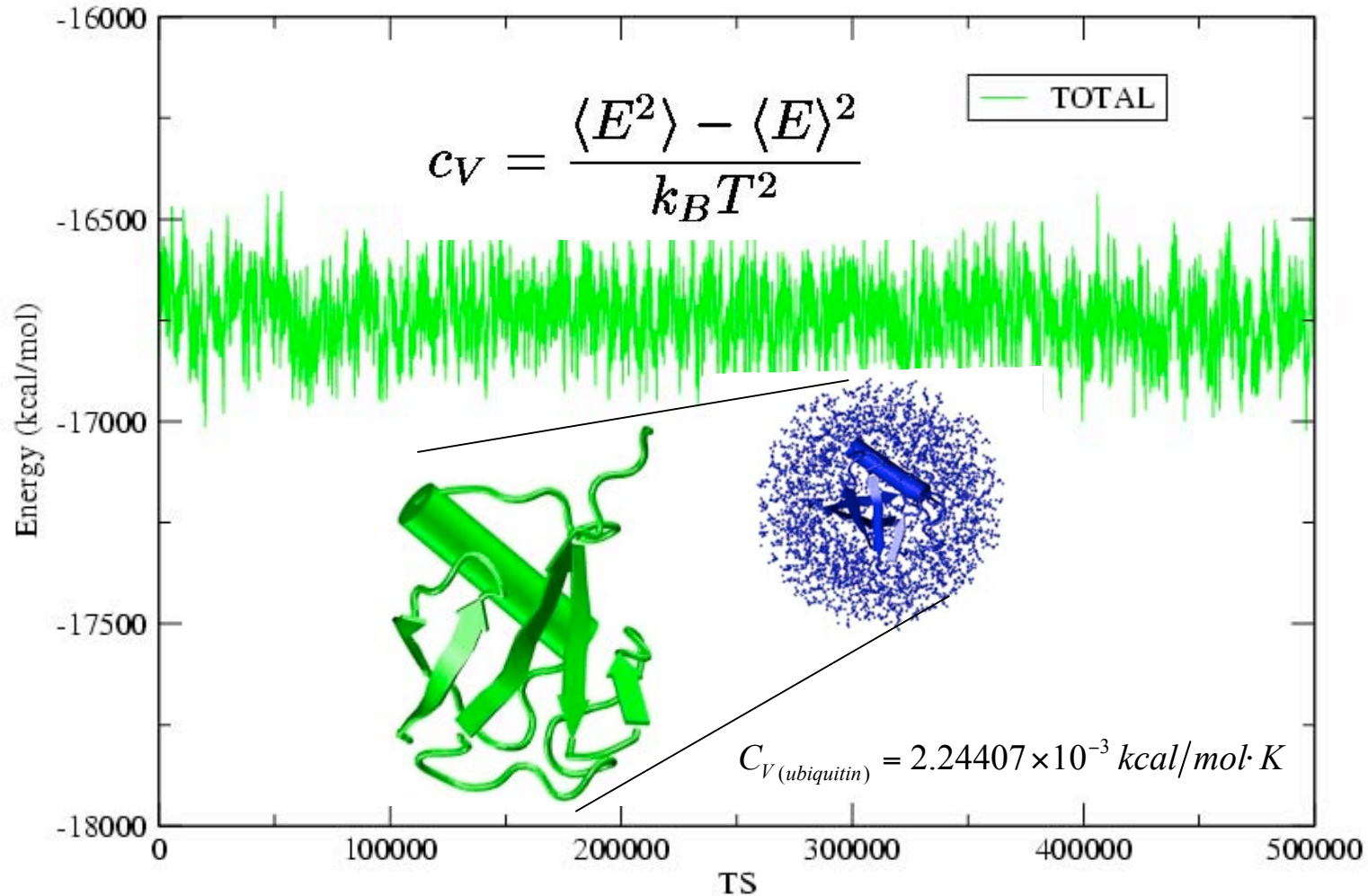
$$m_n \frac{d^2 x_n}{dt^2}(t) = \nabla_{x_n} V - m_n b_n \frac{dx_n}{dt}(t) + f_n(t)$$

Langevin dynamics in strong friction limit



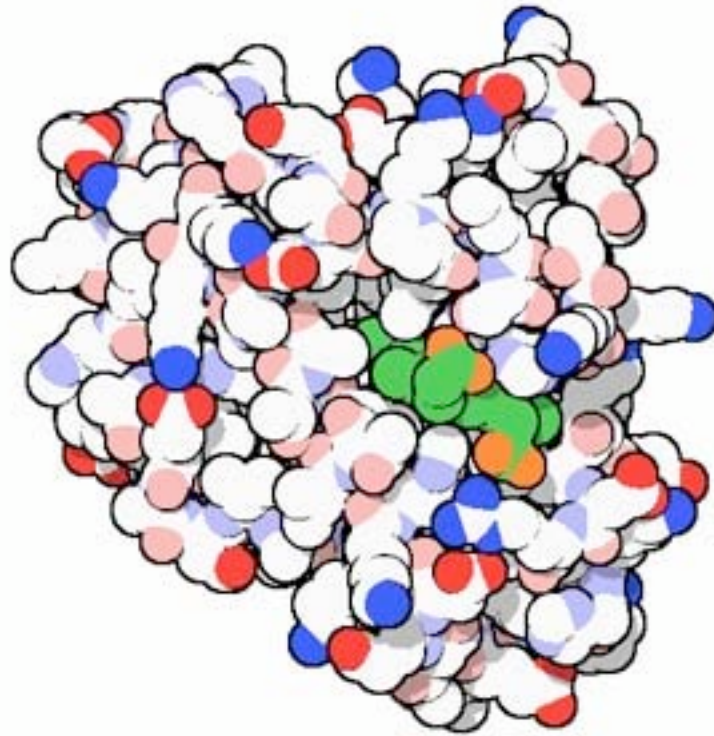
# Specific Heat of a Protein

Total energy of ubiquitin (NVE ensemble)





# Myoglobin

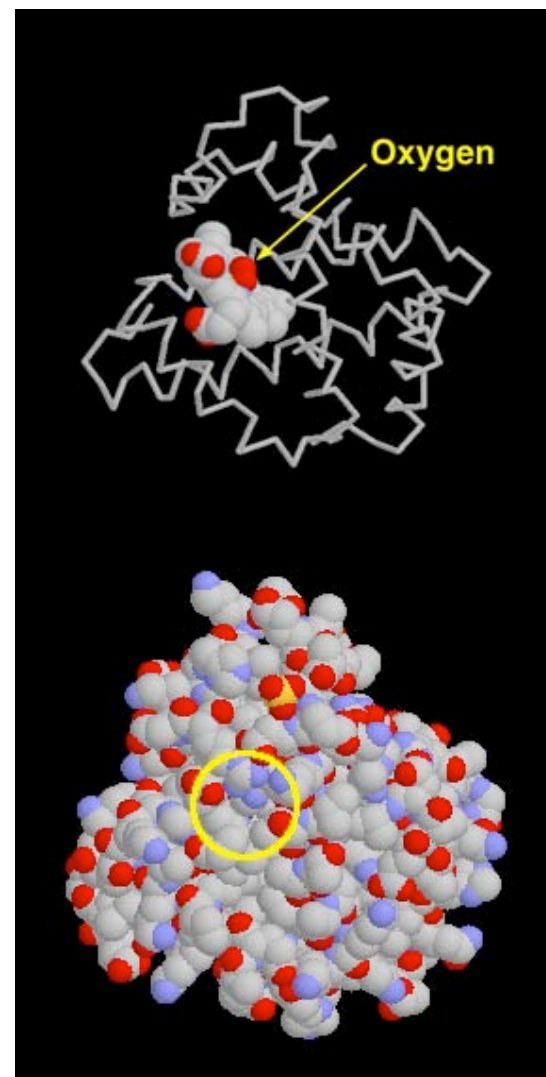


Myoglobin is a small, bright red protein. It is very common in muscle cells, and gives meat much of its red color. Its job is to store oxygen, for use when muscles are hard at work. If you look at John Kendrew's PDB file, you will notice that the myoglobin that he used was taken from sperm whale muscles. As you can imagine, marine whales and dolphins have a great need for myoglobin, so that they can store extra oxygen for use in their deep dives undersea.

[PDB Molecule of the Month: Myoglobin](#)

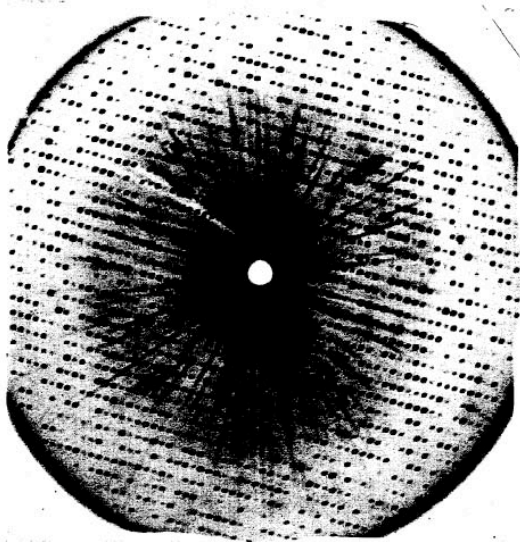
## Oxygen Bound to Myoglobin

This structure of myoglobin, with the accession code [1mbo](#), shows the location of oxygen. The iron atom at the center of the heme group holds the oxygen molecule tightly. Compare the two pictures. The first shows only a set of thin tubes to represent the protein chain, and the oxygen is easily seen. But when all of the atoms in the protein are shown in the second picture, the oxygen disappears, buried inside the protein. So how does the oxygen get in and out, if it is totally surrounded by protein? In reality, myoglobin (and all other proteins) are constantly in motion, performing small flexing and breathing motions. Temporary openings constantly appear and disappear, allowing oxygen in and out. The structure in the PDB is merely one snapshot of the protein, caught when it is in a tightly-closed form. Looking at the static structure held in the PDB, we must imagine the dynamic structure that actually exists in nature. The two pictures above were created with RASMOL. You can create similar pictures by accessing the PDB file [1mbo](#), and then clicking on "View Structure." Try switching between the two types of pictures shown above, to prove to yourself that the oxygen is buried in this structure!



[PDB Molecule of the Month: Myoglobin](#)

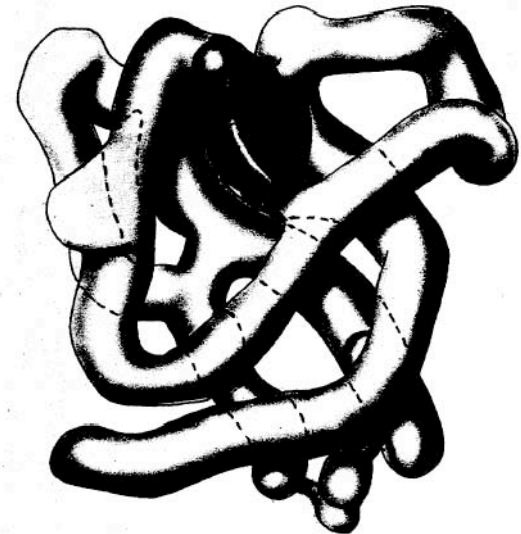
# Myoglobin, the first protein with known structure



Diffraction pattern observed



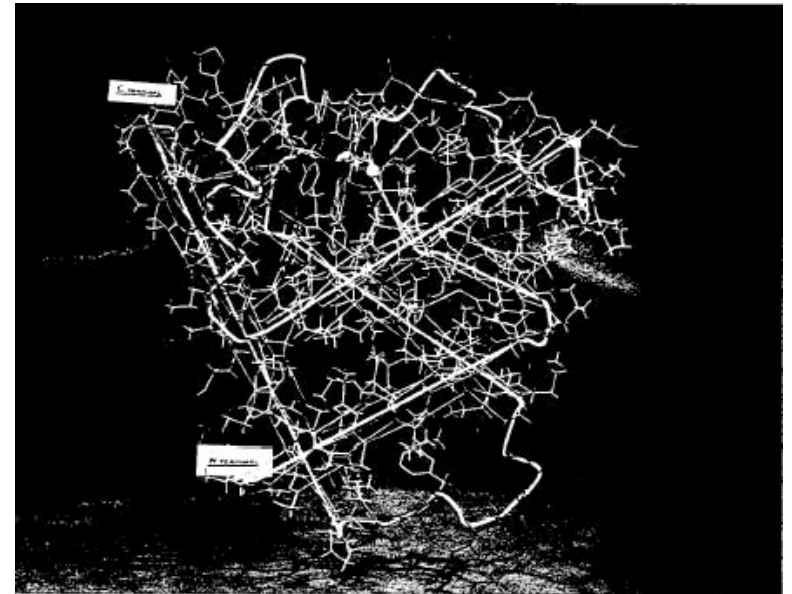
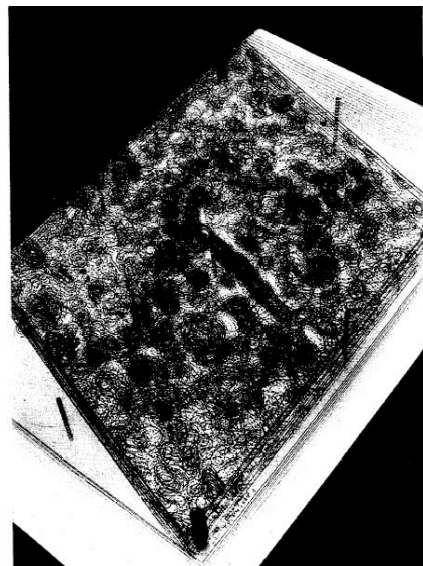
John Cowdery Kendrew  
Nobel Prize in Chemistry  
Jointly with Max Perutz



Structure model at 6 Å resolution

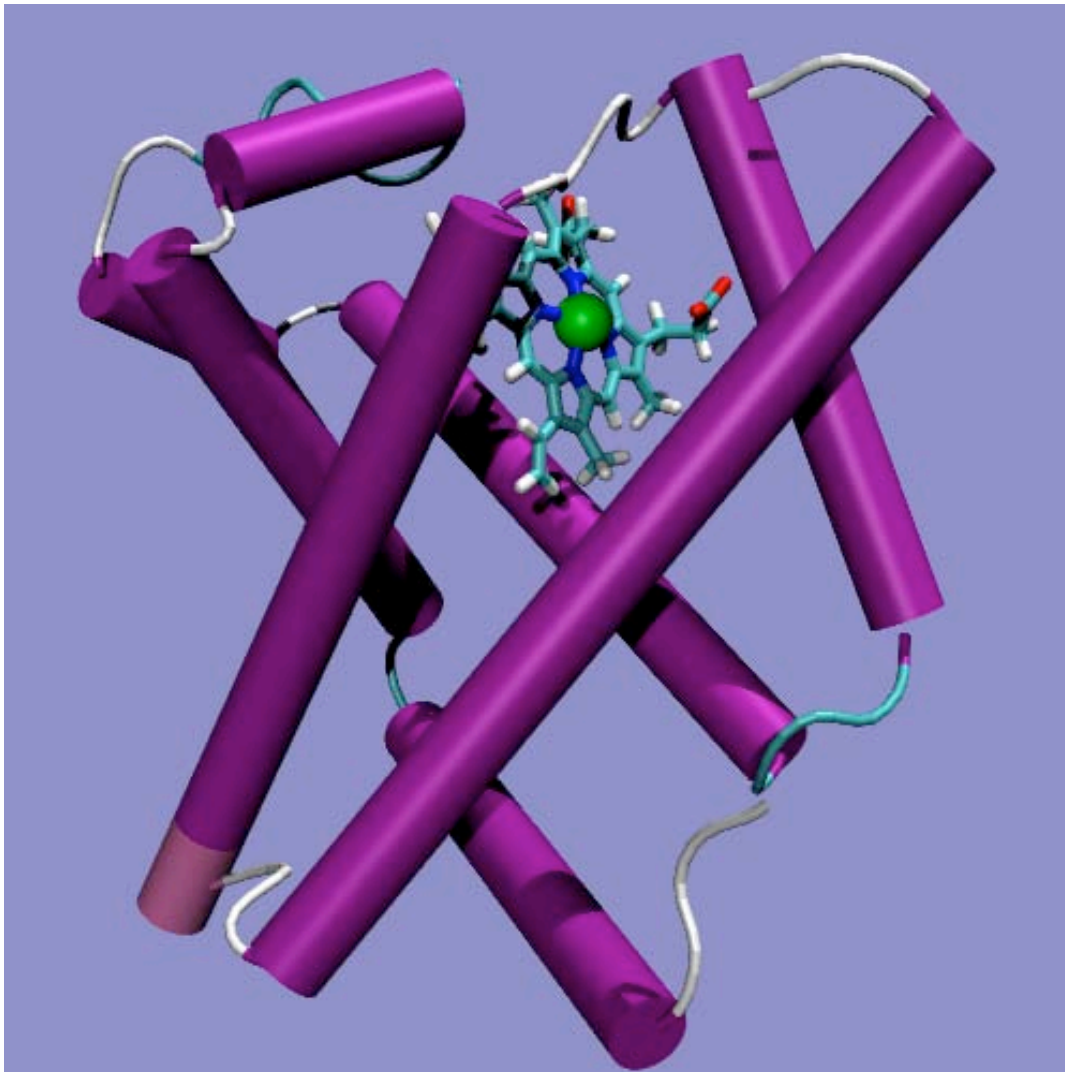
Higher resolution  
Model:

- 1) Construct electron density map
- 2) Build model





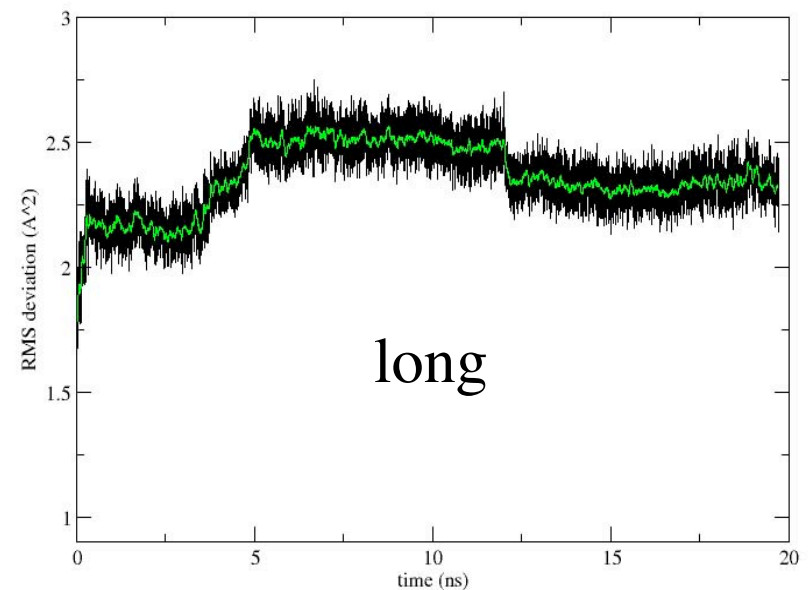
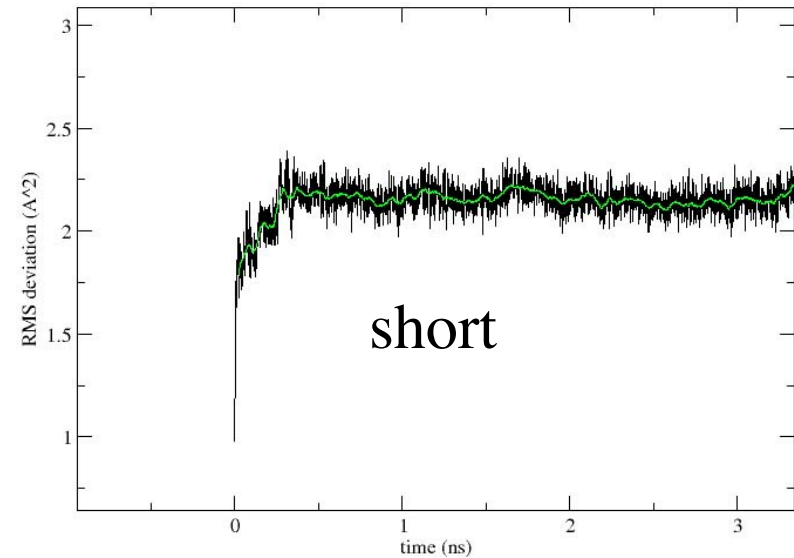
# Myoglobin with heme group



- Myoglobin from PDB structure 1A6M
- X-ray crystal structure at 1.00 Å resolution.
- Steps seen in RMSD are due primarily to tilting of the helix to the upper right of the heme in the picture...

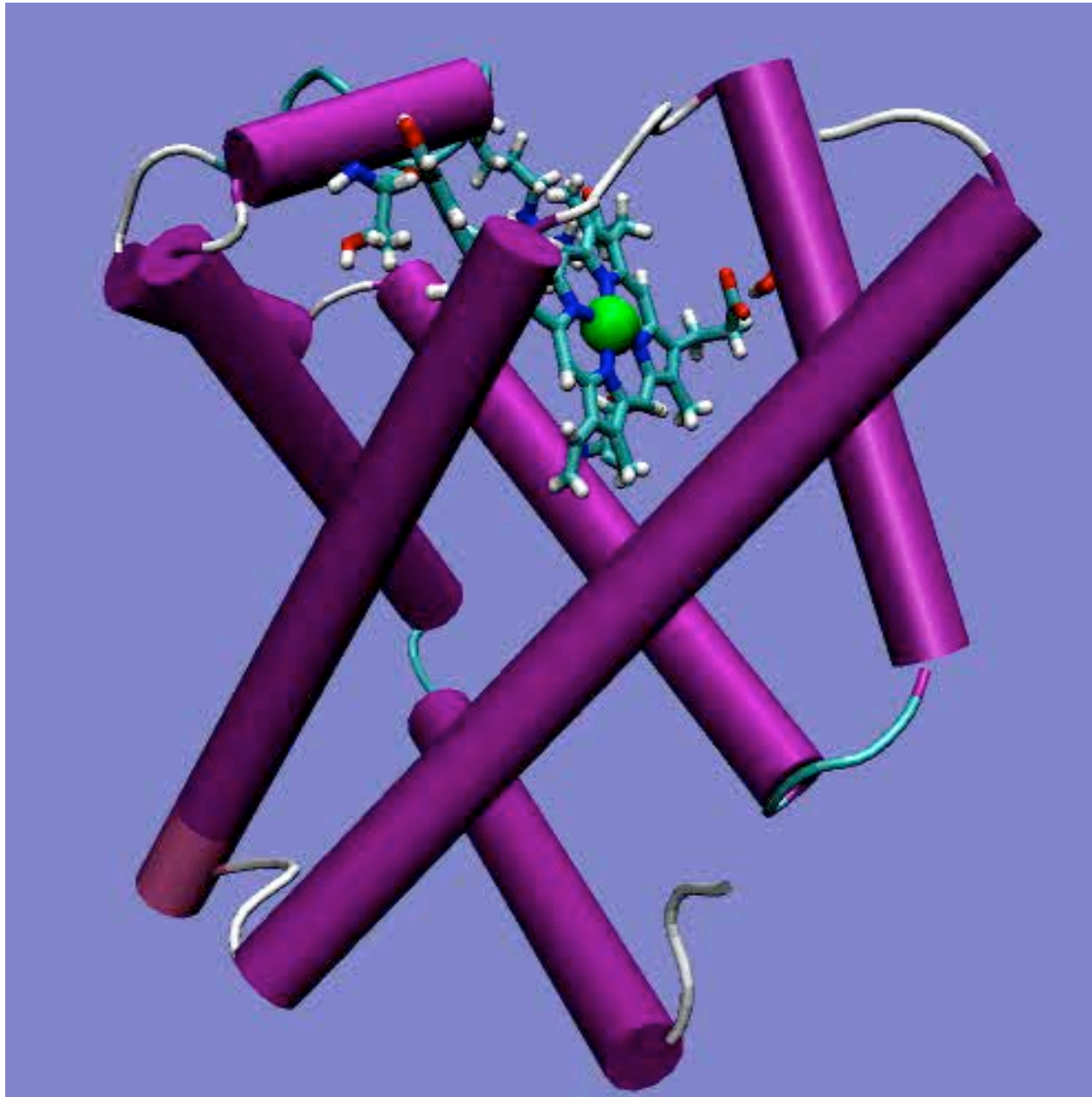
# Setup and Equilibration

- Remove oxygen liganded to the Fe
- Minimize 1000 steps, fixing the Ca atoms.
- Heat for 5 ps with Langevin dynamics at 300 K, fixed Ca atoms.
- Simulate in NVT ensemble for 19 ns, saving coordinates every ps.



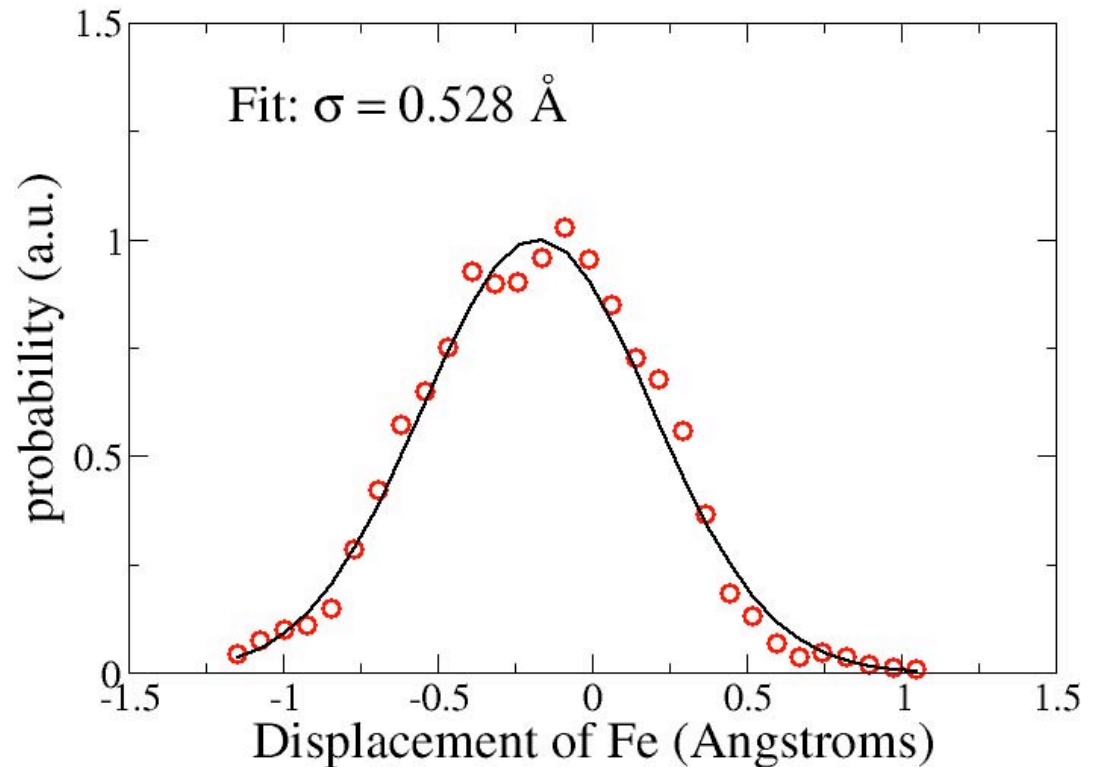


# Myoglobin Dynamics to Probe Motion of Fe



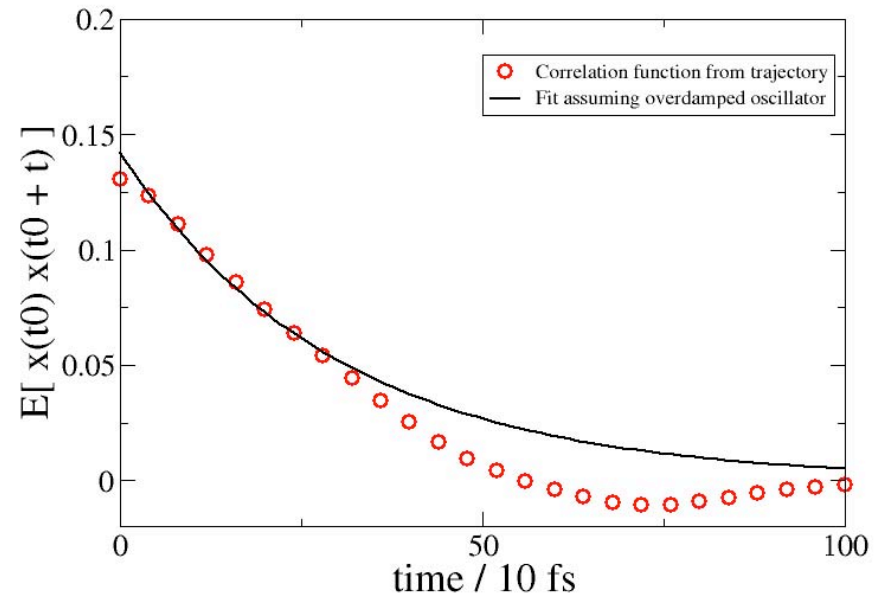
# Obtain “f” from position distribution

- Best fit “by eye” is  $\sigma=0.528 \text{ \AA}$ .
- However: standard deviation gives  $\sigma=0.36$  ( $f=kT/\sigma^2 = 319 \text{ pN/\AA}$ ); this is what we use below.



# Obtain diffusion coefficient from position autocorrelation function

- Once we have the restoring force, the diffusion coefficient can be obtained from the position autocorrelation function:



$$\begin{aligned}
 h(t - t_0) &= \int_{-\infty}^{\infty} dx \int_{-\infty}^{\infty} dx_0 x x_0 p(x, t | x_0, t_0) p_0(x_0) \\
 &= (kT/2f) e^{-(Df/kT)(t-t_0)}
 \end{aligned}$$

$$D f/kT = .0321$$

$$D = 0.0042 \text{ \AA}^2/10 \text{ fs}$$

$$= 0.42 \text{ \AA}^2/\text{ps}.$$

$$\text{Compare: water} = 0.24 \text{ \AA}^2/\text{ps}$$

# Position autocorrelation: underdamped case

The Langevin equation governing underdamped motion is

$$\ddot{x} + b\dot{x} + \omega^2 x = \eta(t)$$

The position correlation function is given by

$$\langle x(0)^2 \rangle e^{-bt/2} \left[ \cos(\Omega t) + \frac{b}{2\Omega} \sin(\Omega t) \right]$$

Using

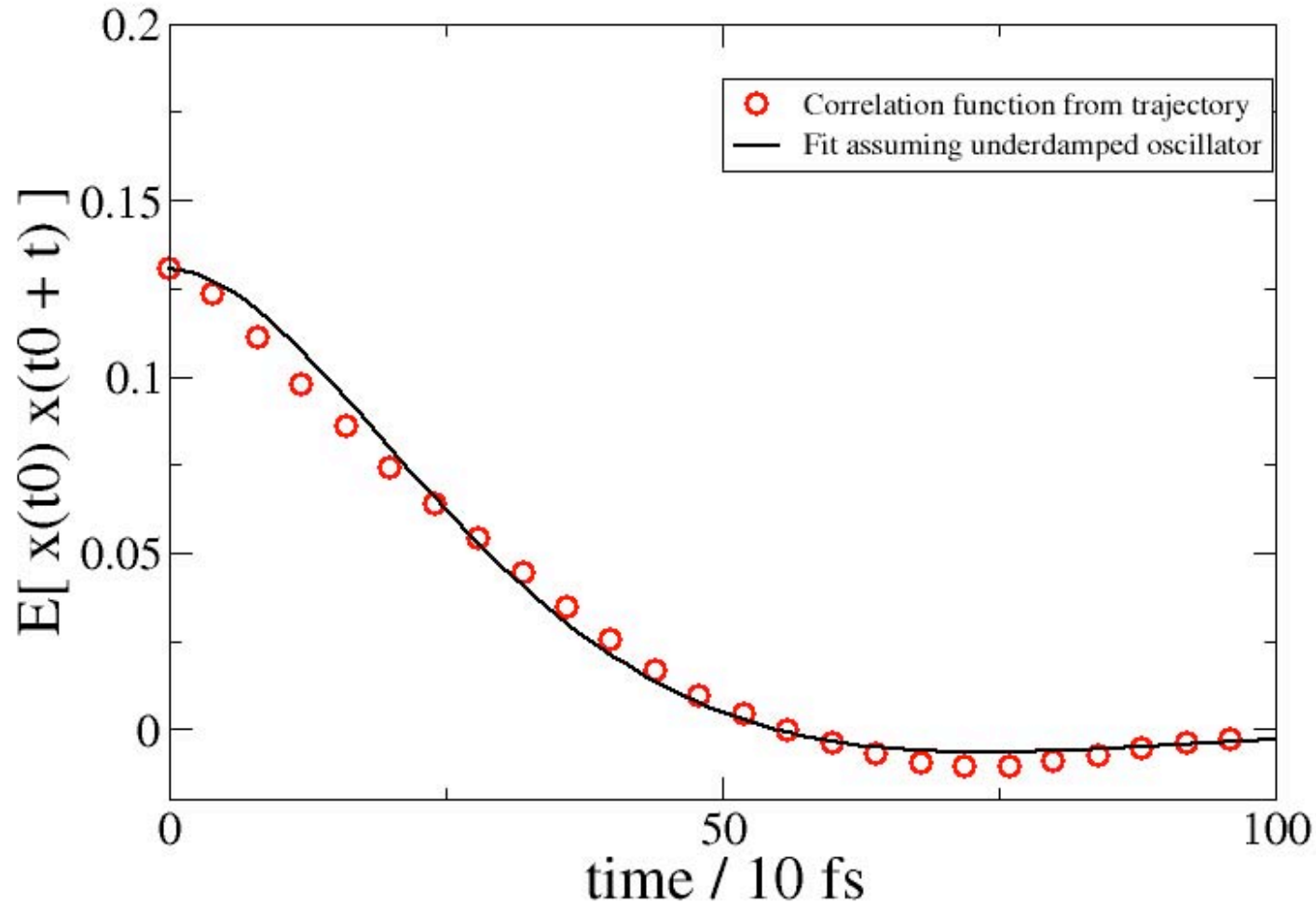
$$m = f/\omega^2 \quad (\text{from } F = ma)$$

$$\gamma = mb$$

$$D = k_B T / \gamma = \frac{k_B T \omega^2}{f b}$$

we can solve for D.

# Diffusion coefficient from underdamped oscillator



Fitting parameters:  $\Omega=0.0426$ ;  $b=0.0811$ ;  $\omega^2=$   
 $\Omega^2+b^2/4 = 34.59/\text{ps}^2$ .  $D = 0.556 \text{ \AA}^2/\text{ps}$ .



# Mossbauer line shape function

The lineshape  $I(\omega)$  we are trying to calculate is given by

$$I(\omega) = \frac{\sigma_0 \Gamma}{4} \int_{-\infty}^{\infty} dt e^{-i\omega t - \frac{1}{2}\Gamma|t|} G(\mathbf{k}, t) \quad (1)$$

where  $G(\mathbf{k}, t)$  is given by

$$G(\mathbf{k}, t) = \int d\mathbf{r} \int d\mathbf{r}_o e^{i\mathbf{k} \cdot (\mathbf{r} - \mathbf{r}_o)} p(\mathbf{r}, t | \mathbf{r}_o, 0) p_0(\mathbf{r}_o) \quad (2)$$

Notice that  $G(\mathbf{k}, t)$  is just the autocorrelation function of  $\exp(-i\mathbf{k} \cdot \mathbf{r})$ .

# Moessbauer Line Shape Function - Sampled and Matched to Analytical Formula

$I(\omega)$  using D and f from position correlation

Positions sampled every 10 fs for 100 ps

