#### Ab Initio Molecular Dynamics

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#### **Molecular Simulation**







# **Molecular Dynamics**

Behavior of many atoms and molecules

 $\Delta t \approx 1 \, \text{fs} = 0.00000000000001 \, \text{sec}$ 

atom positions and velocities

$$r(t + \Delta t) = r(t) + v(t + \Delta t/2)\Delta t$$
$$v(t + \Delta t/2) = v(t - \Delta t/2) + \Delta t \frac{f(t)}{m}$$

#### forcefield

$$V(\mathbf{r}) = \sum_{bonds} k_r (r - r_{eq})^2 + \sum_{angles} k_\theta (\theta - \theta_{eq})^2 + \sum_{dihedrals} \frac{1}{2} \nu_n (1 + \cos(n\phi - \phi_0)) + \sum_{i < j} \left( \frac{a_{ij}}{r_{ij}^{12}} - \frac{b_{ij}}{r_{ij}^6} + \frac{q_i q_j}{\epsilon r_{ij}} \right)$$

bonds

bends

torsions

non-bonded

Schrödinger equation

$$\hat{H}\Psi = E\Psi$$

**Density Functional Theory** 

$$E = E[\rho(\mathbf{r})]$$
$$\rho(\mathbf{r}) = 2\sum_{i} \psi_{i}^{*}(\mathbf{r})\psi_{i}(\mathbf{r})$$

#### **Electronic Structure**



# Electronic structure theory and Molecular dynamics



#### A happy marriage

Quantum chemistry and Statistical Mechanics



chemistry in explicit water



Ab initio Molecular Dynamics

Car-Parrinello MD Born-Oppenheimer MD

# Content

- Introduction
- Classical Molecular dynamics
- Density Functional Theory
- Car-Parrinello Molecular Dynamics
- Born-Oppenheimer Molecular Dynamics
- Extensions
- Applications

#### Car-Parrinello MD

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#### **Unified Approach for Molecular Dynamics and Density-Functional Theory**

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and

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Dipartimento di Fisica Teorica, Università di Trieste, Trieste, Italy, and International School for Advanced Studies, Trieste, Italy (Received 5 August 1985)

We present a unified scheme that, by combining molecular dynamics and density-functional theory, profoundly extends the range of both concepts. Our approach extends molecular dynamics beyond the usual pair-potential approximation, thereby making possible the simulation of both co-valently bonded and metallic systems. In addition it permits the application of density-functional theory to much larger systems than previously feasible. The new technique is demonstrated by the calculation of some static and dynamic properties of crystalline silicon within a self-consistent pseudopotential framework.

PACS numbers: 71.10.+x, 65.50.+m, 71.45.Gm

Electronic structure calculations based on densityfunctional (DF) theory<sup>1</sup> and finite-temperature computer simulations based on molecular dynamics<sup>2</sup> (MD) have greatly contributed to our understanding of condensed-matter systems. MD calculations are able very large and/or disordered systems and to the computation of interatomic forces for MD simulations.

We wish to present here a new method that is able to overcome the above difficulties and to achieve the following results: (i) compute ground-state electronic

#### Car-Parrinello MD



Roberto Car (1947) Princeton, USA Michele Parrinello (1945) ETH Zurich (Lugano), Switzerland

• CPMD (or AIMD or FPMD or DFT-MD) was invented in Trieste (Sissa)

• The 1985 CPMD paper is the 5th most cited paper in Phys. Rev. Lett.

• In 2009, Car and Parrinello were awarded the Dirac Medal

### Starting point

Time-dependent non-relativistic Schrödinger equation

$$i\hbar\frac{\partial}{t}\Psi(\{\mathbf{r}_i\},\{\mathbf{R}_I\};t) = H\Psi(\{\mathbf{r}_i\},\{\mathbf{R}_I\};t)$$

Hamiltonian

$$H = -\sum_{I} \frac{\hbar^2}{2M_I} \nabla_I^2 - \sum_{i} \frac{\hbar^2}{2m_e} \nabla_i^2$$
$$+ \frac{1}{4\pi\epsilon_0} \sum_{i < j} \frac{e^2}{|\mathbf{r}_i - \mathbf{r}_j|} - \frac{1}{4\pi\epsilon_0} \sum_{I,i} \frac{e^2 Z_I}{|\mathbf{R}_I - \mathbf{r}_i|} + \frac{1}{4\pi\epsilon_0} \sum_{I < J} \frac{e^2}{|\mathbf{R}_I - \mathbf{R}_J|}$$

#### Electrons and nuclei

Separation of the wave function:

$$\Psi({\mathbf{r}_i}, {\mathbf{R}_I}; t) \approx \psi({\mathbf{r}_i}; t) \chi({\mathbf{R}_I}; t)$$
 (omitting a phase factor)

Coupled time-dependent Schrödinger equations:

$$i\hbar\frac{\partial\psi}{\partial t} = -\sum_{i}\frac{\hbar^2}{2m_e}\nabla_i^2\psi + \left\{\int\chi^*V_{\rm n-e}\,\chi\,d\mathbf{R}\right\}\psi$$

electrons move in mean-field of nuclei

$$i\hbar\frac{\partial\chi}{\partial t} = -\sum_{I}\frac{\hbar^2}{2M_I}\nabla_I^2\chi + \left\{\int\psi^*V_{\rm n-e}\,\psi\,d\mathbf{r}\right\}\chi$$

nuclei move in mean-field of electrons

time-dependent SCF method, introduced by Dirac in 1930

### Ehrenfest dynamics

#### Nuclei are heavy.

Replace the nuclear density  $|\chi(\{\mathbf{R}_I\};t)|^2$  in the limit of  $\hbar \to 0$  by delta functions centered at the positions of classical particles.

$$\begin{split} M_{I} \frac{d^{2} \mathbf{R}_{I}}{dt^{2}} &= -\nabla_{I} V_{e}^{E}(\{\mathbf{R}_{I}(t)\}) \\ i\hbar \frac{\partial \psi}{\partial t} &= -\sum_{i} \frac{\hbar^{2}}{2m_{e}} \nabla_{i}^{2} \psi + V_{\mathrm{n-e}} \Big(\{\mathbf{r}_{i}\}, \{\mathbf{R}_{I}(t)\}\Big) \psi \\ \psi &= \psi(\{\mathbf{r}_{i}\}, \{\mathbf{R}_{I}\}; t) \end{split}$$

The Hamiltonian and the electronic wave function depend now parametrically on the nuclear positions.

Ehrenfest approach to AIMD includes non-adiabatic transitions between electronic states using classical nuclear motion and the mean field (TDSCF) approximation.

### **Born-Oppenheimer dynamics**

Nuclei are heavy. Adiabatic separation between nuclei and electrons. Electrons remain in the ground-state.

Time-independent Schrödinger equation for the electrons

$$\sum_{i} \frac{-\hbar^2}{2m_e} \nabla_i^2 \psi + V_{n-e} \Big( \{ \mathbf{r}_i \}, \{ \mathbf{R}_I(t) \} \Big) \psi_0 = E_0 \psi_0$$

$$M_I \frac{d^2 \mathbf{R}}{dt^2} = -\nabla_I \min_{\psi_0} \{ \langle \psi_0 | H_e | \psi_0 \rangle \}$$

newtonian nuclear motion

The wave function needs to be minimized every time step of the nuclear dynamics (contrary to Ehrenfest dynamics).

In principle Born-Oppenheimer dynamics also be applied to some specific electronically excited state, however without including interference with other states...

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- Applications

# **Classical Molecular Dynamics**

Why MD simulations?

- 1. observe the dynamics of atoms and molecules
- 2. compute ensemble averages of model systems

Limitations:

- many particle systems exhibit chaotic dynamics
  - trajectories starting from similar initial conditions diverge exponentially fast:

 $|\delta \mathbf{Z}(\mathbf{t})| \approx \mathbf{e}^{\lambda \mathbf{t}} |\delta \mathbf{Z}_0|$  with  $\lambda$  a (positive) Lyapunov exponent

- choice of initial conditions is inaccurate
- models are inaccurate
- integration of equations of motions contains discretization errors
- computers have rounding errors

Therefore:

- A single trajectory is not likely do represent any "true" molecular trajectory.
- But statistical averages over trajectories are useful to estimate ensemble averages

# Classical Molecular Dynamics [1,2]

How can we trust the statistics from MD trajectories? (Considering the limitations of MD simulations)

A trustworthy integrator (MD algorithm) has the following features:

- time-reversible
- phase-space conserving



The phase space density is constant along the trajectory (Liouville's theorem)

The Hamiltonian is the sum of kinetic energy and potential energy

$$H(p,q) = T(p) + V(q)$$

$$\begin{array}{ll} q: \text{position} & \dot{p} = -\frac{\partial H}{\partial q} \\ p: \text{momentum} & \dot{q} = \frac{\partial H}{\partial p} \end{array} \end{array}$$

# Integrators

Algorithms to numerically solve ordinary differential equations (ODE) ODE is an equation that relates the function value to the value(s) of its derivatives

Examples of applications:

- Calculation of an integral
- Solving Schrödingers' equation:
- Geometry optimization
- Molecular dynamics:

Examples of integrators:

- Euler method
- Runga-Kutta
- Verlet
- Velocity Verlet
- Leap-frog
- Beeman's algorithm

• ....

$$E\psi(r) = -\frac{\hbar^2}{2m} \nabla^2 \psi(r) + V(r)\psi(r)$$
$$H = \frac{1}{2} \sum_i m_i \dot{r}_i^2 + V(r)$$

### Molecular dynamics

Integration of Newton's equations





# Example Mass m Mass M distance r

- Newton's Law of Gravitation
  - force is an inverse square law
  - same equations of motion as MD

$$H = \frac{1}{2} \sum_{i} m_i \mathbf{v}_i^2 + \frac{GMm}{|\mathbf{r}|}$$

 $F = -\frac{GMm}{r^2} \qquad \frac{d^2\mathbf{r}}{dt^2} = -\frac{1}{r^3}\mathbf{r}$ 

- Simple Numerical Model in Reduced Units:
  - Assume Sun is stationary (M >> m)
  - For convenience we use Earth Units
    - GM=1
    - circular orbit for r=v=1
    - each revolution takes 2 time!units



### Integrator (1): Euler method

- Truncate Taylor expansion after the acceleration term
  - Local Error:  $O(\Delta t^3)$  in position and  $O(\Delta t^2)$  in velocity

$$x(t + \Delta t) = x(t) + v(t)\Delta t + a(t)\frac{(\Delta t)^2}{2}$$
$$v(t + \Delta t) = v(t) + a(t)\Delta t$$

• Euler method is OK for projectiles, but for MD ...

# Integrator (1): Euler method

#### Matlab/Octave script

```
h=0.1; % timestep
pos=[1 0]; % initial position
                                                                  Consider:
                                                                  • h=0.1 ; steps=100
vel=[0 1.0]; % initial velocity
plot(1,0,'q-',pos(1),pos(2),'ko',0,0,'ro')
                                                                  • h=0.05 ; steps=200
for i=1:100
  x(i) = pos(1);
  y(i) = pos(2);
  plot(x,y,'g-',pos(1),pos(2),'k*',0,0,'r+')
  title(num2str(i*h))
                                                              Plotting instructions
  axis equal;
  axis([-2.0 2.0 -2.0 2.0]);
  pause(0.05);
  r=norm(pos);
                                                              Compute force
  accel=-1/r^2 * pos/r;
  pos=pos + h*vel + 0.5*h*h*accel;
                                                              Integrate
  vel=vel + h*accel;
end
```

# Integrator (1): Euler method

Euler method is OK for projectiles, but for MD ...

trajectory spirals outward
local error accumulates with
time (i.e. large global error)
reducing timestep h just delays
the inevitable



#### Improved integrators

- Symplectic integrators correctly reproduce long-time dynamics
- Common ODE methods such as Runge-Kutta are not suitable
  - error always accumulates in a manner analogous to the Euler example – unreliable long-term behaviour
- A good MD integrator should:
  - be time reversible (thus honouring Newtonian mechanics)
  - conserve phase-space volume (pendulum is illustrative)

# Integrator (2): Verlet method

Combine forward and backward Taylor expansions

 Local Error: O(Δt<sup>4</sup>) in position and O(Δt<sup>2</sup>) in velocity

$$x(t + \Delta t) = 2x(t) - x(t - \Delta t) + a(t)(\Delta t)^{2}$$
$$v(t) = \frac{1}{2\Delta t} [x(t + \Delta t) - x(t - \Delta t)]$$

- Velocities not required:  $[x(t-\Delta t), x(t)] \longrightarrow [x(t+\Delta t)]$
- Not self-starting apply a single Euler step to begin
  - stable even with large time!steps
  - local error does not accumulate (i.e. small global error)

# Integrator (2): Verlet method

#### Matlab/Octave script

```
h=0.2;
       % timestep
pos=[1 0]; % initial position
vel=[0 1.0]; % initial velocity
for i=1:50
  x(i) = pos(1);
  y(i) = pos(2);
             % plotting instructions
  . . .
  r=norm(pos);
  accel=-1/r^2 * pos/r;
  if i==1
    next=pos + h*vel + 0.5*h*h*accel;
  else
    next=2*pos - prev + h*h*accel;
    vel=(next-prev)/(2*h);
  end
  Etot(i)=0.5*norm(vel)^2 + 1/norm(pos);
  prev=pos;
  pos=next;
end
```

#### Consider:

- h=0.1 ; steps=100
- h=0.5 ; steps=100
- h=1.5 ; steps=50



#### Integrator (2): Verlet method



### **Conserved** quantities

- We can't *exactly* numerically integrate, yet "good" integrators oscillate around the true solution
  - Numerical trajectory 'shadows' the exact orbit, with the proximity to the exact orbit varying with  $\Delta t$

- Despite lacking the exact solution, we can gauge the Global Error numerically via conserved quantities

- Momentum (linear & angular ) can be conserved too
- Linear drift in the conserved quantity is a sign that the equations of motion are not being integrated correctly
- Even with high precision integration, trajectories are extremely sensitive to initial conditions (i.e. chaotic)

# Integrator (3): Velocity Verlet

• Resembles Euler method (but with two-step update)

- Local Error:  $O(\Delta t^4)$  in position and  $O(\Delta t^3)$  in velocity

$$x(t + \Delta t) = x(t) + v(t)\Delta t + a(t)\frac{(\Delta t)^2}{2}$$
$$v(t + \Delta t) = v(t) + \frac{[a(t) + a(t + \Delta t)]}{2}\Delta t$$

Reduces to Euler method if  $a(t+\Delta t)=a(t)$ 

- Identical Trajectory to Verlet Method
- Uses present state only:  $[x(t),v(t)] \longrightarrow [x(t+\Delta t),v(t+\Delta t)]$ 
  - Self-starting
  - Easy to change the time-step

#### half-step velocities

• Velocity Verlet is often represented in half-steps:

$$v(t + \frac{1}{2}\Delta t) = v(t) + a(t)\frac{\Delta t}{2}$$

$$x(t + \Delta t) = x(t) + v(t + \frac{1}{2}\Delta t)\Delta t$$

$$v(t + \Delta t) = v(t + \frac{1}{2}\Delta t) + a(t + \Delta t)\frac{\Delta t}{2}$$
apply thermostat
compute forces

 In Leap-Frog Verlet the coordinates are defined at full timesteps (t, t+Δt, t+2Δt...), while the velocities are defined at half-steps (t-Δt/2, t+Δt/2, t+3Δt/2...).

# What is your Hamiltonian?

The model: how are the interactions approximated?

• Empirical forcefields



Lennard-Jones pair-potential

$$V^{\rm LJ}(r) = -4\epsilon \left( \left(\frac{\sigma}{r}\right)^{12} - \left(\frac{\sigma}{r}\right)^6 \right)$$



#### Lennard-Jonesium

$$V^{\rm LJ}(r) = -4\epsilon \left( \left(\frac{\sigma}{r}\right)^{12} - \left(\frac{\sigma}{r}\right)^6 \right)$$



Phase transitions of the Lennard-Jones system, Jean-Pierre Hansen and Loup Verlet, *Phys. Rev.* 184 (1969), 151



FIG. 3. Coexistence curve for the Lennard-Jones system (temperatures and densities in reduced units). The solid line gives our theoretical results. The broken line gives the experimental argon liquid-gas coexistence line taken from Michels *et al.*<sup>17,22</sup> The circles are experimental argon melting data taken from van Witzenburg and Stryland, <sup>20</sup> the crosses are experimental melting data taken from Crawford and Daniels.<sup>21</sup> The triangles indicate the crystallization densities according to the "law" stating that crystallisation occurs whenever  $S(k_0)$  reaches the value 2.85.

 $V^{\rm LJ}(r) = -4\epsilon \left( \left(\frac{\sigma}{r}\right)^{12} - \left(\frac{\sigma}{r}\right)^6 \right)$ 

 $V^{\text{Buck}}(r) = A \exp(-Br) - \frac{C}{r^6}$ 

Non-bonded interactions

- Van der Waals (Lennard-Jones, Buckingham, ...)
- Electrostatic interaction

• Electrostatic interaction 
$$V^{\text{Coulomb}}(r) = \frac{1}{4\pi\epsilon_0} \frac{q_1q_2}{r}$$
  
• H-bonds, 3-body interaction, polarization, ...

#### **Bonded** interactions

• bond 
$$V^{\text{harm}}(r) = \frac{1}{2}k_b(r-r_0)^2$$
  $V^{\text{morse}}(r) = D_e(1-e^{-\alpha(r-r_e)})^2$   
• angle  $V^{\text{harm}}(\theta) = \frac{1}{2}k_\alpha(\theta-\theta_0)^2$   
• dihedral  $V^{\text{Fourier}}(\omega) = \sum_n \frac{1}{2}V_n[1+\cos(n\omega-\gamma)]$ 

improper

**Total potential** 

 $E^{\text{pot}} = E^{\text{bonded}} + E^{\text{non-bonded}}$ 

$$E^{\text{pot}} = \sum_{\text{bonds}} V^{\text{bond}} + \sum_{\text{angles}} V^{\text{angle}} \sum_{\text{dihedrals}} V^{\text{torsion}} + \sum_{i} \sum_{j \neq i} V^{\text{LJ}} + \sum_{i} \sum_{j \neq i} V^{\text{Coulomb}}$$

#### Common forcefields

MMS CFF AMBER CHARMM GROMOS OPLS UFF

#### MARTINI (CG)

Simulated heating of water molecules



**Total potential** 

 $E^{\text{pot}} = E^{\text{bonded}} + E^{\text{non-bonded}}$ 



Common forcefields

MMS CFF AMBER CHARMM GROMOS OPLS UFF

MARTINI (CG)

partial unfolding of photoactive yellow protein



Classical (Forcefield) Molecular Dynamics

- parameterizations available
- implemented in efficient parallel programs
- system sizes of 10<sup>6</sup> particles
- simulation times of ~ microseconds

Limitations

- transferability (molecular environment, thermodynamic state)
- often: no polarization, many-body interactions
- no bond-breaking (chemistry)
- no information on the electronic structure (spectroscopy)

### Ab initio molecular dynamics

Empirical forcefields are often fitted to ab initio calculations. Why not obtain the ab initio potential on the fly?

Which level of ab initio theory?

- (semi-emprical), HF, DFT, MP2, CASSCF, CC,... would all be possible.

Density Functional Theory is a good compromise between accuracy and computational cost.

- GGA functionals may have limited accuracy
- Van der Waals interactions are problematic
- better non-local functionals, hybrid functionals, etc, are costly

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# **Density Functional Theory**

The energy is a functional of the electron density

^

 $E = E[
ho(\mathbf{r})]$  Hohenberg & Kohn (1964)

Variation principle:

$$\langle \Psi[\rho] | \hat{H} | \Psi[\rho] \rangle = \int d\mathbf{r} \, v(\mathbf{r}) \, \rho(\mathbf{r}) + T[\rho] + V_{\text{ee}}[\rho] = E_v[\rho] \ge E_0[\rho]$$

$$\text{external} \quad \text{kinetic} \quad \text{electron-}$$

potential (nuclei) kinetic electronenergy electron interaction

second HK theorem

Non-interaction potential yields the same density:

$$E[\rho] = T_s[\rho] + V_N[\rho] + J_{ee}[\rho] + E_{xc}[\rho]$$

Kohn-Sham (1965)

$$\rho(\mathbf{r}) = 2\sum_{i}^{occ} |\psi_i(\mathbf{r})|^2$$



Walter Kohn (1923) Nobelprize 1998

#### **Density Functional Theory**

$$E[\rho] = T_s[\rho] + V_{\rm N}[\rho] + J_{\rm ee}[\rho] + E_{\rm xc}[\rho]$$

non-interaction kinetic energy nuclear Coulomb potential interaction

Exchange + correlation

$$T_{s}(\rho) = -\frac{\hbar^{2}}{2m} \sum_{i}^{N} \int d\mathbf{r} \, \psi_{i}^{*}(\mathbf{r}) \nabla^{2} \psi_{i}(\mathbf{r})$$
$$V_{N}[\rho] = \int d\mathbf{r} \, v^{\text{ext}}(\mathbf{r}) \, \rho(\mathbf{r})$$
$$J_{\text{ee}}[\rho] = \frac{e^{2}}{2} \int d\mathbf{r} \int d\mathbf{r}' \frac{\rho(\mathbf{r})\rho(\mathbf{r}')}{|\mathbf{r} - \mathbf{r}'|}$$

$$E_{\rm xc}[\rho] = V_{\rm ee} - J_{\rm ee}[\rho] + T[\rho] - T_s[\rho]$$

the rest

#### **Density Functional Theory**

Minimization of the Kohn-Sham equations (variational principle)

$$\hat{H}^{\mathrm{KS}}\psi_{i} = \left[-\frac{\hbar^{2}}{2m}\nabla^{2} + v^{\mathrm{ext}} + \frac{e^{2}}{2}\int d\mathbf{r}\frac{\rho(\mathbf{r}')}{|\mathbf{r} - \mathbf{r}'|} + \frac{\delta E_{\mathrm{xc}}[\rho]}{\delta\rho(\mathbf{r})}\right]\psi_{i} = \epsilon_{i}\psi_{i}$$

Local Density Approximation:

$$E_{\rm xc}^{\rm LD} = \int d\mathbf{r} \rho(\mathbf{r}) \,\epsilon_{\rm xc}$$

Generalized Gradient Approximation Becke Exchange functional (1988)

$$\epsilon_{\rm xc}^{\rm B} = -\beta \rho^{1/3} \frac{x^2}{(1 + 6\beta x \sinh^{-1} x)}$$

$$\beta = 0.0042$$

 $x = \frac{|\nabla \rho|}{\rho^{4/3}}$ 

#### **Born-Oppenheimer dynamics**

Nuclei are heavy. Adiabatic separation between nuclei and electrons. Electrons remain in the ground-state.

Time-independent Schrödinger equation for the electrons

$$\sum_{i} \frac{-\hbar^2}{2m_e} \nabla_i^2 \psi + V_{n-e} \Big( \{ \mathbf{r}_i \}, \{ \mathbf{R}_I(t) \} \Big) \psi_0 = E_0 \psi_0$$

$$M_I \frac{d^2 \mathbf{R}}{dt^2} = -\nabla_I \min_{\psi_0} \{ \langle \psi_0 | H_e | \psi_0 \rangle \}$$

Newtonian nuclear motion

# Rigorous wave function minimization every MD step (matrix diagonalization).

#### Basis sets

To optimize the Kohn–Sham orbitals

$$\hat{H}\psi_i = \epsilon\psi_i$$

these one electron wave functions are expanded in an orthogonal basis

$$\psi_i = \sum_k c_k^i \chi_k$$

for example: Gaussians, Slater functions, or plane waves.

Plane waves describe well free electrons (valence electrons in metals)

$$\psi_i(\mathbf{r}) = \sum_{\mathbf{k}} c_k^i \exp(i\mathbf{k}\mathbf{r})$$
$$|\mathbf{k}|^2 \le E_{\text{cut}}$$

- frozen core approximation
- pseudo-potential replaces nucleus + core electrons
- valence electrons are represented by pseudo-wave functions
- projector augmented wave (PAW): local functions + (pseudo-) plane waves

# Summary of yesterday

- Method by Car and Parrinello (1985)
- BOMD: Combine classical MD of nuclei with QM timeindependent Schrödinger equation of the electrons
- Classical MD
  - Integrators: Euler versus Verlet
  - time-reversibility, phase-space conserving (can be checked)
  - force fields (harmonic bonds, Lennard-Jones, ...)
  - parameters: Amber, Gromos, OPLS, CHARMM, UFF, ReaxFF
  - programs: Amber, NAMD, DLPoly, LAMMPS, Gromacs
- Density Functional Theory (see Prof. Baerends lecture)
  - simulated annealing versus matrix diagonalization
  - equation of motion for coefficient dynamics
  - fictitious "electron" mass, constraint orthogonality
- CP extended Lagrangian

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### Car-Parrinello MD

Optimizing the coefficients to minimize the Kohn-Sham energy has some analogy with a geometry optimization.

- the coefficients move in a coefficient space
- with the constraint of orthonormality

$$\sum_{k} c_k^{i*} c_k^j = \delta_{ij} \quad \text{with} \quad \delta_{ij} = \begin{cases} 1 & \text{for } i = j \\ 0 & \text{for } i \neq j \end{cases}$$

We can even define equations of motions:



Wave functions optimization through Simulated Annealing

- start from random coefficients
- integrate EOMs
- damp dynamics to converge
- Alternative for matrix diagonalization
- Useful for large systems

#### Car-Parrinello MD

Simultaneous dynamics of the nuclei and the wave function coefficients

Lagrangian formalism of CPMD

$$\mathcal{L} = \sum_{I} \frac{1}{2} M_{I} \left| \frac{d\mathbf{R}_{I}}{dt} \right|^{2} + \sum_{i,k} \frac{1}{2} \mu_{k} \left| \frac{dc_{k}^{i}}{dt} \right|^{2} - E[\{c_{k}^{i}\}, \{\mathbf{R}_{I}\}] + \sum_{i,j} \lambda_{ij} (\sum_{k,l} c_{l}^{i} c_{k}^{j} S_{kl} - \delta_{ij})$$
kinetic energy of nuclei
"kinetic energy" coefficients
Kohn-Sham potential
holonomic constraints

Hellman-Feynman forces

$$-\frac{\partial E[\{c_k^i\}, \{\mathbf{R}_I\}]}{\partial \mathbf{R}_I} = \frac{\partial \langle \Psi_0 | H | \Psi_0 \rangle}{\partial \mathbf{R}_I} = \langle \Psi_0 | \frac{\partial H}{\partial \mathbf{R}_I} | \Psi_0 \rangle$$

In the electronic ground state, the wave function derivatives are zero

#### How can this work?

Simultaneous dynamics of the nuclei and the wave function coefficients

The wave function dynamics should be cold

- sufficiently close to the ground state
- but fast enough to follow the nuclei

Adiabatic separation of nuclei and wave function dynamics

$$\mu_e << M_I \implies \omega_e >> \omega_I$$
  
 $T_e << T_I \implies E^{\text{tot}} \approx T_I + V^{\text{KS}}$ 

conserved quantity



periodic super cell containing 8 Si atoms in the diamond structure

G. Pastore, E. Smargiassi, F Buda, *Phys. Rev. A* **44** (1991), 6334

#### How can this work?

Simultaneous dynamics of the nuclei and the wave function coefficients



spectrum of electronic modes

Clear separation between characteristic electronic and ionic frequencies

- small fictious mass ( $\mu$ =300 au = 0.165 Dalton)
- small time step (dt = 5 atu = 0.12 fs)

### CPMD versus BOMD

#### BOMD

- matrix diagonization
- at  $\Psi_0$  every MD step
- time step: ~1 fs
- converged (HF) forces
- risk of growing global error



cp2k program

#### CPMD

- wave function dynamics
- close to  $\Psi_0$  every MD step
- time step: ~0.1 fs
- noisy forces
- small global error (E<sup>tot</sup> conserved, when adiabatic)

cpmd program

#### Periodic boundary conditions



Copies of the system in all directions

- effects due to walls are avoided
- finite size effects are less
- plane waves are already periodic

Con's

- isolated systems are difficult
- fictitious periodicity

#### Ensembles

The equation of motion derived from Lagrangian (or Hamiltonian) dynamics conserve the total energy of the system.

• The micro-canonical ensemble is sampled (NVE)

Other ensembles:

NVT ensemble, by coupling the system to a thermostat ("heat bath")

- Nose-Hoover chain (deterministic)
- Canonical Sampling through Velocity Rescaling ("bussi thermostat")
- Langevin dynamics

#### NPT ensemble, coupling to a thermostat and a barostat

- Parrinello-Rahman
- Berendsen

#### Grand canonical (µPT), coupling to bath of particles (i.e. electrons)

### **Computing properties**

Ergodicity hypothesis

$$\langle A \rangle = \frac{\int \int d\mathbf{r}^N d\mathbf{p}^N A(\mathbf{r}^N, \mathbf{p}^N) \exp[-\beta H(\mathbf{r}^N, \mathbf{p}^N)]}{\int \int d\mathbf{r}^N d\mathbf{p}^N \exp[-\beta H(\mathbf{r}^N, \mathbf{p}^N)]}$$
ensemble average

$$\langle A \rangle = \lim_{t \to \infty} \frac{1}{t} \int_0^t dt' A(\mathbf{r}^N, \mathbf{p}^N)$$
 time average

Time correlation functions can be related to transport properties

$$D_i = \int_0^\infty d\tau \langle v_i(\tau) v_i(0) \rangle \qquad \qquad \text{diffusion coefficient}$$

Fourier transform of time-correlation functions allow for experimental spectra

#### Water



#### O-O Radial distribution function

#### mean square displacement



64 water molecules BLYP functional 30 ps simulation NVE (T~423 K)

Time-Dependent Properties of Liquid Water: A Comparison of Car-Parrinello and Born-Oppenheimer Molecular Dynamics Simulations I-F.W. Kuo, C.J. Mundy, M.J. McGrath and J.I. Siepmann *J. Chem. Theory Comput.* 2006





3.5

3.0



DFT GGA water is too structured
Diffusion coefficient is too low
(BP: 0.35 10<sup>-5</sup> vs EXP: 2.35 10<sup>-5</sup> cm<sup>2</sup>/s)

- correcting for VdW is important
- ZPE correction can be included

CPMD contributed significantly to understanding water and solvation

### Acidity of Fe(III)

 $Fe^{III}(H_2O)_6^{3+} + H_2O \iff Fe^{III}(H_2O)_5(OH)^{2+} + H_3O^{+}$ 

$$pKa = -\log\left(\frac{[\mathrm{B}^{-}][\mathrm{H}_{3}\mathrm{O}^{+}]}{[\mathrm{HB}]}\right) = -\log\left(\frac{(x(\mathrm{H}_{3}\mathrm{O}^{+}))^{2}[\mathrm{HB}]_{0}}{1 - x(\mathrm{H}_{3}\mathrm{O}^{+})}\right)$$



Method	x(H₃O) <sup>+</sup>	kA	pkA
CPMD	0.130	0.034	I.47
static DFT		10,000	-4.00
expt		0.006	2.2

# Redox potentials

Warshel, Sprik, Blumberger, Sulpizi, Cheng, and others

Rudolph A. Marcus 1992 Nobel prize in Chemistry  $\Delta \mathcal{E} = IP_D + EA_A$ 

 $\Delta c - \Pi_D + L$ 





HOMO-LUMO gap is not a good estimate of the redox potential



The vertical energy gap quantifies the polarization by the environment.

• reaction coordinate:

$$\Delta E = E_R(\mathbf{r}^N) - E_O(\mathbf{r}^N).$$

#### Lumiflavin

#### oxidation and protonation states



$$\Delta E = E_R(\mathbf{r}^N) - E_O(\mathbf{r}^N).$$
 Redox potentials

We can histogram dE during an MD simulation:

$$P_{\eta}(\Delta E') = Z^{-1} \int d\mathbf{r}^{N} e^{-\beta E_{\eta}} \delta(\Delta E - \Delta E')$$
$$= \lim_{\tau \to \infty} \frac{1}{\tau} \int_{0}^{\tau} \delta(\Delta E(\mathbf{r}^{N}(t)) - \Delta E') dt$$



DFT-MD (BO simulations) CP2K program PBE + DZVP/300Ry

lumiflavin + 102 H2O Lbox=15 A (PBCs) NVT ensemble sim. time: 30-50 ps

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$$= \lim_{\tau \to \infty} \frac{1}{\tau} \int_{0}^{\tau} \delta(\Delta E(\mathbf{r}^{N}(t)) - \Delta E') dt$$

And make the free energy profiles:

 $A_{\eta}(\Delta E) = -k_B T \ln \left[ P_{\eta}(\Delta E) \right]$ 

DFT-MD (BO simulations) CP2K program PBE + DZVP/300Ry

lumiflavin + 102 H2O Lbox=15 A (PBCs) NVT ensemble sim. time: 30-50 ps



#### Redox potentials

#### **Redox potentials**

What is the reorganization? (which changes correlate with dE?)



#### **Redox potentials**

What is the reorganization? (which changes correlate with dE?)



### Content

- Introduction
- Classical Molecular dynamics
- Density Functional Theory
- Car-Parrinello Molecular Dynamics
- Born-Oppenheimer Molecular Dynamics
- Extensions
- Applications

#### **AIMD** implementations

CPMD PAW VASP quantum-espresso Siesta CP2K

ADF Gaussian

. . .

Friday, 12 December, 14

#### Extensions

extension to DFT-based AIMD (CPMD, BOMD)

- combined CP/BO MD, wave function propagation + minimization (CP2K)
- Brillouin zone sampling, k-space integration
- TD-DFT MD, ROKS-MD excited state molecular dynamics
- Ehrenfest, Tully's minimum hops approach, ...
- PIMD, path-integral, ring-polymer dynamics
- HF, B3LYP, MP2 MD
- enhanced sampling methods
  - constrained MD, steered MD, metadynamics, transition path sampling
- QM/MM

#### Longer time scales

#### The rare event problem:

chemical reactions take place on a time scale that as much longer than can be simulated with AIMD

Enhanced sampling methods:

- constrained MD
- umbrella sampling
- steered MD
- metadynamics
- transition path sampling



#### Longer time scales

Transition path sampling of electron transfer self-exchange between Ru<sup>2+</sup> and Ru<sup>3+</sup> in water

#### Sampling ensemble of transition paths

- Monte Carlo scheme
- No reaction coordinate needed
- description of stable states
- Needs initial path
- Can relax an unphysical (enforced) path





#### Free energy calculations

**Constrained Molecular Dynamics** 



### Larger length scales

#### QM/MM

• important part of the system with QM (semi-empirical, HF, DFT,...

• environment included with MM (empirical force field)



#### **QM-MM** coupling

- Mechanical coupling: bonds, angles, VdW
- Electrostatic coupling to include environment interaction into the QM system.
  - polarization of electron density
- Link atom/pseudo potential at hybrid (QM/ MM) bonds

#### Karplus, Levitt, Warshel Chemistry Nobelprize 2013





# QM/MM + enhanced sampling

Proton Shuttles and Phosphatase Activity in Soluble Epoxide Hydrolase

- CPMD QM/MM
- constrained MD



Computational study of phosphatase activity in soluble epoxide hydrolase: high efficiency through a water bridge mediated proton shuttle. Marco De Vivo, Bernd Ensing, and Michael L. Klein **Communication in** J. Am. Chem. Soc. **127** (2004), 11226-11227



three-9,10-phosphonooxy-hydroxy-octadecanoic acid



## QM/MM + enhanced sampling

Proton transfer during signal propagation in Photoactive Yellow Protein



- CPMD QM/MM- transition path sampling









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