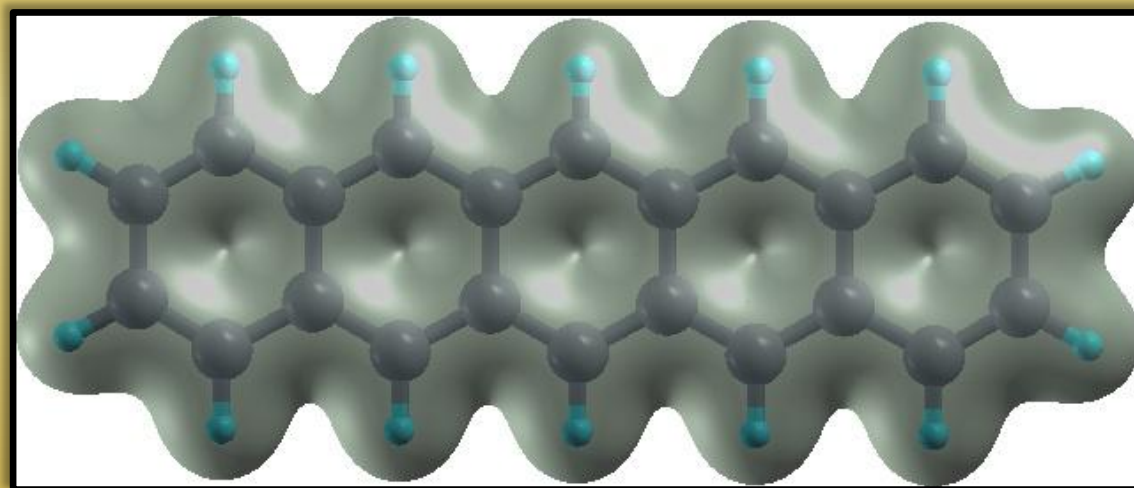


Electronic Structure Theory in Practice



Oliver T. Hofmann,
Trieste, Aug 7th 2013

Solving the Schrödinger equation

$$\hat{H}\Psi = E\Psi, \text{ with}$$

$$\Psi = \Psi(\{R_{Nuc}\}, \{r_{elec}, \sigma_{elec}\})$$

$$\hat{H} = \hat{T}^{Nuc} + \hat{V}^{Nuc-Nuc} + \hat{T}^e + \hat{V}^{Nuc-e} + \hat{V}^{e-e}$$

- **Full many body solution typically not attainable**
- **→ Born-Oppenheimer Approximation**

$$\hat{H}^e \Phi_\nu = E_\nu^e \Phi_\nu, \text{ with}$$

$$\hat{H}^e = \hat{T}^e + \hat{V}^{e-Nuc} + \hat{V}^{e-e}$$

- **Assumption: electrons are in an eigenstate of H^e**
- **Separation of nuclear and electronic coordinates**

Outline

- **Solving the electronic part**
 - Self-consistent field method
 - Achieving and accelerating convergence
- **Structure optimization**
 - (Global structure optimization)
 - Local structure optimization
 - Vibrations
- **What can we learn from this?**
 - Visualization

Where are the electrons?

- All ground state properties related to electron distribution [1] $\Phi(r_1, r_2, \dots, r_N) \iff n(r)$
 - Relative energy of conformers, dipole moments, reactivities, etc.
 - \rightarrow Density functional theory (DFT)
- Kohn-Sham scheme [2]
 - Map electron density on effective one-particle orbitals

$$n(r) \implies \sum_i f_i |\phi_i|^2$$

[1] P. Hohenberg, W. Kohn, *Phys Rev.* (1964), B864

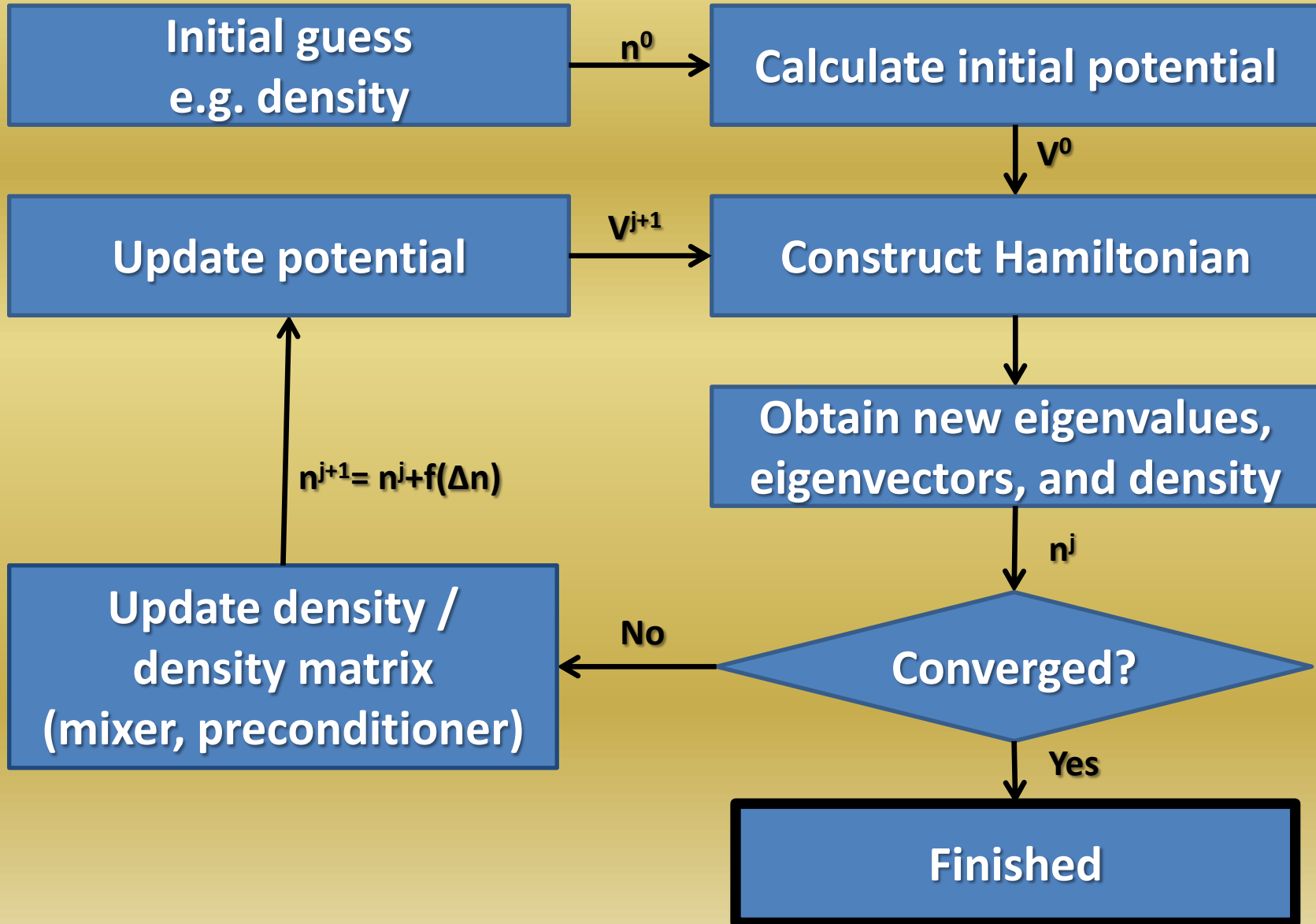
[2]: W. Kohn, L.J. Sham, *Phys. Rev.* (1965), A1133

Kohn-Sham DFT

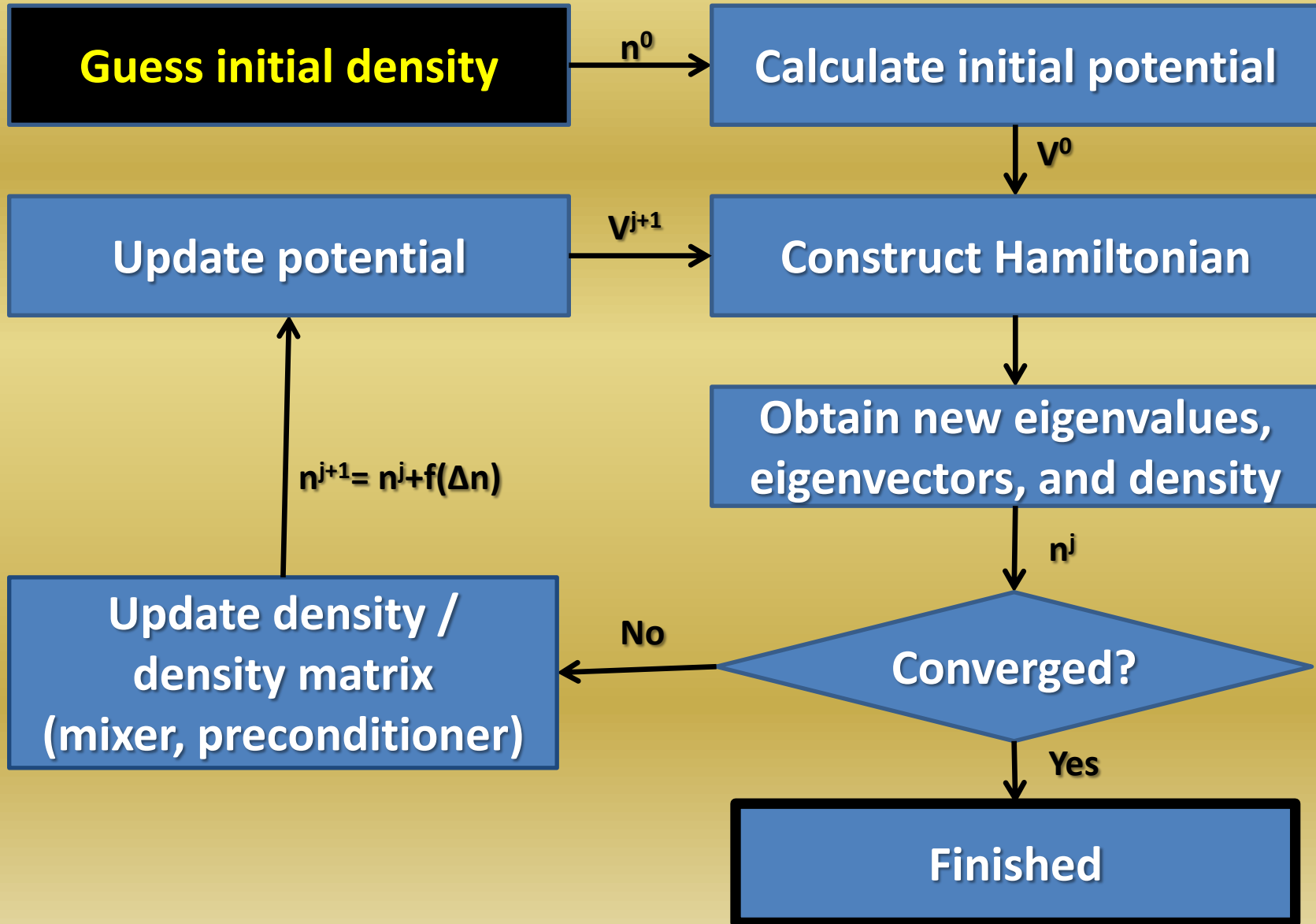
$$\left(\underbrace{\frac{1}{2} \nabla^2}_{\hat{T}^e} + \underbrace{\int \frac{n(r')}{|r - r'|} d^3 r' + V_{xc} + V_{ext}}_{\hat{V}^{e-e}, \text{ depends on } n = \sum_i |\phi_i|^2} \right) \phi_i = \epsilon_i \phi_i$$

- **We want to determine all Φ_i such that**
 - **$E[n] \rightarrow \min$**
 - **H is consistent with Φ_i**
- **Approaches**
 - Direct minimization
 - **Self-consistent field method**

Self-consistent field method

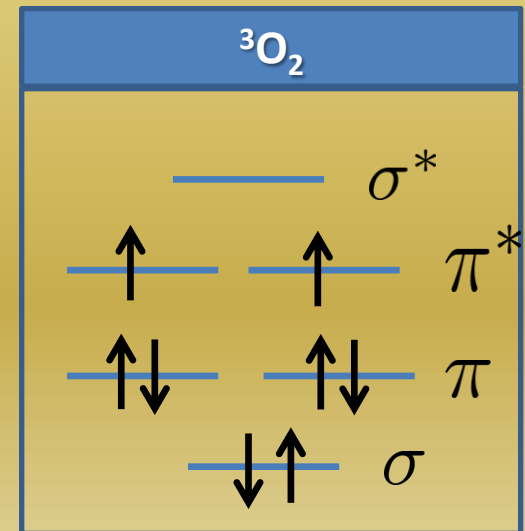
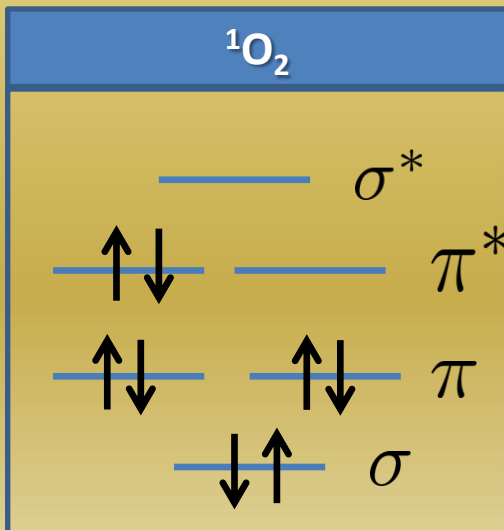
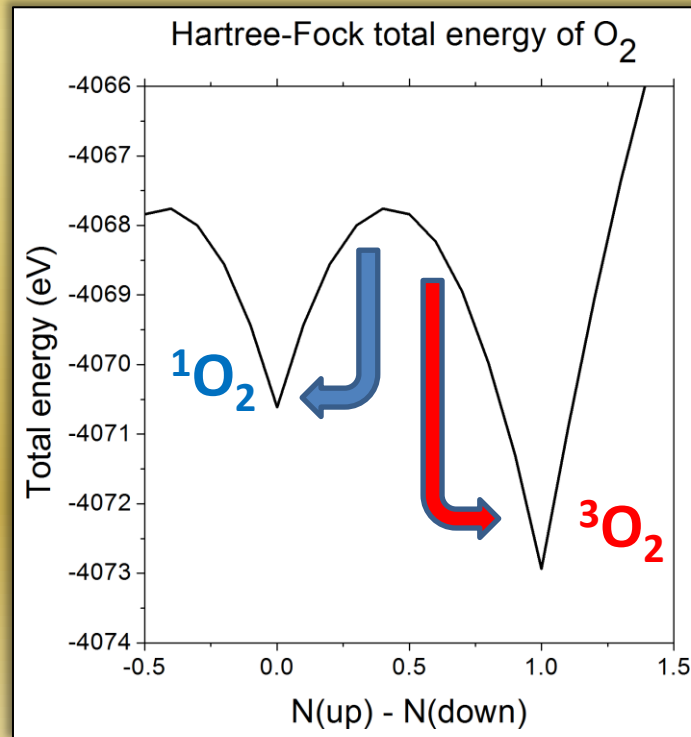


Self-consistent field method



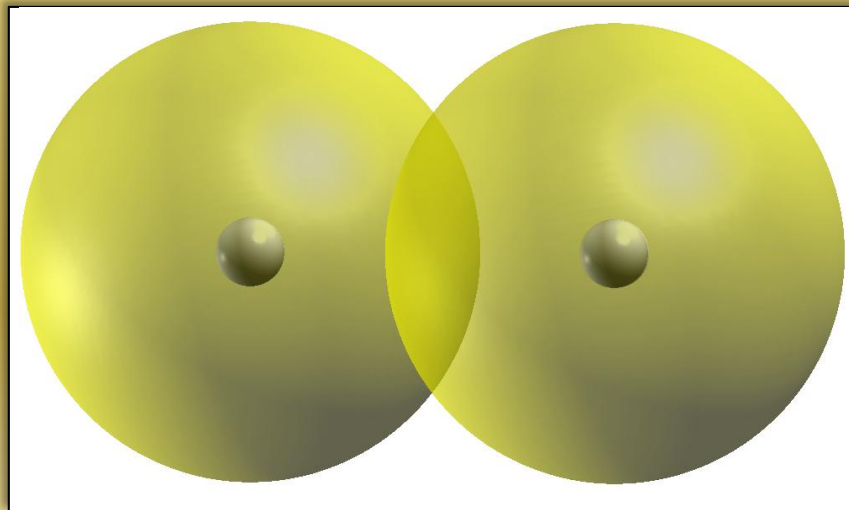
Importance of the initial guess

- Different minima might exist, qualitative changes
- Example: Two different stable spin-states for O_2
- Common issue, e.g., for magnetic solids



Finding an initial guess

- **Superposition of spheric atomic densities**
 - Straightforward to implement
 - „Mostly sufficient“, but can overemphasize symmetry
 - No density matrix / orbital coefficients



Finding an initial guess

- **Extended Hückel Theory [1]**

- **Linear combination of atomic orbitals:** $\phi_i = \sum_j c_{ij} \psi_j$

- **Hamiltonian:**

- H_{ii} : parameterized valence ionization energies

- $H_{ij} = \frac{1}{2} K S_{ij} (H_{ii} + H_{jj})$ [2,3]

- **Solve set of linear equations:** $\sum_i [H_{ij} - ES_{ij}] c_{ij} = 0$

- **Improved flexibility, specific orbitals can be populated**

- **Random basis set coefficients**

- **Backup method**

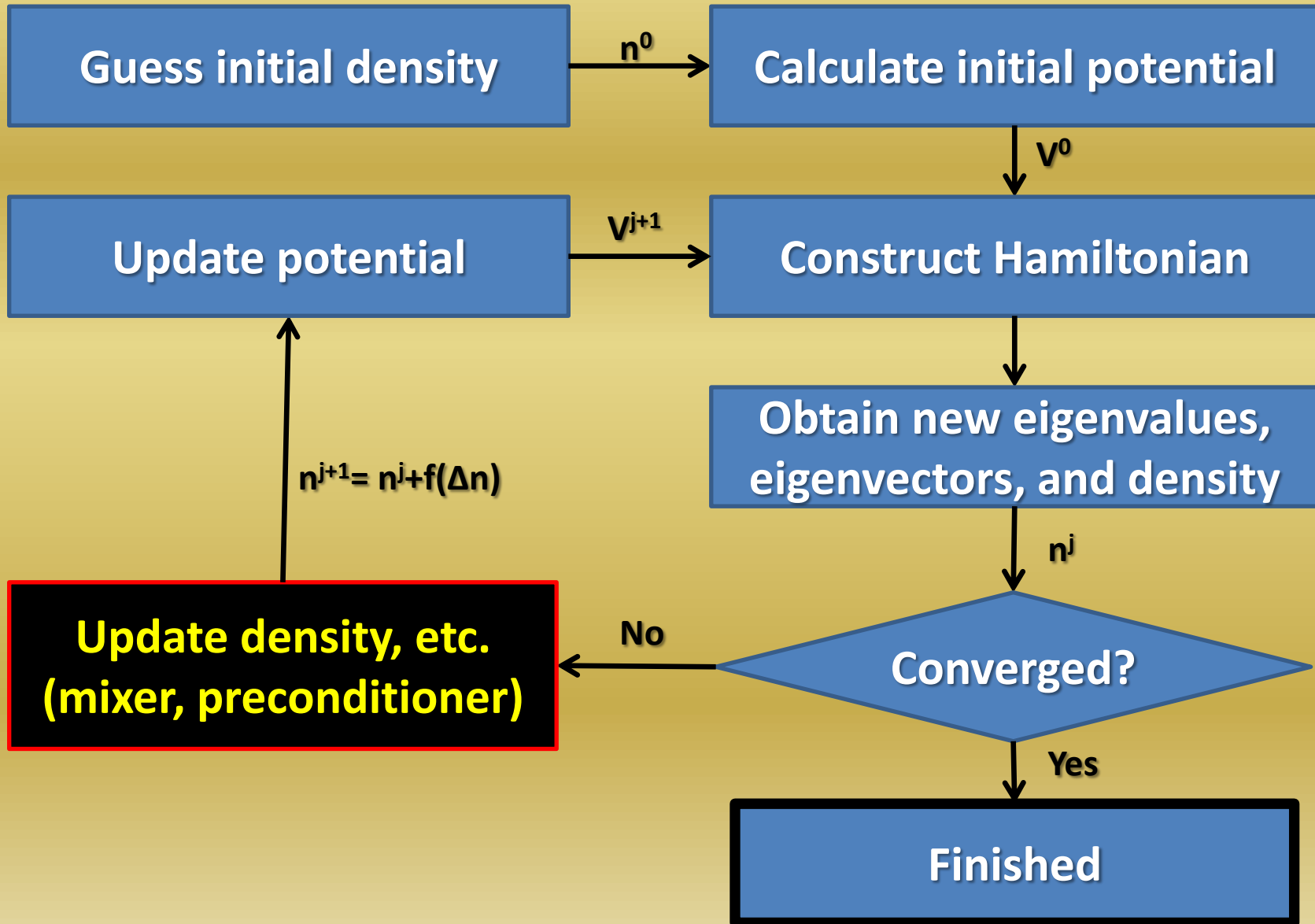
- **Usually plane-waves only**

[1] R. Hoffmann, J Chem. Phys (1963), 1397

[2] R. S. Mulliken, J. Chem. Phys. (1946) 497

[3] M. Wolfsberg and L. Helmholz, J. Chem. Phys (1952), 837

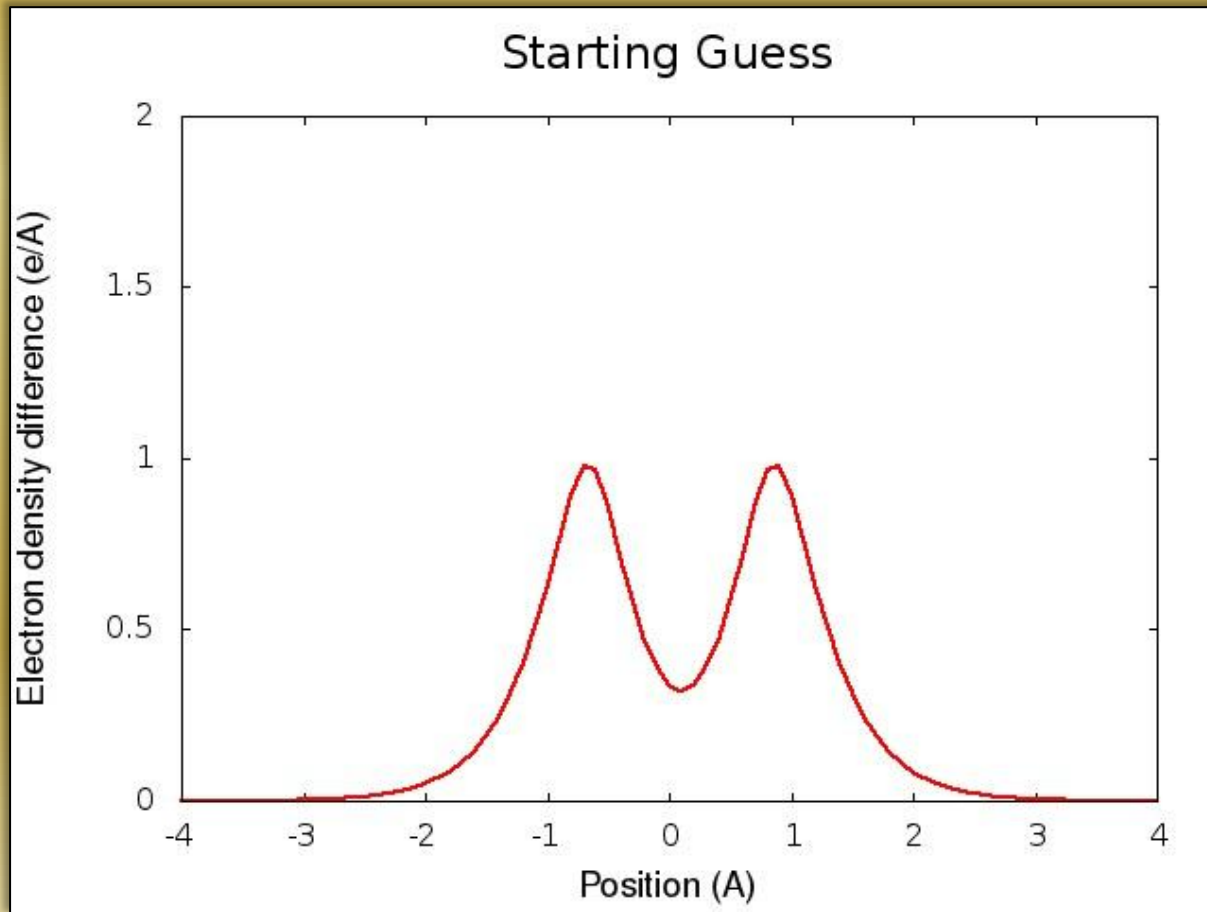
Self-consistent field method



Naive Mixing – Good guess

Naively take the newly calculated density: $n^{j+1} = n^j + \Delta n$

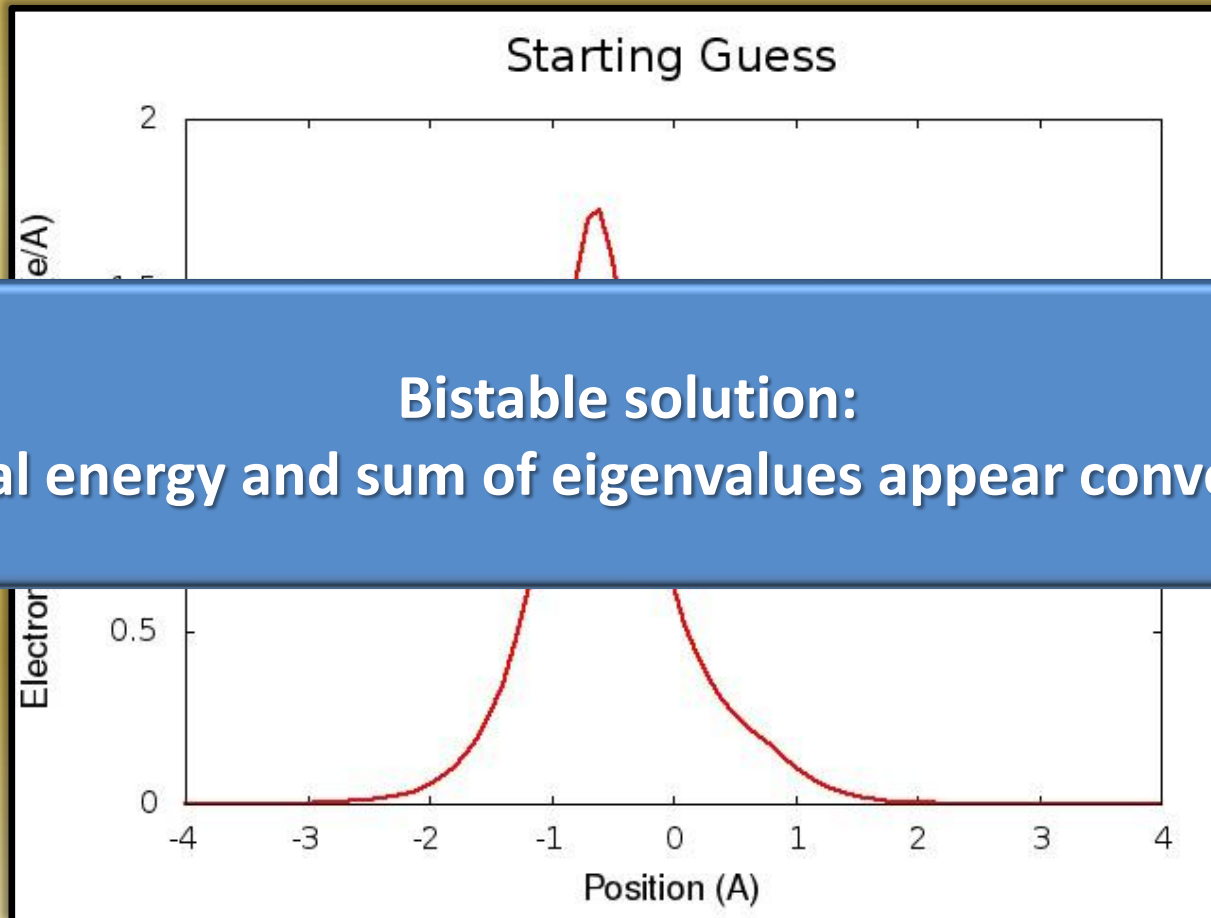
Example: H_2 , $d=1.5\text{\AA}$, projected in 1 dimension, PBE calculation



Naive Mixing – Bad guess

Naively take the newly calculated density: $n^{j+1} = n^j + \Delta n$

Example: H_2 , $d=1.5\text{\AA}$, projected in 1 dimension, PBE calculation

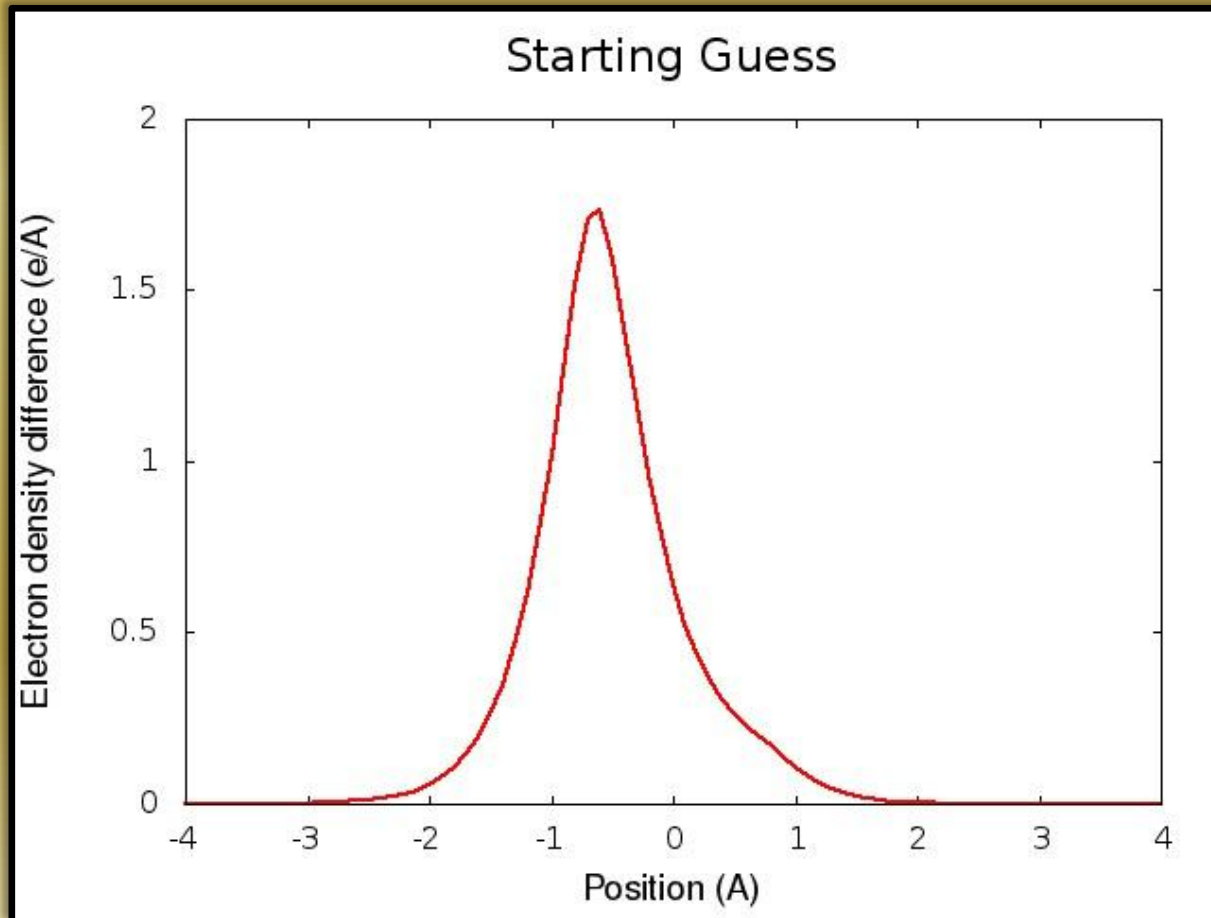


Bistable solution:
Total energy and sum of eigenvalues appear converged

Linear mixing

Damp oscillations by reducing steplength: $n^{j+1} = n^j + \alpha \Delta n$

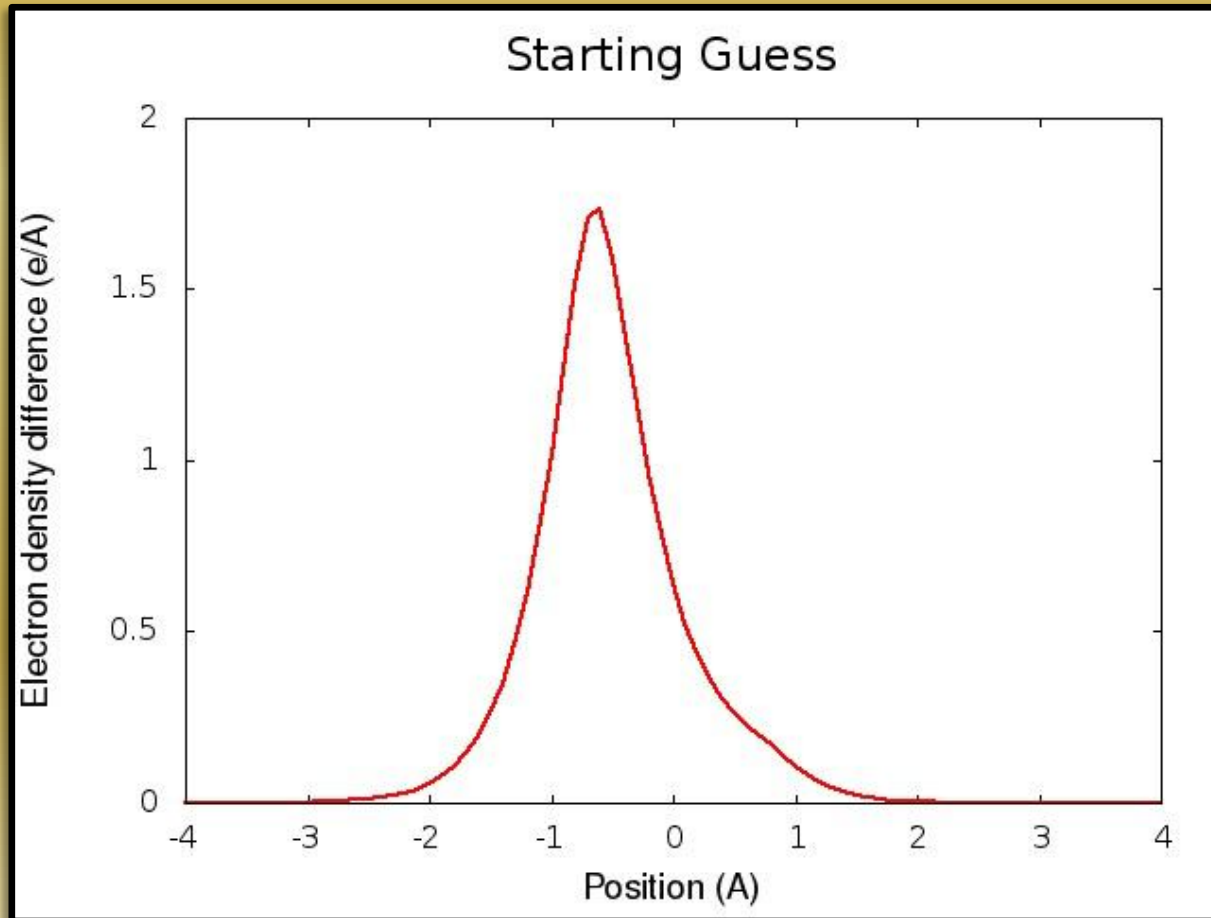
Example: As previous, $\alpha=0.3$



Linear mixing

Damp oscillations by reducing steplength: $n^{j+1} = n^j + \alpha \Delta n$

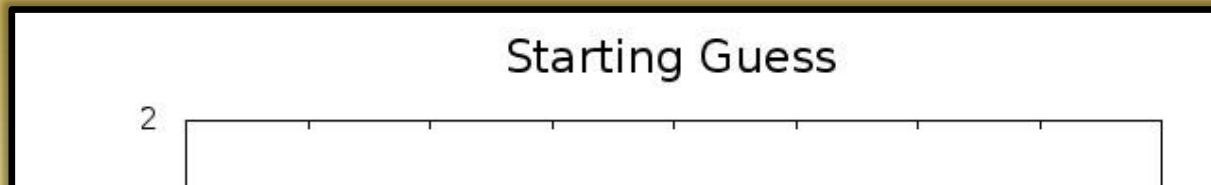
Example: As previous, $\alpha=0.8$



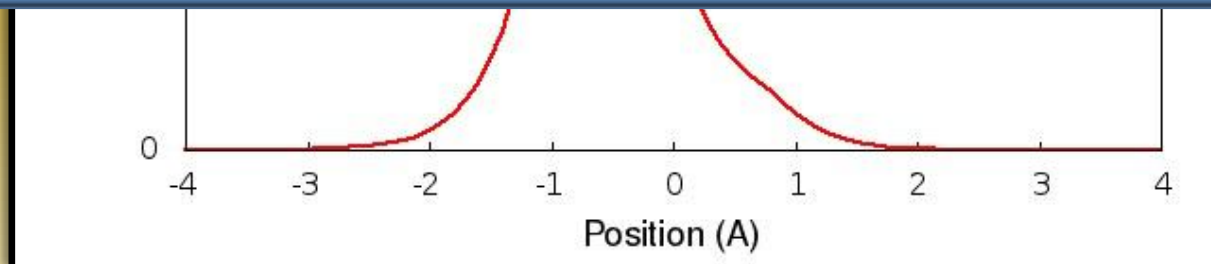
Linear mixing

Damp oscillations by reducing steplength: $n^{j+1} = n^j + \alpha \Delta n$

Example: As previous, $\alpha=0.03$



Ideal choice system dependant
No clear recipe to choose ideal α



Pulay mixing [1]

Generate optimized input density: $n^{j+1} = n^{opt} + \alpha R[n^{opt}]$

- a.k.a. **Direct Inversion in Iterative Subspace (DIIS) [1]**

- **Account for previous densities:**

$$n^{opt} = \sum_{\mu=1}^j \beta^{(\mu)} n^{(\mu)}, \text{ under the constrain that } \sum \beta = 1$$

- **Assuming linearity of residual ...**

$$R[n^{opt}] = R[\sum_{\mu} \beta^{(\mu)} n^{\mu}] = \sum_{\mu} \beta^{\mu} R[n^{\mu}]$$

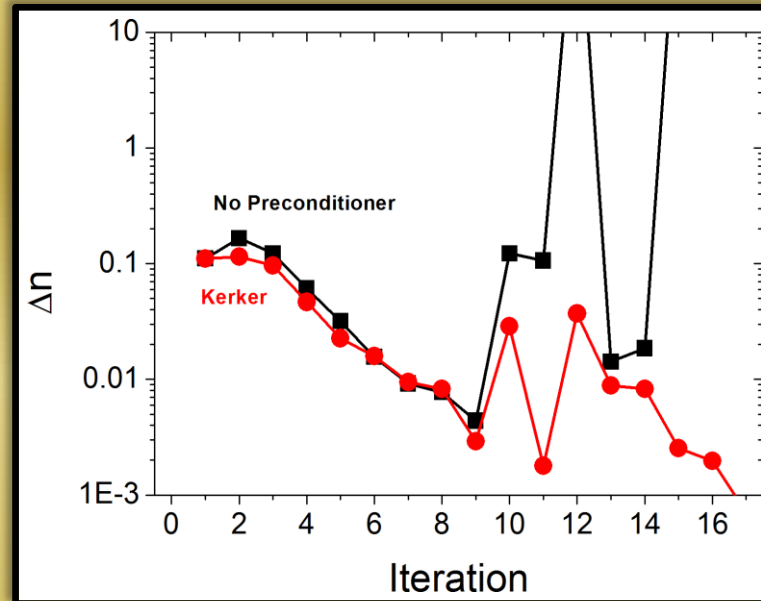
- **... the residual is minimized and the new density is constructed**

Preconditioning

- Potential during SCF deviates from correct potential, causes spurious „charge overshooting“
- Often pathological for surfaces, slab, thin films, etc.
- **Solution: Make α depend on $\Delta n(\mathbf{r})$** $n^{j+1} = n^j + \hat{G} \Delta n$
 - Kerker preconditioning [1]: $\hat{G} = \alpha \frac{\nabla^2}{\nabla^2 + q_0^2}$

Preconditioning

8 layer Al slab, PBE calculation



- Again, no *a priori* known ideal choice for q_0
- Reasonable values close to Thomas-Fermi screening constant

$$q_0 \approx \sqrt{\frac{4k_f}{\pi}}$$

Broadening of states

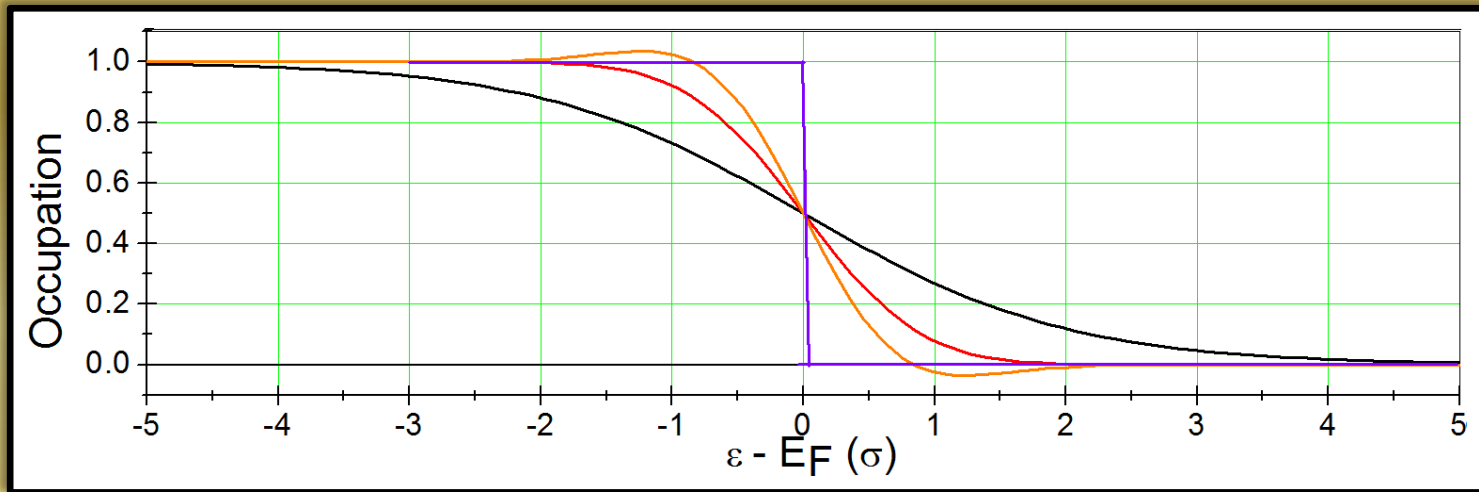
$$n = \sum_i f_i |\phi_i|^2 \qquad f = \Theta(\epsilon - E_F)$$

- **Stepfunction: Discontinuity for bands crossing E_F**
- **Solution: Replace Θ by an approximate, smooth function**

Broadening of states

$$n = \sum_i f(E_F - \epsilon_i) |\Psi_i|^2$$

$$f(x) = \Theta(-x)$$



$$f(x) = \left(\exp\left(\frac{x}{\sigma} + 1\right) \right)^{-1}$$

Fermi [1]

$$f(x) = \frac{1}{2} \operatorname{erfc} \left(\frac{x}{\sigma} \right)$$

Gaussian [2]

$$f(x) = \frac{1}{2} \operatorname{erfc} \left(\frac{x}{\sigma} \right) + \sum_m^n A_m H_{2M+1} \times \frac{x}{\sigma} \exp \left(\frac{x}{\sigma} \right)^2$$

Methfessel-Paxton [3]

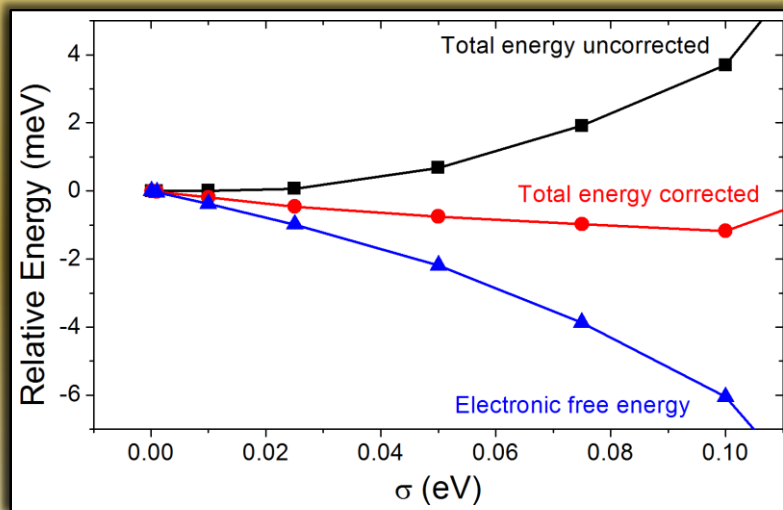
[1] N. Mermin, *Phys. Rev.* 137, A1441 (1965).

[2] C.-L. Fu, K.-H. Ho, *Phys. Rev. B* 28, 5480 (1983).

[3] M. Methfessel, A. Paxton, *Phys. Rev. B* 40, 3616 (1989).

Broadening of states

- Total energy now depends on σ , no longer variational
- Optimize free energy: $\Omega = E_{tot} - \sigma S(\sigma)$
- Backextrapolation to $\sigma \rightarrow 0$
- S similar for different situations (absorption)



Cu (111)

5 layer slab

Gaussian smearing

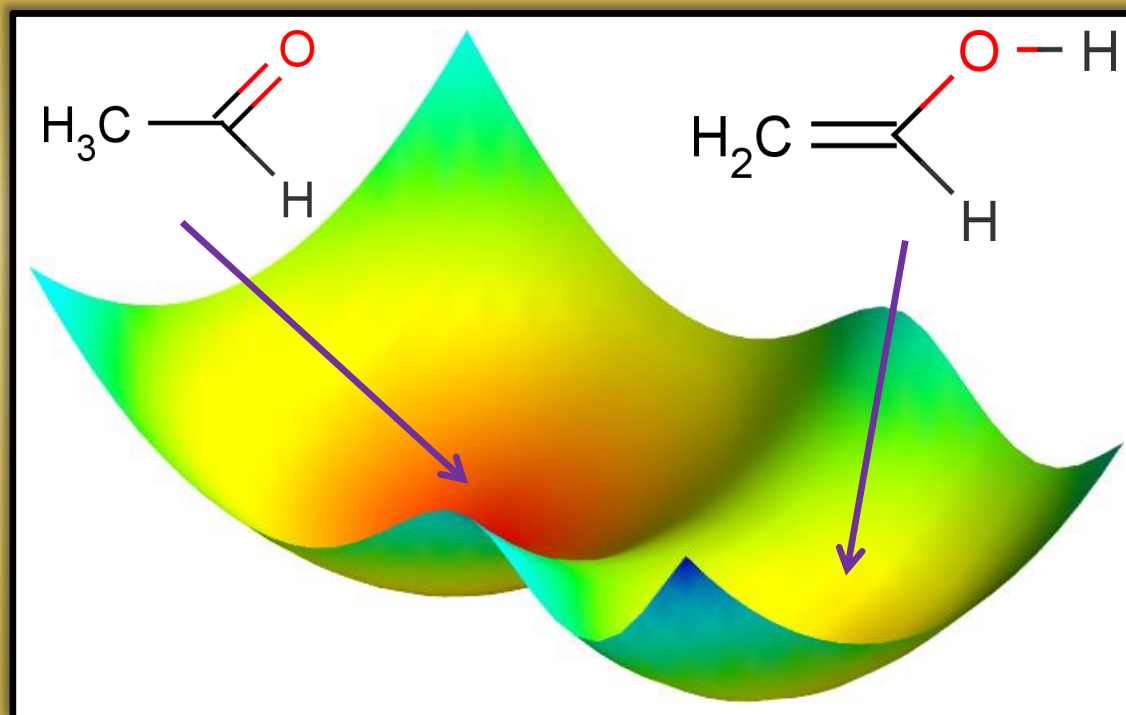
PBE calculation

12x12x1 k-points

Summary SCF

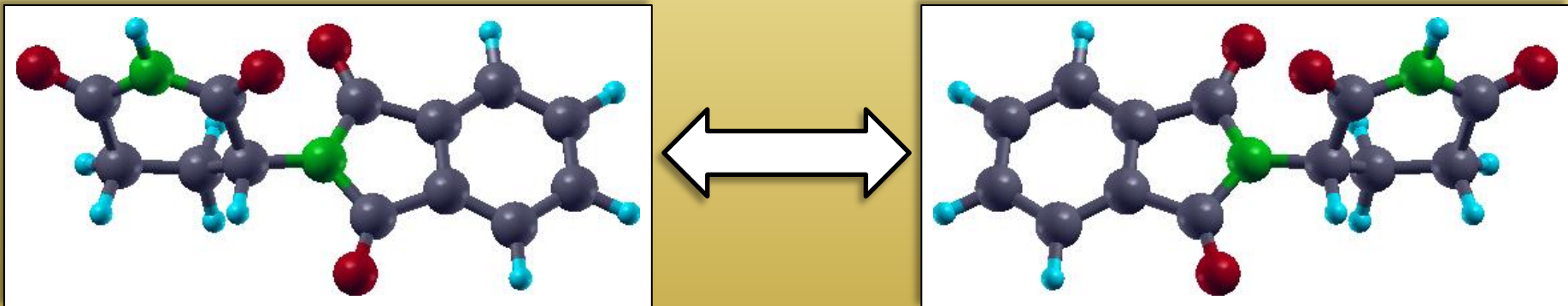
- **Ground state electron density determined iteratively**
- **Initial guess needs initial thought, can change results qualitatively**
- **Density update by**
 - Linear mixing (slow)
 - Pulay mixing
- **Convergence acceleration by**
 - Preconditioner
 - Broadening of states

Structure optimization



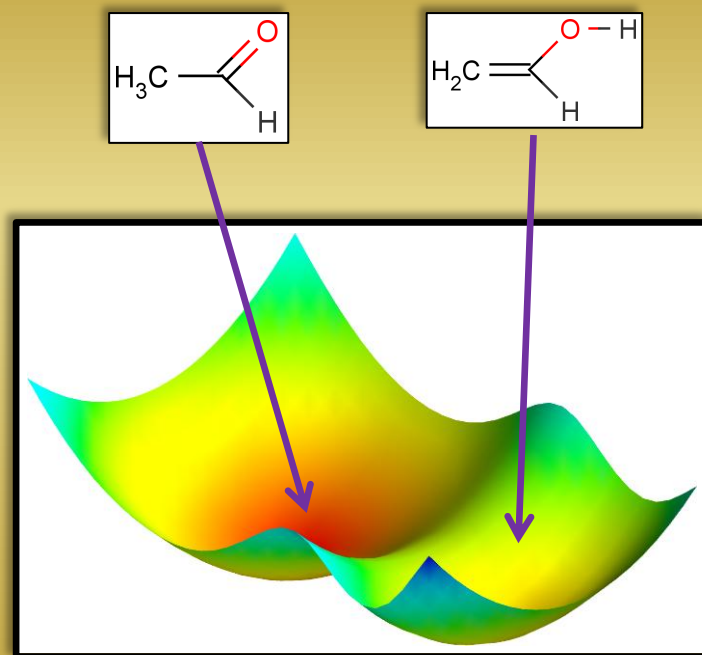
Structure optimization

- Most electronic properties sensitive to geometry
- „Geometry determines function“



Global structure search

- **Born-Oppenheimer energy surface can contain several minima**
 - Constitution isomery
 - Configuration isomery
 - Conformation isomery
- **System in equilibrium is given by ensemble average over all minima**
- **Often dominated by global minimum (but watch out for tautomers)**



Global structure search

- **Methods to find the global minimum:**
- **Stochastical or Monte-Carlo**
- **Molecular dynamics: Simulated annealing [1,2]**
- **Genetic algorithm [3]**
- **Diffusion methods [4]**
- **Experimental structure determination**

[1]: S. Kirkpatrick, et al., *Science*, (1983), 671

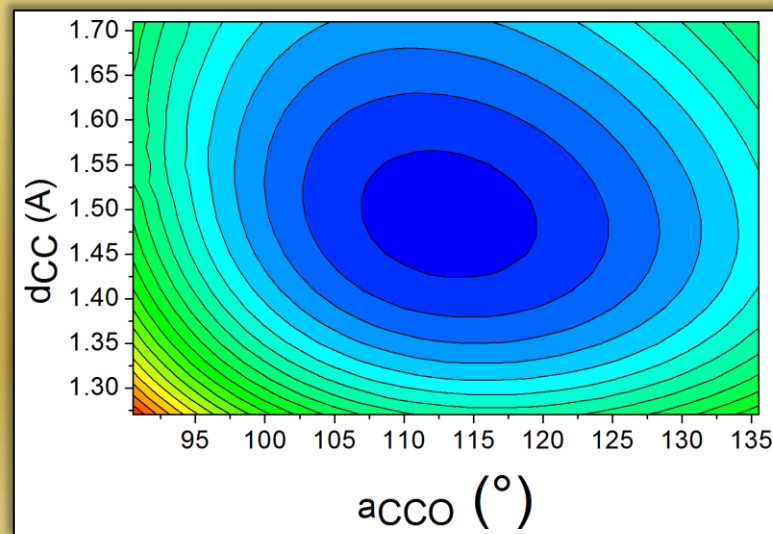
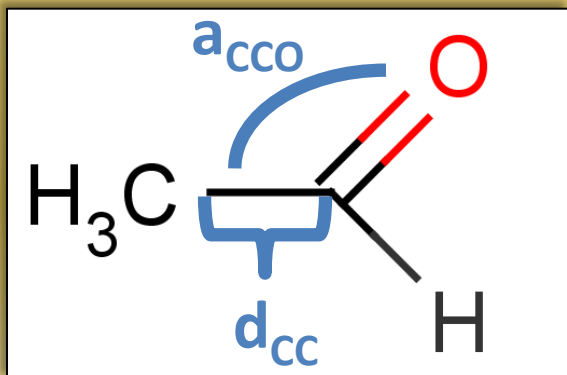
[2]: S.R. Wilson and W. Cui, *Biopolymers* (1990), 225

[3]: R.S. Judson, *Rev. Comput Chem.*, (1997), 1

[4] J. Konstrowicki, H. A. Scheraga, *J Phys. Chem.* (1992), 7442

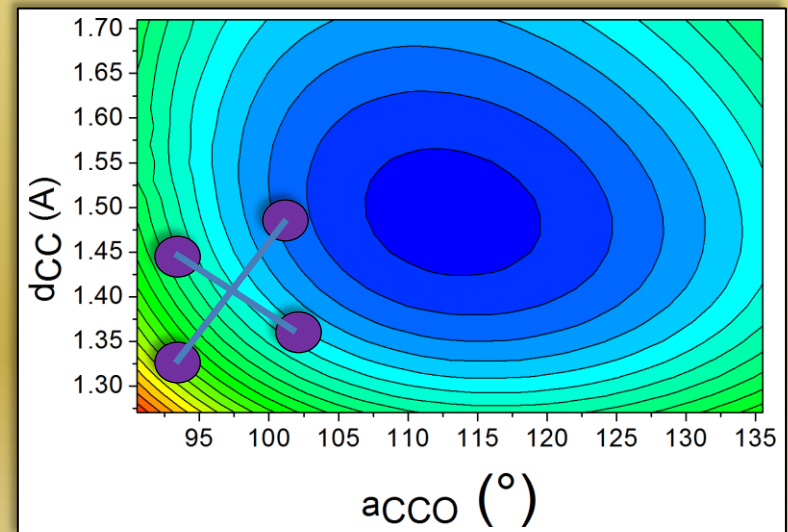
Local structure optimization

- Once we have an reasonable guess, find closest minimum
- Different approaches possible:
 - Mapping of the potential energy surface
 - Requires a lot of calculations
 - Typically only for dynamics



Local structure optimization

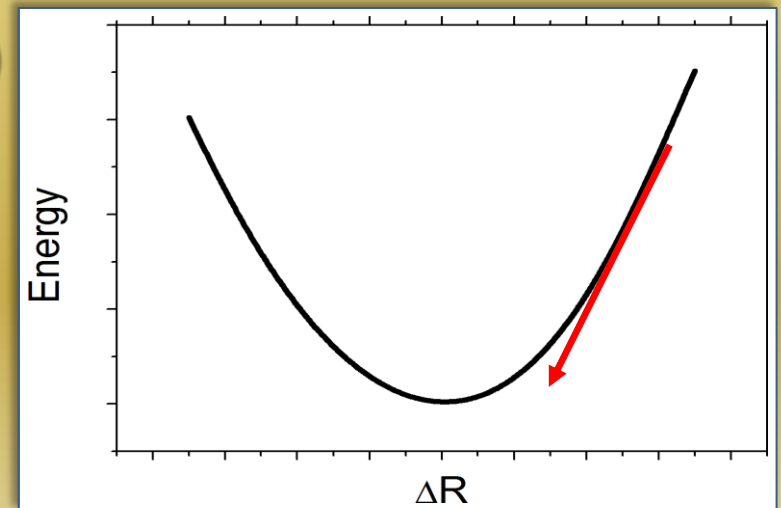
- Once we have an reasonable guess, find closest minimum
- Different approaches possible:
 - Mapping of the whole potential energy surface
 - Gradient free methods: e.g.,. Simplex method [1]
 - Choose n+1 start points
 - Determine best and worst energy
 - Remove worst point
 - Project new point by reflection
 - Expand, contract, compress
 - Repeat until self-consistent



Local structure optimization

- Once we have an reasonable guess, find closest minimum
- Different approaches possible:
 - Mapping of the whole potential energy surface
 - Gradient free method: e.g., simplex
 - Gradient-based methods
 - Calculate gradient (a.k.a. „forces“)

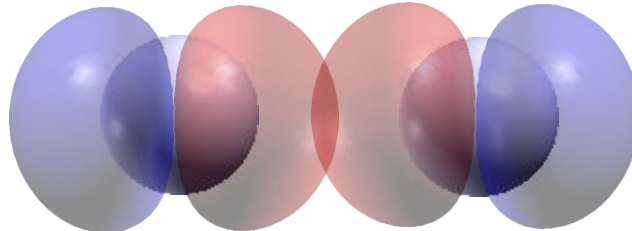
$$F = \frac{\delta E}{\delta R}$$



Total energy gradient

- Search for minimum by following the gradient

$$\frac{\delta E}{\delta R} = \langle \Psi_0 | \frac{\delta \hat{H}}{\delta R} | \Psi_0 \rangle + \langle \frac{\delta \Psi_0}{\delta R} | \hat{H} | \Psi_0 \rangle + \langle \Psi_0 | \hat{H} | \frac{\delta \Psi_0}{\delta R} \rangle$$



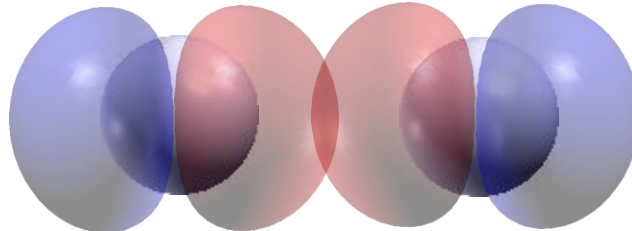
Total energy gradient

- Search for minimum by following the gradient

$$\frac{\delta E}{\delta R} = \left\langle \Psi_0 \left| \frac{\delta \hat{H}}{\delta R} \right| \Psi_0 \right\rangle + \left\langle \frac{\delta \Psi_0}{\delta R} \left| \hat{H} \right| \Psi_0 \right\rangle + \left\langle \Psi_0 \left| \hat{H} \right| \frac{\delta \Psi_0}{\delta R} \right\rangle$$

- affects only $V^{\text{nuc-nuc}}$ and $V^{\text{e-nuc}}$

$$F_i^{\text{Hellman-Feynman}} = Z_i \sum_j \nabla R_i \frac{Z_j}{|R_i - R_j|} + \int d^3r n(r) \nabla R_i \frac{Z_i}{|R_i - r|}$$



Total energy gradient

- Search for minimum by following the gradient

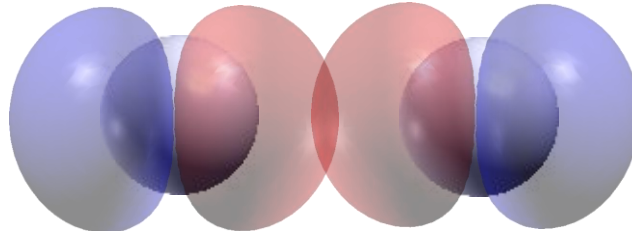
$$\frac{\delta E}{\delta R} = \langle \Psi_0 | \frac{\delta \hat{H}}{\delta R} | \Psi_0 \rangle + \langle \frac{\delta \Psi_0}{\delta R} | \hat{H} | \Psi_0 \rangle + \langle \Psi_0 | \hat{H} | \frac{\delta \Psi_0}{\delta R} \rangle$$

$$\frac{\delta \Psi_0}{\delta R} = \cancel{\frac{\delta \Psi_0}{\delta c} \frac{\delta c}{\delta R}} + \frac{\delta \Psi_0}{\delta \phi} \frac{\delta \phi}{\delta R}$$

- First term vanishes

- Second term survives for atom-centered basis functions

$$F^{Pulay} = -2 \sum_{i\sigma} \langle \frac{\delta \phi_{i\sigma}}{\delta R} | \hat{h} - \epsilon_{i\sigma} | \phi_{i\sigma} \rangle$$



Total energy gradient

- **Search for minimum by following the gradient**

$$\frac{\delta E}{\delta R} = \langle \Psi_0 | \frac{\delta \hat{H}}{\delta R} | \Psi_0 \rangle + \langle \frac{\delta \Psi_0}{\delta R} | \hat{H} | \Psi_0 \rangle + \langle \Psi_0 | \hat{H} | \frac{\delta \Psi_0}{\delta R} \rangle$$

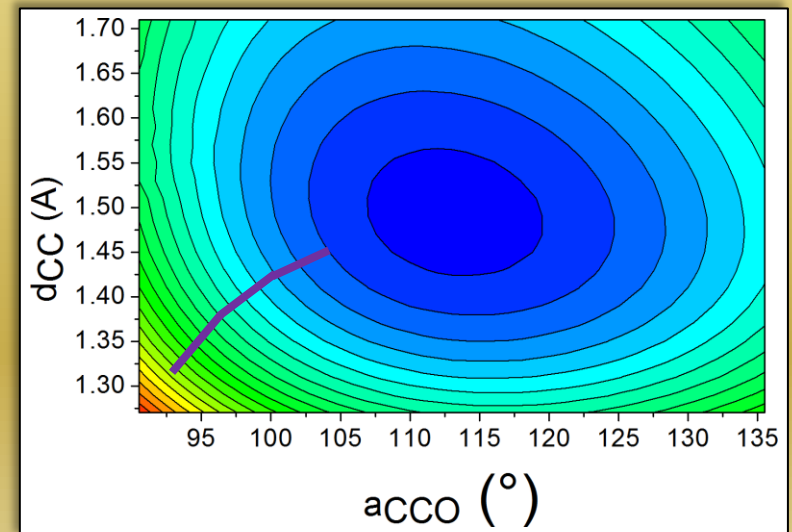
- **Additional contributions from atom-centered approximations**
 - Multipole expansion
 - Relativistic corrections
 - (Integration grids)
- **All straightforward but lengthy**

Geometry update – Steepest descent

- Follow negative gradient to find minimum

$$R^{n+1} = R^n - \alpha F'(R^n)$$

- Steplength α variable
- Guaranteed but slow convergence
- Oscillates near minimum
- Not suitable for saddle points
- Improved versions exist
 - Conjugated gradient [1]



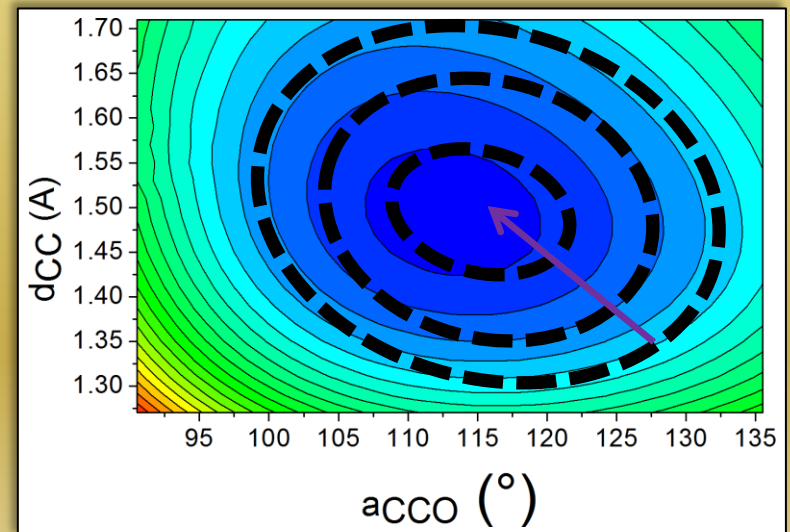
(Quasi)Newton methods

- Approximate PES by quadratic function

$$E(\Delta R) \approx E(R_{Min}) + \underbrace{\frac{\delta E}{\delta R}}_{F(R)} \Delta R + \frac{1}{2} \underbrace{\frac{\delta^2 E}{\delta R^2}}_{H \dots \text{Hessian}} \Delta R^2$$

- Find minimum: $\Delta R = H^{-1} F$
 - Newton: calculate exact H
 - Quasi-Newton: approximate H
 - Update as search progresses [1]

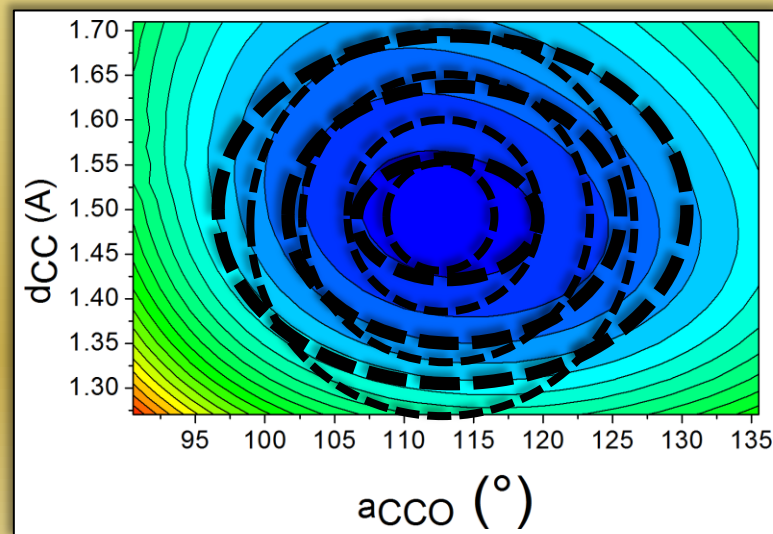
$$\tilde{H} \leftarrow \tilde{H} - \frac{\tilde{H} \Delta R (\tilde{H} \Delta R)^T}{\Delta R^T \tilde{H} \Delta R} - \frac{\Delta F \Delta F^T}{\Delta F^T \Delta R}$$



(Quasi)Newton methods

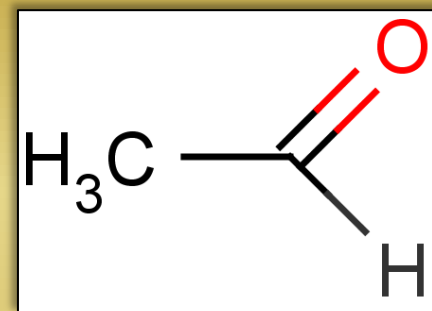
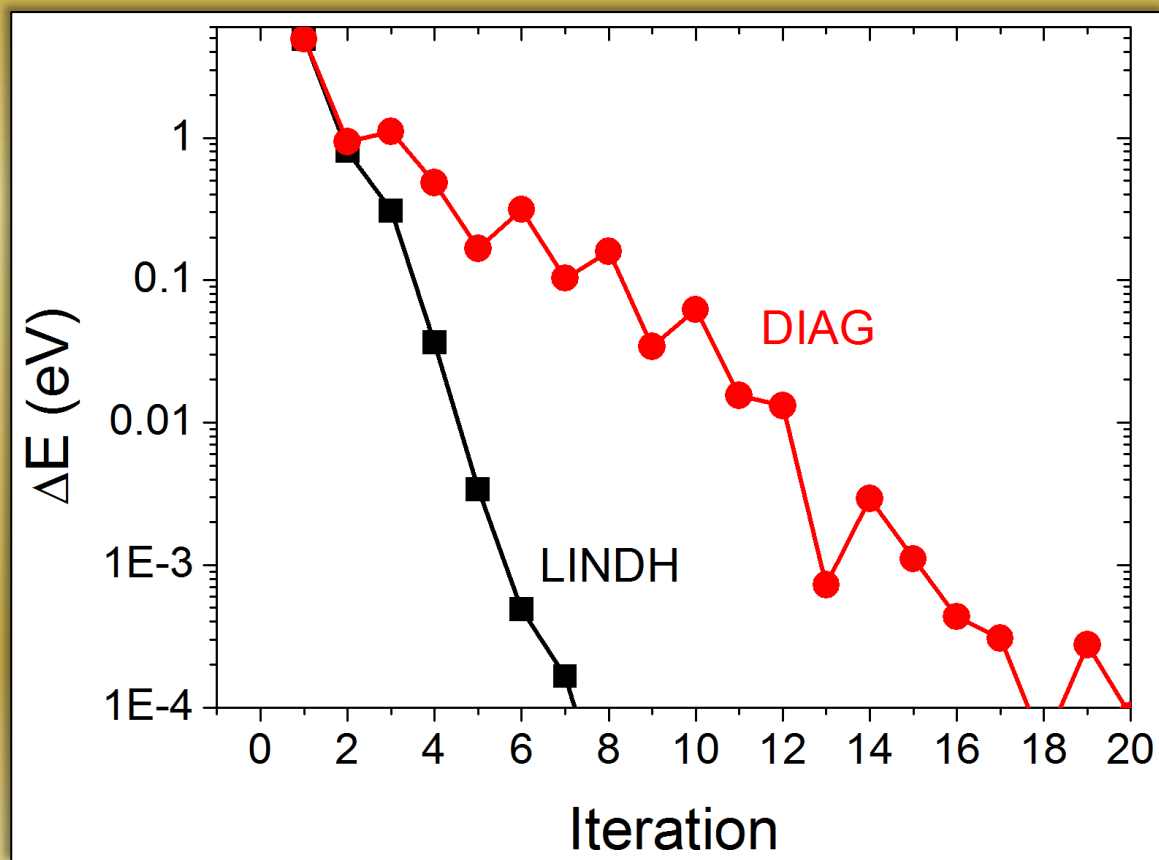
- Initial Hessian critical for performance
- Naive choice: Scaled unit matrix $\tilde{H} = \beta \bar{1}$
- Improved version: Apply „penalties“ on different kind of coordinates

$$\begin{aligned}\tilde{E} &= E + F\Delta R \\ &+ \sum_{ij} k_{ij} d_{ij}^2 \quad \text{Bond stretching} \\ &+ \sum_{ijl} k_{ijl} a_{ijl}^2 \quad \text{bending} \\ &+ \sum_{ijlm} k_{ijlm} \tau_{ijlm}^2 \quad \text{torsion} \\ &- k \text{ parameterized [1]}\end{aligned}$$



Effect of the Initial Hessian

Proper initialization leads to significant speed-up



(Quasi)Newton methods

- Soft degrees of freedom can cause large ΔR
- **Step control needed:** $\Delta R = \alpha H^{-1} F$
 - Line search method: If new point is worse than old, interpolate

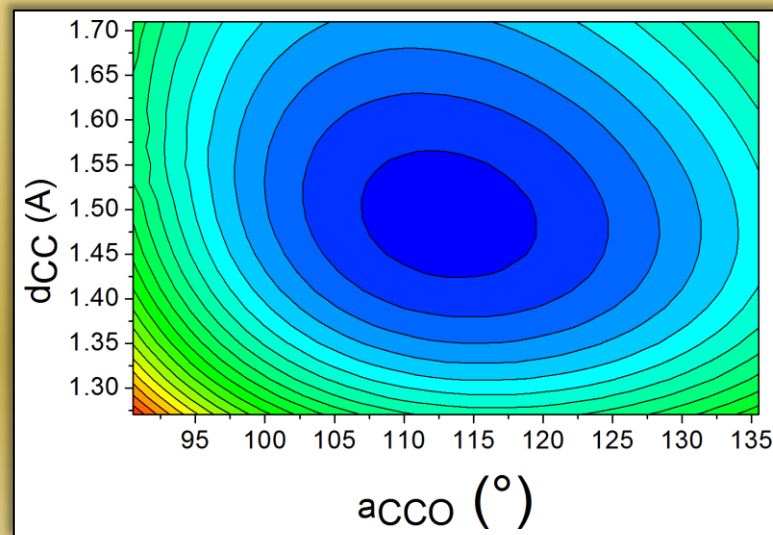
$$E(\alpha) = E(R + \alpha \Delta R)$$

- **Trust radius method**

- Enforce upper limit for ΔR
- Evaluate quality of quadratic model

$$q = \frac{E_{true}}{E_{expected}}$$

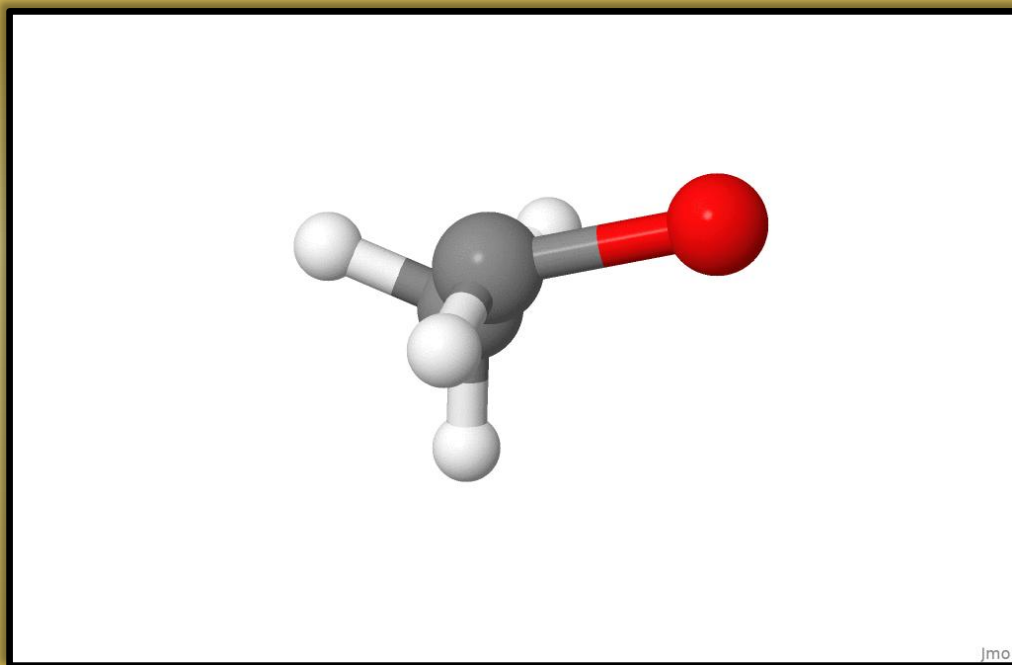
- **Adjust ΔR_{max} based on q**



Conclusions

- **(Global optimization: PES feature-rich, methods to find global minima exist)**
- **Local geometry optimization: Follow gradient**
 - Hellman-Feynman from moving potentials
 - Pulay from moving basis functions
 - + additional terms
- **Quasi-Newton method *de-facto* standard**
 - Require approximation and update of Hessian
 - Step control by line search or trust radius method

Vibrations



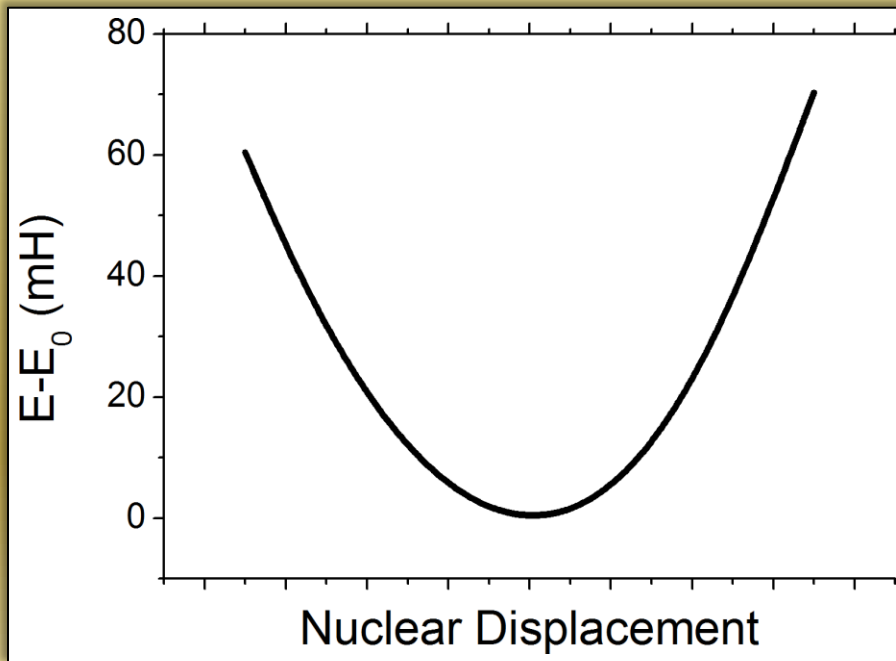
Vibrations

- **Vibrations give important information about the system:**
 - **Classification of stationary point (minimum / saddle point)**
 - **If saddle-point: Provides search direction**
 - **Thermodynamic data**
 - **Zero-point energy**
 - **Partion sum**
 - **Finite temperature effects**
 - **Connection to experiment:**
 - **Infra-red intensities: derivative of dipole moment**
 - **Raman intensities: derivative of polarizabilty**

Vibrations

- Expand Energy in Taylor series:

$$E(R) \approx E(R_0) + \sum_i \frac{\delta E}{\delta R_i} \Delta R_i + \sum_i \sum_j \frac{\delta^2 E}{\delta R_i \delta R_j} \Delta R_i \Delta R_j + \dots$$



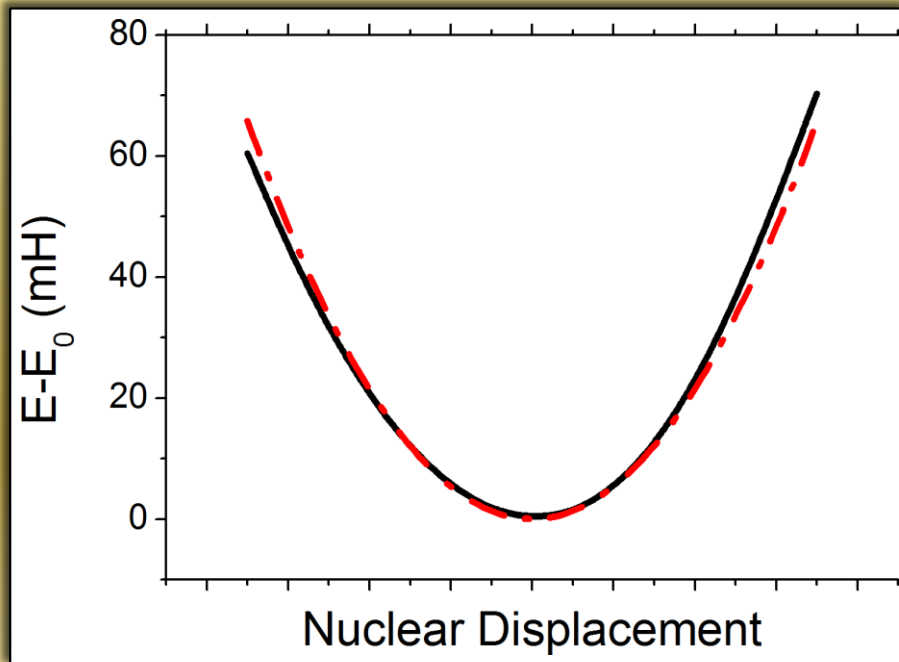
Vanishes for R_0

Vibrations

- Expand Energy in Taylor series:

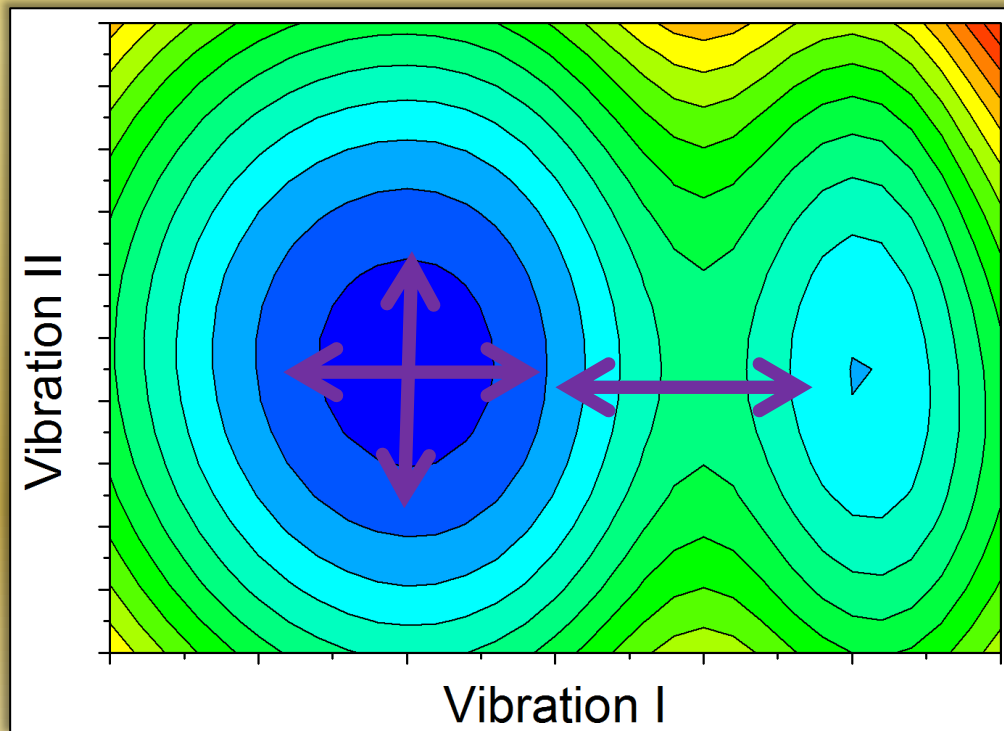
$$E(R) \approx E(R_0) + \sum_i \frac{\delta E}{\delta R_i} \Delta R_i + \sum_i \sum_j \frac{\delta^2 E}{\delta R_i \delta R_j} \Delta R_i \Delta R_j + \dots$$

Hessian H



Vibrations

- **Solve Newtons equation of Motion:** $F = M\Delta\ddot{R}$
 - Exponential ansatz: $\Delta R = ue^{i\omega t}$
 - Leads to generalized eigenvalue problem: $Hu = \omega^2 Mu$



- **Negative ω : Transition state**
- **Large ω = large force constant, e.g., bond stretching**
- **Small ω : small force constant, e.g., out-of-plane vibrations**

Vibrations

- **Free energy for finite temperature**

$$F(T) = E_{min} + \sum_{\nu} \left(\frac{\hbar\omega}{2} + k_b T \ln[1 - e^{-\frac{\hbar\omega}{k_B T}}] \right)$$

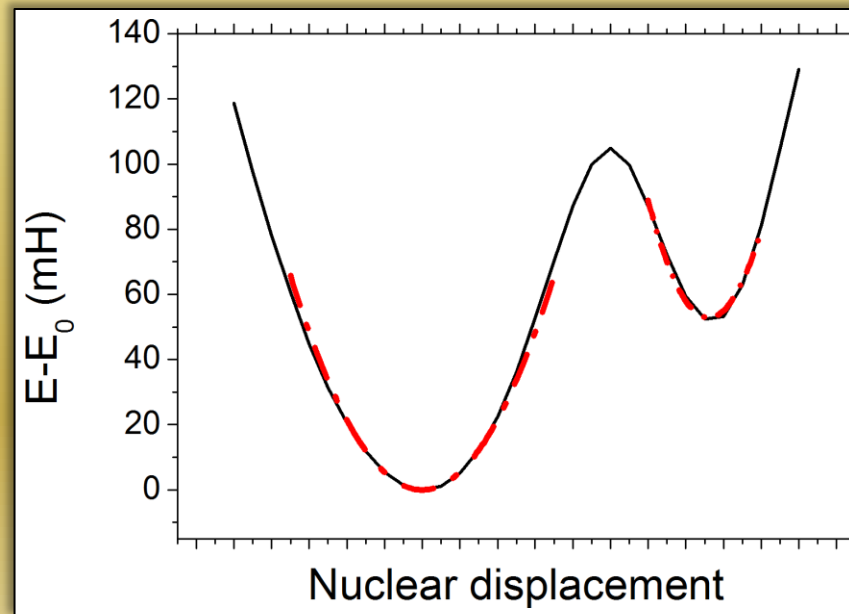
- **Partition sum**

$$z_{vib} = \prod_j \sum_{\nu} \exp \left(-\frac{\hbar\omega(\nu + \frac{1}{2})}{k_B T} \right)$$

- **Hessian from geometry optimization not sufficient**
 - Analytic second derivative using perturbation theory [1]
 - Numerical differentiation

Vibrations – beyond harmonic

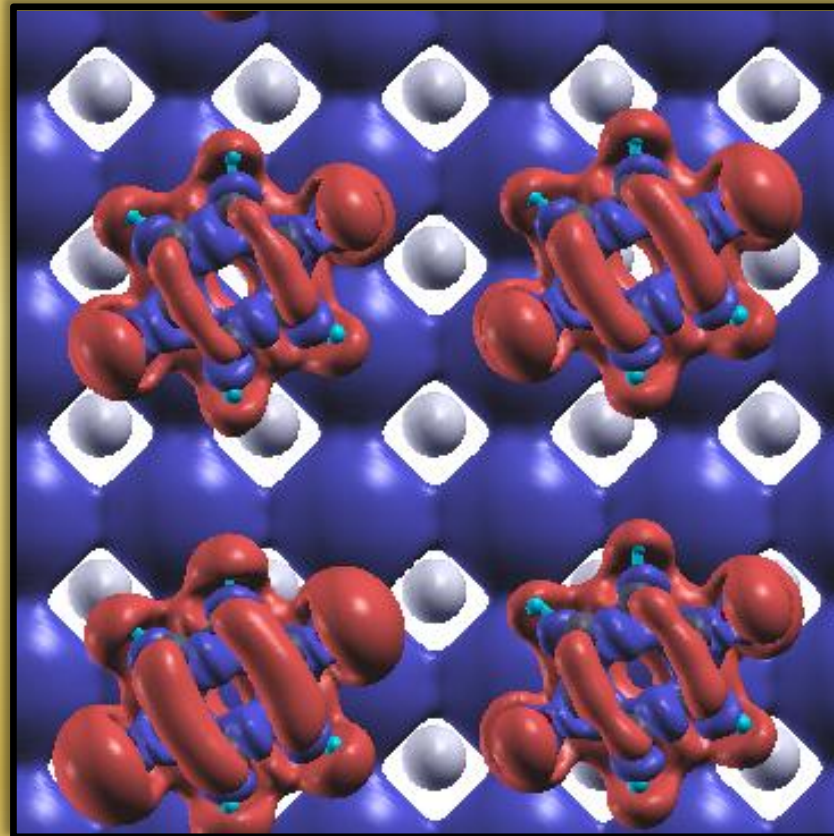
- For high T or double-well minima
 - **Molecular dynamics: Luca Ghiringhelli**
- Re-introducing quantum nuclei:
 - **See talk by Roberto Car**



Conclusions



- **Often calculated in harmonic approximation**
- **Yield information about stability of geometry**
- **Required for temperature effects**
- **Anharmonic effects via molecular dynamics**

Visualization



PBE: Electron density difference upon adsorption of p-benzoquinone on Li

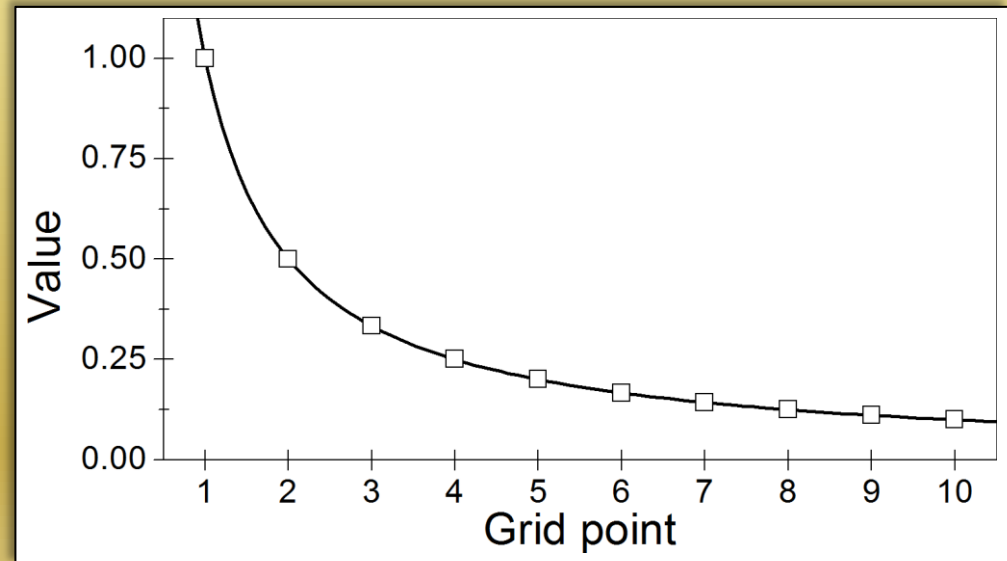
Visualization

- Nuclear coordinates 
- Electron distribution 

- What else can we learn?
- How can we visualize results that are not just „numbers“

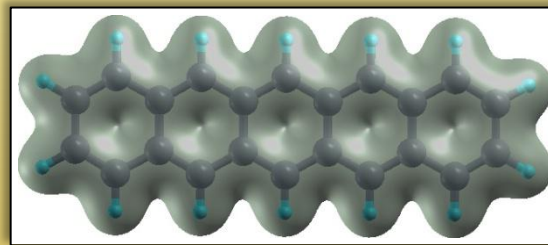
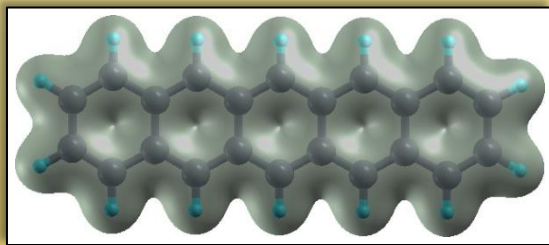
Format for visualization

- Codes use different types of basis functions and grids to store n / Ψ . No standard format to save information about custom grids
- Solution: Extrapolate and save quantities on evenly-spaced grids
 - *Common format: cube [1]*
 - *Very memory intensive*
- 3 examples:
 - *Electron density*
 - *Orbitals*
 - *Scanning tunneling microscopy*



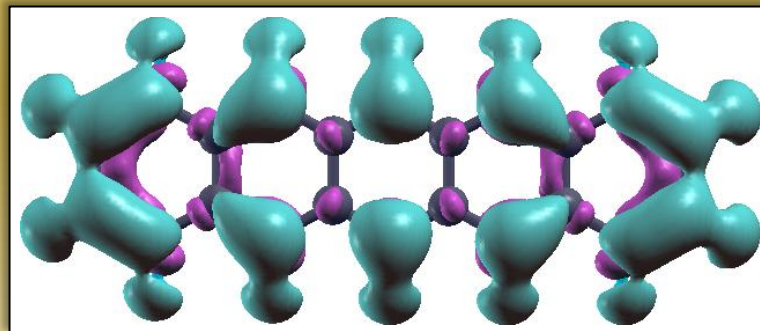
Electron density

- Contains core and valence electrons
- Resolution typically not sufficient for QM-postprocessing
- Even electron counting can be challenging
- Can be used, e.g., for charge differences (Δ SCF)



Total density of neutral pentacene

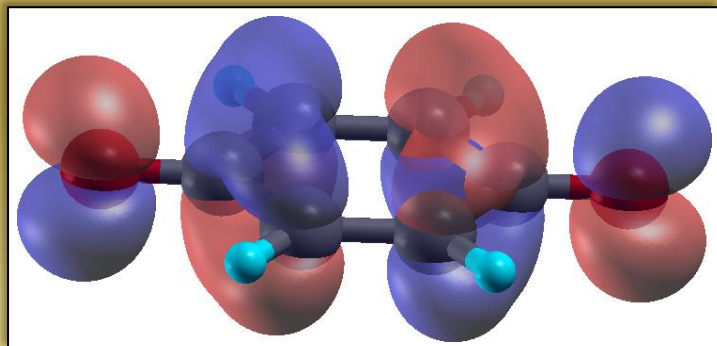
Total density of the pentacene cation



Δ SCF density. Cyan are negative values

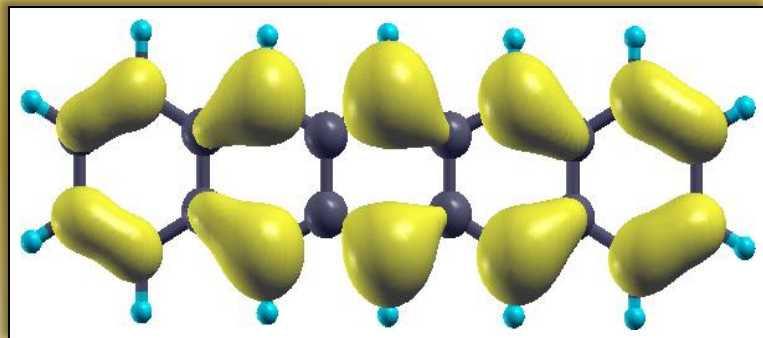
Orbitals

- Valence orbitals contain „chemical information“

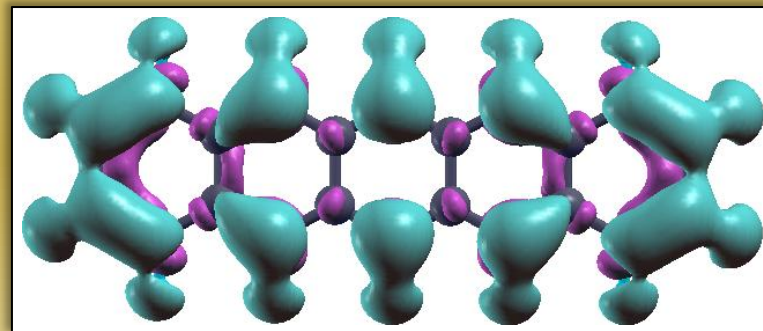


The LUMO of p-Benzoquinone exhibits nodes on the C=O double bond

- Eigenstate densities $n_i = |\psi_i|^2$
 - tend to agree well with Δ SCF



Pentacene HOMO density



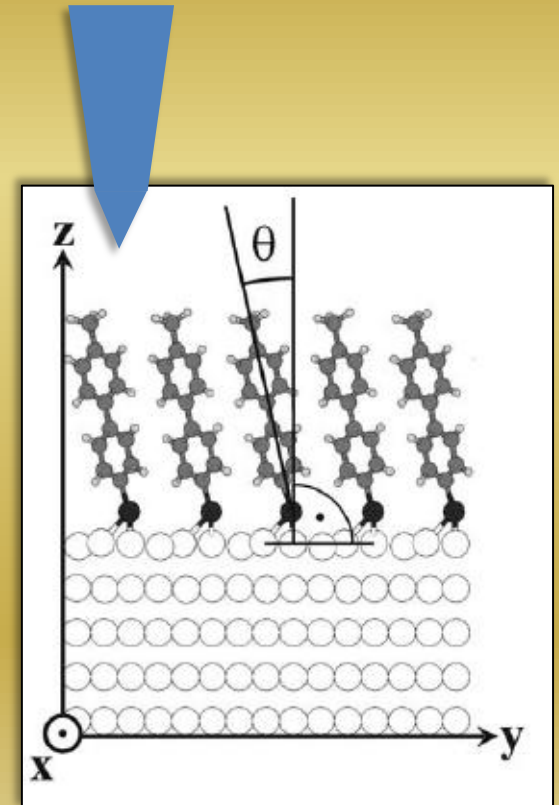
Δ SCF density for electron removal

Cyan: electron density reduced: Magenta: Increased

Scanning Tunneling Microscopy

- **Scan over (x,y) and measure tunnel current**
- **2 Modes:**
 - **Constant height**
 - **Constant current**
- **Tunnel current**
 - **Depends on energy (E) and tunnel matrix elements (M) of both tip (μ) and sample (ν)**

$$I = \frac{2\pi e}{\hbar} \sum_{\mu,\nu} f(E_\nu) [1 - f(E_\nu - eV)] |M_{\mu\nu}|^2 \delta(E_\mu - E_\nu)$$



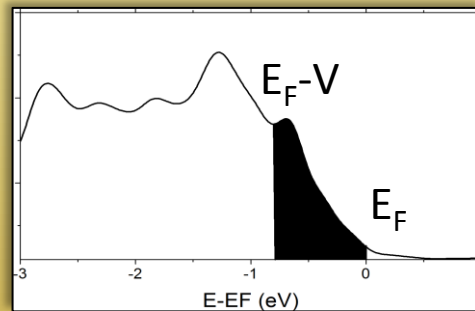
[1] OJ. Bardeen, Phys. Rev. Lett. 6, 57 (1961)

[2] J. Tersoff, Phys. Rev. B 40 (1989) 11990.

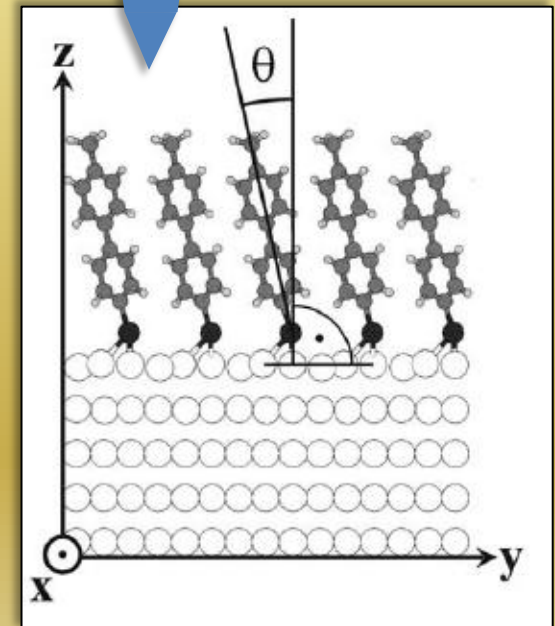
Scanning Tunneling Microscopy

- **Simulation by Tersoff-Hamann [1]**
 - **Neglect impact of tip**
 - **Assume single point-like atom at apex**

$$I \approx \int_{E_f - V}^{E_f} \sum_{\nu} |\psi_{\nu}(r)|^2 \delta(\epsilon_{\nu} - E_F)$$



- **Works only for s-type tips [2]**
 - **CO-functionalized tips probe gradient**

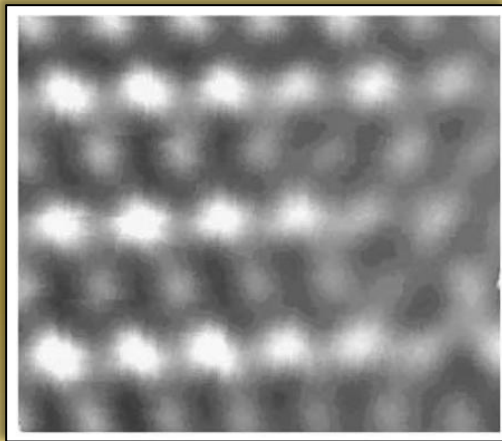


[1] J. Tersoff, Phys. Rev. B 40 (1989) 11990.

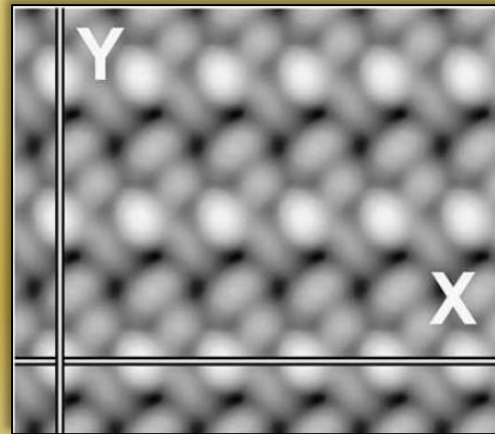
[2] L. Gross et al, Phys. Rev. Lett. (2011), 086101

Scanning Tunneling Microscopy

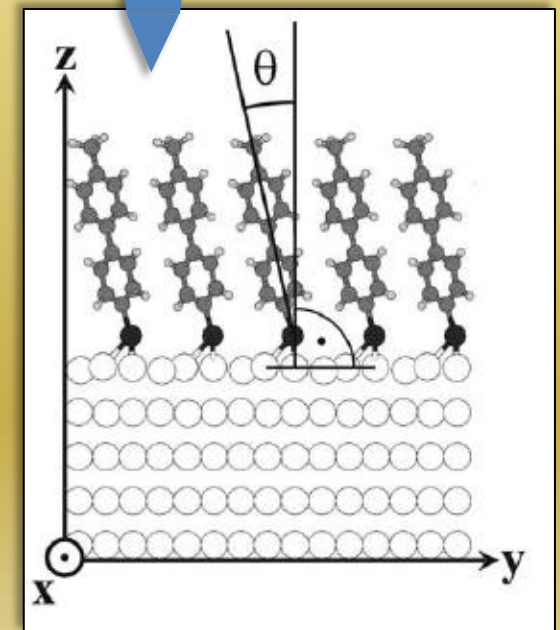
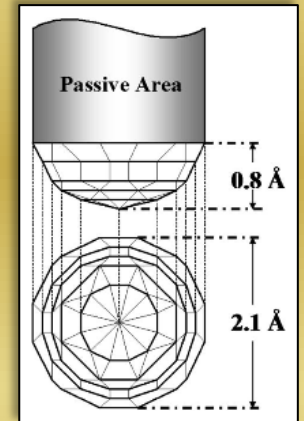
- **Problem for adsorbate systems:**
 - **Point-like tip can penetrate layer**
 - **Resulting pictures too „crisp“**
 - **Solution:**
 - **Average over adjacent points**
 - **Model tip as extended object [1]**



Experimental STM [2]



Simulated STM [1]



[1] G. Heimel et al., *Surface Science* 600 (2006) 4548–4562

[2] W. Azzam et al., *Langmuir* 19 (2003) 4958.

Conclusion

- **Electronic Schrödinger equation**
 - Solved by direct minimization or self-consistent field method
 - Initial guess requires some thought
 - Mixer: Tradeoff between stability and time
 - Convergence acceleration: Preconditioner, Broadening
- **Structure optimization**
 - Evaluate energy gradients
 - Contribution from Hellman-Feynman and Pulay forces
 - Solution by (Quasi)Newton-Methods

Conclusion

- **Vibrations**
 - Information about stability of geometry
 - Characterization of thermodynamic properties
 - Allow to account for temperature effects
- **Visualization**
 - Fields saved on regular grid
 - Helpful for direction connection with experiment, e.g.:
 - Scanning tunneling microscopy

**Thank you for your
attention**