# **Density-Functional Theory for Practitioners - Tutorial 4**

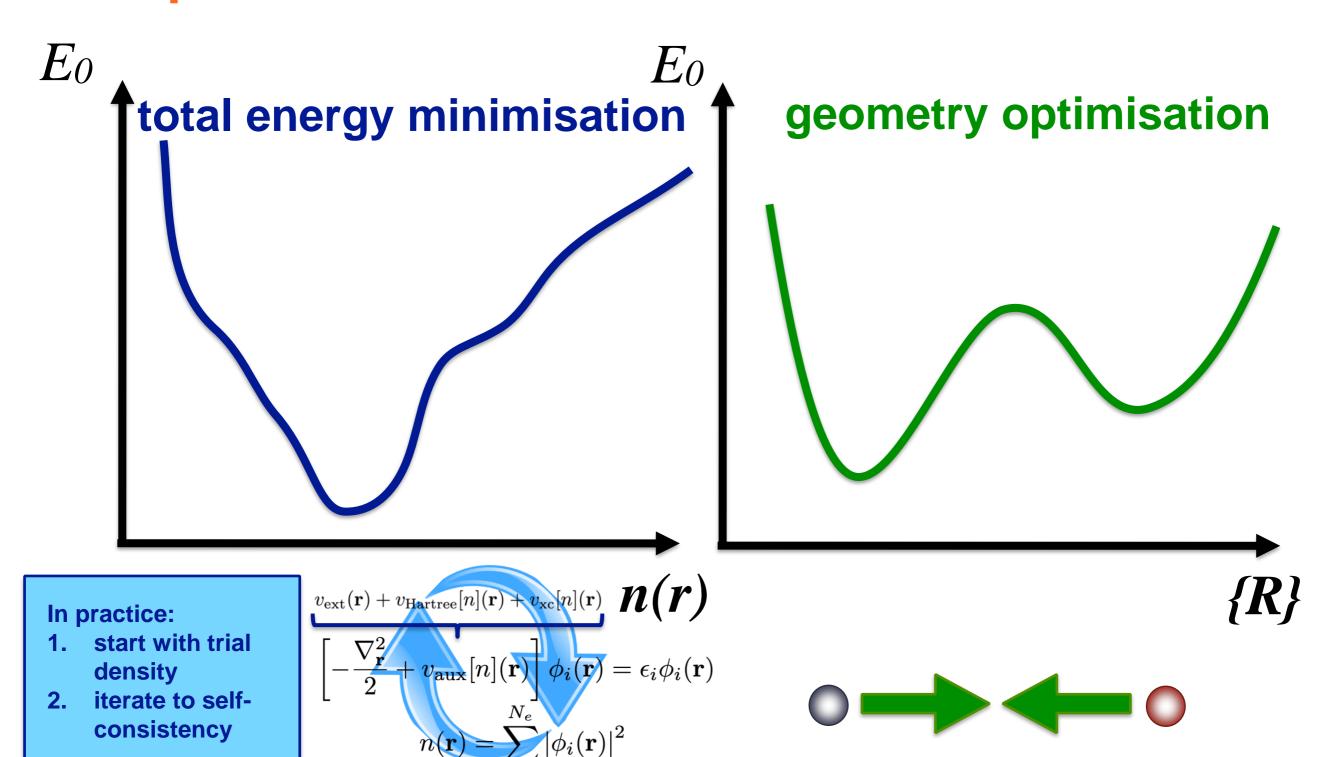
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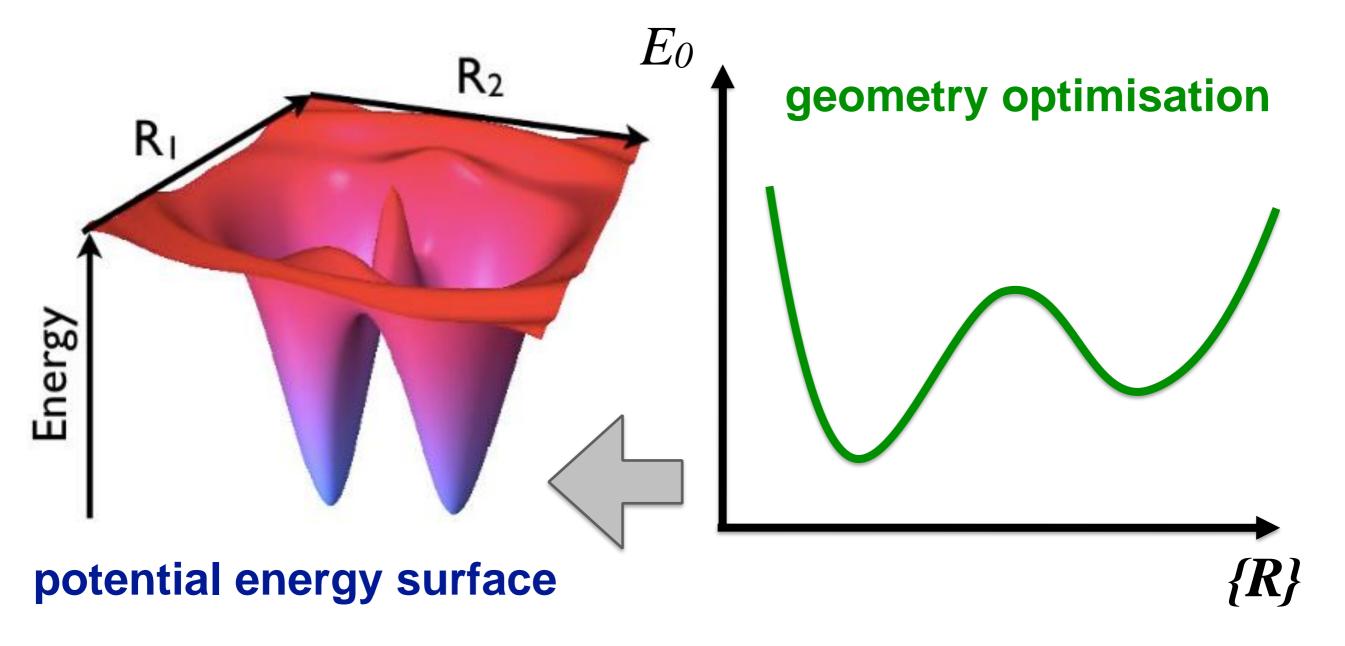


#### Recap - two minimisations in DFT structure search



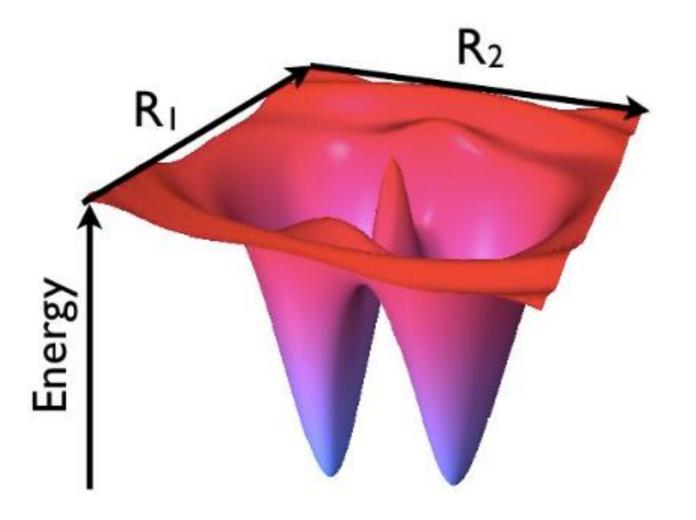


## DFT potential energy surface





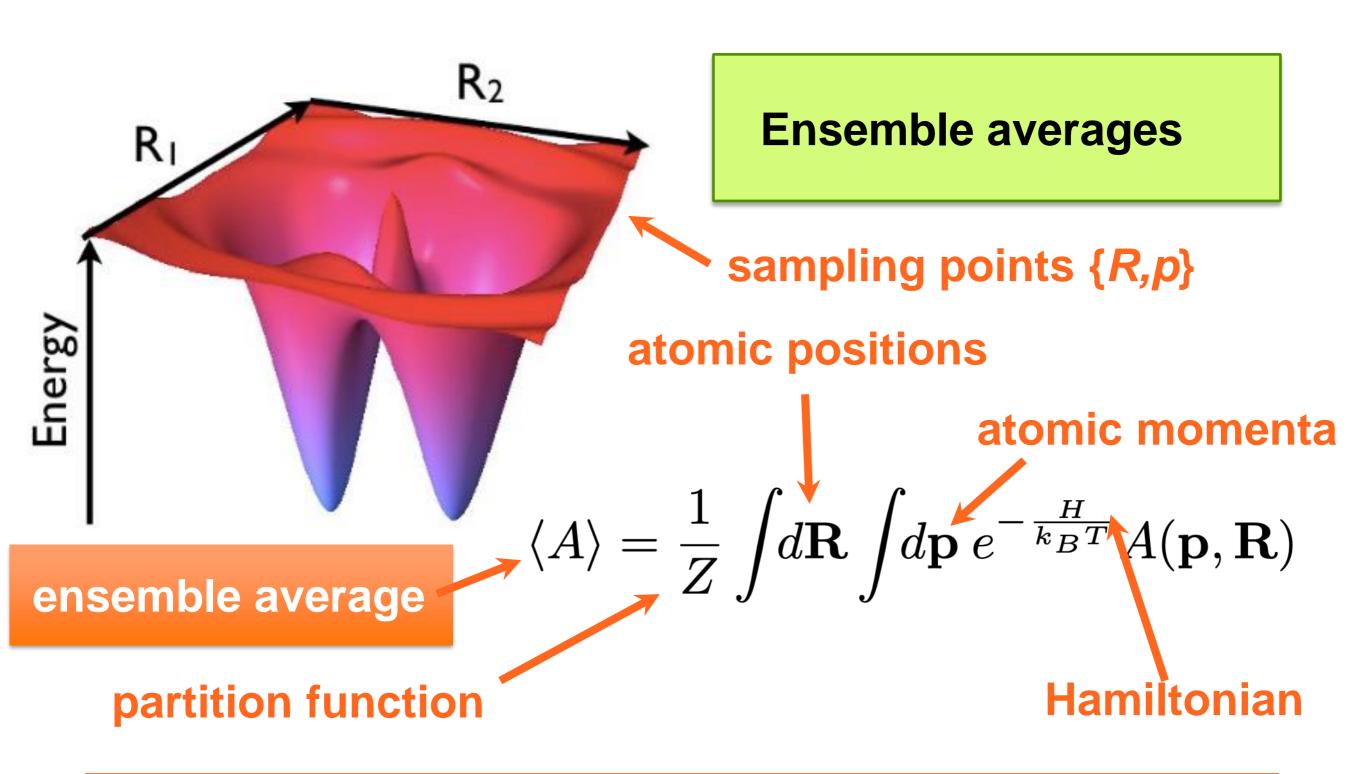
#### DFT molecular dynamics (MD)



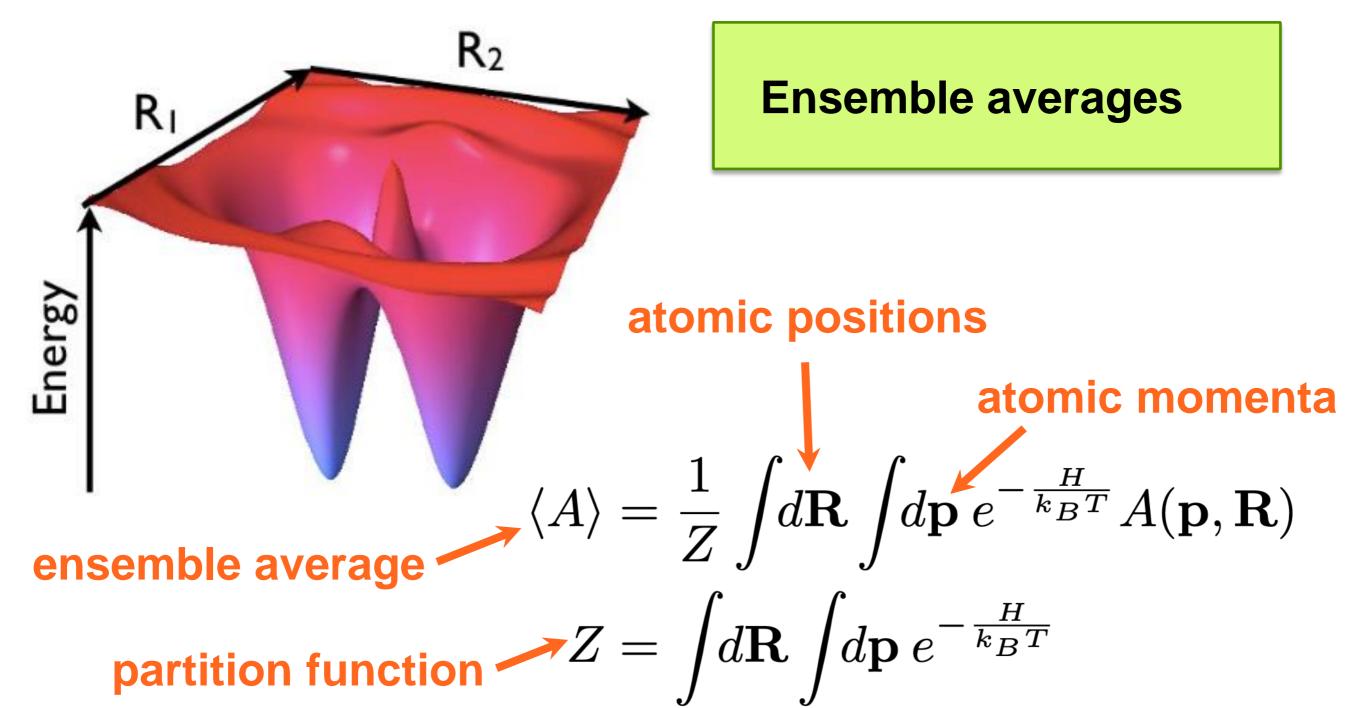
Molecular dynamics or how to move on a potential energy surface.

potential energy surface

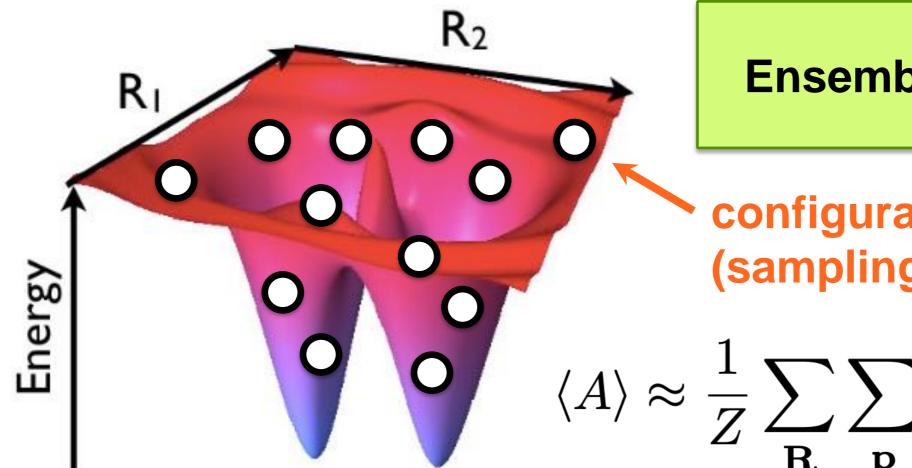












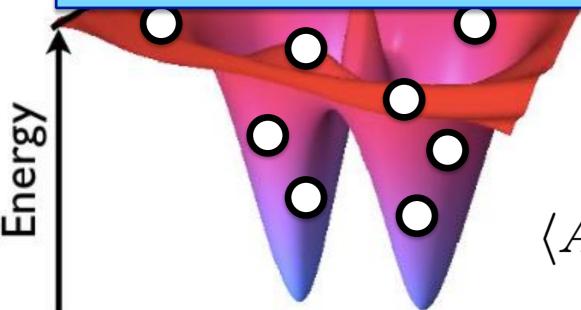
**Ensemble averages** 

configuration (sampling points {*R*,*p*})

$$\langle A \rangle pprox \frac{1}{Z} \sum_{\mathbf{R}} \sum_{\mathbf{p}} e^{-\frac{H}{k_B T}} A(\mathbf{p}, \mathbf{R})$$

Compute by summing over configurations.

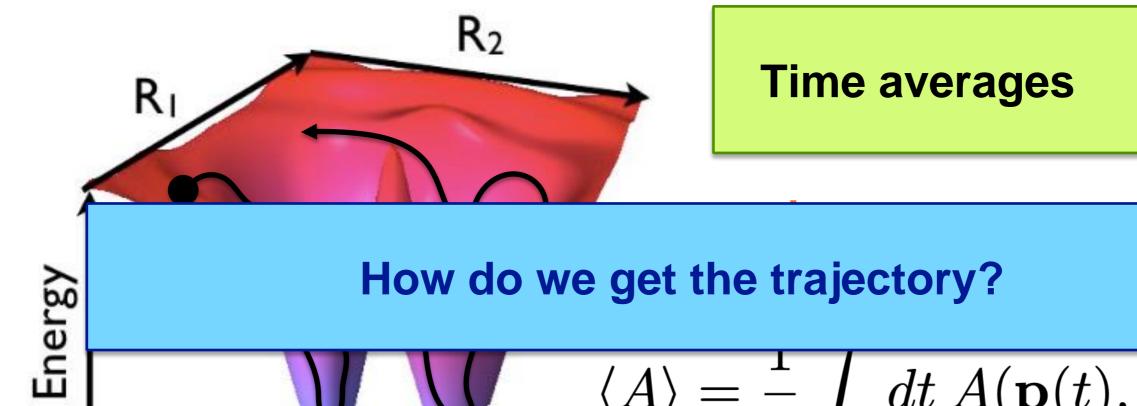
#### Is there a different way we can proceed?



configuration (sampling points {*R*,*p*})

$$\langle A \rangle pprox \frac{1}{Z} \sum_{\mathbf{R}} \sum_{\mathbf{p}} e^{-\frac{H}{k_B T}} A(\mathbf{p}, \mathbf{R})$$

- We might need a lot of configurations.
- We do not necessarily know how to find them.



 $\langle A \rangle = \frac{1}{\tau} \int_0^{\infty} dt \, A(\mathbf{p}(t), \mathbf{R}(t))$ 

Ergodic hypothesis: ensemble averages equal time averages



#### Remember lecture 1

We could propagate the Schrödinger equation:

$$\mathcal{H}\Psi(t) = \mathrm{i}\frac{\partial}{\partial t}\Psi(t)$$

This would treat the nuclei quantum mechanically, but that is maybe not what we want.

Back to classical nuclei and DFT.



#### The full Hamiltonian

$$H(\circ\circ\circ\ldots\circ\circ\circ\ldots)$$

$$\mathcal{H} = -\sum_{I=1}^{N_n} \frac{\nabla_{\mathbf{R}_I}^2}{2M_I} + \sum_{I=1}^{N_n} \sum_{J>I}^{N_n} \frac{Z_I Z_J}{|\mathbf{R}_I - \mathbf{R}_J|}$$

$$-\sum_{i=1}^{N_e} \frac{\nabla_{\mathbf{r}_i}^2}{2} + \sum_{i=1}^{N_e} \sum_{j>i}^{N_e} \frac{1}{|\mathbf{r}_i - \mathbf{r}_j|} + \sum_{i=1}^{N_e} \sum_{J=1}^{N_n} \frac{-Z_J}{|\mathbf{r}_i - \mathbf{R}_J|}$$

$$V^{ee}$$

#### The full Hamiltonian

$$H(\circ \circ \ldots \circ \circ \circ \ldots)$$

$$\mathcal{H} = -\sum_{I=1}^{N_n} rac{
abla_{\mathbf{R}_I}^T}{2M_I} + \sum_{I=1}^{N_n} \sum_{J>I}^{N_n} rac{Z_I Z_J}{|\mathbf{R}_I - \mathbf{R}_J|}$$

$$+E_{\mathrm{DFT}}^{e}(\{\mathbf{R}\})$$

We have solved the electronic problem.

#### The full Hamiltonian

$$H(\bullet \bullet \bullet \ldots \bullet \bullet \bullet \ldots)$$

$$\mathcal{H} = -\sum_{I=1}^{N_n} rac{
abla_{\mathbf{R}_I}^2}{2M_I} + \sum_{I=1}^{N_n} \sum_{J>I}^{N_n} rac{Z_I Z_J}{|\mathbf{R}_I - \mathbf{R}_J|}$$

$$+E^e_{
m DFT}(\{{f R}\})$$
 potential energy surface  $V(\{{f R}\})$ 

#### Classical Hamiltonian for the nuclei

$$H(\circ \circ \ldots)$$

$$\mathcal{H} = \sum_{I=1}^{N_n} \frac{\mathbf{p}_I^2}{2M_I} + V(\{\mathbf{R}\})$$

classical Hamiltonian

## Molecular dynamics

$$\mathcal{H} = \sum_{I=1}^{N_n} \frac{\mathbf{p}_I^2}{2M_I} + V(\{\mathbf{R}\})$$

classical Hamiltonian

$$\mathbf{F}_{I} = -\frac{\partial \mathcal{H}}{\partial \mathbf{R}_{I}} = -\frac{\partial V(\{\mathbf{R}\})}{\partial \mathbf{R}_{I}}$$

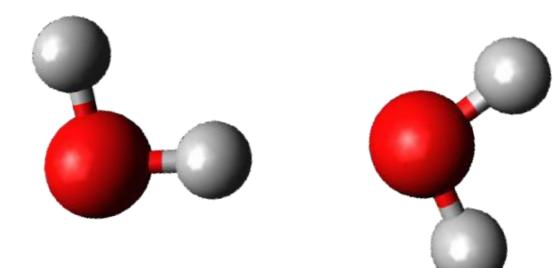
**Forces** 

$$\mathbf{F}_I = M_I \mathbf{R}_I$$
$$= M_I \mathbf{a}_I$$

Newton's equation of motion

## Molecular dynamics — moving atoms

$$\mathbf{F}_I = M_I \ddot{\mathbf{R}}_I$$



at time t

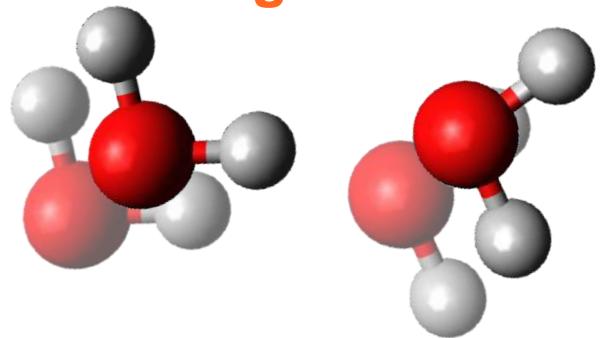
velocities: 
$$\mathbf{v}_I(t) = \dot{\mathbf{R}}_I(t)$$

positions:  $\mathbf{R}_I(t)$ 

Molecular dynamics — moving atoms

$$\mathbf{F}_I = M_I \ddot{\mathbf{R}}_I$$

at time  $t + \Delta t$ 



velocities:  $\mathbf{v}_I(t+\Delta t)$ 

positions:  $\mathbf{R}_I(t+\Delta t)$ 

move atoms according to forces

## Numeric integration — naive propagation

#### We start from Taylor expansion:

$$\mathbf{R}(t + \Delta t) = \mathbf{R}(t) + \dot{\mathbf{R}}\Delta t + \frac{1}{2}\ddot{\mathbf{R}}\Delta t^2 + \frac{1}{6}\ddot{\mathbf{R}}\Delta t^3 + \dots$$

Usual approximation: truncation

$$\mathbf{R}(t+\Delta t) = \mathbf{R}(t) + \dot{\mathbf{R}}\Delta t + \frac{1}{2}\ddot{\mathbf{R}}\Delta t^2$$
 velocity  $\mathbf{v}$  acceleration  $\mathbf{a}$ 

## Numeric integration — naive propagation

- Not time reversible!
- Does not conserve volume in phase space!
- Suffers from energy drift!

Usual approximation: truncation

$$\mathbf{R}(t+\Delta t) = \mathbf{R}(t) + \dot{\mathbf{R}}\Delta t + \frac{1}{2}\ddot{\mathbf{R}}\Delta t^2$$
 velocity  $\mathbf{v}$  acceleration  $\mathbf{a}$ 



## Numeric integration — Verlet algorithm

#### Taylor expansion for $+ \Delta t$ and $- \Delta t$

$$\mathbf{R}(t + \Delta t) = \mathbf{R}(t) + \dot{\mathbf{R}}\Delta t + \frac{1}{2}\ddot{\mathbf{R}}\Delta t^2 + \frac{1}{6}\ddot{\mathbf{R}}\Delta t^3 + \dots$$
$$\mathbf{R}(t - \Delta t) = \mathbf{R}(t) - \dot{\mathbf{R}}\Delta t + \frac{1}{2}\ddot{\mathbf{R}}\Delta t^2 - \frac{1}{6}\ddot{\mathbf{R}}\Delta t^3 + \dots$$

#### The sum gives:

$$\mathbf{R}(t + \Delta t) + \mathbf{R}(t - \Delta t) = 2\mathbf{R}(t) + \ddot{\mathbf{R}}\Delta t^2 + \mathcal{O}(\Delta t^4)$$

## Numeric integration — Verlet algorithm

#### Taylor expansion for $+ \Delta t$ and $- \Delta t$

$$\mathbf{R}(t + \Delta t) = \mathbf{R}(t) + \dot{\mathbf{R}}\Delta t + \frac{1}{2}\ddot{\mathbf{R}}\Delta t^2 + \frac{1}{6}\ddot{\mathbf{R}}\Delta t^3 + \dots$$
$$\mathbf{R}(t - \Delta t) = \mathbf{R}(t) - \dot{\mathbf{R}}\Delta t + \frac{1}{2}\ddot{\mathbf{R}}\Delta t^2 - \frac{1}{6}\ddot{\mathbf{R}}\Delta t^3 + \dots$$

#### The sum gives, which is:

$$\mathbf{R}(t + \Delta t) = 2\mathbf{R}(t) - \mathbf{R}(t - \Delta t) + \mathbf{R}\Delta t^{2}$$



## Numeric integration — Verlet algorithm

- Time reversible!
- Conserve volume in phase space!
- No energy drift!

#### The sum gives, which is:

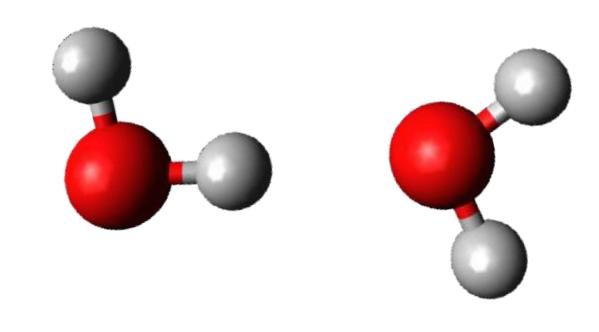
$$\mathbf{R}(t + \Delta t) = 2\mathbf{R}(t) - \mathbf{R}(t - \Delta t) + \ddot{\mathbf{R}}\Delta t^{2}$$



## Molecular dynamics in practice

Converge DFT calculation

Calculate forces

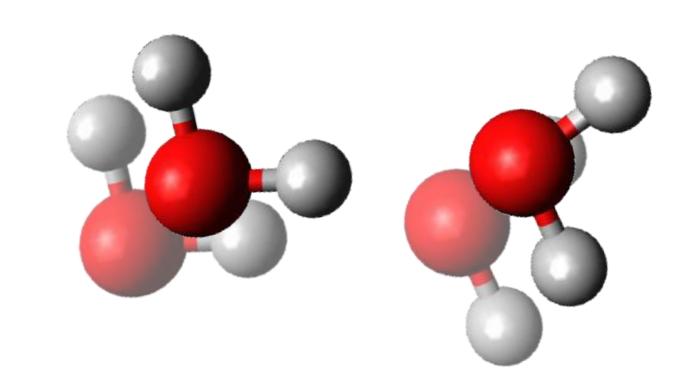


#### Molecular dynamics in practice

Initial v(0), R(0)

**Converge DFT calculation** 

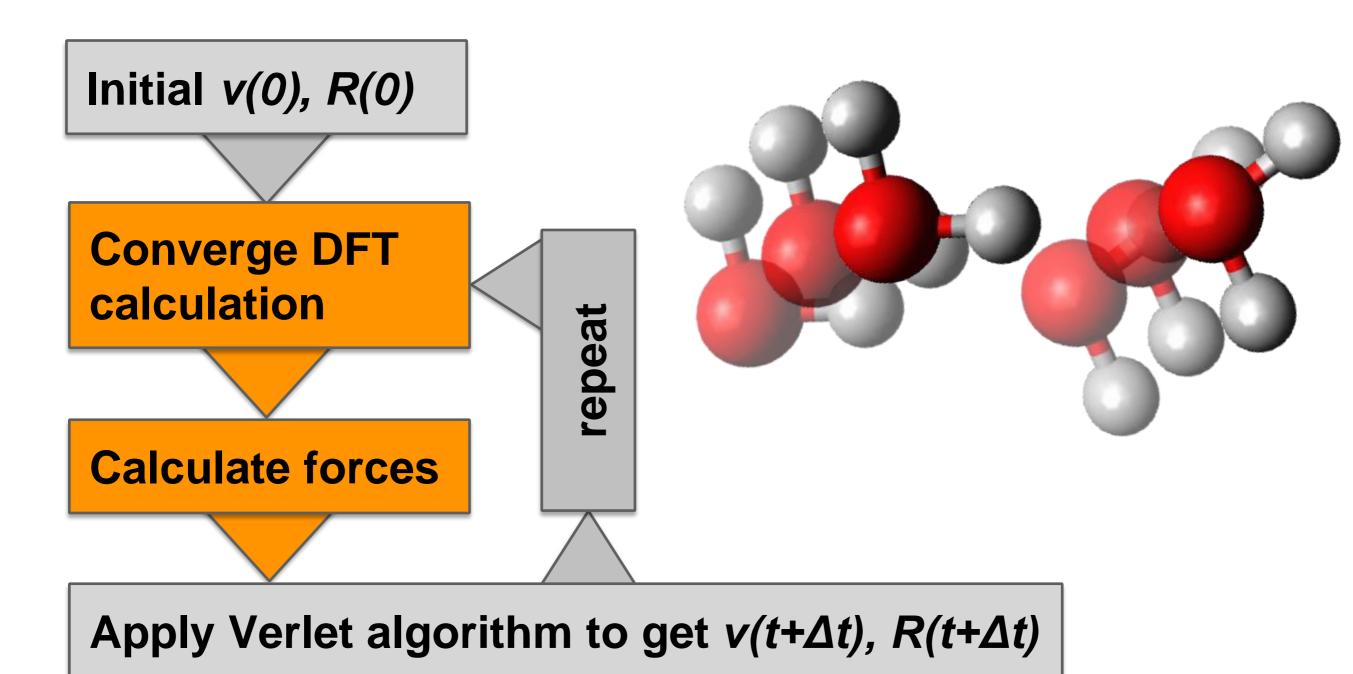
**Calculate forces** 



Apply Verlet algorithm to get  $v(t+\Delta t)$ ,  $R(t+\Delta t)$ 

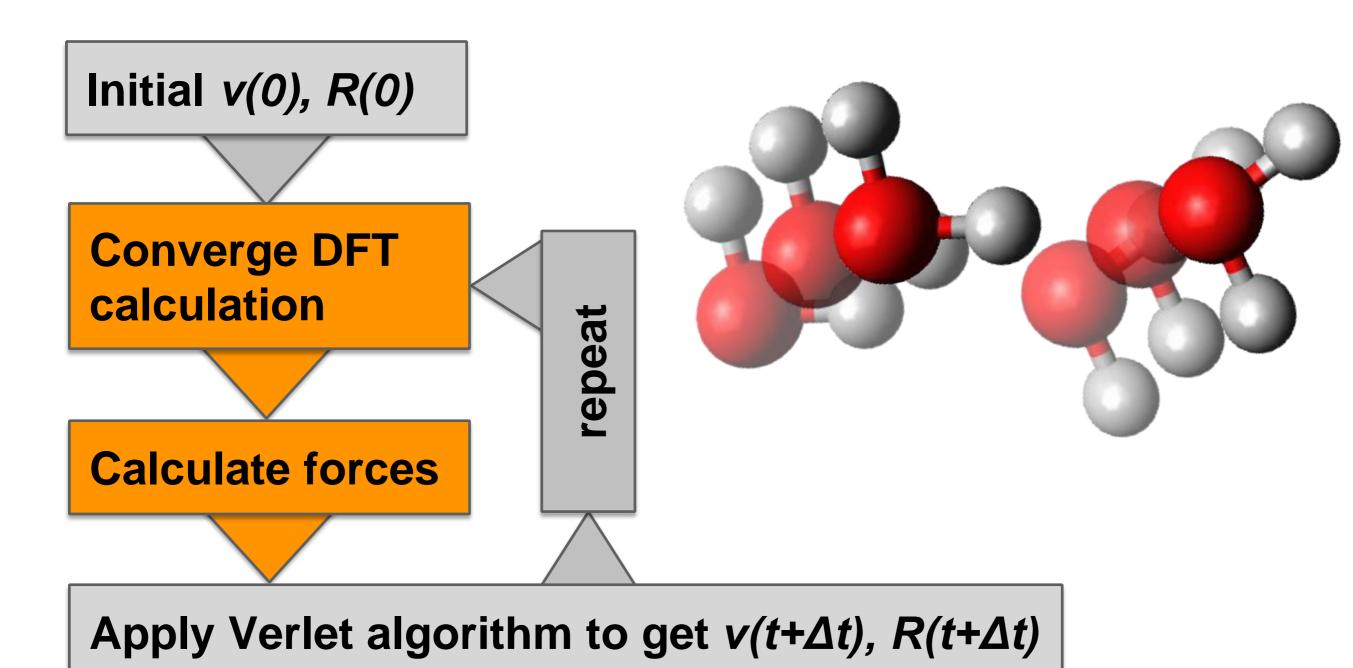


## Molecular dynamics in practice





## **Questions – DFT MD in practice?**





## Thermodynamic ensembles

	conserved quantities
Micro-canonical ensemble (NVE)	# particles, volume, energy
Canonical ensemble (NVT)	# particles, volume, temperature
NPT or NPH ensemble (for phase transitions)	# particles, pressure, temperature or enthalpy
Grand-canonical ensemble (µVT) (for ad- or desorption)	chemical potential, volume, temperature



## FHI-aims MD settings

#### FHI-aims technical detail:

settings for molecular dynamics calculations:

MD\_run time ensemble

 specify total simulation time and the MD ensemble

MD\_time\_step deltat

: set the MD time step

sc\_accuracy\_forces

: request an appropriate force accuracy

#### Thermodynamic ensembles

	conserved quantities
Micro-canonical ensemble (NVE)	# particles, volume, energy

## typical MD ensemble (follows directly from Newton's equation of motion)

NPT or NPH ensemble # particles, pressure, for phase transitions) # temperature or enthalpy

Grand-canonical ensemble chemical potential, volume (µVT) (for ad- or desorption) temperature



## Thermodynamic ensembles

conserved quantities

Micro-canonical ensemble (NVE)

# particles, volume, energy

Canonical ensemble (NVT)

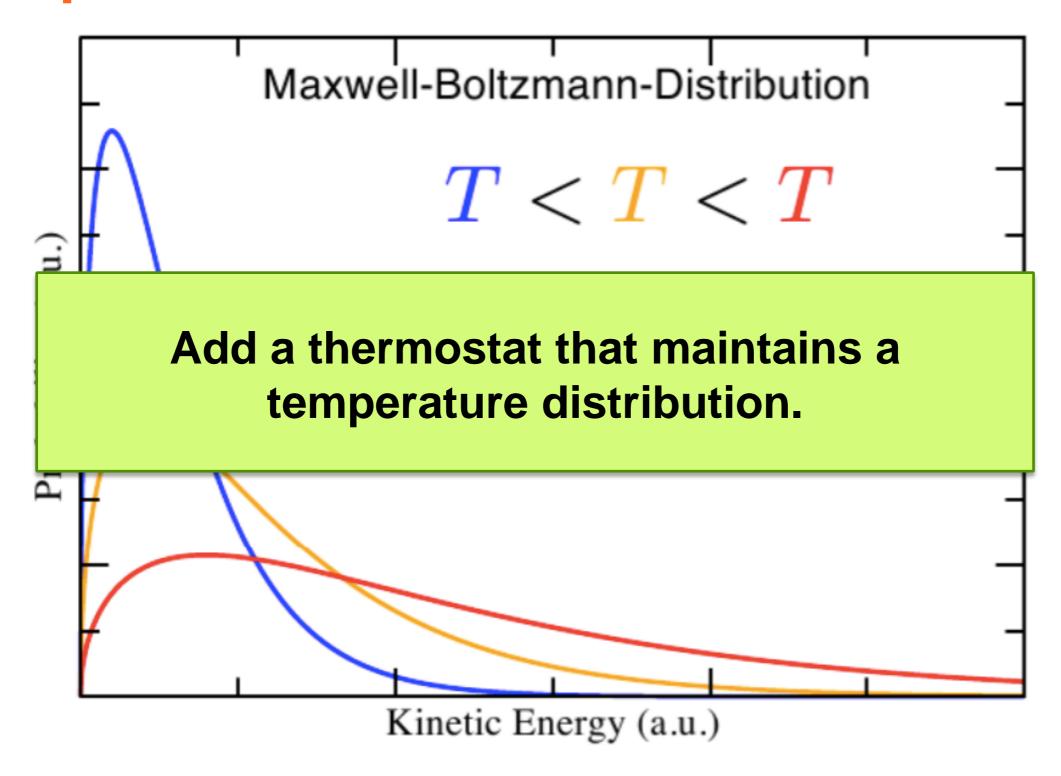
# particles, volume, temperature

What about this ensemble?

Need to maintain a constant temperature.

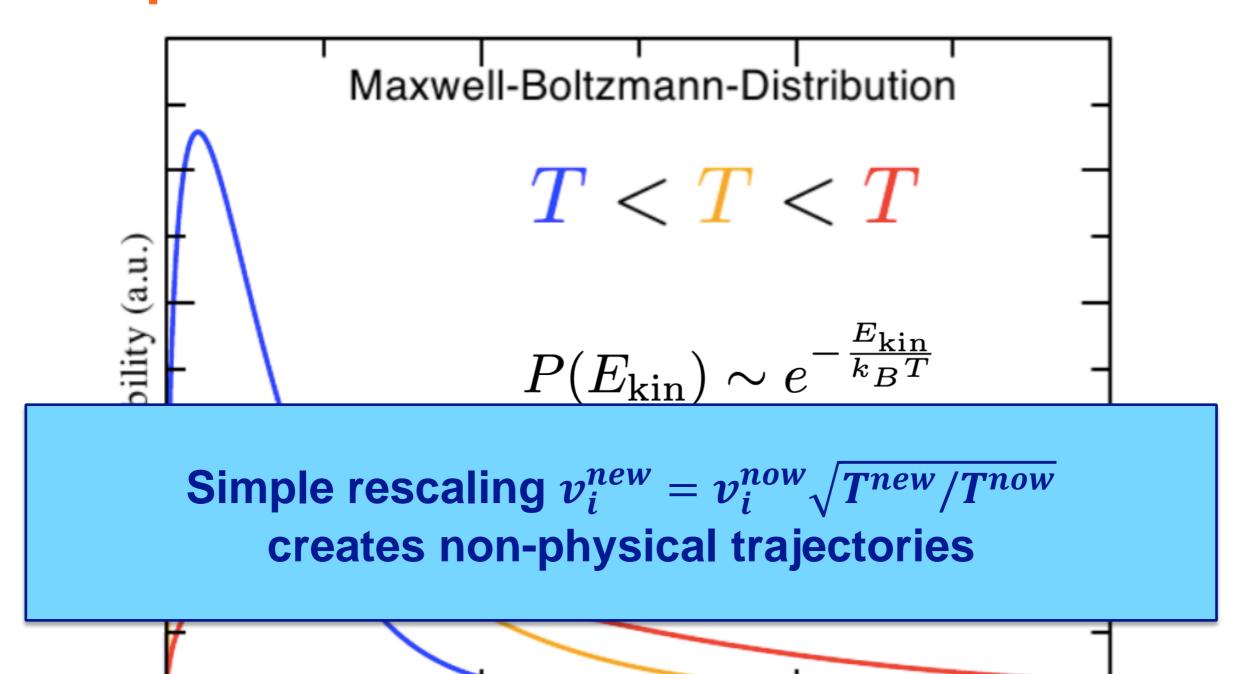


#### **Temperature distributions**





#### **Temperature distributions**



Kinetic Energy (a.u.)



#### Nosé-Hoover thermostat

$$\mathcal{H} = \sum_{I=1}^{N_n} \frac{(\mathbf{p}_I')^2}{2M_I} + V(\{\mathbf{R}\}) + \frac{p_{\eta}^2}{2Q} + 3Nk_B T \eta$$

original Hamiltonian

heat bath (in form of fictitious oscillator)

One of possible thermostats giving appropriate trajectories (close to the wanted T)

#### Nosé-Hoover thermostat

fictitious mass

$$\mathcal{H} = \sum_{I=1}^{N_n} \frac{(\mathbf{p}_I')^2}{2M_I} + V(\{\mathbf{R}\}) + \frac{p_{\eta}^2}{2Q} + 3Nk_B T \eta$$

original Hamiltonian

heat bath (in form of fictitious oscillator)

$$\mathbf{p}_I' = \frac{\mathbf{p}_I}{s}$$
 scaled momenta

#### Nosé-Hoover thermostat

fictitious mass

$$\mathcal{H} = \sum_{I=1}^{N_n} \frac{(\mathbf{p}_I')^2}{2M_I} + V(\{\mathbf{R}\}) + \frac{p_{\eta}^2}{2Q} + 3Nk_B T \eta$$

original Hamiltonian

heat bath (in form of fictitious oscillator)

$$\dot{\mathbf{p}}_I' = \mathbf{F}_I - \frac{p_\eta}{Q} \mathbf{p}_I' \quad \mbox{momenta are damped} \\ \mbox{by fictitious mass}$$

This is what maintains a constant temperature.



#### **Questions?**

fictitious mass

$$\mathcal{H} = \sum_{I=1}^{N_n} \frac{(\mathbf{p}_I')^2}{2M_I} + V(\{\mathbf{R}\}) + \frac{p_{\eta}^2}{2Q} + 3Nk_B T \eta$$

original Hamiltonian

heat bath (in form of fictitious oscillator)

$$\dot{\mathbf{p}}_I' = \mathbf{F}_I - \frac{p_\eta}{Q} \mathbf{p}_I' \quad \mbox{momenta are damped} \\ \mbox{by fictitious mass}$$

This is what maintains a constant temperature.



## **Computational Project**



**Preassignment for next Monday:** 

Read *Planning a Computational Project* chapter (on MyCourses->Lectures>Lecture 5)

#### **Questions?**

#### Enjoy our "DFT MD & dispersion interactions" tutorial:

- Download from Mycourses
- /work/courses/unix/PHYS/E0546/TUTORIALS
- Ask for printouts

#### Interesting links related to the tutorial: More information on

Thermostats: <a href="https://nanohub.org/resources/7576/download/Martini\_L4\_T">https://nanohub.org/resources/7576/download/Martini\_L4\_T</a> <a href="https://emperatureControl.pdf">emperatureControl.pdf</a>

https://www2.mpip-mainz.mpg.de/~andrienk/journal\_club/thermostats.pdf http://www.courses.physics.helsinki.fi/fys/moldyn/lectures/L5.pdf

And also FHI-aims manual.

Don't forget to put your name in the list of attendance!



