

# Density functional theory in solid state physics

Lecture 12

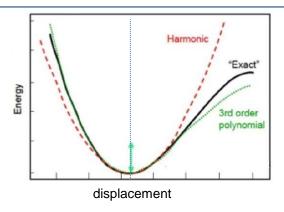
## **Summary**



- DFT allow access to vibrational (phononic) spectra of materials within harmonic approximation
- DFT is quite accurate for phonons
- Need dynamical matrix of material
  - Finite displacement method: build force constants/dynamical matrix by successive small displacement of atoms in the unit cell and numerical differentiation
  - Density functional perturbation theory (DFPT): directly calculate dynamical matrix by calculating derivatives of the total energy using perturbation theory.
  - Result: Phonon frequencies, "normalized displacements"  $A_{\nu i} = \frac{c_{\nu}}{\sqrt{M_i}}$  ( $c_{\nu}$ : eigenvector of the DM)
- Phonon dispersions and vibrational DOS from FD requires supercell method (computationally expensive!) due to periodic boundary conditions
- DFPT is more complex but only requires unit cell to obtain full phonon spectrum (but instead sampling of BZ), also yields dielectric tensor, Raman&infrared spectra etc.



- Harmonic approximation only valid for small displacements, and small temperatures,
- no volume dependence of thermal properties, no interaction between phonons

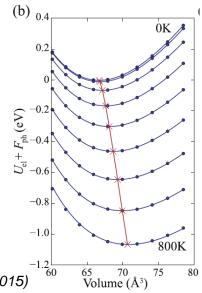


Quasiharmonic approximation: introduce volume dependence into harmonic approximation

Helmholtz free energy 
$$F^{QHA}(T,V) = U^{0}(V) + F^{QHA}_{vib}(T,V)$$

Calculated from phonon frequencies

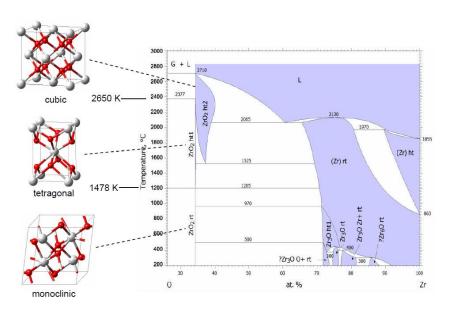
• Allow access to thermal lattice expansion (see exercise sheet 4), temperature-induced phase transitions etc.

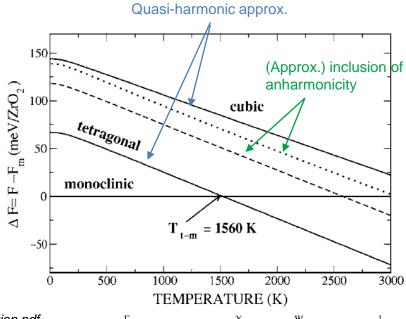


Scripta Materalia 108, 1 (2015)



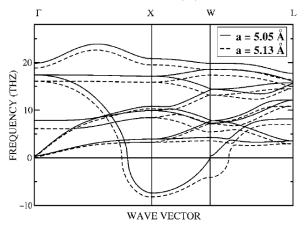
#### Example: phase transition in ZrO<sub>2</sub>





http://archive.materialsdesign.com/system/files/appnotes/ZrO2\_phase\_transition.pdf

- QHA works well for monoclinic-tetragonal transition
- ZrO<sub>2</sub> has "soft" phonon mode, requiring inclusion of anharmonic effects for tetra-cubic transition



J. Chem Phys. 123, 204708 (2005)

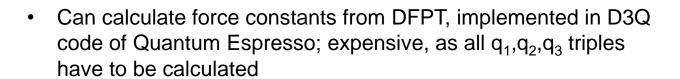


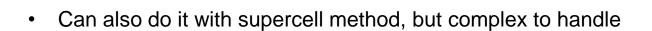
Expansion of lattice potential energy to include anharmonic effects (1D case)

$$U(u) \approx U(0) + \frac{1}{2} \frac{\partial^2 U}{\partial u^2} u^2 + \underbrace{\frac{1}{6} \frac{\partial^3 U}{\partial u^3} u^3}_{\widetilde{U}_3} + \underbrace{\frac{1}{24} \frac{\partial^4 U}{\partial u^4} u^4}_{\widetilde{U}_4} + \cdots$$

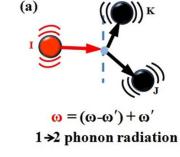
• U<sub>3</sub>, U<sub>4</sub>, etc correspond to effect of phonon-phonon interaction

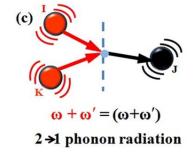
$$U_{3} = \frac{N^{-0.5}}{n!} \sum_{\substack{q_{1},q_{2},q_{3},\\\alpha,\alpha',\alpha''}} \phi_{\alpha,\alpha',\alpha''}^{lj,l'j',l''j''} (\vec{q}_{1},\vec{q}_{2},\vec{q}_{3}) u_{lj\alpha}(\vec{q}_{1}) u_{l'j'\alpha'}(\vec{q}_{2}) u_{l''j''\alpha''}(\vec{q}_{3})$$













• Flux of heat for temperature gradient is given by perturbed phonon population  $N_{qv}$ 

$$\sum_{\mathbf{v}} \int_{BZ} \hbar \omega_{q\mathbf{v}} \vec{c}_{q\mathbf{v}} N_{q\mathbf{v}} dq = -\kappa \nabla T \qquad \text{(Fourier's law)}$$

Boltzmann Transport Equation for phonons: flow of phonon population

$$\frac{\partial N_{qv}}{\partial t} = -\left[\vec{c}_{qv} \cdot \nabla T \left(\frac{\partial N_{qv}(r,t)}{\partial T}\right) + \hbar^{-1} \nabla_q N_{qv}(r,t) \cdot \vec{F}\right] + \left(\frac{\partial N_{qv}}{\partial t}\right)_{scat}$$
Diffusion terms

External field scattering



Eur. Phys. J 89, 239 (2016)

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 Steady-state Absence of external fields

•  $\left(\frac{\partial N_{qv}}{\partial t}\right)_{cont}$  derived from phonon-phonon scattering rate (three-phonon case)

$$\Gamma_{qv}^{ph-ph} = \frac{18\pi}{\hbar^2} \sum_{q_1v_1,q_2v_2} \left|V^{(3)}\right|^2 \delta_{\vec{q}+\vec{q}_1+\vec{q}_2,+\vec{G}} \cdot \left[ \left(N_{q_1v_1} + N_{q_2v_2} + 1\right) \delta\left(\omega_{qv} - \omega_{q_1v_1} - \omega_{q_2v_2}\right) + \left(N_{q_1v_1} - N_{q_2v_2}\right) \left(\delta\left(\omega_{qv} + \omega_{q_1v_1} - \omega_{q_2v_2}\right) - \delta\left(\omega_{qv} - \omega_{q_1v_1} + \omega_{q_2v_2}\right) \right) \right]$$
 Three-phonon coupling, depends on  $\Phi_{\alpha,\alpha',\alpha''}^{lj,l'j',l''j''}$  Eur. Phys. J 89, 239 (2016)

Density functional theory in solid state physics



• Small perturbations: 
$$N_{q\nu} \approx N_{q\nu}^{eq} + \frac{\partial N_{q\nu}}{\partial (\hbar \omega'_{q\nu})} \Big|_{\omega'_{q\nu} = \omega_{q\nu}} \vec{F}_{q\nu} \cdot \nabla T$$

Leads to linearized BTE and the approximation 
$$\frac{\partial N_{qv}(r,t)}{\partial T} \approx \frac{\partial N_{qv}^{eq}(r,t)}{\partial T}$$

• Solving BTE iteratively for  $ec{F}_{qv}$  allows for following phonon population with time

Can get several properties from this, e.g. thermal conductivity tensor:

$$\kappa_{\alpha\beta} = \frac{\hbar}{k_B T^2 V_{uc}} \sum_{q\nu} \omega_{q\nu} c_{\alpha} N_{q\nu}^{eq} (N_{q\nu}^{eq} + 1) F_{q\nu,\beta}$$

- Most expensive part: Calculating the phonon-phonon scattering matrix elements
- Additional simplification: Relaxation time approximation (RTA)

$$\left(\frac{\partial N_{qv}}{\partial t}\right)_{ph-ph} \approx \left(N_{qv} - N_{qv}^{eq}\right) \tau_{qv}^{-1}$$

$$= \Gamma_{qv}^{ph-ph}$$

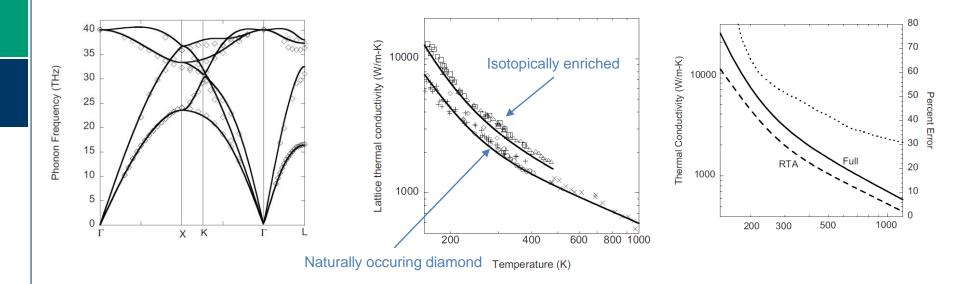
Could also include defect and/or four-phonon scattering here

Eur. Phys. J 89, 239 (2016) Phys. Rev. B 93, 024307 (2016)



Example: Thermal conductivity in diamond

Phys. Rev. 80, 125203 (2009)



- Three-phonon scattering and elastic scattering on isotopic impurities included, iterative solution of the BTE
- Solution of the BTE (both iterative and in the RTA) are implemented in a few freely available packages







Now coupling between electronic and phononic subsystem:

$$H = H^{KS} + H^{phon} + \underbrace{H^{el-phon}}_{\sum_{qv} g_{mk+q,nk}^{qv} \hat{c}_{mk+q}^{\dagger} \hat{c}_{nk}} \left( + H^{el-2phon} + \cdots \right)$$

• Matrix element for scattering of electron from state  $\varphi_{nk}$  to state  $\varphi_{mk+q}$  by phonon

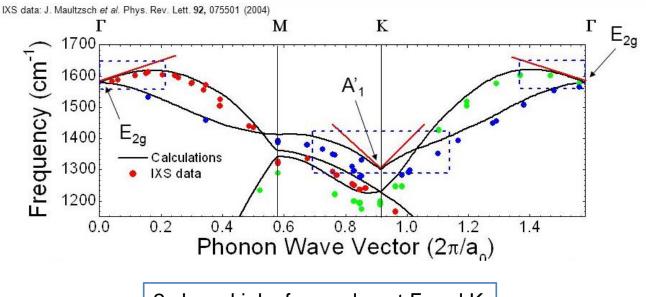
$$g_{mk+q,nk}^{qv} = \sum_{l,i} \sum_{\alpha=1}^{3} \frac{A_{li\alpha}^{qv}}{\sqrt{M_i \omega_{qv}}} \left\langle \phi_{mk+q} \left| \frac{\partial v_{KS}}{\partial \tilde{u}_{0i,\alpha}(q)} \right| \phi_{nk} \right\rangle_{uc} \right\rangle_{uc}$$

- Here: include the reaction ("screening") of the electronic structure to lattice distortion
- Straight-forward to calculate from DFT because electronic part (Kohn-Sham wavefunctions) and phononic part (DFPT) are separated.
- Readily available in several DFT codes, such as Quantum Espresso, Elk, GPAW etc.
- Review and more details of EPC in Rev. Mod. 89, 015003 (2017)



- Electron-phonon coupling crucial for correct description of effect of Kohn anomalies on phonon spectrum
- Kohn anomaly: phonons can couple two points on Fermi surface, reducing phonon frequency

Prominent example: Graphene



Mat. Today Pys. 3, 93 (2017)

Conducti

Fermi energy

Valence band

ENERGY (eV)

2 sharp kinks for modes at  $\Gamma$  and K

Kohn anomaly  $\leftrightarrow$  EPC $\neq$ 0

Phys. Rev. Lett. 93, 185503 (2004)



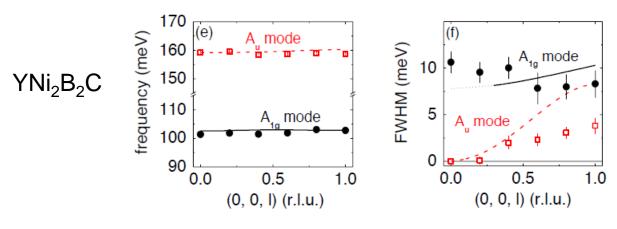
Phonon self-energy from EPC:

$$\Pi_{q\nu}(\omega) = \frac{2}{V_{BZ}} \sum_{m,n} \int_{BZ} \left| g_{mk+q,nk}^{q\nu} \right|^2 \frac{f_{nk}(T) - f_{mk+q}(T)}{\varepsilon_{nk} - \varepsilon_{mk+q} - \omega - i\delta} dk$$

Renormalization of phonon frequencies:

$$\widetilde{\omega}_{q\nu}^2 = \omega_{q\nu}^2 - 2\omega_{q\nu}Re\left(\Pi_{q\nu}(\widetilde{\omega}_{q\nu}, T)\right)$$

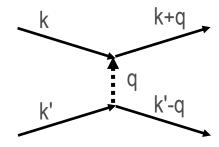
• EPC induced phonon linewidths for small T (experimentally measureable from, e.g. neutron or x-ray scattering):  $\gamma_{av} = -2\pi Im(\Pi_{av})$ 



Phys. Rev. Lett. 109, 057001 (2012)



• Superconductivity: Phonon-mediated electron-electron interaction



- Migdal-Eliashberg theory: extension of BCS theory framework to strong coupling regime
- Quasiparticle spectrum is gapped (Eliashberg gap equations, see <a href="https://www.cond-mat.de/events/correl13/manuscripts/ummarino.pdf">https://www.cond-mat.de/events/correl13/manuscripts/ummarino.pdf</a> for details)
- Important ingredient: Eliashberg function for coupling between two electronic states:

$$\alpha^{2} F_{mk+q,nk} (\omega) = \frac{N(E_{F})}{V_{BZ}} \sum_{\nu} \int_{BZ} \left| g_{mk+q,nk}^{q\nu} \right|^{2} \delta(\omega - \omega_{q\nu}) dq$$

 $N(E_F)$ : electronic DOS at  $E_F$ 



Electron-phonon coupling strength for phonon branch ν:

$$\lambda_{qv} = \frac{1}{N(E_F)\omega_{qv}} \sum_{m,n} \int_{BZ} \left| g_{mk+q,nk}^{qv} \right|^2 \delta(\varepsilon_{nk} - E_F) \delta(\varepsilon_{mk+q} - E_F) dk$$

Superconducting gap surprisingly isotropic: Isotropic Eliashberg function

$$\alpha^{2}F(\omega) = \frac{1}{N(E_{F})V_{BZ}} \sum_{\nu} \int_{BZ} \omega_{q\nu} \lambda_{q\nu} \, \delta(\omega - \omega_{q\nu}) dq$$

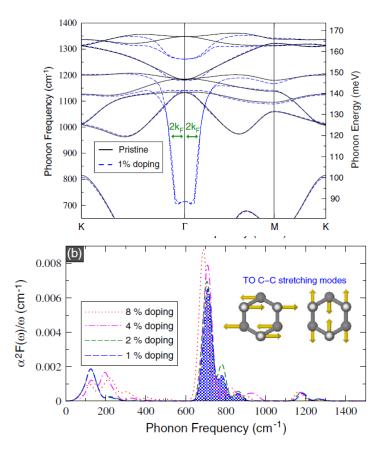
- Isotropic EPC strength:  $\lambda = 2 \int \frac{\alpha^2 F(\omega)}{\omega} d\omega$   $\lambda < 0.5$ : weak coupling,  $\lambda > 1$ : strong coupling
- All ingredients (with full momentum dependence) readily available from ab initio using DFT+DFPT approach

• Can be used to estimate critical temperature: 
$$T_c = \frac{\omega_{ph}^{eff}}{1.2} exp \left( -\frac{1.04(1+\lambda)}{\left(\lambda - \mu^*(1-0.62\lambda)\right)} \right)$$
 
$$\omega_{ph}^{eff} = \frac{2}{\lambda} \int \alpha^2 F(\omega) \ d\omega$$
 "Coulomb pseudopotential", can be measured accurately experimentally

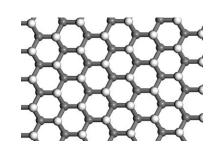


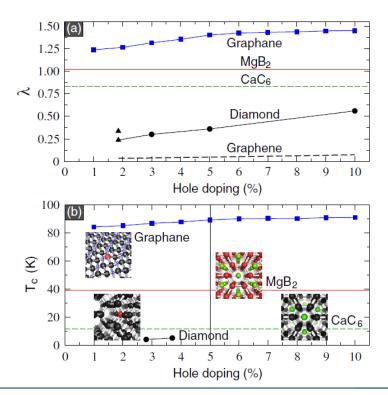
• Example: p-doped graphane Phys. Rev. Lett. 105, 037002 (2010)

Calculated with Quantum Espresso, LDA



 BCS like superconductivity with high T<sub>c</sub>, could be achieved by gate doping







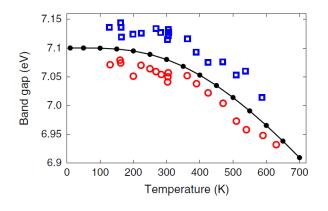
- On the other hand: effect on "conventional" electronic structure as well
- Electron self-energy from EPC:

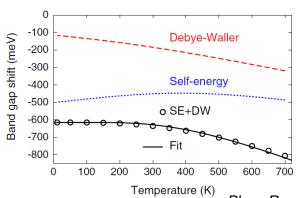
$$\Sigma_{nk}(\omega,T) \approx \underbrace{\sum_{q\nu} \frac{1}{2\omega_{q\nu}} \sum_{m} \left| g_{mk+q,nk}^{q\nu} \right|^2 \left[ \frac{N_{q\nu}(T) + f_{mk+q}(T)}{\omega - \varepsilon_{mk+q} + \omega_{q\nu} + i\eta} + \frac{N_{q\nu}(T) + 1 - f_{mk+q}(T)}{\omega - \varepsilon_{mk+q} - \omega_{q\nu} + i\eta} \right] + \Sigma_{nk}^{DW}(T)}_{\Sigma_{nk}^{Fan}(\omega,T)}$$
Electron-2 phonon scattering

Temperature-induced renormalization of band gaps:

$$\tilde{\epsilon}_{nk}(T) = \epsilon_{nk}(T) + Re[\Sigma_{nk}(\epsilon_{nk}, T)]$$

For example: Direct band gap in diamond







- Phonons also affect the resistivity of a material through scattering of carriers
- First principle carrier dynamics using calculated electron-phonon matrix elements
- Boltzmann-Transport Equation (BTE): flow of electron occupations  $f_{nk}(r,t)$

$$\frac{\partial f_{nk}(r,t)}{\partial t} = -\left[\nabla_r f_{nk}(r,t) \cdot \vec{v}_{nk} + \hbar^{-1} \nabla_k f_{nk}(r,t) \cdot \vec{F}\right] + I[f_{nk}]$$
Drift terms
Collision term

Collision term describes scattering of charge carriers, for scattering from EPC

$$\begin{split} I^{el-phon}[f_{nk}] &= -\frac{2\pi}{\hbar} \frac{1}{N_q} \sum_{m,q} \left| g_{mk+q,nk}^{qv} \right|^2 \{ \delta \left( \varepsilon_{nk} - \varepsilon_{mk+q} - \hbar \omega_{qv} \right) \cdot F_{em} + \\ &+ \delta \left( \varepsilon_{nk} - \varepsilon_{mk+q} + \hbar \omega_{qv} \right) \cdot F_{abs} \} \end{split}$$

$$F_{em} = f_{nk} (1 - f_{mk+q}) N_{q\nu} - f_{mk+q} (1 - f_{nk}) (N_{q\nu} + 1)$$
 Phonon emission 
$$F_{abs} = f_{nk} (1 - f_{mk+q}) (N_{q\nu} + 1) - f_{mk+q} (1 - f_{nk}) N_{q\nu}$$
 Phonon absorption

Eur. Phys. J. B 89, 239 (2016)



- Solve BTE iteratively by updating  $f_{nk}$ , but keeping  $N_{qv}$  constant
- Simple and easier: Relaxation time approximation (RTA)

$$I[f_{nk}] = -\frac{f_{nk}(r,t) - f_{nk}^{eq}(r,t)}{\tau_{nk}^{el-phon}}$$
+other terms

- Relaxation time for electron state n,k:  $\tau_{nk}^{el-phon} = \left(\frac{2}{\hbar}Im[\Sigma_{nk}]\right)^{-1}$
- From (iterative) solution of the BTE:

Conductivity tensor 
$$\sigma_{\alpha\beta} \propto \sum_{nk} v_{nk}^{\alpha} F_{nk}^{\beta} \left( -\frac{\partial f_{nk}^{eq}}{\partial \varepsilon_{nk}} \right)$$

Mobility tensor

$$\mu_{\alpha\beta} = \frac{\sigma_{\alpha\beta}}{en_{carrier}}$$

Other properties

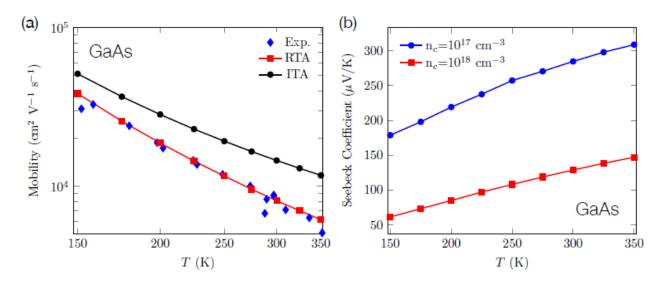
· Also several codes available nowadays that solve the BTE based on DFT input



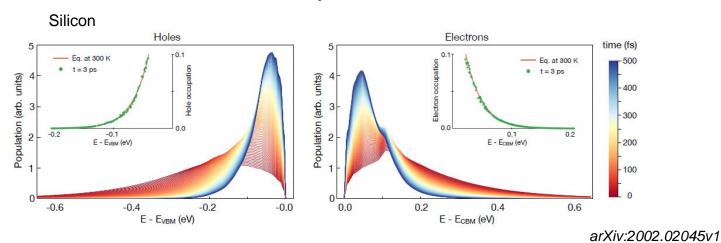




### Mobility and Seebeck coefficient in GaAs

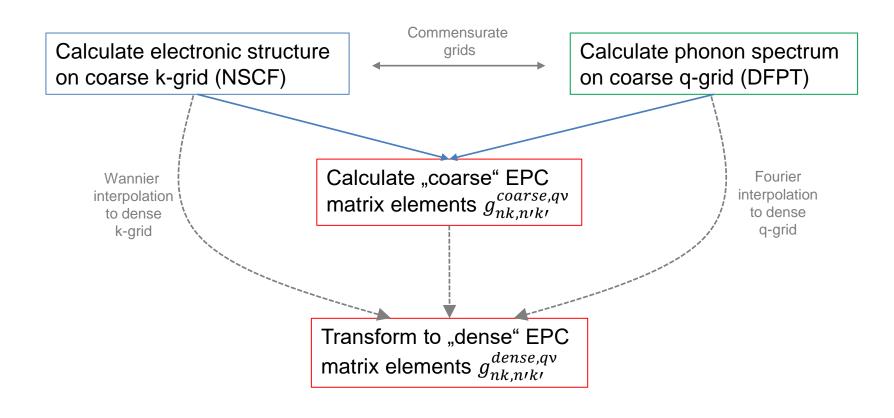


We also have access to "ultrafast carrier dynamics"





- EPC related properties often require very dense k-point and q-point samplings, of order 100x100x100 points
- Modern approach: use Wannier interpolation for electrons and Fourier interpolation of phonons

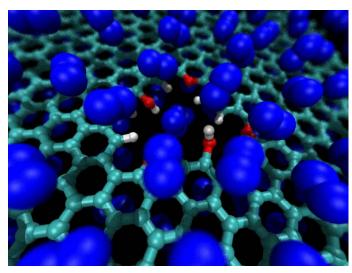




- Let's talk about a more ,integrated' way to obtain physical properties of materials
- BO approximation: Nuclei are supposed to obey classical mechanics, i.e.

$$m_I \ddot{R}_I = -\frac{\partial \Phi^{BO}(\{R\})}{\partial R_I} \quad I = 1, N$$

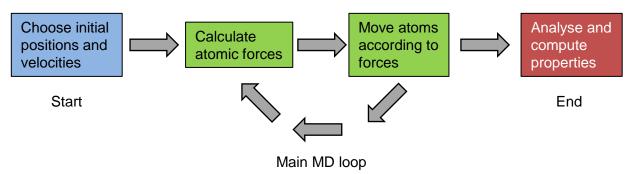
- Molecular dynamics: Follow the time evolution of the atomic movements ("trajectories") and do statistics
  - Observe dynamics of atoms and molecules
  - Compute ensemble averages
- Access to
  - chemical reactions
  - Adsorption of molecules on surfaces
  - Phonons
  - Phase transitions
  - Diffusion of atoms or defects
  - IR and Raman spectra



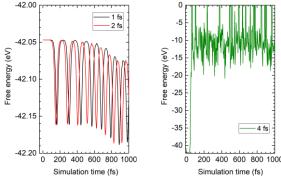
Nature Communications 9, 1812 (2018)



• Goal: "Propagate Newton's Equations, use discrete timestep  $\Delta t$ 



- Need some "propagator" (or "integrator") to do the update
  - Integrator should be time reversible
  - It should conserve phase space volume
  - It should be stable for larger time steps (i.e. allow for longer MD simulation time)



The choice of  $\Delta t$  is crucial!

Example: "Velocity Verlet" method, combine forward and backward Taylor expansions

$$R_I(t + \Delta t) = 2R_I(t) - R_I(t - \Delta t) + \ddot{R}_I(t) \frac{(\Delta t)^2}{2}, \qquad v_I(t + \Delta t) = v_I(t) \left[ \frac{a(t) + a(t + \Delta t)}{2} \right] \Delta t$$



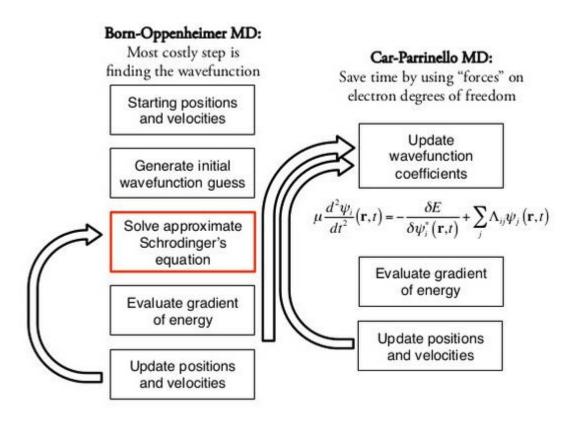
- Need to get interatomic forces
- Ab initio molecular dynamics (AIMD): the potential energy surface is obtained from density functional theory
- Born-Oppenheimer AIMD:  $m_i \ddot{R}_i = -\nabla_I \min_n \{ \langle \phi^{GS} | H^{KS} | \phi^{GS} \rangle \}$
- At each time-step minimize electron density to obtain the current electronic structure and forces
- An alternative: "Car-Parinello" molecular dynamics (CPMD)

$$m_i \ddot{R}_i = -\nabla_I E[\{\phi_i\}, \{R_I\}]$$

$$\mu_k \ddot{\varphi}_i(r,t) = -\frac{\delta E^{KS}}{\delta \varphi_i^*} - \sum_j \lambda_{ij} \varphi_j(r,t)$$
 ficticious mass Gradient forces Orthogonality constraint

CPMD: Propagate KS orbitals together with nuclei





- · Ab initio DFT methods allow for simulation times of a few ps
- CPMD is faster than BOMD, but forces are noisy and require much smaller timestep  $(\Delta t \sim 0.1 \, fs)$  compares to BOMD  $(\Delta t \sim 1 \, fs)$
- AIMD methods that go beyond Born-Oppenheimer exist (Ehrenfest, Surface hopping)



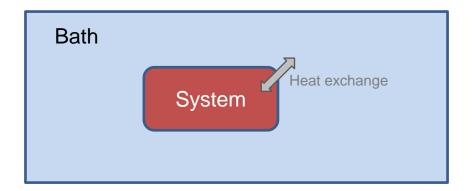
- Can simulate different ensembles:
  - Microcanonical ensemble (NVE): Number of particles, volume and the total energy are conserved, "natural ensemble" for MD
  - Canonical ensemble (NVT): Number of particles, volume and temperature are conserved → system is in contact with a heat bath
  - NPT, NPH ensembles: number of particles, pressure and enthalpy or temperature are constant, used for studying phase transitions
  - Grand canonical ensemble (µVT): chemical potential is constant, used for adsorption/desorption
- MD allows us to simulate experiments at these conditions



- How to include temperature?
- Simplest way: "velocity rescaling"
  - every N steps, rescale the atomic velocities by a factor that creates the desired temperature T

$$v_{new} = \sqrt{\frac{T}{T(t)}} v_{old}$$

- Easy and stable, but does not correspond to any ensemble
- Not time-reversible
- Idea: couple the system to a heat bath that acts as a thermostat



System: energy not conserved System+bath: Energy conserved

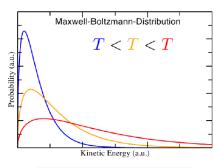


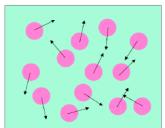
- Weak coupling Berendsen bath: Unit cell immersed in a hypothetical surrounding bath at  $T_{bath}$ :
  - More elaborate velocity rescaling, adjust system temperature according to

$$\Delta T = \frac{\Delta t}{\tau} (T_{bath} - T(t))$$

- Still no real ensemble, but in practice results are close enough.
- Not time-reversible
- The ,rise time  $\tau$  needs to be chosen to keep the temperature evolution smooth

- Andersen thermostat J. Chemical Phys. 72, 2384 (1980)
  - Particles have fixed probability to collide with "Andersen daemon", collision frequency v
  - After collision, give velocity according to Maxwell-Boltzmann distribution
  - Samples correctly the NVT ensemble







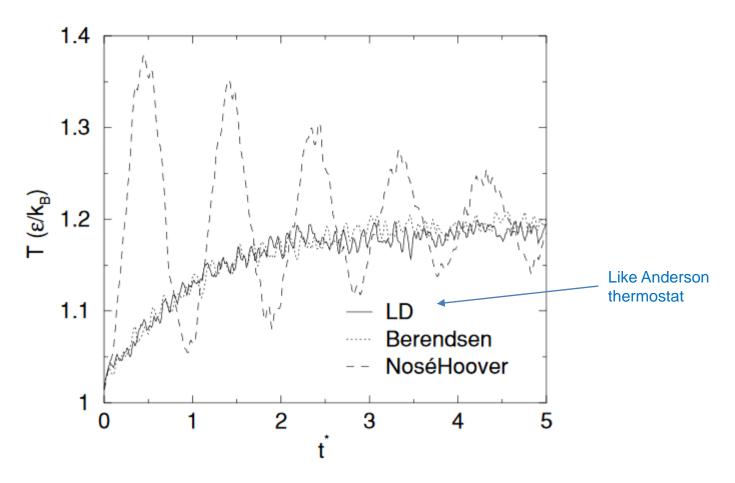
- Nosé-Hoover thermostat J. Chem. Phys. 81, 511 (1984), Phys. Rev. A. 31, 1695 (1984)
  - Includes the heat bath explicitly as an additional degree of freedom
  - Introduce artificial ,time scaling parameter s, a ficticious mass Q and a friction coefficient  $\zeta$
  - Nosé-Hoover Hamiltonian:  $H_{N-H} = \sum_{i=1}^{N} \frac{\vec{p}_i^2}{2m_i} + U(\vec{R}) + \frac{\zeta^2 Q}{2} + 3Nk_B T \ln s$

Ficticious oscillator

- Magnitude of Q controls coupling strength
- Q needs to be carefully chosen: -too large → poor temperature control
   -too small → high frequency T variations
- Very popular algorithm



• Comparison of thermostats



• Each thermostat requires an ,equilibration phase to reach desired temperature



- How about constant pressure?
- Barostats:
  - Weak coupling Berendsen J. Chem. Phys. 81, 3684 (1984)
    - Similar to thermostat
    - Scale each dimension by  $\mu = \left[1 \frac{\beta \Delta t}{\tau} (P_0 P)\right]^{1/2}$  where  $\beta$  is an isothermal compressibility (has to be properly chosen)
  - Rahman-Parrinello J. Appl. Phys. 52, 7182 (1981)
    - Adaption of Nosé-Hoover thermostat
    - Extension to allow change of cell volume and shape
    - <u>But:</u> Another "cell mass" to properly choose such that coupling to ,pressure bath' is neither too strong nor to weak
- Combination of barostats and thermostats allows for geometry optimization for a specfic temperature T or for search for global energy minimum → simulated annealing



## Example: 1-D superionic conduction and phase transition β-AISiO<sub>4</sub>

