



**The Abdus Salam  
International Centre for Theoretical Physics**



**2145-8**

**Spring College on Computational Nanoscience**

*17 - 28 May 2010*

**Coloring the Noise or Cheating One's Way to Quantum Effects**

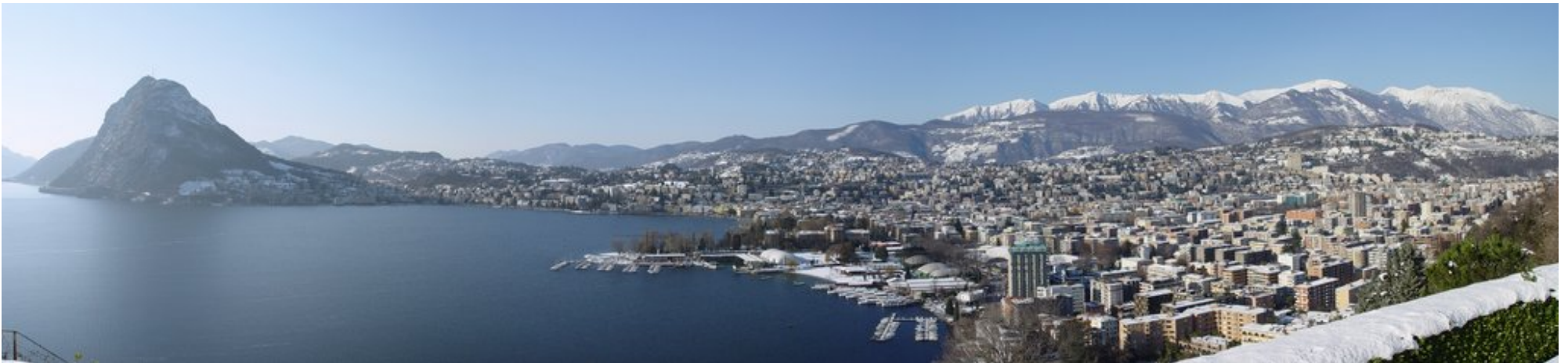
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# Coloring the noise

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USI Campus, Lugano, Switzerland





# Newtonian dynamics and statistical mechanics

From Newtons equations

$$\dot{R} = \frac{P}{M} \qquad \dot{P} = F$$

Under the hypothesis of ergodicity

$$\langle O(P_I, R_I) \rangle = \lim_{\tau \rightarrow \infty} \frac{1}{\tau} \int_0^\tau dt O(P_I(t), R_I(t)) = \int dP_I dR_I O(P_I, R_I) P(P_I, R_I)$$

$$P(P_I, R_I) \propto \delta(H(P_I, R_I) - E)$$

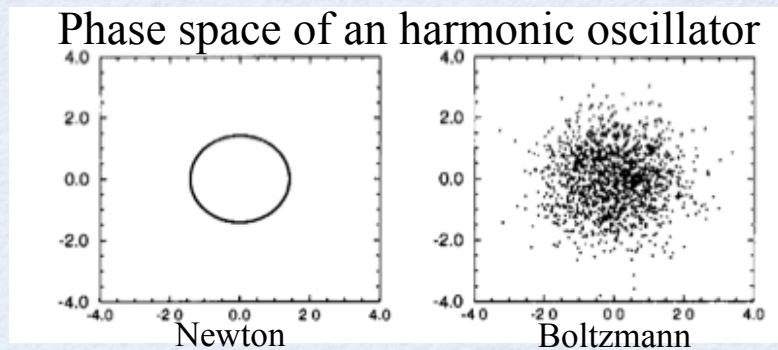
$$\langle K \rangle = \frac{3}{2} N k_B T$$



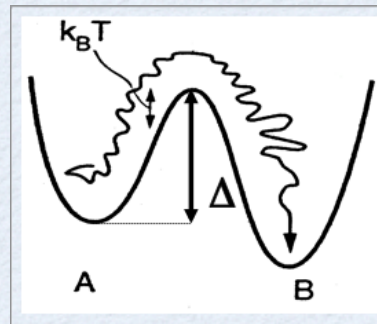


# Problems with molecular dynamics

\*Ergodicity



\* Activated events



\* Slow diffusion





# Controlling the temperature

- From (NVE) to (NVT)

$$P(P_I, R_I) \propto \exp(-\beta H(P_I, R_I))$$

- A good thermostat should:
  - ▶ Sample the canonical distribution
  - ▶ Be ergodic
  - ▶ Be tunable
  - ▶ Not disturb the dynamics





# Some popular thermostats

- Velocity-rescaling\*
- Langevin dynamics\* (Schneider and Stoll, PRB, 1978)
- Andersen\* (JCP, 1980)
- Berendsen\* *et al* (JCP, 1984)
- Nosé (JCP, 1984), Hoover (PRA, 1985)
- Nosé-Hoover chains (Martyna *et al*, JCP, 1992)
- ...

\*stochastic thermostats, no conserved quantity

\*the sampling is not canonical





# Two simple but incorrect thermostats

Rescale the velocities so as to get the target kinetic energy value

$$\overline{K} = \frac{3}{2} N k_B T$$

Berensen's thermostat

$$dK = -\frac{K - \overline{K}}{\tau} dt$$





# Make it stochastic

At every step draw the kinetic energy from the canonical distribution

$$P(K) \propto K^{\frac{3}{2}N-1} e^{-\beta K}$$

☺ Easy to code

☺ Samples the canonical distribution

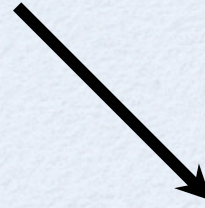
☹ Leads to wrong dynamics





# Make it smooth

Add a stochastic term



$$dK = -\frac{K - \bar{K}}{\tau} dt + 2\sqrt{\frac{K \bar{K}}{3N\tau}} dW$$

The limiting distribution of this stochastic process is

$$P(K) \propto K^{\frac{3}{2}N-1} e^{-\beta K}$$





# A Monte Carlo perspective

Each step can be considered as a Monte Carlo move

The acceptance test can be written as

$$\min \left( 1, \frac{M(x_i^* \leftarrow x_{i+1}^*) \bar{P}(x_{i+1}^*)}{M(x_{i+1} \leftarrow x_i) \bar{P}(x_i)} \right) \equiv \min \left( 1, e^{-\frac{\Delta \tilde{H}}{k_B T}} \right)$$

Use the effective energy as a measure of the accuracy



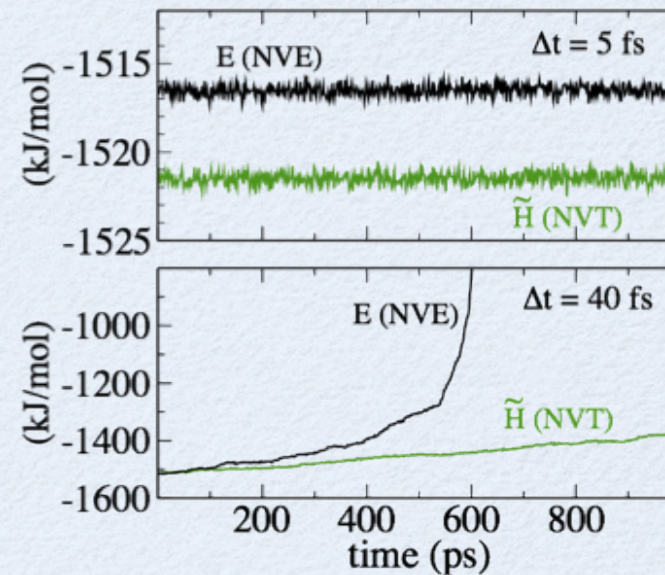


# Orthokatanomy: a conserved quantity

$$\tilde{H} = H(x) - \int_0^t \frac{dt'}{\tau} (\bar{K} - K(t')) - 2 \int_0^t \sqrt{\frac{K(t') \bar{K}}{N_f}} \frac{dW(t')}{\sqrt{\tau}}$$

Behaves like the energy in a MD run

Checking the integration time step



Similar ideas can be applied to the Langevin equation

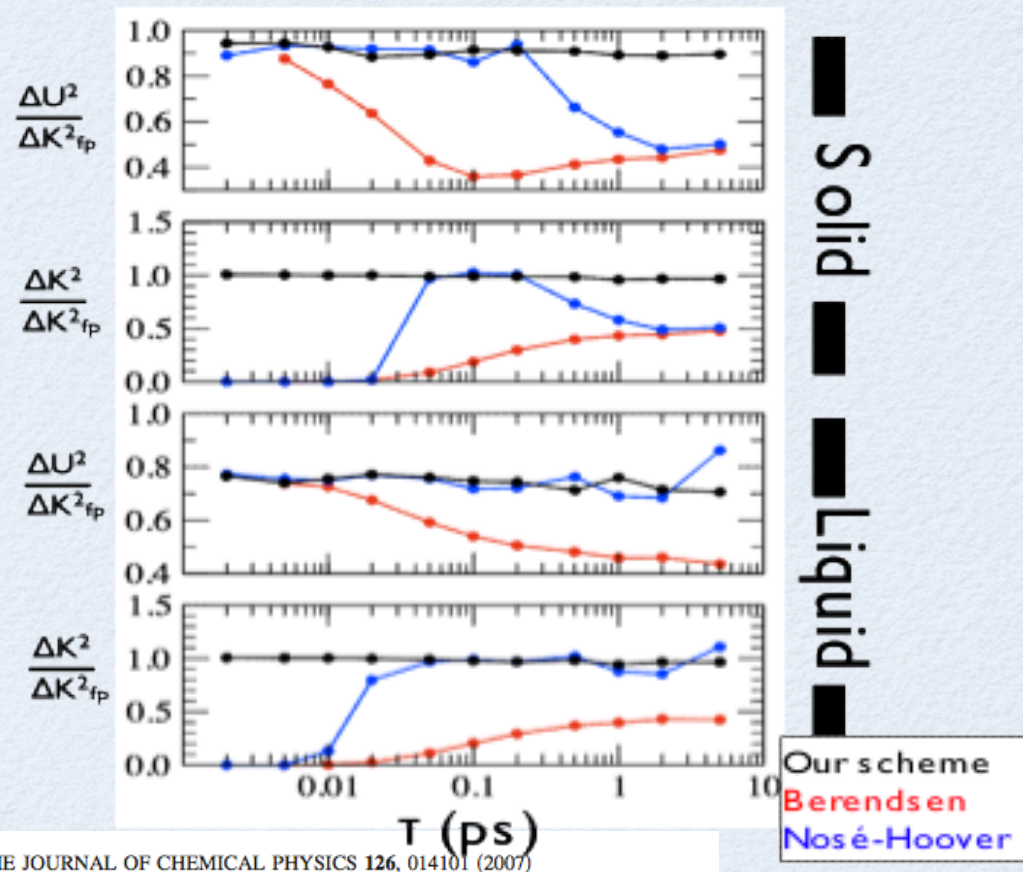


# An excellent thermostat

Lennard-Jones system

Berendsen fails

Nose'-Hoover fails too



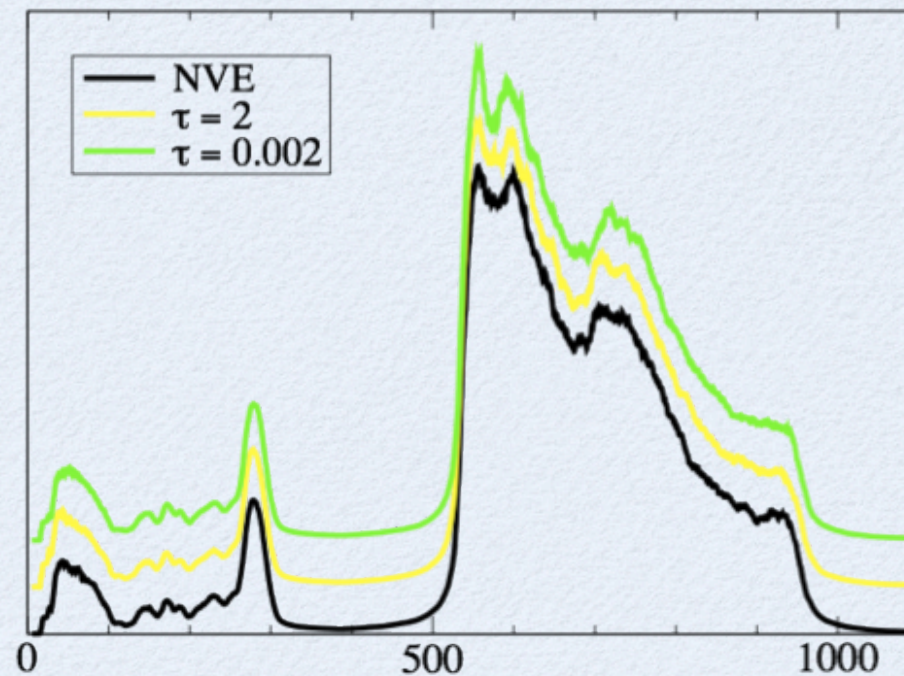
## Canonical sampling through velocity rescaling

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 Computational Science, Department of Chemistry and Applied Biosciences, ETH Zürich, USI Campus, Via  
 Giuseppe Buffi 13, CH-6900 Lugano, Switzerland



# The right kind of dynamics

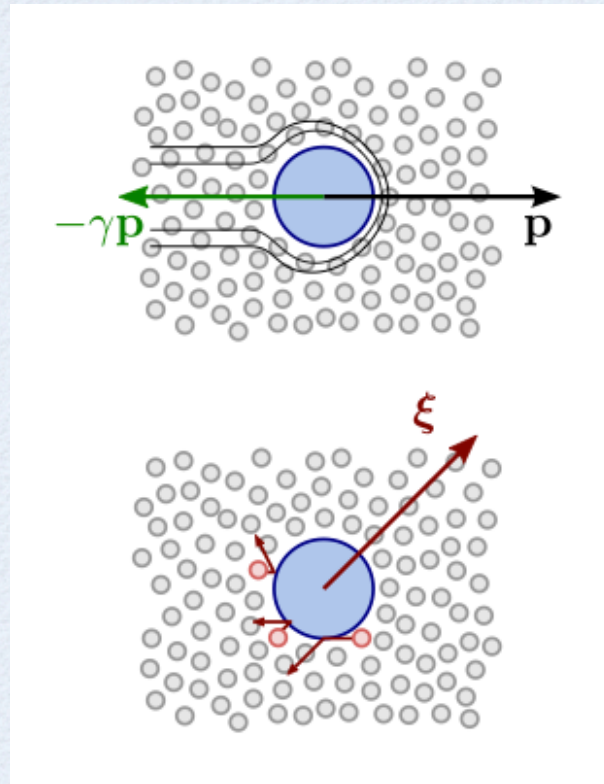
The vibrational spectrum of TIP4P water





# Langevin equation

Brownian particle



$$\dot{P} = -\gamma P + \xi$$

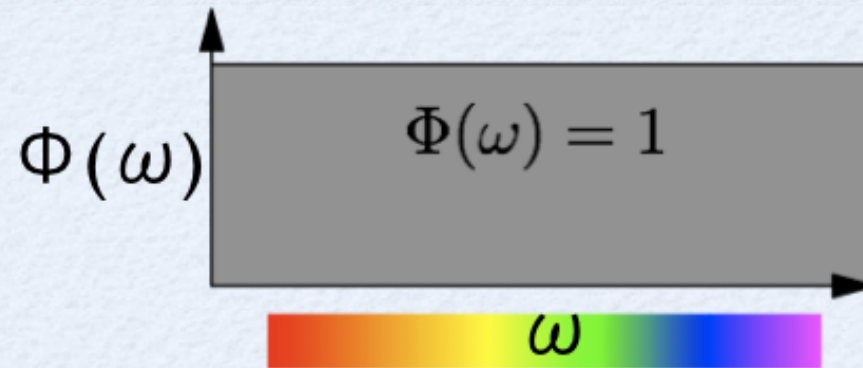


# Langevin equation and statmech

$$\dot{R}_I = \frac{P_I}{M_I}$$

$$\dot{P}_I = F_I - \gamma P_I + \sqrt{2M_I \gamma k_B T} \xi_I$$

$$\langle \xi_I(t) \xi_I(t') \rangle = \delta(t - t')$$



Canonical ensemble

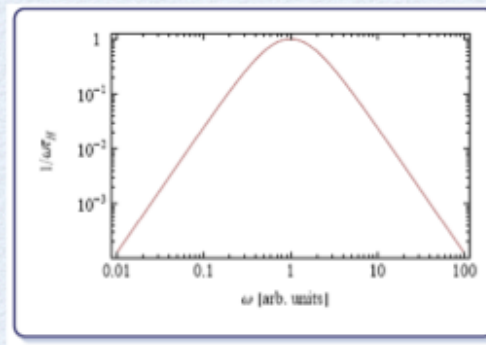
$$P(P_I, R_I) \propto \exp(-\beta H(P_I, R_I))$$



# How efficient is the sampling?

Given a mode of frequency  $\omega$ , we choose the friction such that the energy relaxation time  $\tau$  is optimal.

$$\omega\tau_{opt} = 1$$




For optimal sampling one chooses the reference frequency in the middle of the spectrum.



# Generalized Langevin dynamics

$$\dot{\mathbf{R}} = \frac{\mathbf{P}}{M}$$
$$\dot{\mathbf{P}} = \mathbf{F} - \int_0^t \mathbf{K}(t-t') \mathbf{P}(t') dt' + \sqrt{M k_B T} \boldsymbol{\zeta}(t)$$

Memory function



$$\langle \boldsymbol{\zeta}(t) \boldsymbol{\zeta}(t') \rangle = \mathbf{K}(t-t') \longrightarrow \text{Colored noise}$$

Mori-Zwanzig

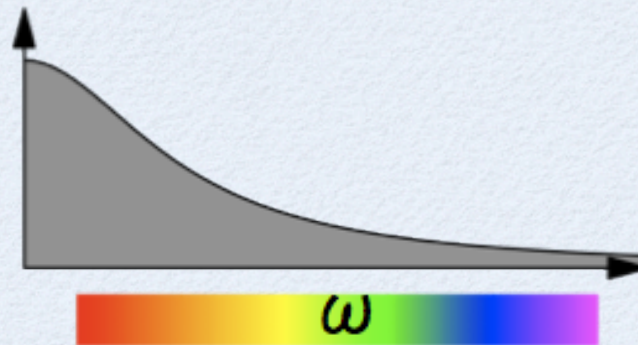




# An elementary example

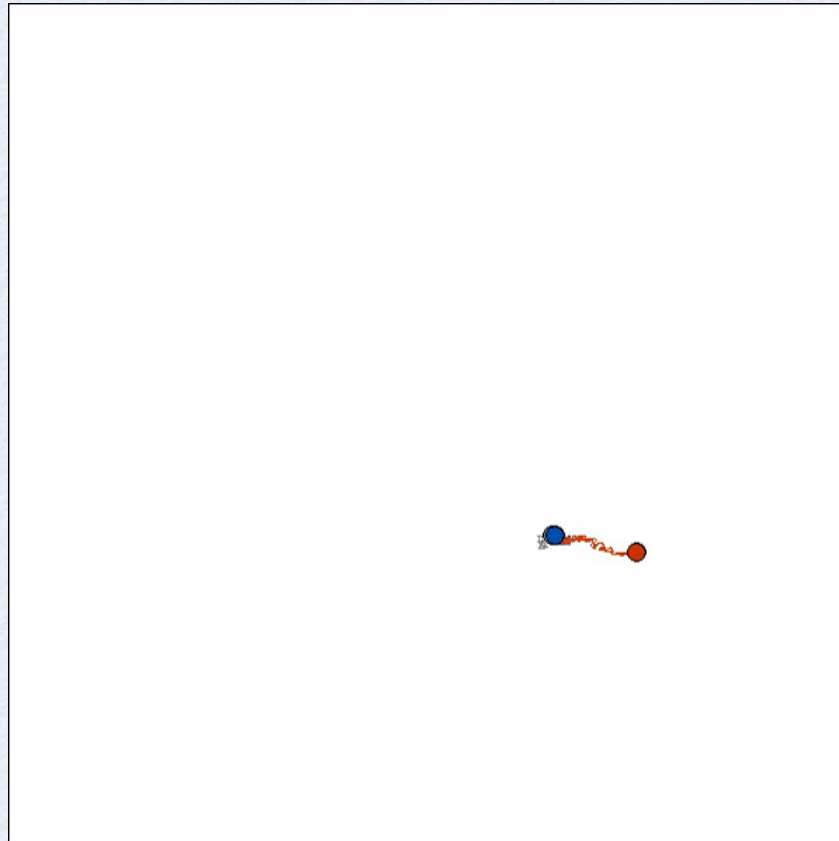
$$\langle \xi(t) \xi(t') \rangle = K(t-t') = \frac{1}{2\tau} e^{-\frac{|t-t'|}{\tau}}$$

$$K(\omega) = \frac{1}{1 + (\omega\tau)^2}$$





# The effect of different memory functions



Three particles

Same diffusion coefficient

Grey no memory

Blue fast memory

Red slow memory





# Mission impossible?

Almost any memory function can be approximated  
by a Markov process in an extended space

$$\dot{R} = \frac{P}{M}$$

$$\begin{pmatrix} \dot{P} \\ \dot{s} \end{pmatrix} = \begin{pmatrix} F \\ 0 \end{pmatrix} - A \begin{pmatrix} P \\ s \end{pmatrix} + B \zeta(t)$$

$$\langle \zeta(t) \zeta(t') \rangle = \delta(t - t')$$



# An elementary example

A non Markov process with a memory function of the type

$$K(t-t') = \frac{1}{2\tau} e^{-\frac{|t-t'|}{\tau}}$$

Is e equivalent to a Markov stochastic process in an extended space

$$\begin{pmatrix} \dot{P} \\ \dot{s} \end{pmatrix} = \begin{pmatrix} F \\ 0 \end{pmatrix} - A \begin{pmatrix} P \\ s \end{pmatrix} + B \zeta(t)$$

with

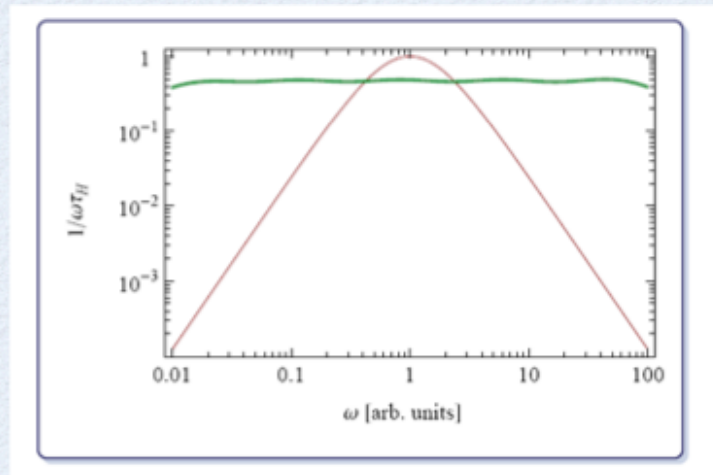
$$A = \frac{1}{\tau} \begin{pmatrix} & \sqrt{\tau} \\ \sqrt{\tau} & 1 \end{pmatrix} \quad B = \sqrt{\frac{Tm}{\tau}} \begin{pmatrix} 0 & 0 \\ 0 & 1 \end{pmatrix}$$





# Application #1: optimal sampling

Design  $\tau(\omega)$  such that  $\tau(\omega) \sim \omega^{-1}$  in the relevant frequency range

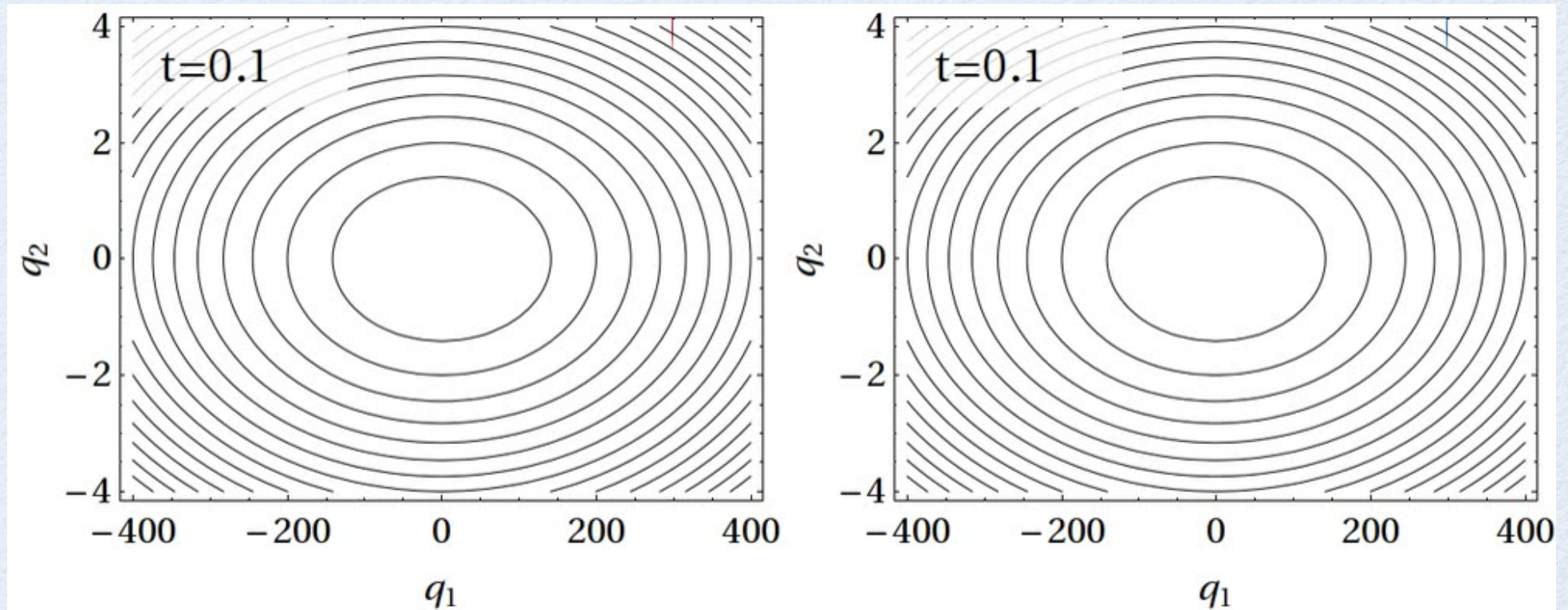


Optimal

Standard



# Optimal sampling at work

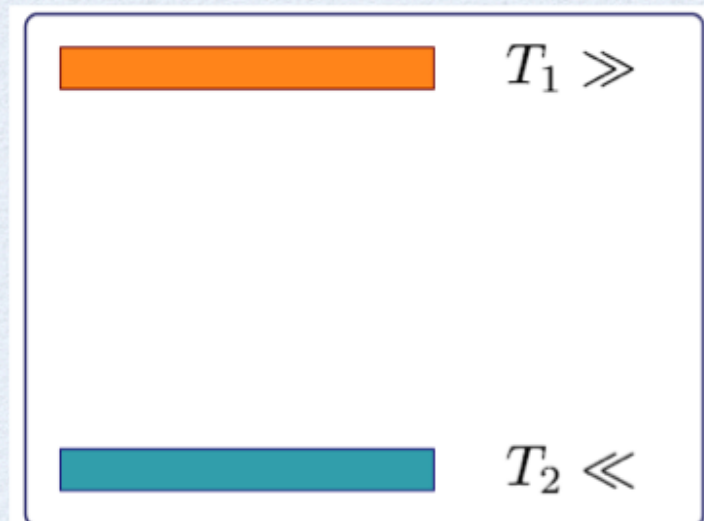


Standard

Optimal



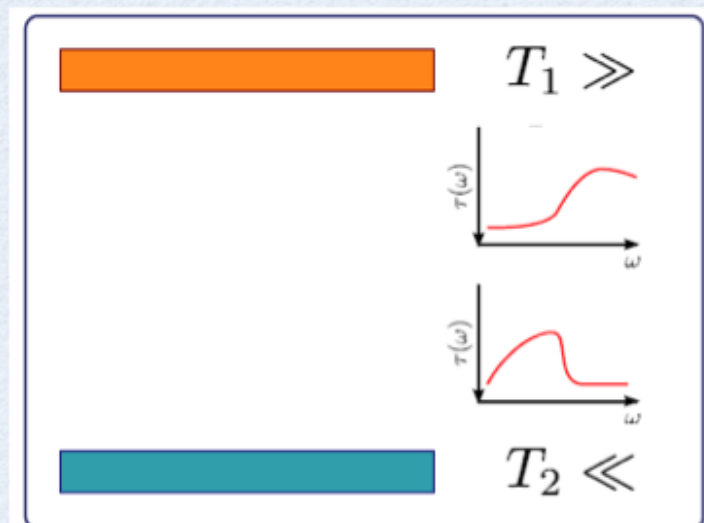
# #2: different strokes for different folks



Two thermostats at different temperatures



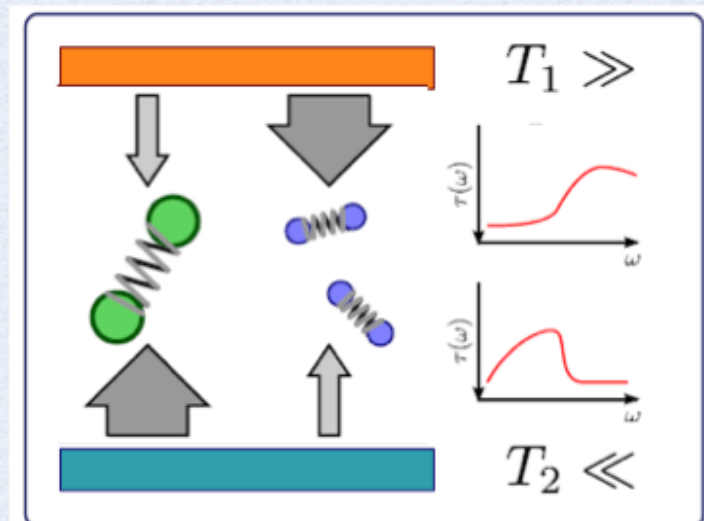
# #2: different strokes for different folks



Impose different responses



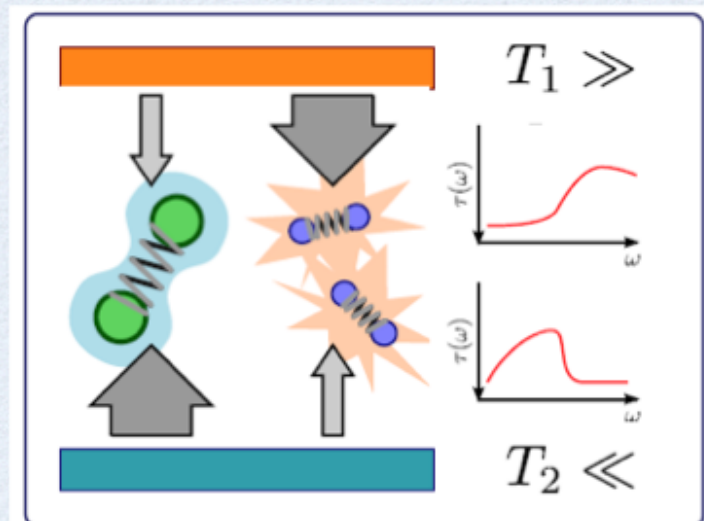
## #2: different strokes for different folks



The thermostats will act differently on different modes



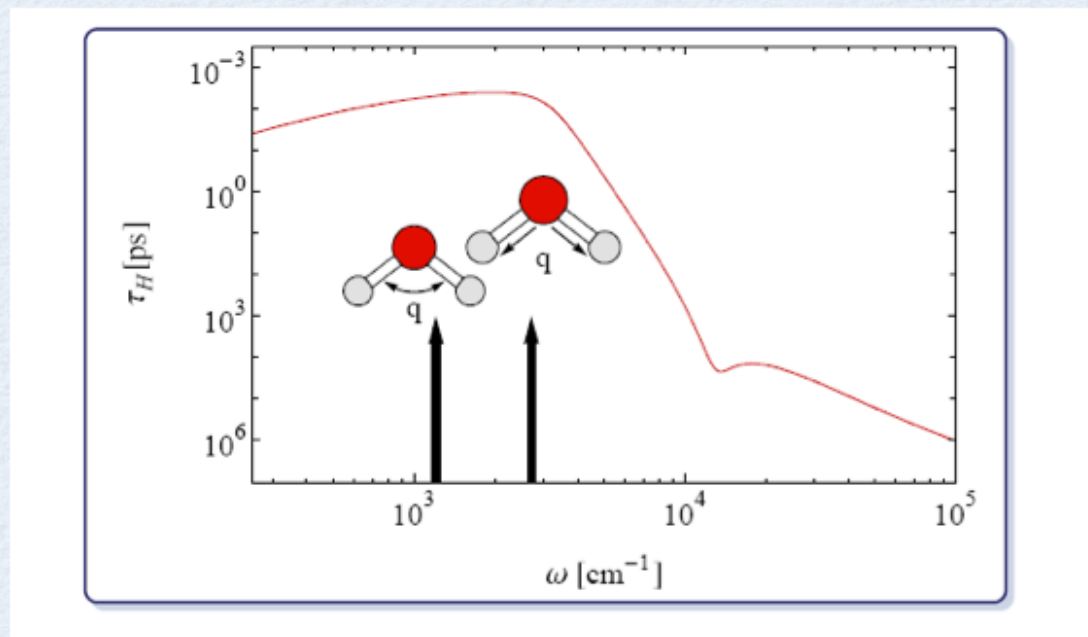
## #2: different strokes for different folks



Note: one can impose a frequency dependent temperature  
**without having to calculate the second derivatives**

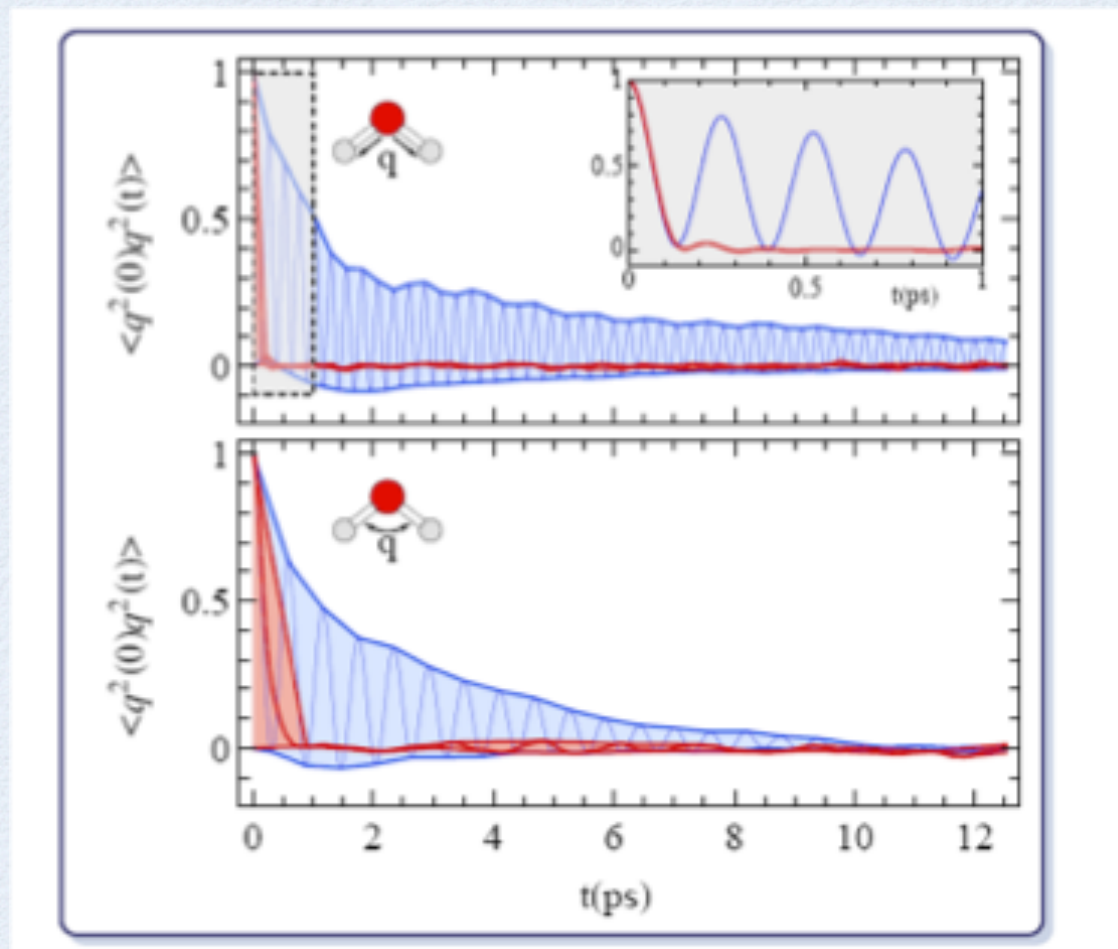


# Car-Parrinello





# More efficient than Nose'-Hoover





# #3: Quantum effects

Enforce a quantum distribution for momenta and positions for each oscillator

$$\langle \mathbf{P}^2 \rangle = \omega^2 \langle \mathbf{R}^2 \rangle = \hbar \omega \coth \left( \frac{\hbar \omega}{k_B T} \right)$$

Correct in the harmonic and classical limit  
in between it interpolates

No need to know the harmonic spectrum!





# Harmonic oscillator

$$\rho(x) \propto \exp - \frac{1}{\frac{\hbar\omega}{2} \coth \beta \frac{\hbar\omega}{2}} \left( \frac{1}{2} m \omega^2 x^2 \right) = \exp - \beta^*(\omega) \left( \frac{1}{2} m \omega^2 x^2 \right)$$

The position (and momentum) distribution of a quantum harmonic oscillator is like that of a classical one at the temperature

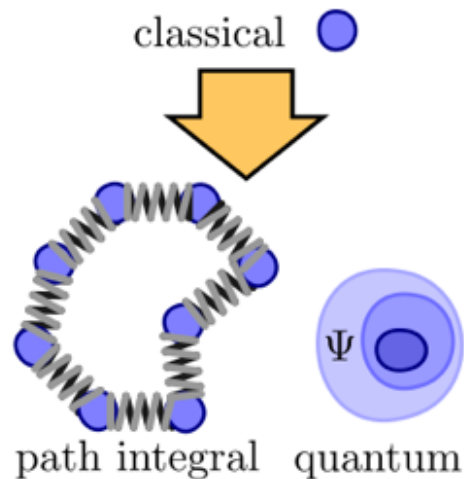
$$\beta^*(\omega)^{-1} = \frac{\hbar\omega}{2} \coth \frac{\beta\hbar\omega}{2}$$





# Why bother?

$$Z = \text{Tr} \left[ e^{-\frac{\beta}{P} \mathbf{H}} \right]^P = \int d\mathbf{r}_1 \dots d\mathbf{r}_P \langle \mathbf{r}_1 | e^{-\frac{\beta}{P} \mathbf{H}} | \mathbf{r}_2 \rangle \dots \langle \mathbf{r}_P | e^{-\frac{\beta}{P} \mathbf{H}} | \mathbf{r}_1 \rangle$$



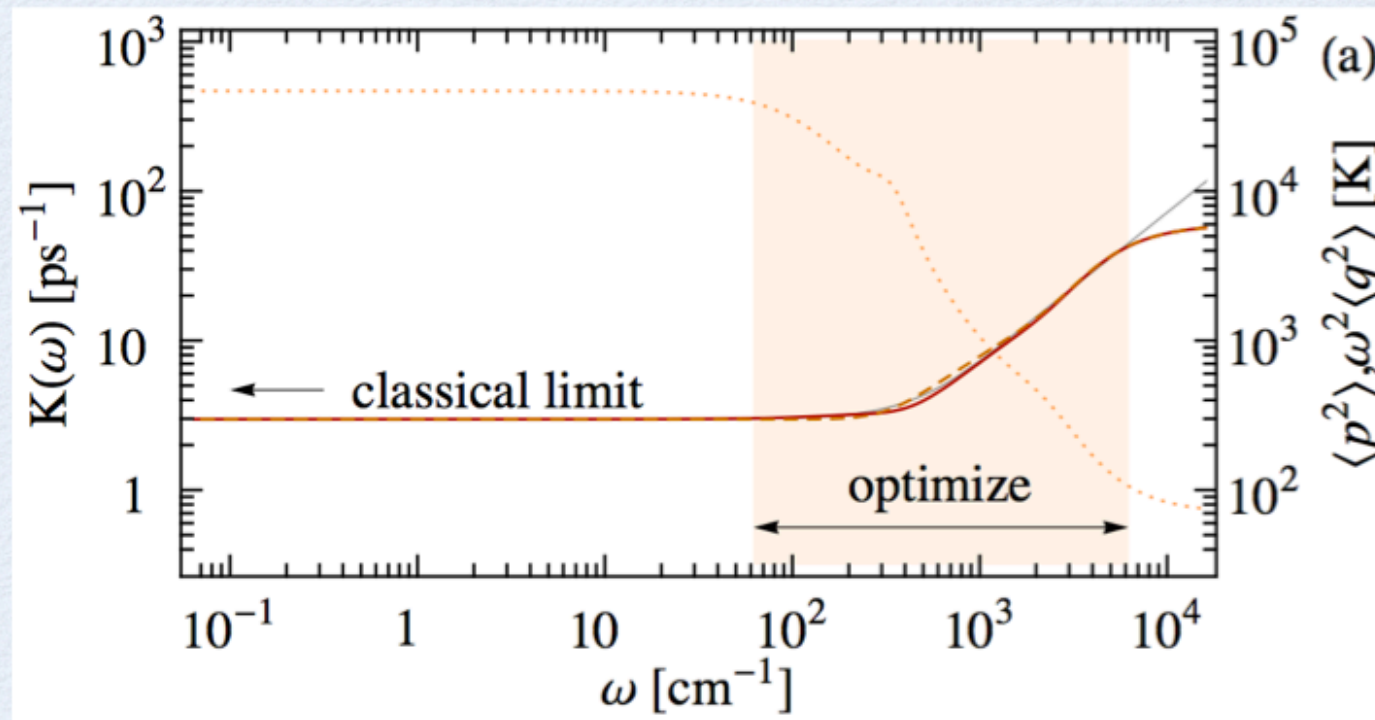
$$\langle \mathbf{r}_1 | e^{-\frac{\beta}{P} \mathbf{H}} | \mathbf{r}_2 \rangle \approx$$

$$\exp \left[ -\frac{\beta}{P} \left( \frac{V(\mathbf{r}_1) + V(\mathbf{r}_2)}{2} + \frac{1}{2} m \omega_P^2 (\mathbf{r}_1 - \mathbf{r}_2)^2 \right) \right]$$

$$\omega_P = P / \beta \hbar$$

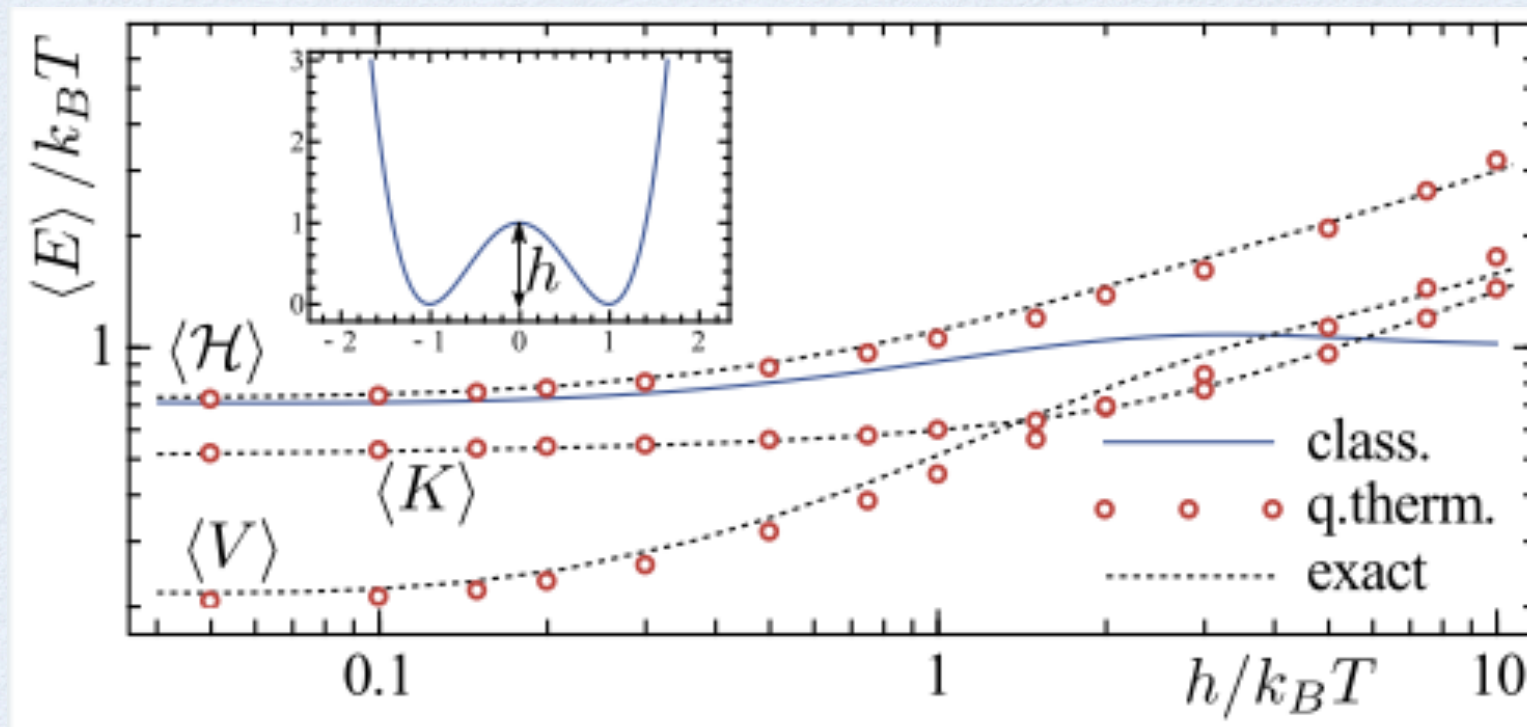


# Some popular thermostats





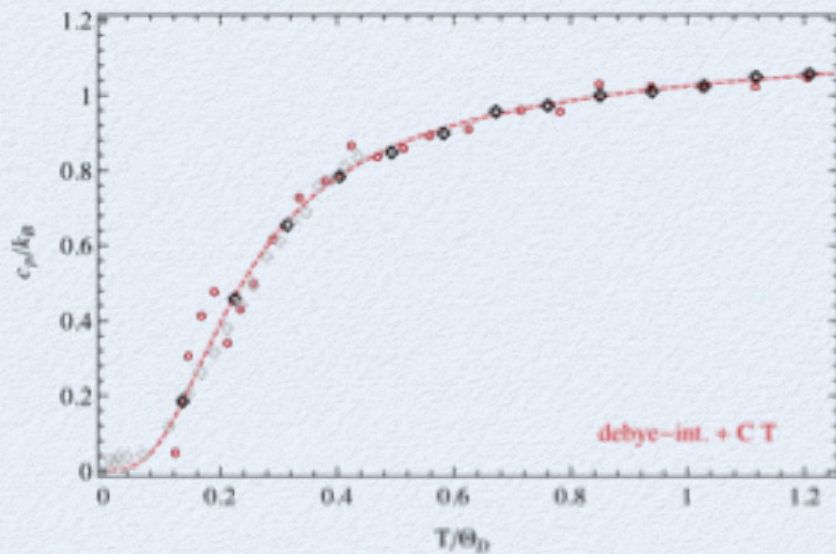
# A double well



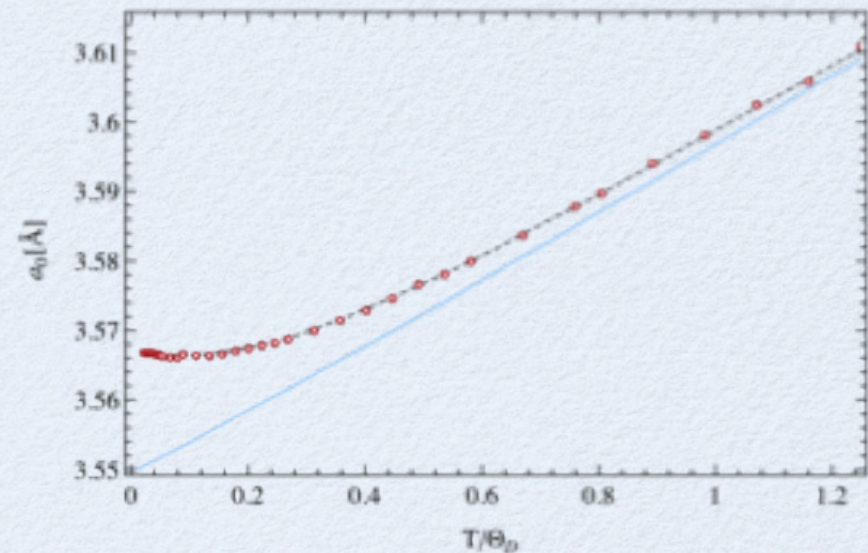


# A quantum solid: diamond

Specific heat



Lattice constant



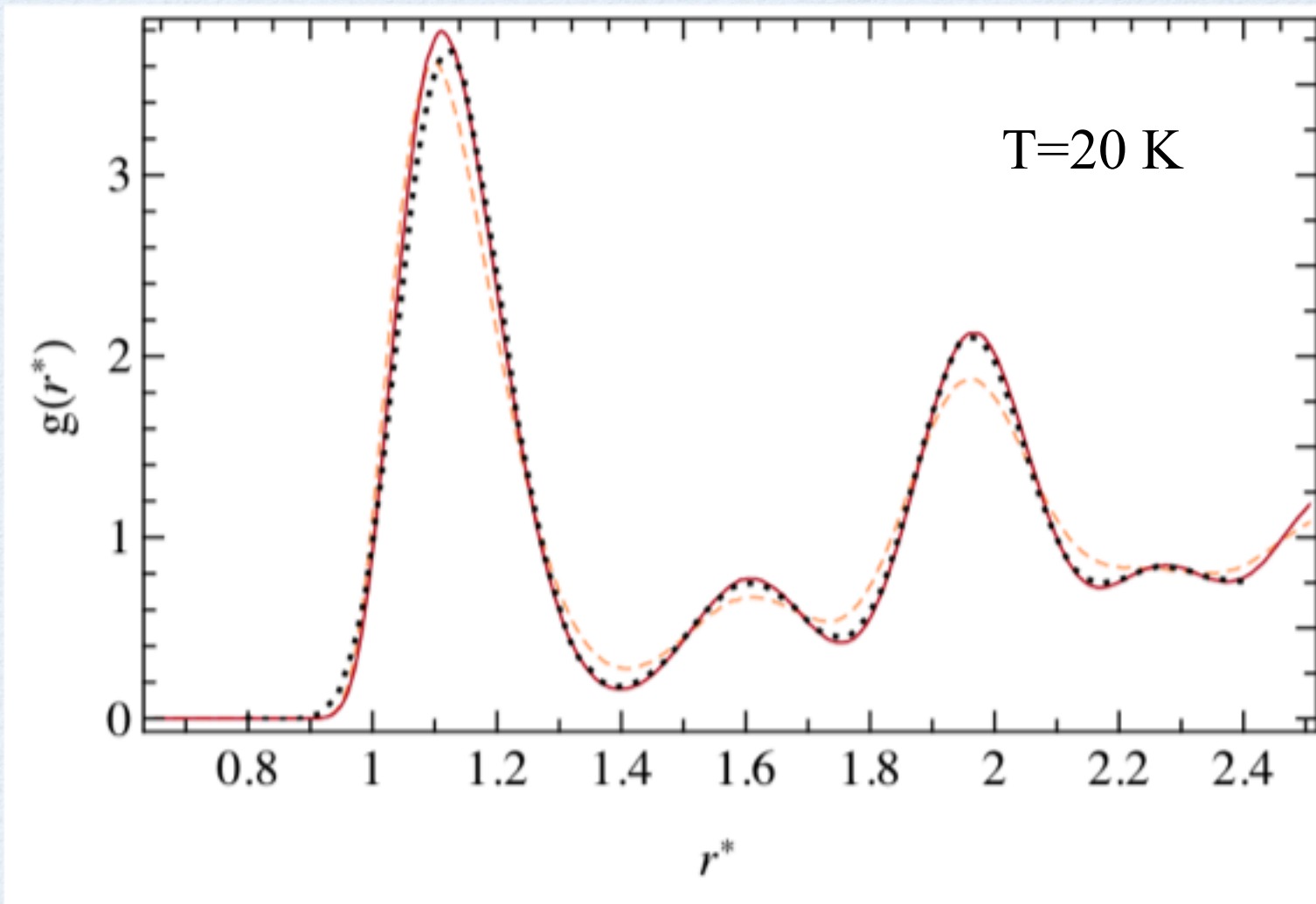
Path integral

Quantum thermostat

Classical

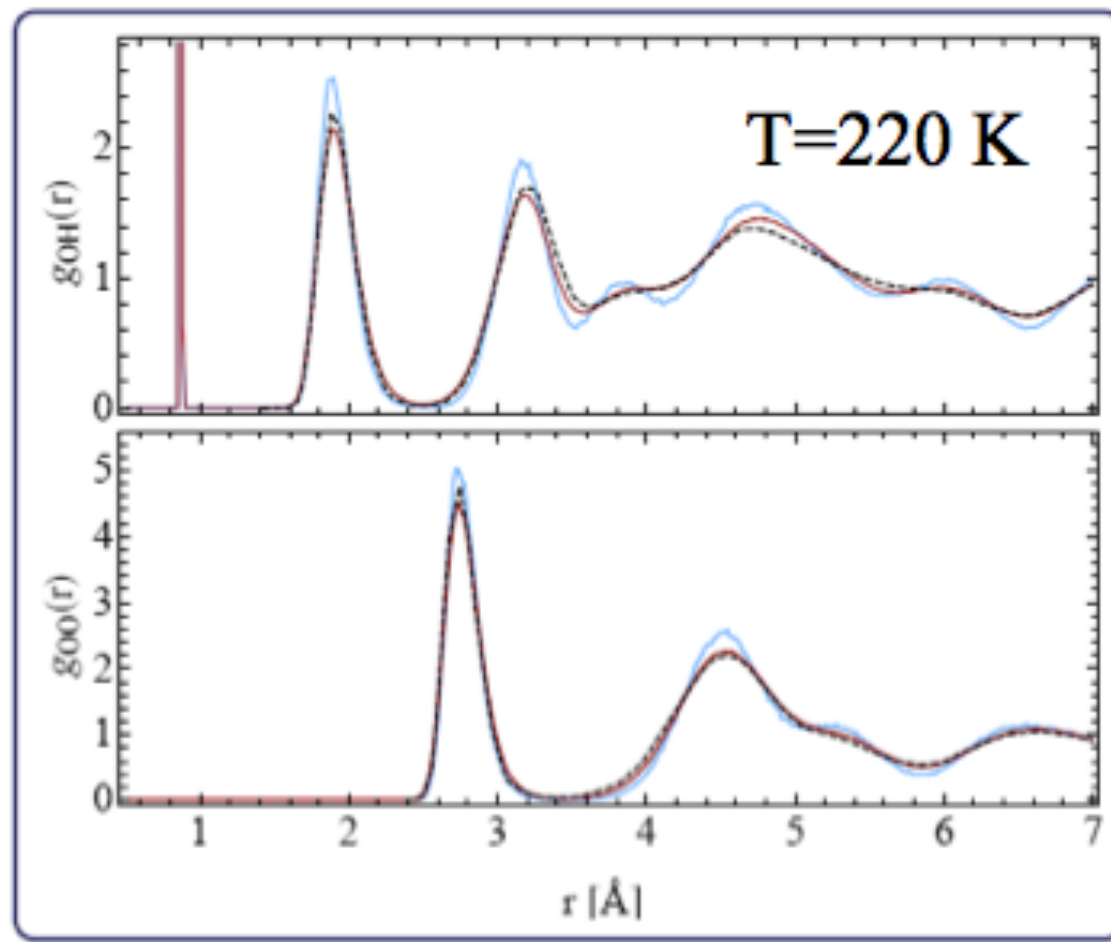


# Neon





# Ice (TIP4P)



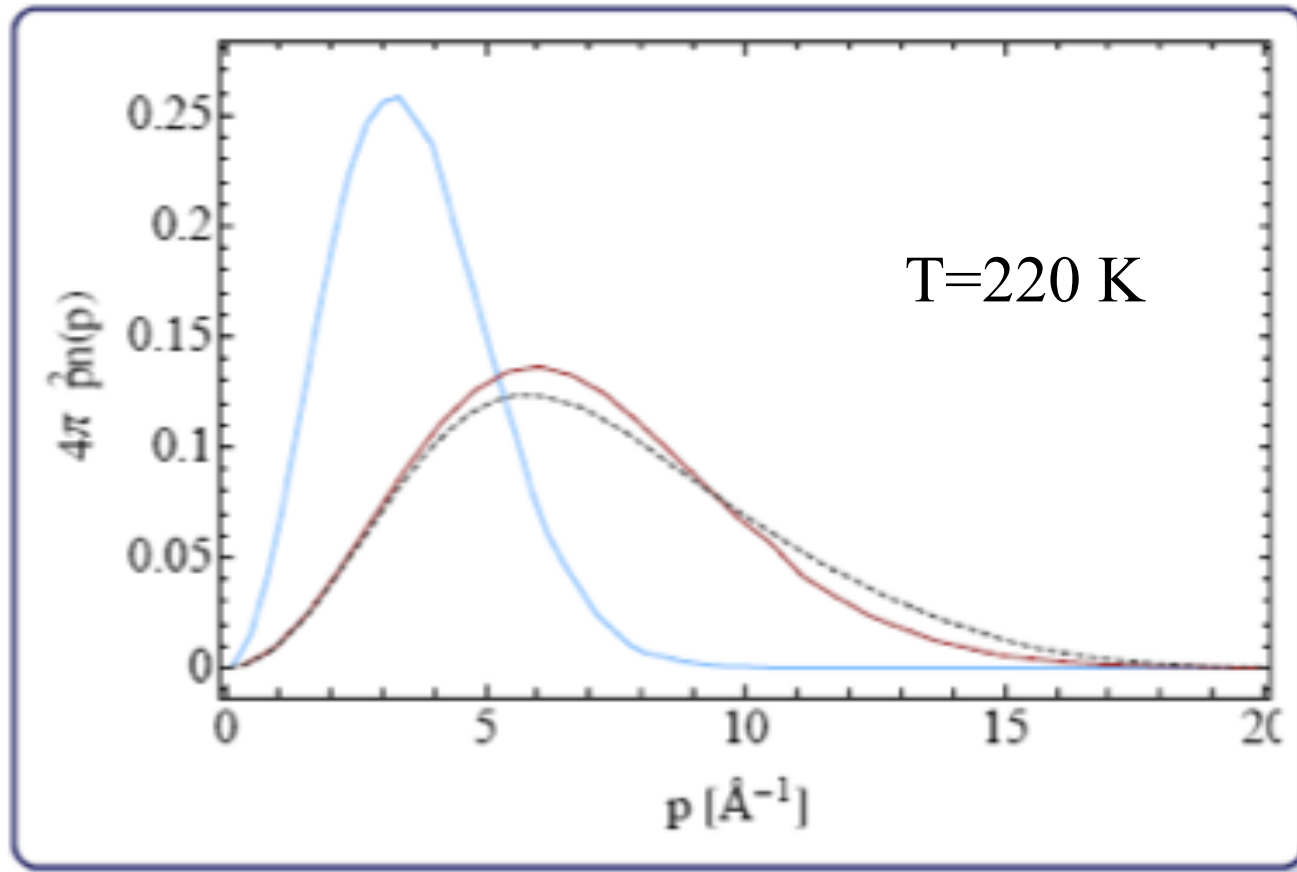
Path integral

Quantum  
thermostat

Classical



# Ice momentum distribution



Experiment

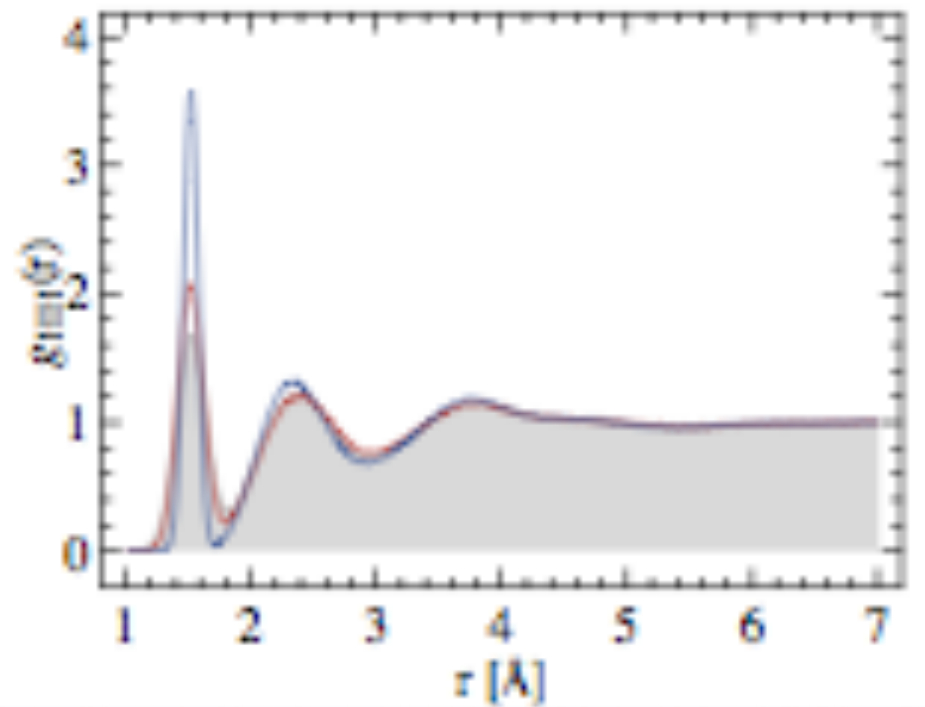
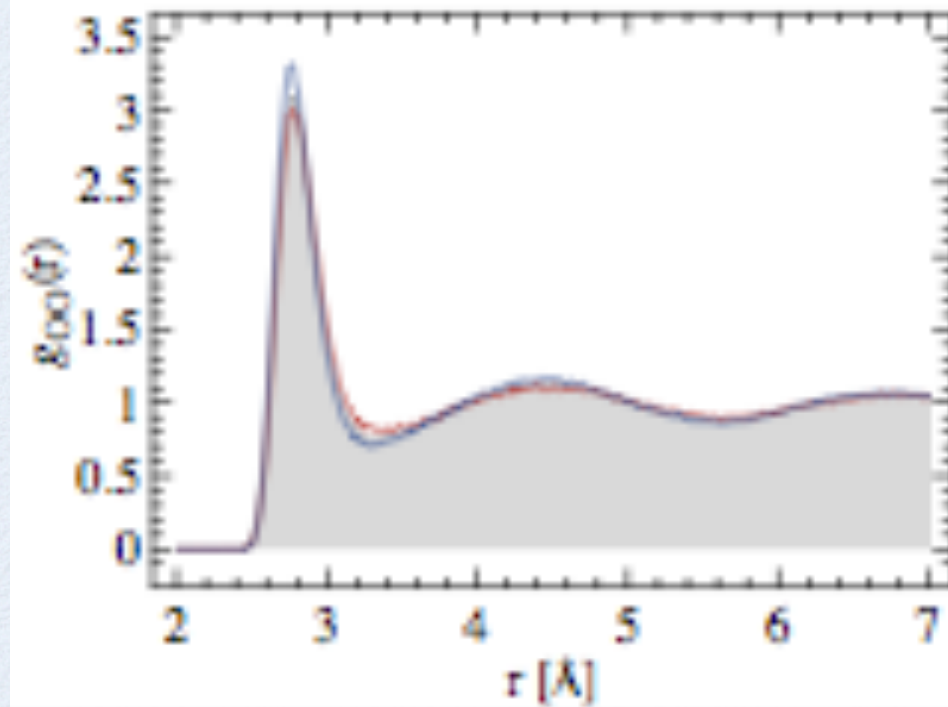
Quantum  
thermostat

Classical

G. Reiter et al., Braz. J. Phys. **34**, 142 (2004)



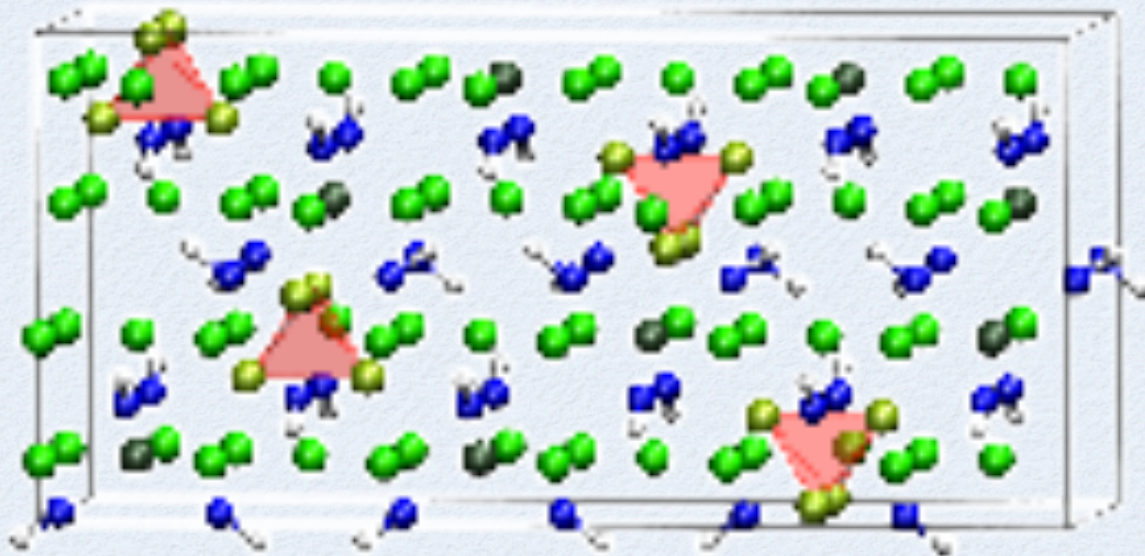
# Even water



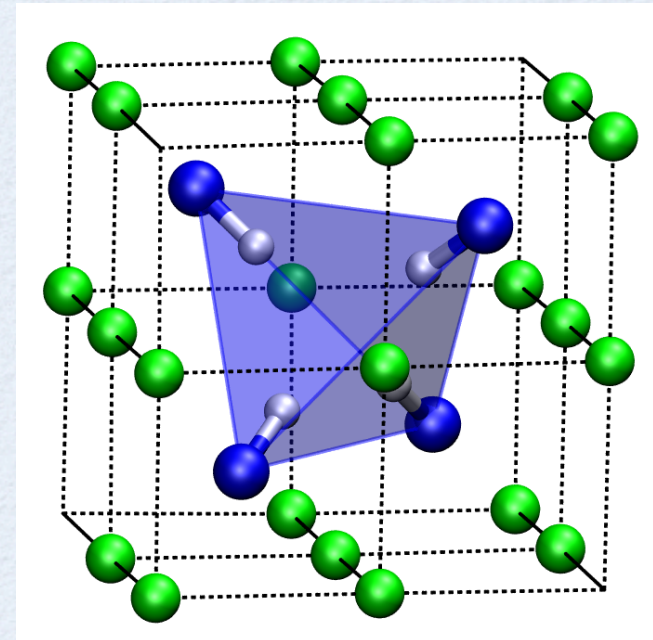


# An interesting material: $\text{Li}_2\text{NH}$

Belongs to a class of materials being investigated for hydrogen storage



A complex antiferroite  
structure ( $\text{Fm}\bar{3}\text{m}$ )  
not yet fully resolved



Tetrahedral arrangement  
of the NH groups  
around a Li vacancy



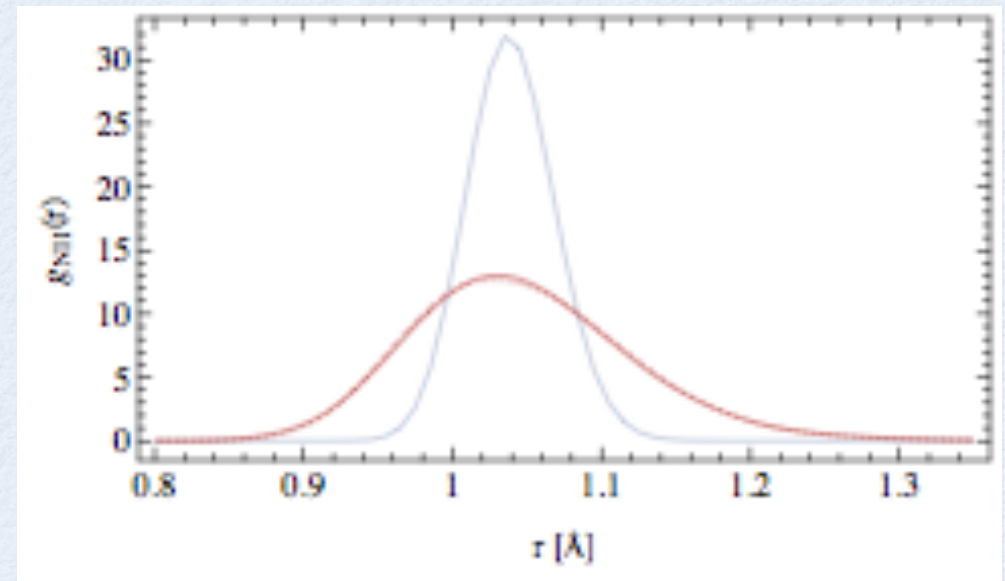
# Ab-initio quantum simulation

128 atoms supercell

PDE exchange and correlation

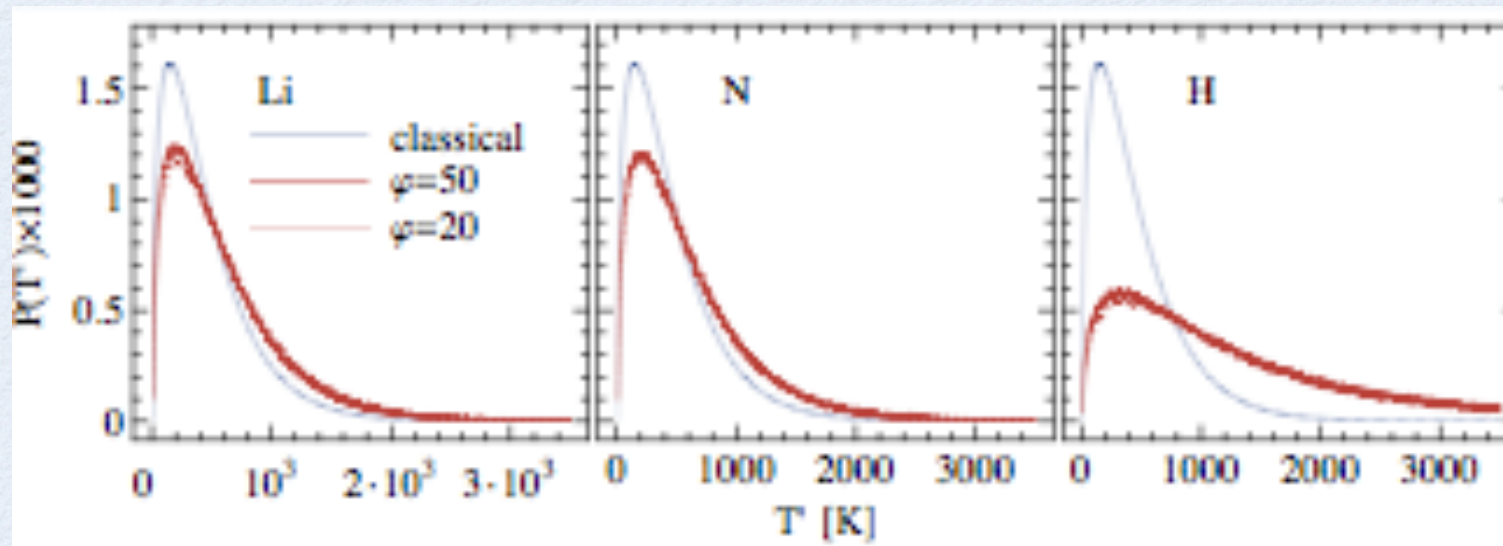
Quantum thermostats

$T=300$  K



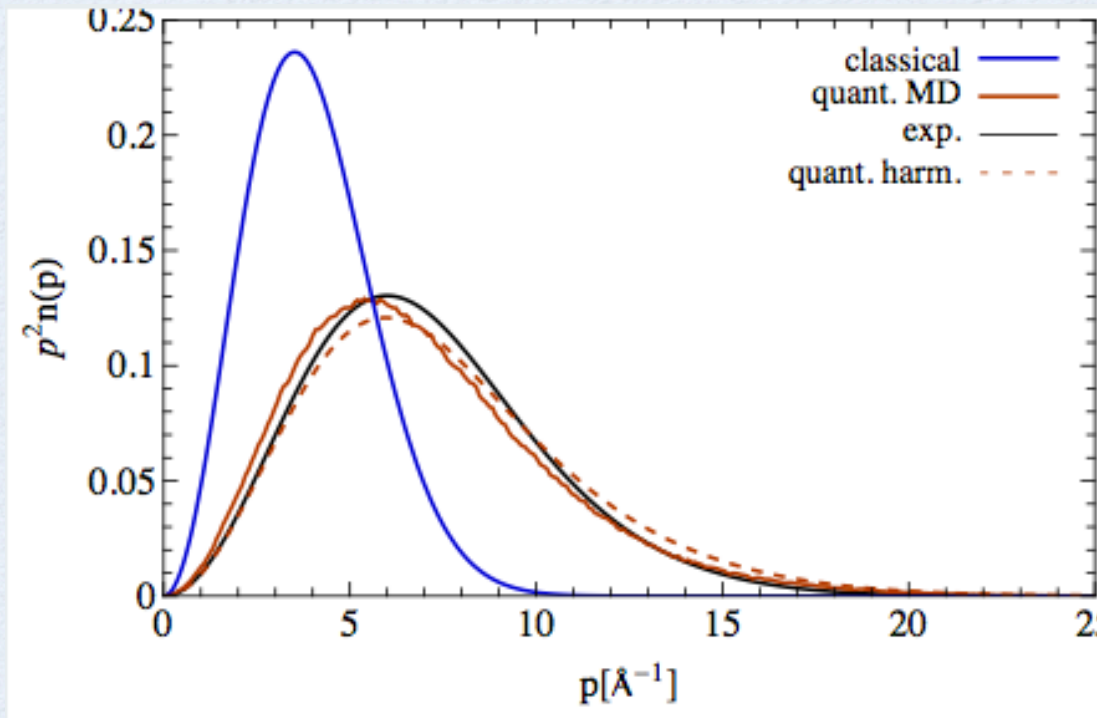


# Effective temperature distributions

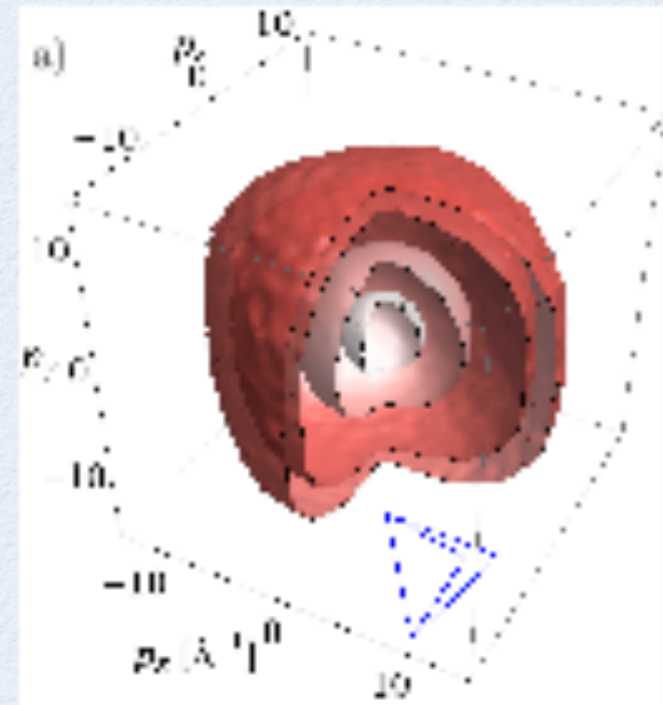




# Momentum distribution: Theory and Experiment



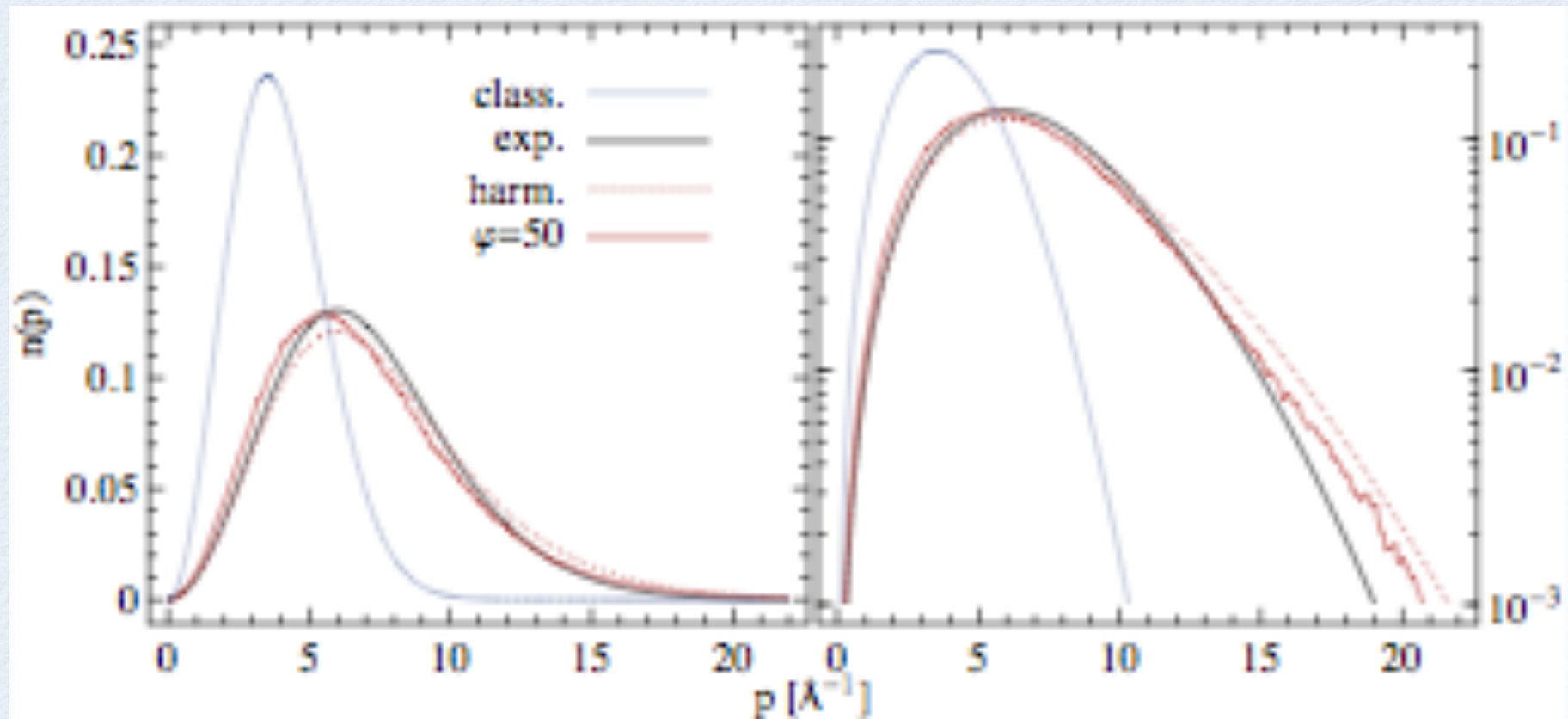
Spherical average



Angularly resolved

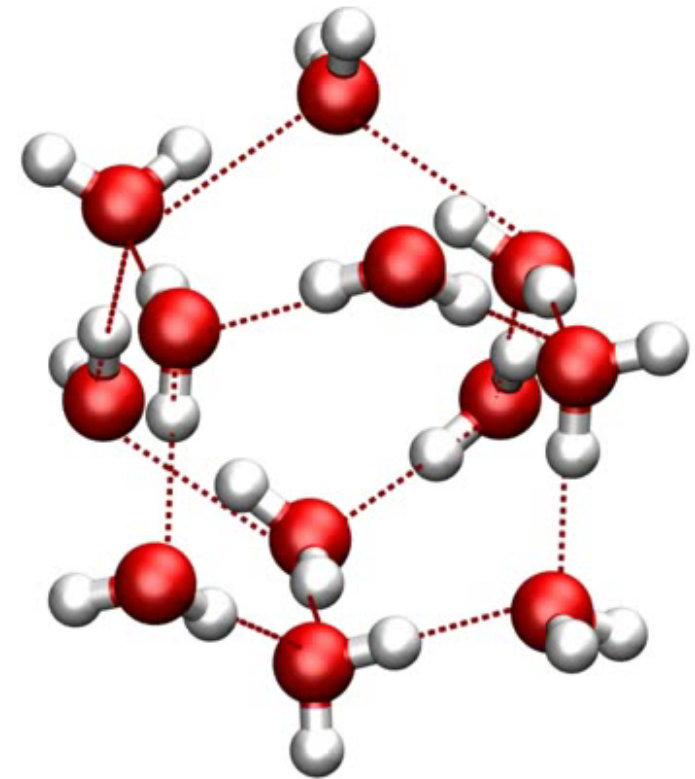
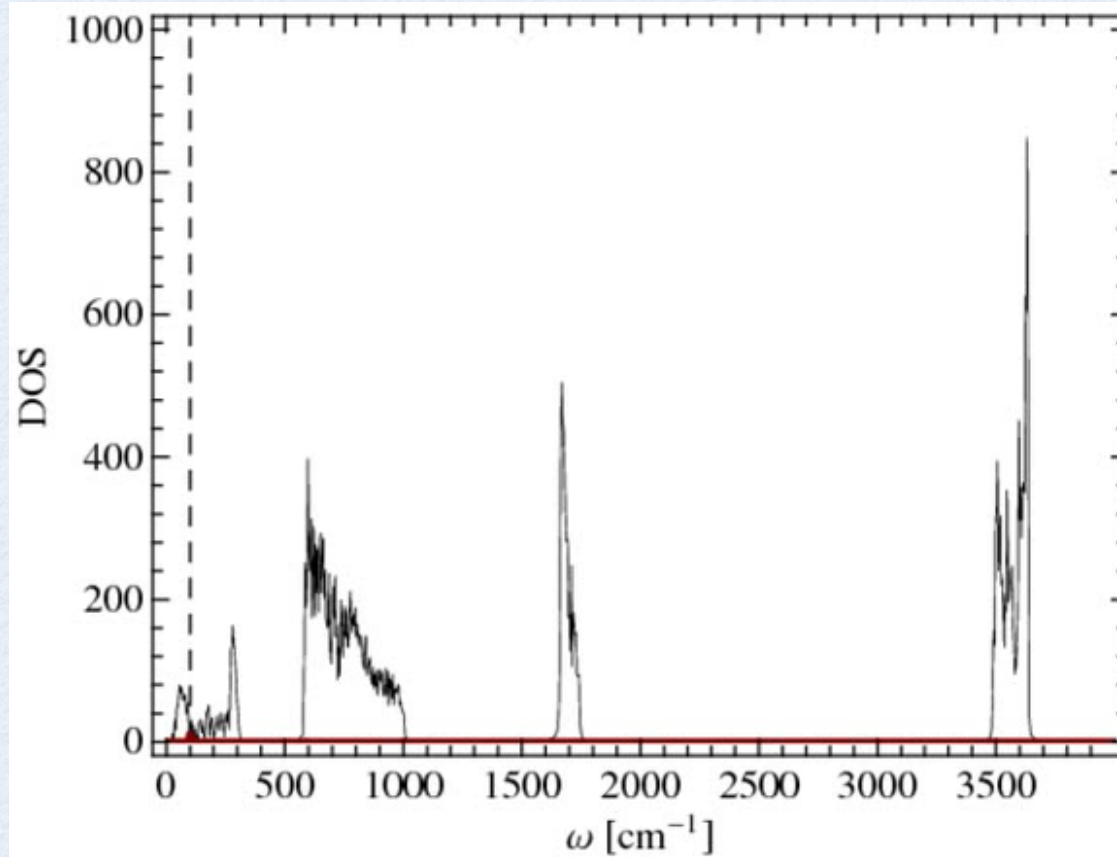


# Spherical average





## #4 $\delta$ -like excitation



Exciting selectively the vibrational modes of ice



# #5 The best has yet to come



Eidgenössische Technische Hochschule Zürich  
Swiss Federal Institute of Technology Zurich





# Collaborators

For the thermostats

G. Bussi, SISSA (Trieste)

M. Ceriotti, ETH (Lugano)

D. Donadio, MPI (Mainz)

For  $\text{Li}_2\text{NH}$

## Theory

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G. Miceli, Bicocca (Milano)

M. Bernasconi, Bicocca (Milano)

## Experiment

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D. Colognesi, Bicocca (Milano)

M. Catti, Bicocca (Milano)

A. C. Nale, Bicocca (Milano)





*The end*

*Thank you for your  
attention*



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Swiss Federal Institute of Technology Zurich

