

A novel framework for enhanced molecular dynamics based on the generalized Langevin equation

Michele Ceriotti

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Eidgenössische Technische Hochschule Zürich
Swiss Federal Institute of Technology Zurich

- Simulation of the trajectories of a system at the atomic level
 - Hamilton's equation (classical dynamics)
 - Model of the interatomic potential (force field/ab initio)

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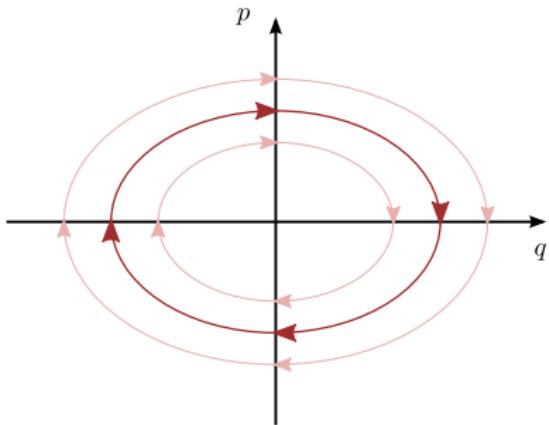
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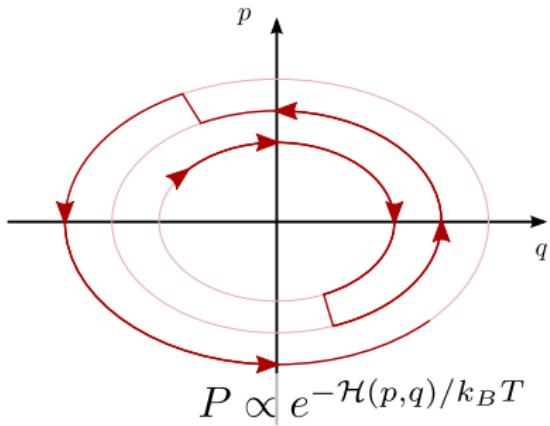
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 - Modify for constant temperature sampling



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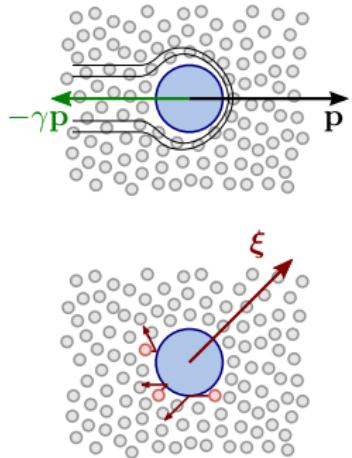
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- Originally, physical model for Brownian motion containing a **viscous friction** and **noisy force** term

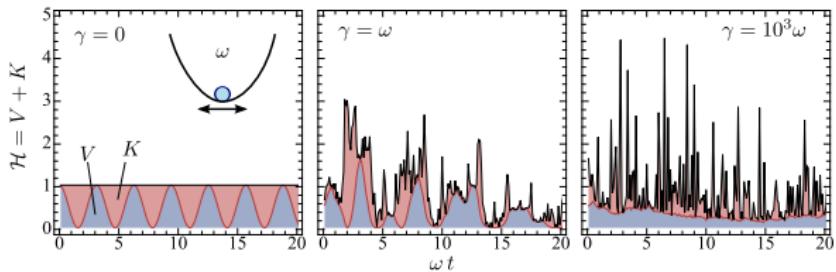
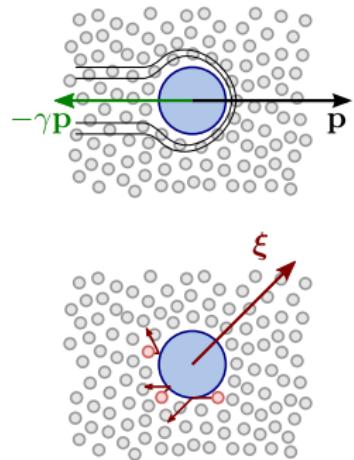
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- Used routinely in MD simulations to achieve canonical sampling: how efficient?



Sampling efficiency depends on γ !

- The Langevin equation: a Markovian stochastic differential equation for the momenta

$$\dot{p}(t) = -\gamma p(t) + \sqrt{2m\gamma T} \xi(t), \langle \xi(t) \xi(0) \rangle = \delta(t)$$

- The Langevin equation: a Markovian stochastic differential equation for the momenta
- What if one considers a **non-Markovian** equation?

$$\dot{p}(t) = - \int_0^{\infty} K(s) p(t-s) ds + \sqrt{2mT} \zeta(t), \langle \zeta(t) \zeta(0) \rangle = K(t)$$

Details of the noise **dramatically change dynamics!**

The trajectories of a particle subject to white and colored-noise LE with the same diffusion coefficient yield very different short-times behavior.

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- Non-Markovian generalized Langevin equations are used in many contexts as a physical model
 - Can we exploit the flexibility to manipulate the sampling properties of a molecular dynamics trajectory?
 - Can we make it as general and “user-friendly” as possible?

- A large class of non-Markovian dynamics can be mapped onto a Markovian dynamics in an extended phase space

Non-Markovian GLE

$$\dot{q}(t) = p(t)/m$$

$$\dot{p}(t) = -V'(q) - \int_0^\infty K(t') p(t-t') dt' + \sqrt{2mT} \zeta(t)$$

$$\langle \zeta(t) \zeta(0) \rangle = T K(t)$$

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Markovian GLE

$$\begin{aligned}\dot{q}(t) &= p(t)/m \\ \begin{pmatrix} \dot{p} \\ \dot{s} \end{pmatrix} &= \begin{pmatrix} -V'(q) \\ 0 \end{pmatrix} - \begin{pmatrix} a_{pp} & a_p^T \\ \bar{a}_p & \mathbf{A} \end{pmatrix} \begin{pmatrix} p \\ s \end{pmatrix} + \mathbf{B}\xi \\ \mathbf{B}\mathbf{B}^T &= T(\mathbf{A} + \mathbf{A}^T)\end{aligned}$$

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- The Markovian GLE corresponds to a (possibly complex) exponential memory kernel $K(t) = a_{pp}\delta(t) - \mathbf{a}_p^T e^{-\mathbf{A}t} \bar{\mathbf{a}}_p$

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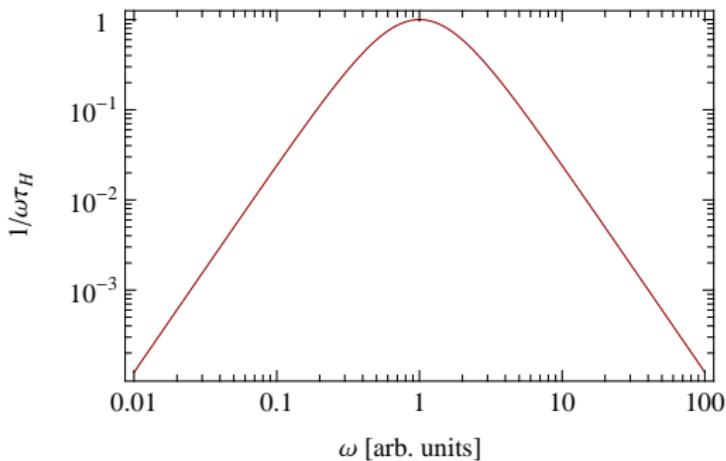
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- Except for the non-linear potential, this stochastic differential equation is an **Ornstein-Uhlenbeck process** $\dot{\mathbf{u}} = -\mathbf{A}\mathbf{u} + \mathbf{B}\xi$ which can be solved analytically.

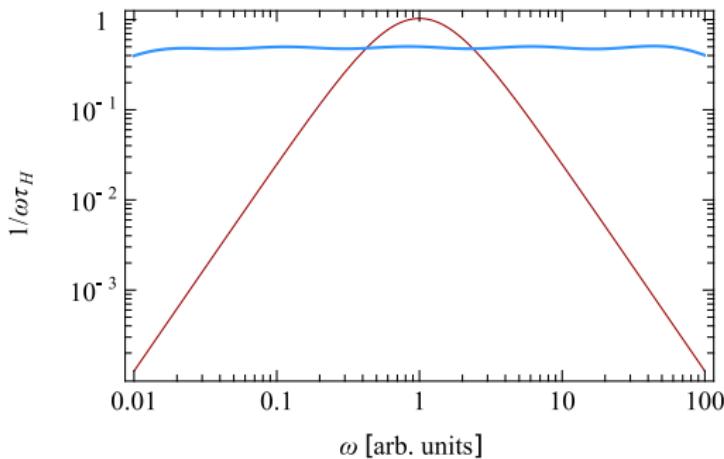
- In the **harmonic limit**, exact propagator for the OU process:
 - Thanks to **rotational invariance**, response is the same when independent GLEs are applied to Cartesian coordinates or in normal mode representation!
- One can obtain **custom-tailored thermostats**:
 - Compute response properties over a frequency range as broad as the vibrational spectrum of the system
 - Modify the parameters of the GLE until the response matches requirements
- The fitting is a complex **nonlinear optimization** problem:
must restrict the range of \mathbf{A}_p and \mathbf{B}_p

- Measure statistical sampling efficiency by the correlation time,
i.e. $\tau_{\mathcal{H}} = \int_0^{\infty} \langle H(t) H(0) \rangle dt$
 - “Normalized” sampling efficiency $\kappa(\omega) = [\tau(\omega) \omega]^{-1}$

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 - Severe degradation for $\omega \neq \omega_{opt}$: choice of γ ?



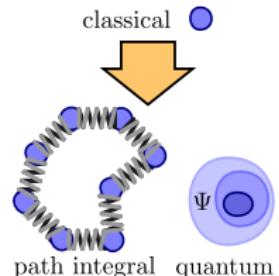
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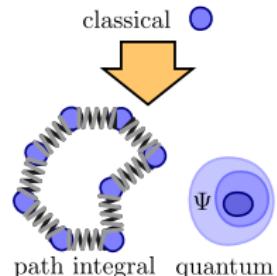
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White noise ($\gamma = 0.1$) vs optimal sampling. Anisotropic 2D harmonic oscillator ($\omega_1 = 0.01$, $\omega_2 = 1$). Relaxation of probability density starting from δ .

- Path integral methods allow computing expectation values in quantum systems
 - Isomorphism between the quantum partition function and that of a classical ring polymer.
 - Many replicas of the system, corresponding particles connected by harmonic springs
- **Difficult sampling problem:** non-ergodic stiff modes together with the ones of the classical system



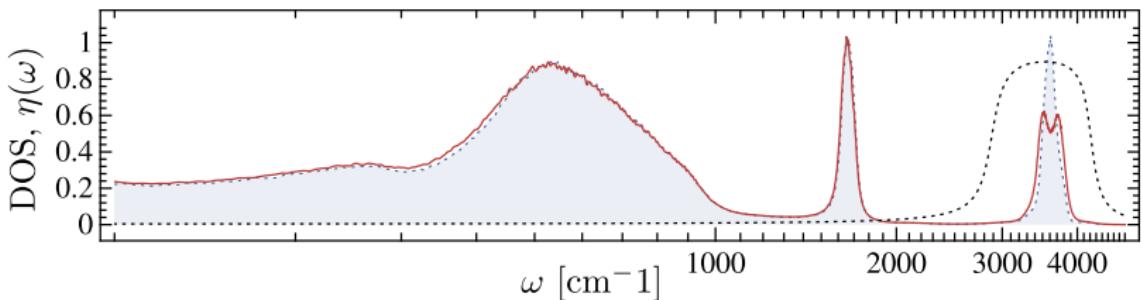
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- GLE allows to sample nearly-optimally the whole spectrum...
- ...hence, better sampling performance than white noise, for different observables



τ [ps]	WN	GLE
Kinetic En.	0.036	0.020
Potential En.	2.24	1.20
Cell dipole	32	14

- Application to **Car-Parrinello dynamics**
- Evaluate quantitatively the disturbance induced on dynamics
 - “ η ” parameter, based on the predicted smearing of the power spectrum
 - **Localize disturbance** on few normal modes

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Comparison between NVE and “localized disturbance” power spectrum for liquid water.

- All applications so far had fluctuation-dissipation theorem satisfied,

$$\langle \zeta(t) \zeta(0) \rangle = T K(t)$$

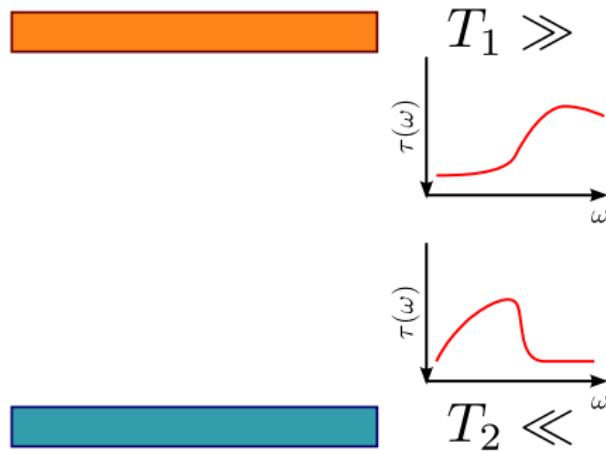
- Simple non-eq. example: two thermostats at different temperature and different coupling curves

 $T_1 \gg$  $T_2 \ll$

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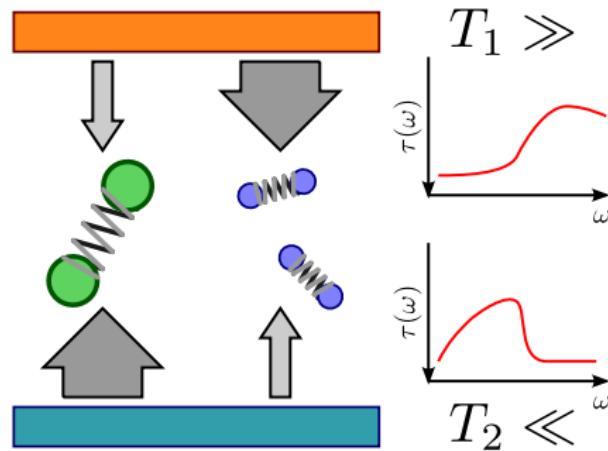
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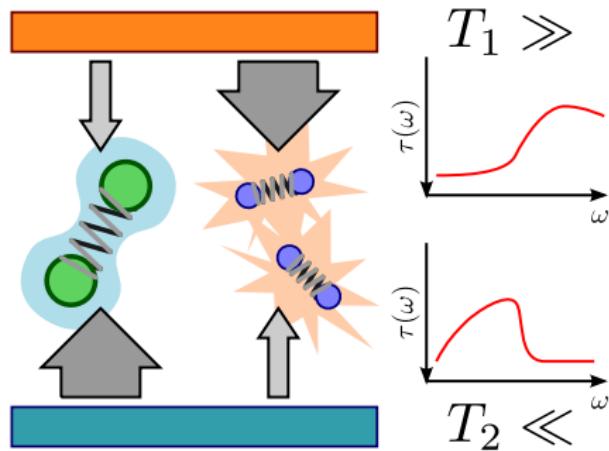
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- All applications so far had fluctuation-dissipation theorem satisfied,

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- Simple non-eq. example: two thermostats at different temperature and different coupling curves
 - A steady state will be reached with frequency-dependent T



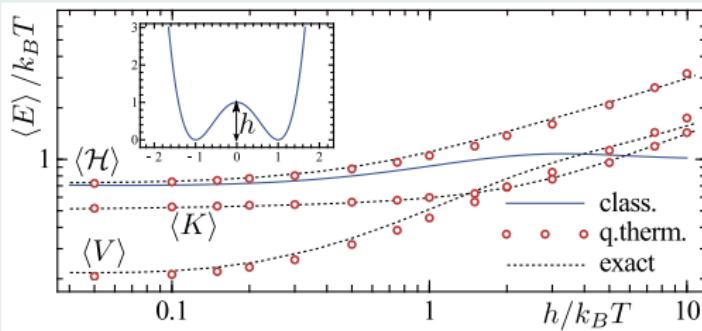
- A simple application: the δ -thermostat
 - Thermalize the normal modes in a narrow frequency window, keep all the others frozen
 - No need to know normal modes in advance!
 - A stochastic vibrational spectroscopy and $\mathcal{O}(N)$ eigensolver

Selective NM excitation in hexagonal ice. Comparison of the NVE density of states and that obtained by targeted δ -thermostats. Atomic displacements have been magnified for clarity.

- The finite-temperature density for a quantum harmonic oscillator is a Gaussian, with a frequency and temperature dependent width
 - This is the same as a classical distribution at the effective temperature $T^*(\omega) = (\hbar\omega/2k_B) \coth(\hbar\omega/2k_B T)$
 - We can enforce an ω -dependent temperature by an appropriate non-equilibrium GLE!

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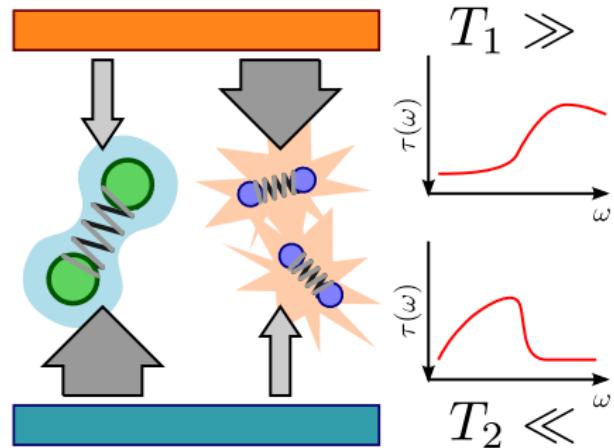
Quartic double well



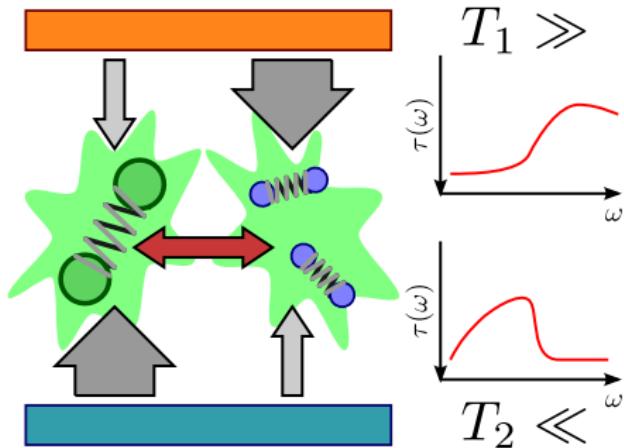
Distance between minima:
1 Å, comparison
between exact
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- The quantum thermostat costs as little as classical MD
 - $10\times$ to $100\times$ advantage over PI methods
- The momentum distribution can also be obtained

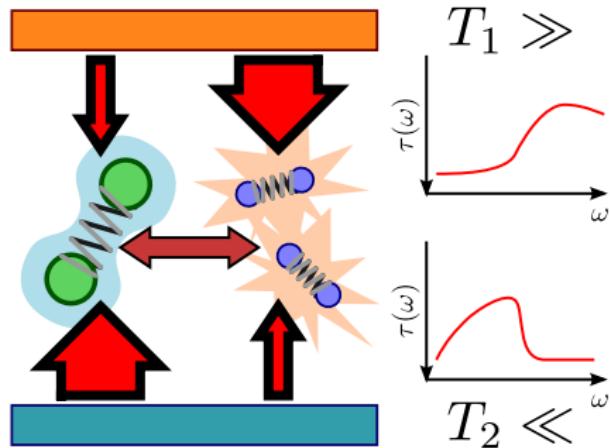
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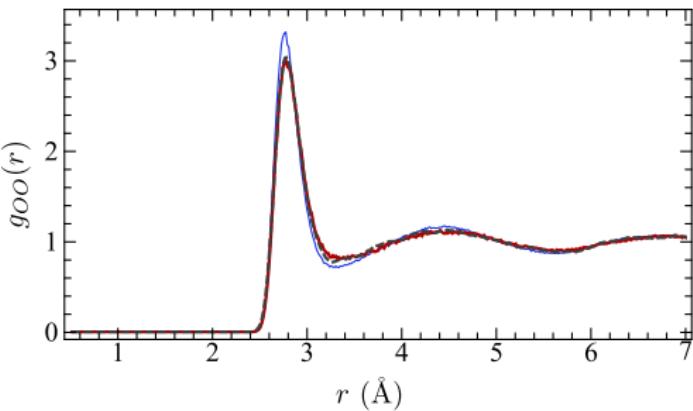
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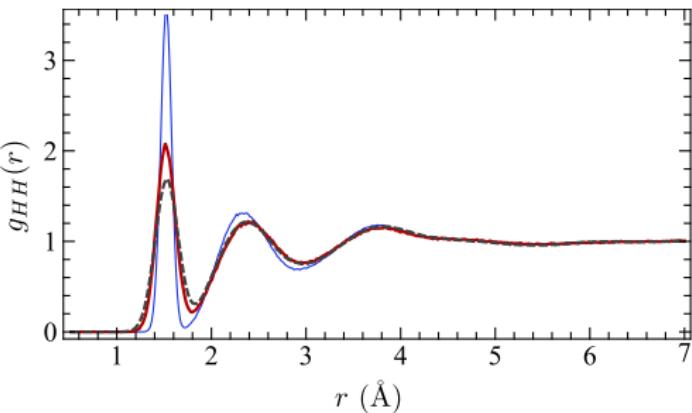
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Oxygen-oxygen correlation function

Blue: classic MD, black: PIMD (exact), red: quantum thermostat.

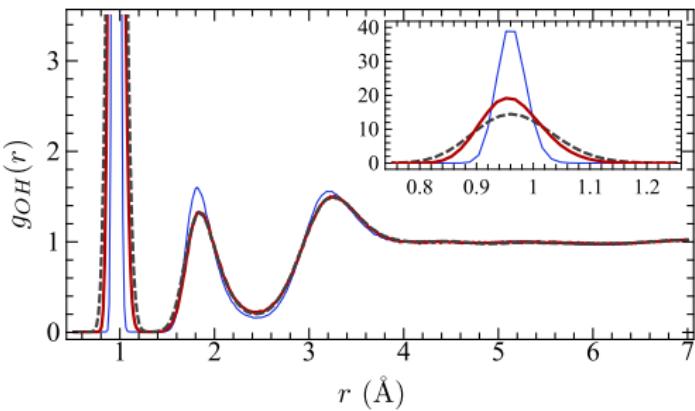
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Hydrogen-hydrogen correlation function.

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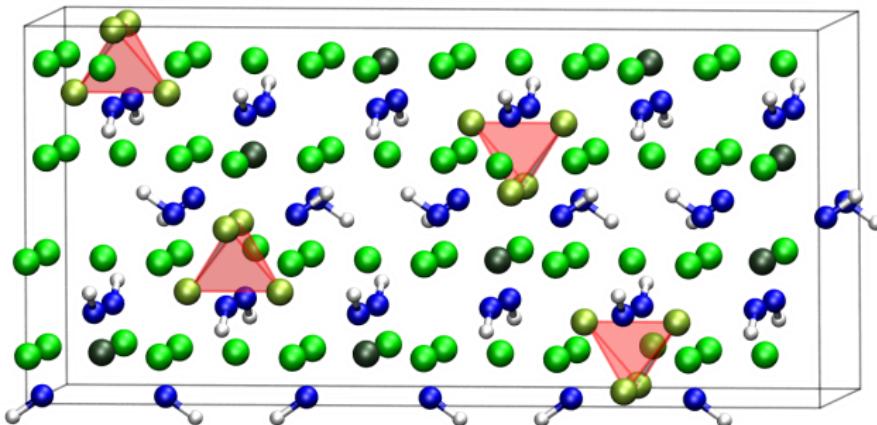
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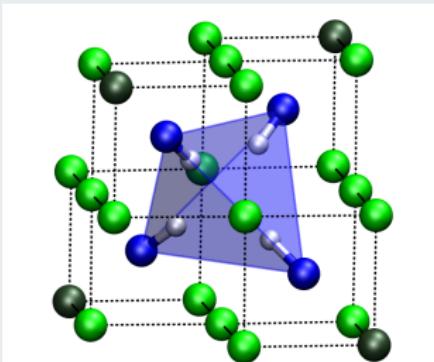
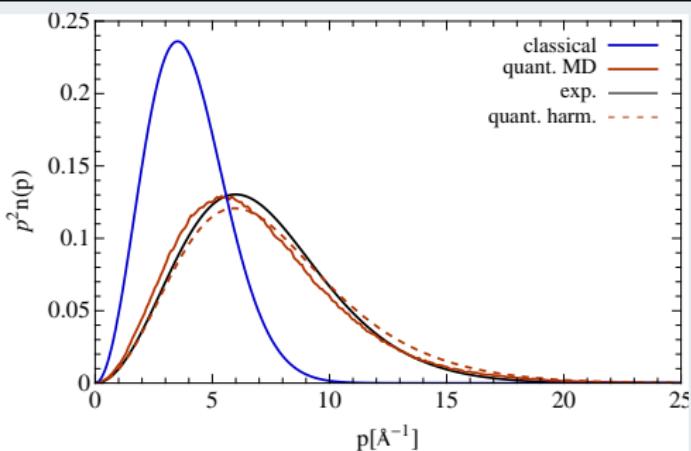
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- Ab initio analysis (no FF available), anharmonic system



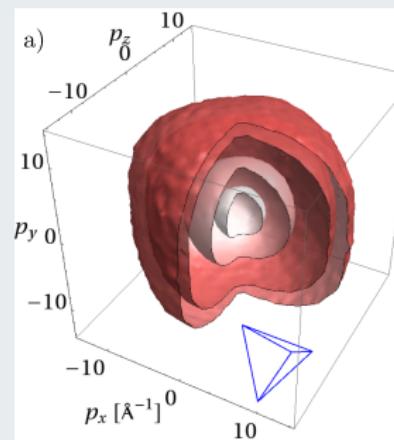
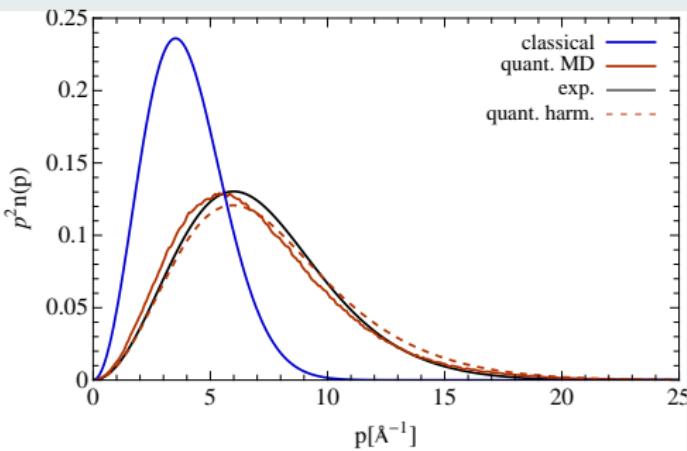
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Proton momentum distribution, theory & experiment



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- Non-Maxwellian momentum distribution is a purely quantum effect
 - Good agreement with inelastic neutron scattering experiments
 - More information in the directionally-resolved proton momentum distribution

Proton momentum distribution, theory & experiment

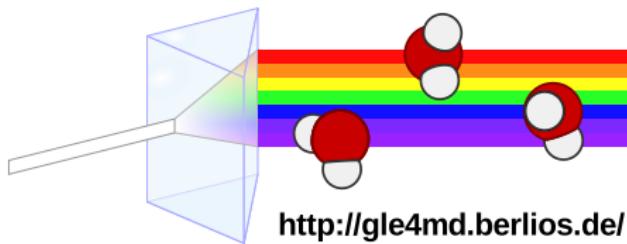


- Enhanced MD stochastic schemes based on GLEs
- Simple & robust: analytical predictions and fitting
- Flexible: many applications within the same framework
 - Canonical sampling (efficient, targeted, gentle on dynamics....)
 - Non-equilibrium GLE, unusual statistical ensembles (selected NM excitation, quantum thermostat)
- More to come: a long to-do list!
- A webpage with references, tutorials and sample code:
<http://gle4md.berlios.de/>

- Michele Parrinello
- Giovanni Bussi
- David Manolopoulos, Tom Markland
- Marco Bernasconi, Giacomo Miceli
- Gareth Tribello
- Everyone @ RGP



THANKS!



- In a velocity-Verlet integrator, we can propagate stepwise the nonlinear (q, p) coupling, and treat (p, s) exactly, using the free-particle propagator.

$$\begin{aligned}\dot{q} &= p/m \\ \begin{pmatrix} \dot{p} \\ \dot{s} \end{pmatrix} &= \begin{pmatrix} f(q) \\ \mathbf{0} \end{pmatrix} - \mathbf{A} \begin{pmatrix} p \\ s \end{pmatrix} + \mathbf{B} \xi\end{aligned}$$

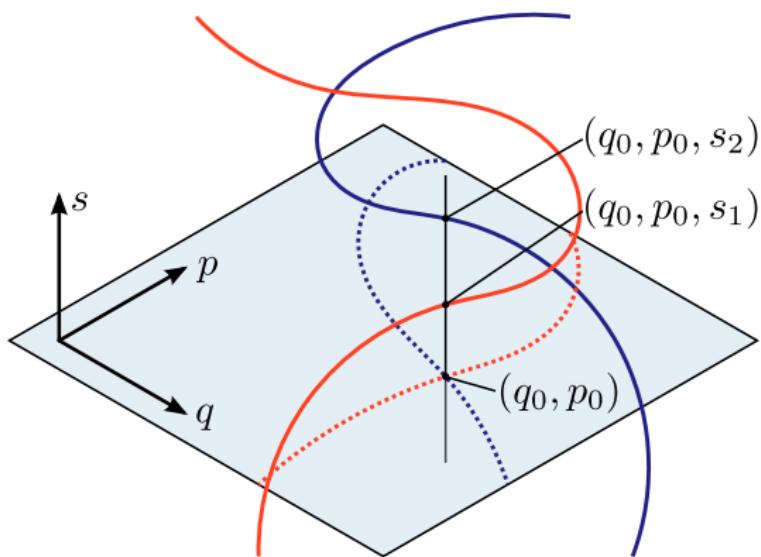
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- We must then solve the forward Chapman-Kolmogorov equation, computing $P [(p, s) ; \Delta t | (p_0, s_0) ; 0]$

$$\begin{pmatrix} \dot{p} \\ \dot{s} \end{pmatrix} = -\mathbf{A} \begin{pmatrix} p \\ s \end{pmatrix} + \mathbf{B} \boldsymbol{\xi} \quad \Rightarrow \quad P [(p, s), \Delta t | (p_0, s_0); 0]$$

- In a velocity-Verlet integrator, we can propagate stepwise the nonlinear (q, p) coupling, and treat (p, s) exactly, using the free-particle propagator.
- We must then solve the forward Chapman-Kolmogorov equation, computing $P [(p, s) ; \Delta t | (p_0, s_0) ; 0]$
- The distribution is Gaussian, so we can get the new position properly by knowing the new mean value and covariance matrix.

$$\begin{pmatrix} \dot{p} \\ \dot{s} \end{pmatrix} = -\mathbf{A} \begin{pmatrix} p \\ s \end{pmatrix} + \mathbf{B} \boldsymbol{\xi} \quad \Rightarrow \quad P [(p, s), \Delta t | (p_0, s_0); 0]$$
$$\Downarrow$$
$$\begin{pmatrix} p(t + \Delta t) \\ s(t + \Delta t) \end{pmatrix} = \mathbf{T}(\Delta t) \begin{pmatrix} p(t) \\ s(t) \end{pmatrix} + \mathbf{S}(\Delta t) \boldsymbol{\xi}$$
$$\mathbf{T} = e^{-\Delta t \mathbf{A}} \quad \mathbf{S} \mathbf{S}^T = m T [1 - \mathbf{T} \mathbf{T}^T]$$

- Markovian trajectories can be mapped to non-Markovian ones in a lower-dimensionality phase-space



- Consider the free-particle GLE in Markovian form

$$\begin{pmatrix} \dot{p} \\ \dot{s} \end{pmatrix} = - \begin{pmatrix} a_{pp} & \mathbf{a}_p^T \\ \bar{\mathbf{a}}_p & \mathbf{A} \end{pmatrix} \begin{pmatrix} p \\ s \end{pmatrix} + \mathbf{B}\boldsymbol{\xi}$$

- Consider the free-particle GLE in Markovian form
- Ansatz for the additional momenta, assuming $\mathbf{s}(-\infty) = 0$

$$\begin{pmatrix} \dot{p} \\ \dot{\mathbf{s}} \end{pmatrix} = - \begin{pmatrix} a_{pp} & \mathbf{a}_p^T \\ \bar{\mathbf{a}}_p & \mathbf{A} \end{pmatrix} \begin{pmatrix} p \\ \mathbf{s} \end{pmatrix} + \mathbf{B}\boldsymbol{\xi}$$

\Downarrow

$$\mathbf{s}(t) = \int_{-\infty}^t e^{-(t-t')\mathbf{A}} [-p(t') \bar{\mathbf{a}}_p + \mathbf{B}\boldsymbol{\xi}(t')] dt'$$

- Consider the free-particle GLE in Markovian form
- Ansatz for the additional momenta, assuming $\mathbf{s}(-\infty) = 0$
- Verify that the original GLE is satisfied, and that one can write \dot{p} in non-Markovian form

$$\begin{pmatrix} \dot{p} \\ \dot{\mathbf{s}} \end{pmatrix} = - \begin{pmatrix} a_{pp} & \mathbf{a}_p^T \\ \bar{\mathbf{a}}_p & \mathbf{A} \end{pmatrix} \begin{pmatrix} p \\ \mathbf{s} \end{pmatrix} + \mathbf{B}\xi$$

$$\downarrow$$

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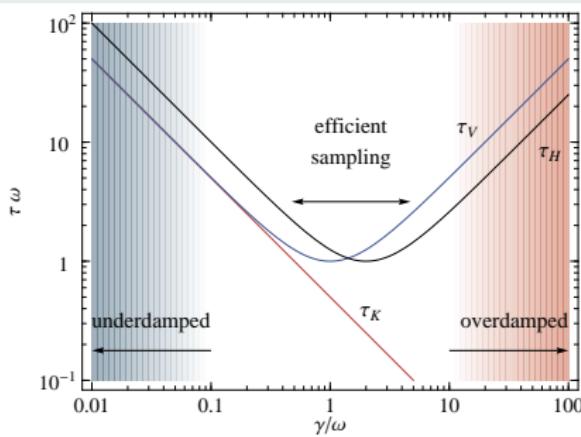
$$\downarrow$$

$$\dot{p} = \dots = - \int_0^\infty K(t') p(t-t') dt' + \sqrt{mT} \zeta(t)$$

$$K(t) = 2a_{pp}\delta(t) - \mathbf{a}_p^T e^{-|t|\mathbf{A}} \bar{\mathbf{a}}_p \quad \zeta(t) = \dots$$

- Measure statistical sampling efficiency by the correlation time, i.e. $\tau_{\mathcal{H}} = \int_0^\infty \langle H(t) H(0) \rangle dt$
- For white noise and harmonic potential, a simple closed-form expression can be found

White-noise correlation times



Correlation times of kinetic, potential and total energy:

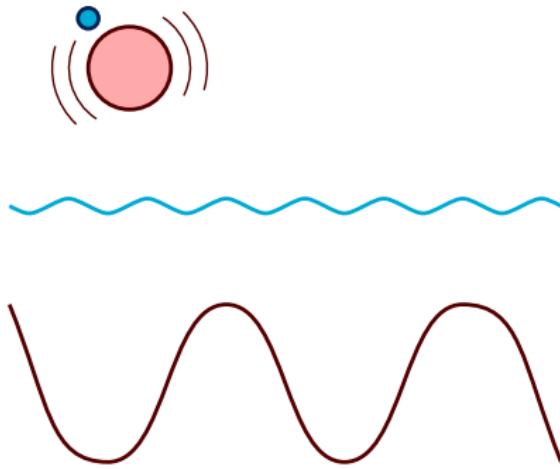
$$\tau_K = 1/2\gamma$$

$$\tau_V = 1/2\gamma + \gamma/2\omega^2$$

$$\tau_{\mathcal{H}} = 1/\gamma + \gamma/4\omega^2$$

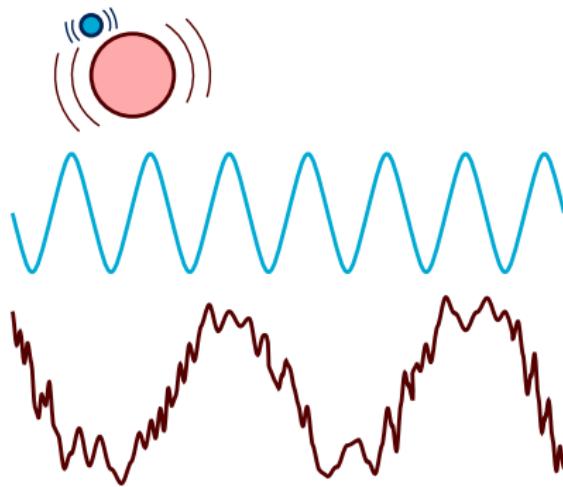
- Based on adiabatic separation: fast modes must remain cold

CPMD

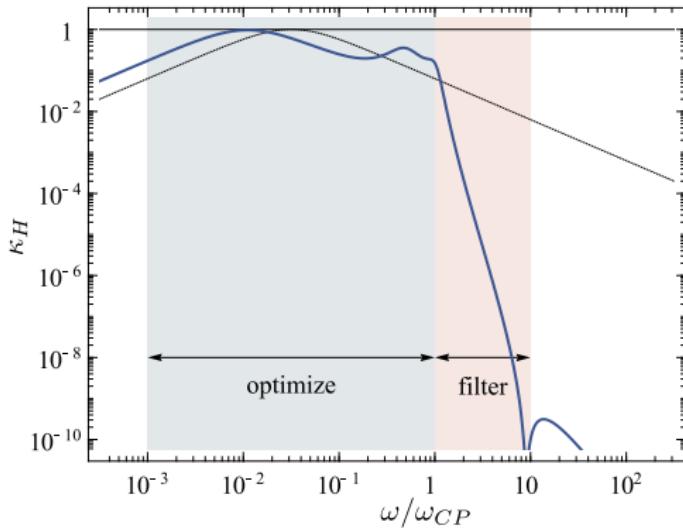


- Based on adiabatic separation: fast modes must remain cold
 - White noise quickly disrupts adiabatic behavior.

CPMD + noise

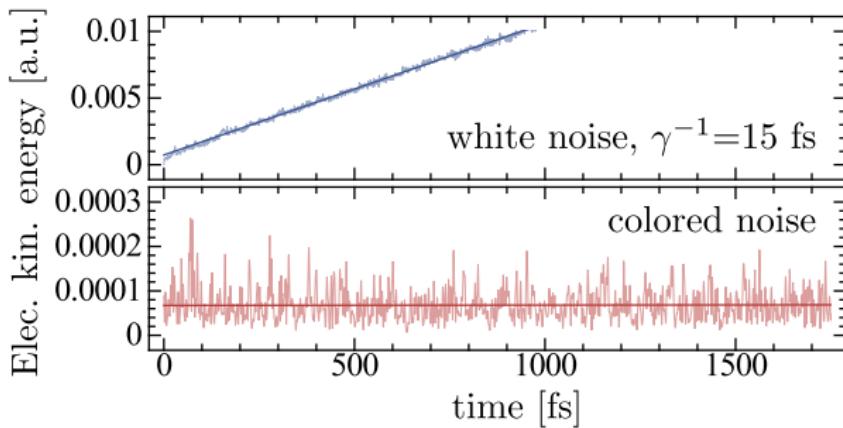


- Based on adiabatic separation: fast modes must remain cold
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 - With GLE one can enforce *loose* coupling, and at the same time optimize sampling for ions



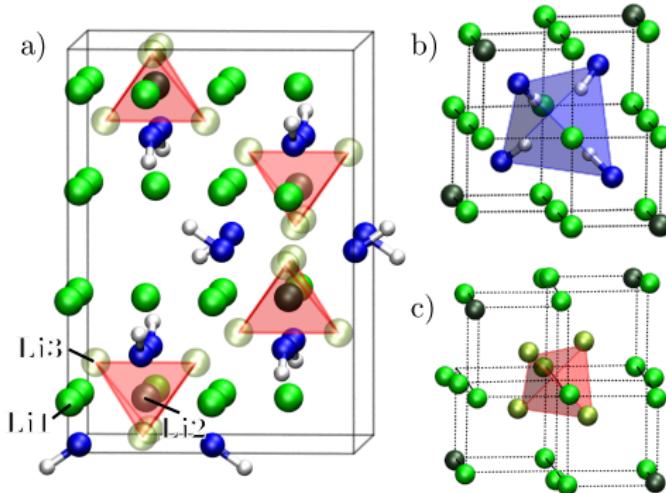
Response curve for a GLE fitted for CPMD

- Based on adiabatic separation: fast modes must remain cold
 - White noise quickly disrupts adiabatic behavior.
 - With GLE one can enforce *loose* coupling, and at the same time optimize sampling for ions



Drift of electronic temperature, white noise vs GLE (a water molecule in vacuum)

- Partially disordered structure with fractional occupations.
 - Intrinsic Li vacancies coordinated by imide groups
 - Tetrahedral clusters of interstitials key to explain local structure



- Strongly anharmonic system
 - Librations of NH groups.
 - Quasi-harmonic description is inadequate
 - Pronounced quantum effects on hydrogens

Distribution of hydrogens

