

Density functional theory in solid state physics

Lecture 8

Summary

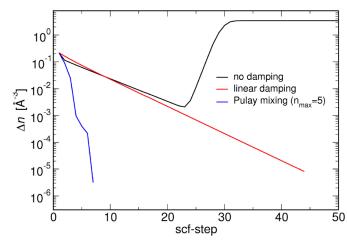


- Planewave basis useful and very accurate for periodic solids
- localized basis useful for low-D systems, potentially faster than PW, but more complex
- Kohn-Sham Equation in reciprocal space (solve iteratively):

$$\sum_{\vec{G}'} \left[\frac{1}{2} \left| \vec{k} + \vec{G} \right|^2 \delta_{GG'} + v(\vec{G}, \vec{G}') + v_H(\vec{G} - \vec{G}') + v_{XC}(\vec{G} - \vec{G}') \right] c_{ik}(\vec{G}') = \epsilon_{ik} S c_{ik}(\vec{G})$$
Describe this with pseudo- or PAW potentials. Non-local PPs: $v_k^{NL-PS}(\vec{G}, \vec{G}')$
Want to only consider valence electrons Valence electrons For NC-PP: $S = I$ For US: $S = I + \sum_{mn} Q_{mn}(\vec{r}) |\beta_m\rangle\langle\beta_n|$

- Solution using SCF algorithm can suffer from charge sloshing
- Need to stabilize SCF: Mix new and old electron densities

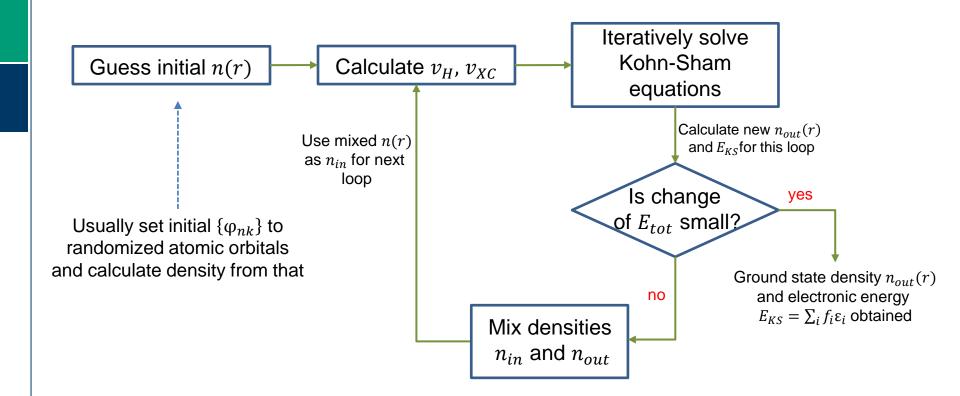
$$n_{in}^{i}(r) = \alpha n_{out}^{i-1}(r) + (1 - \alpha)n_{in}^{i-1}(r)$$
 mixing parameter



The SCF method with density mixing



More stable SCF algorithm:

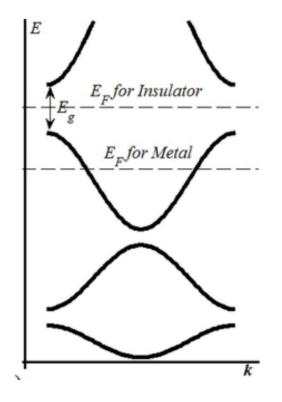


• Alternatively also can mix Kohn-Sham potential $v_{\mathit{KS}}(r)$, but less stable than density mixing

Charge sloshing for metals



- Metals: partial occupation of bands.
- Slow convergence with k-point sampling due to integration of discontiuous occupation
- Small density variations can cause strong changes in band occupations



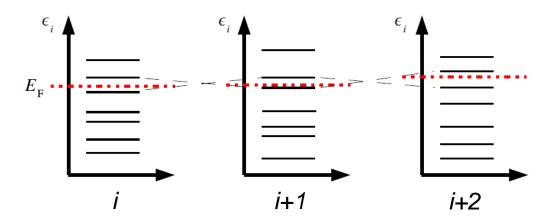
$$n(r) = \frac{1}{V_{BZ}} \sum_{n} \int_{BZ} f(\varepsilon_{nk} - E_F) |\phi_{nk}|^2 dk$$
$$E_{KS} = \frac{1}{V_{BZ}} \sum_{n} \int_{BZ} f(\varepsilon_{nk} - E_F) \varepsilon_{nk} dk$$

$$f(x) = \theta(x) = \begin{cases} 1, & \text{if } x \le 0 \\ 0, & \text{if } x > 0 \end{cases}$$

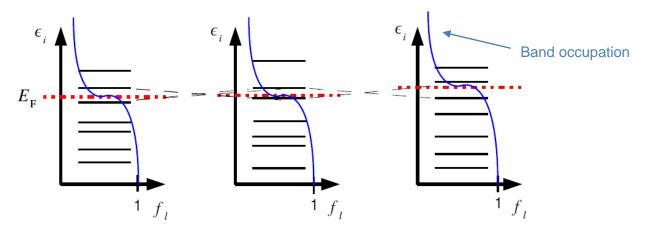
Level crossings in metals



• Additional problem: discontinuous occupation leads to "jumps" in energy, level crossings



Remedy: "Smear out" bands occupations around the Fermi energy



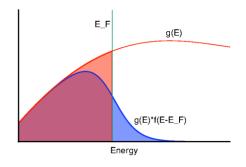
Taken from "Making electronic structure theory work"

Smearing of band occupations



- Electron density: $n(r) = \sum_{n,k} f(\epsilon_{nk}) |\phi_{nk}(r)|^2$
- Fermi-Dirac smearing for "electronic temperature" T_e :

$$f_{FD}(\varepsilon_{nk}) = \left[\exp\left(\frac{\varepsilon_{nk} - E_F}{\sigma}\right) + 1\right]^{-1} \quad \sigma = k_B T_e$$



Introduction of error, as Fermi-Dirac is a bad approximation to a step function, slow convergence with respect to σ

• Gaussian smearing: Approximate step function (occupation at T = 0) by smooth gaussian

$$f_{gauss}(\varepsilon_{nk}) = \frac{1}{2} \left(1 - \operatorname{erf}\left(\frac{\varepsilon_{nk} - E_F}{\sigma}\right) \right)$$

Energy width of smearing

Faster convergence with k-point grid than Fermi-Dirac, but not guaranteed that SCF converges to correct minimum

Still: standard smearing method in most DFT solid-state physics codes

Smearing of band occupations



Methfessel-Paxton: Approximate step function by expansion in Hermite polynomials

$$f_{MP,0}(x) = \frac{1}{2} (1 - \operatorname{erf}(x))$$

$$f_{MP,N}(x) = f_{MP,0}(x) + \sum_{n=1}^{N} A_n H_{2n-1}(x) e^{-x^2}$$

$$x = \frac{\varepsilon_{nk} - E_F}{\sigma}$$

Gaussian smearing is equal to 0-order MP smearing, order-1 and order-2 are most widely used

Very fast convergence with σ and k-point sampling, but might get unphysical *negative* band occupations

Phys. Rev. B 40, 3616 (1989)

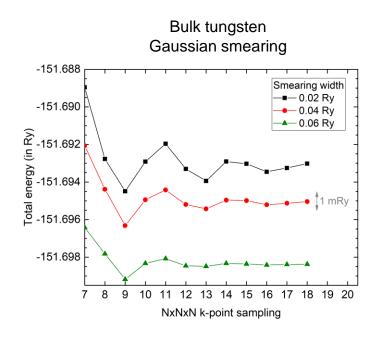
 Marzari-Vanderbilt ("cold smearing"): Generalization of order-2 MP smearing to always yield positive occupations

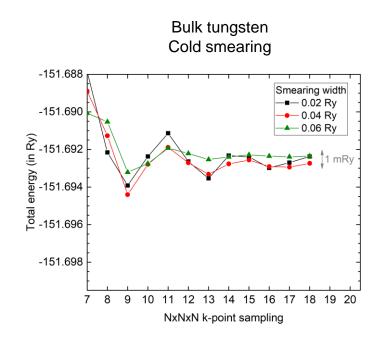
(Phys. Rev. Lett. 82, 3296 (1999)

Total energy dependence on smearing



Obtained energy depends on smearing width/electron temperature





- Variational minimization from SCF not total energy anymore, but free energy $F = E \sigma S$
- Need to back-extrapolate to $E[\sigma \to 0]$ in order to obtain desired E_{tot}

Accessible properties for fixed atomic positions



- So far: solution of Kohn-Sham Equations for a fixed set of atomic positions
- Direct access to a variety of properties:

Interaction energy between nuclei

- Total energy $E_{tot} = E_{KS} + E_{n-n}$ (comparison with other structures, binding energy of adsorbates etc)
- Electron density n(r)
- Potentials v, v_H, v_{XC} and $v_{KS} = v + v_H + v_{XC}$
- Quasi-single electron eigenvalues ε_{nk} and band occupations f_{nk}
- Fermi energy E_F from band occupations (and with that also work function)

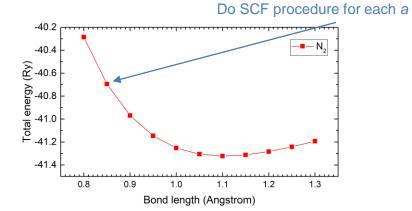
- Properties will somewhat depend on used atomic positions
- To be fully consistent, also need to take nucleic degree of freedom into account
- Also: How do we get the atomic positions and lattice constants for materials without tabulated structural data?

Manual minimization of atomic positions

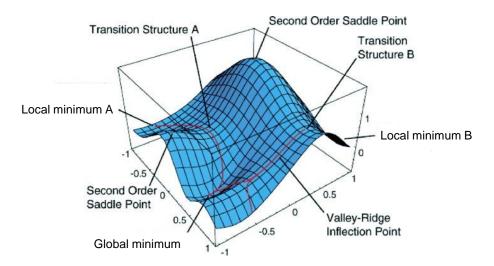


- Geometry optimization by varying atomic positions and minimizing total energy E_{tot}
- Simple example: diatomic molecule





For more complicated systems: Find global minimum of potential energy surface:



→ complex problem

Hellmann-Feynman forces



- Classically, driving forces acting on nucleus l: $\vec{F}_l = -\frac{\partial E_{tot}}{\partial \vec{R}_l}$
- Energy minimum corresponds to vanishing interatomic forces: $\vec{F}_l = 0|_{\{\vec{R}_l\} = \{\vec{R}_l^0\}}$ for all l
- Hellmann-Feynman theorem for perturbation $\partial \vec{R}_l$:

$$\frac{\partial E_{tot}}{\partial \vec{R}_{l}} = \frac{\partial}{\partial \vec{R}_{l}} \langle \psi | \hat{H} | \psi \rangle = \left\langle \psi \left| \frac{\partial \hat{H}}{\partial \vec{R}_{l}} \right| \psi \right\rangle + \underbrace{E_{tot} \frac{\partial}{\partial \vec{R}_{l}} \langle \psi | \psi \rangle}_{\text{Many-body wavefunction}}$$
"Pulay forces"

• In DFT:

$$E_{tot}[\{R\}] = E_{KS}[\{R\}] + E_{n-n}[\{R\}]$$

$$\rightarrow \frac{\partial E_{tot}}{\partial \vec{R}_{l}} = \frac{\partial E_{n-n}}{\partial \vec{R}_{l}} - \int n(r) \frac{\partial v}{\partial \vec{R}_{l}} dr - \int \frac{\partial E_{KS}}{\partial n} \frac{\partial n}{\partial \vec{R}_{l}} dr$$

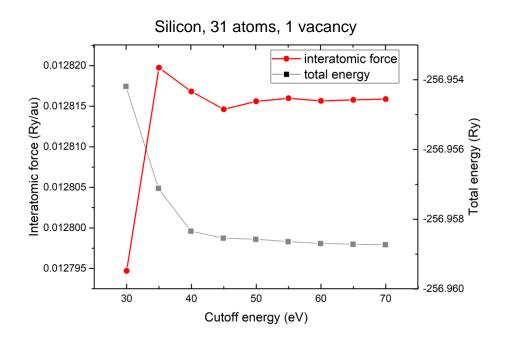
These vanish, if basis set is independent from nucleic positions (such as planewayes)

This term vanishes in the energy minimum

Convergence of interatomic forces



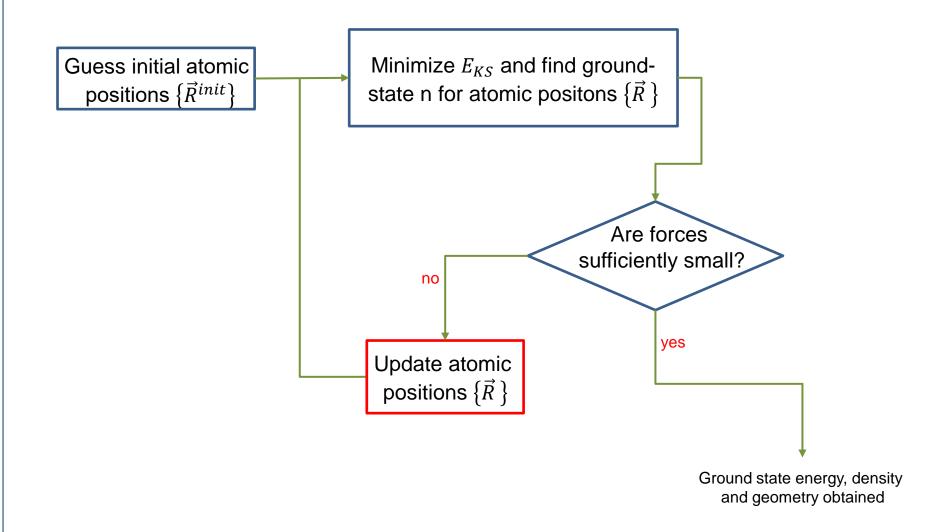
- Total energy from variational SCF procedure correct to second order errors, but forces only correct to first order errors
- More complicated, if we use density mixing to solve KS equations
- Careful: Convergence of forces with basis set size (cutoff energy) is (usually) slower than that of E_{tot}
- Should also check influence of energy tolerance for SCF convergence (Exercise sheet 2)



Iterative geometry optimization



Treat geometry optimization as an iterative process:



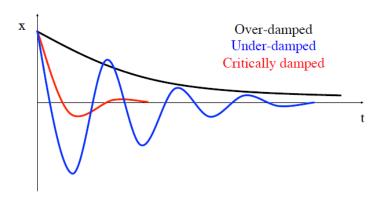
Damped molecular dynamics



- How do we update atomic positions?
- Physically motivated approach: damped molecular dynamics (damped MD):
 - Treat atoms as damped harmonic oscillators

$$M_l \ddot{\vec{R}}_l = \vec{F}_l - \gamma \vec{v}_l$$

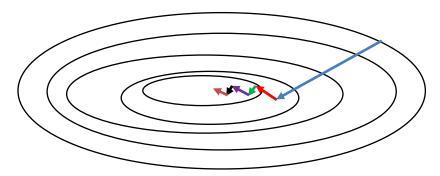
- Move atoms using obtained velocities and forces, need to choose suitable time step Δt
- Use an algorithm to guess optimal damping γ
- Fast convergence, while far away from minimum, but slower convergence when close to minimum (small forces)



Iterative minimizaton procedures: SD and CG



- Alternatively: treat update of atomic positions as a iterative minimization problem
- Steepest descent (SD)



- Line search: Move atoms along energy gradient (i.e. forces) until local energy starts to rise again
- Calculate new gradient and repeat 1. until forces are small enough

convergence of steepest descent towards minimum is unpractically slow

- Conjugate gradients (CG)
 - Similar to SD, but choose new search directions to be orthogonal to all previous search directions
 - Significantly faster convergence than SD

Iterative minimization: the BFGS algorithm



- The Broyden–Fletcher–Goldfarb–Shanno (BFGS) algorithm
 - Quasi-Newton method
 - Idea: energy surface near the minimum is nearly quadratic, i.e. determined by the Hessian matrix \overrightarrow{A} of the system $\partial^2 F_{i-1} = \partial^2 F_{i-1}$

essian matrix
$$\overrightarrow{A}$$
 of the system
$$\delta E_{tot} = \frac{1}{2} (\overrightarrow{R} - \overrightarrow{R}^{min})^T \cdot \overrightarrow{A} \cdot (\overrightarrow{R} - \overrightarrow{R}^{min}) \qquad \overrightarrow{A} = \begin{pmatrix} \frac{\partial^2 E_{tot}}{\partial^2 \overrightarrow{R}_1} & \dots & \frac{\partial^2 E_{tot}}{\partial \overrightarrow{R}_1 \partial \overrightarrow{R}_N} \\ \vdots & \ddots & \vdots \\ & \dots & \frac{\partial^2 E_{tot}}{\partial^2 \overrightarrow{R}_N} \end{pmatrix}$$

$$\cdots \qquad \frac{\partial^2 E_{tot}}{\partial^2 \overrightarrow{R}_N}$$

- If Hessian known, we could find the minimum in one step
- Algorithm:
 - 1. Guess approximate Hessian
 - 2. Do a line search along $\Delta \vec{X}_i = (\vec{A}_i)^{-1} \vec{F}_i$ and update atomic positions: $\vec{X}_{i+1} = \vec{X}_i + \lambda \Delta \vec{X}_i$ Matrix of atomic positions for step i
 - 3. Improve approximation of Hessian and repeat step 2 until convergence achieved

Matrix of interatomic

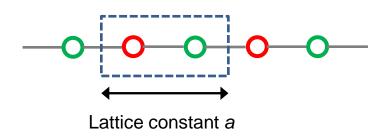
forces for step i

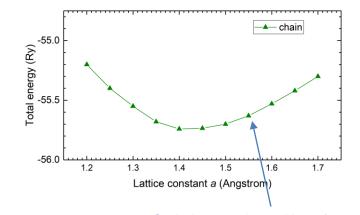
- BFGS is far more efficient than CG or SD, standard method in most codes
- Careful: iterative methods can be caught in local minima instead of finding global minimum

Manual update of lattice vectors



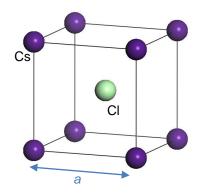
- How about lattice constants/vectors?
- In principle could again update manually
- Simple example: Atomic chain

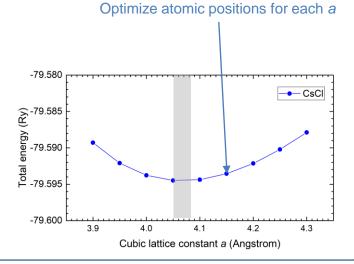




Similarly for more complex 3D systems

Example: bcc CsCl





Birch-Murnaghan Equation-Of-State

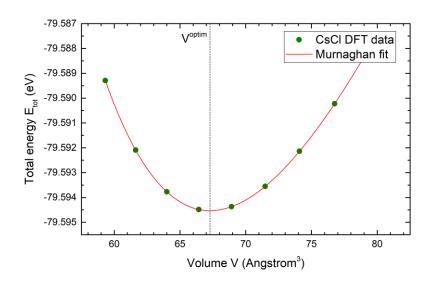


A bit better: Fit Birch-Murnaghan Equation to DFT data

$$E_{tot}(V) = E_0 + \frac{9V_0B_0}{16} \left\{ B_0' \left[\left(\frac{V_0}{V} \right)^{2/3} - 1 \right]^3 + \left[6 - 4 \left(\frac{V_0}{V} \right)^{2/3} \right] \left[\left(\frac{V_0}{V} \right)^{2/3} - 1 \right]^2 \right\}$$

Groundstate total energy

 V_0 : Unit cell volume at energy minimum, B_0 : Bulk modulus, B'_0 : Derivative of bulk modulus with pressure

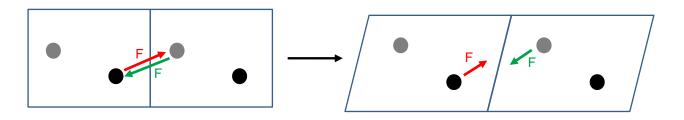


- Advantage of BM method: Can directly obtain lattice constants and bulk moduli B₀
- However: the two methods are (obviously) difficult to use for Bravais lattices with low symmetry (i.e. with different lattice constants and angles)

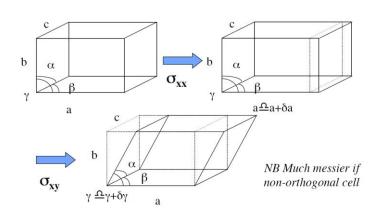
Variable cell relaxations



- Common approach nowadays: "Variable cell" optimizations
- Situation: Interatomic forces between neighbouring cells cause stresses $\sigma = \frac{F}{A}$ on the cell faces



 Stress induces volume changes and shape deformations

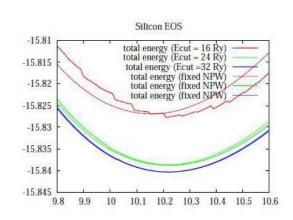


• Resulting deformations of the lattice: $\vec{h}' = (\vec{I} + \vec{\epsilon})\vec{h}$ tensor containing the lattice vectors strain tensor

Hellmann-Feynman stress tensor & BFGS



- Stress tensor from Hellmann-Feynman theorem: $\sigma_{\alpha\beta} = -\frac{1}{V} \frac{\partial E_{tot}}{\partial \epsilon_{\alpha\beta}} = -\frac{1}{V} \sum_{\nu} \frac{\partial E_{tot}}{\partial \overset{.}{h}_{\alpha\gamma}} \overset{.}{h}_{\gamma\beta}^{T}$
- Can be evaluated numerically, or implemented efficiently in a planewave basis (long eq.!)
- Generalized forces on lattice vectors: $F_{n\beta}^{lat} = -\frac{\partial H}{\partial a_{n\beta}} = V \sum_{\alpha} \left(\overrightarrow{h}^{-1} \right)_{n\alpha} \left(\sigma_{\gamma\beta} p \delta_{\gamma\beta} \right)$ external pressure
- Use generalized forces to update components of lattice vectors during BFGS minimization
- Careful: Plane wave basis is independent of atomic positions, but NOT independent of the unit cell volume or shape
- Strong changes in unit cell can affect basis quality
- Constant number of PWs vs. constant E_{cut}



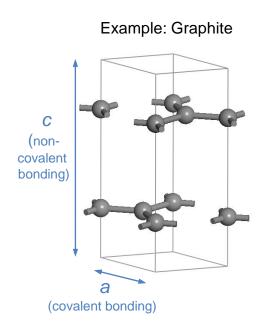
Enthalpy $H = E_{tot} + pV$

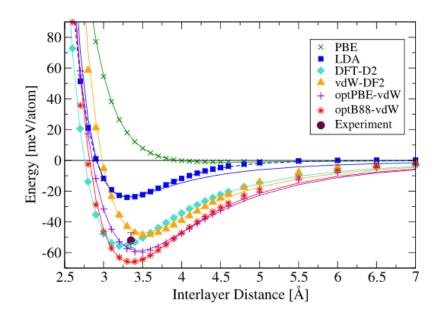
https://people.sissa.it/~degironc/ES/lectures/Relax.pdf

A Problem in DFT: van-der-Waals interactions



- Problem: Exchange-correlation potential of "standard" DFT decays too strongly
 - → long-range non-covalent "van-der-Waals" bonding on surfaces or in layered materials is not well represented
- Non-covalent binding energy from "bare" DFT usually too small



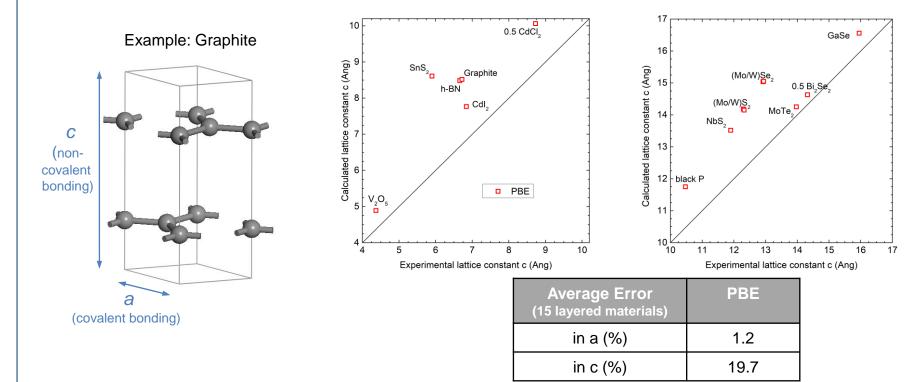


Binding energy of graphite for different functionals *J. Phys.: Cond. Mat 24, 424216 (2012)*

A Problem in DFT: van-der-Waals interactions



- Problem: Exchange-correlation potential of "standard" DFT decays too strongly
 - → long-range non-covalent "van-der-Waals" bonding on surfaces or in layered materials is not well represented
- PBE overestimates lattice constants in layered materials by ~20%



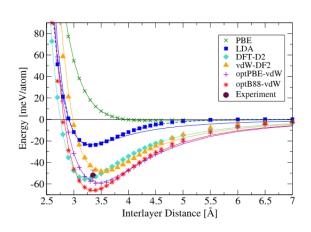
Semi-empirical model van-der-Waals corrections



- In practice: Two common ways to include non-covalent bonding effects
- London-type corrections
 - Use semi-empirical model to correct DFT energy, forces and stresses

$$E_{tot} = E_{DFT} + \Delta E_{disp} \qquad \Delta E_{disp} \propto \sum_{A,B} \frac{C_6}{R_{AB}^6} f_6 \left(R_{AB} \right) + \left[\dots \right] \qquad \text{,damping" to remove correction for small R}$$

- Several proposals:
 - DFT+D2 J. Comp. Chem. 27, 1787 (2006)
 - DFT+D3 J. Chem. Phys. 132, 154104 (2010)
 - DFT+TS
 Phys. Rev. Lett. 102, 073005 (2009)
 Phys. Rev. Lett. 108, 236402 (2012)
 - ...



- Advantages: Relatively easy and straight-forward to handle and implement
- Disadvantages: only "correction", difficult to achieve flexibility with respect to bonding conditions

Flexibility in the DFt-D3 method



- Example: DFT-D3 $\Delta E_{disp} \propto \sum_{A,B} \frac{C_6^{AB}}{R_{AB}^6} f_6 (R_{AB}) + \frac{C_8^{AB}}{R_{AB}^8} f_8 (R_{AB})$
- Flexibility through pair-specific C_6^{AB} :
 - Calculate coordination number CN for atoms A and B
 - Interpolate C_6^{AB} from tabulated reference data

$$C_6^{AB} = \frac{1}{\sum_{i,j} L_{ij}} \left(\sum_{i,j} C_{6,ref}^{AB} \left(CN_i^A, CN_j^B \right) L_{ij} \right)$$
 Sum over tabulated reference molecules for elements of A and B Tabulated "support points" for interpolation
$$CN_{ref} = 0 \qquad CN_{ref} = 1 \qquad CN_{ref} = 2$$

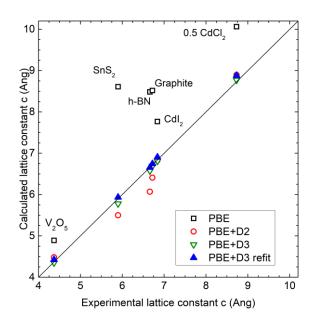
$$CN_{ref} = 3 \qquad CN_{ref} = 4$$

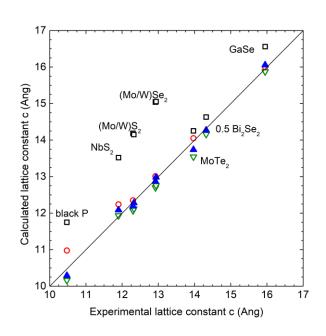
$$CN_{ref} = 3 \qquad CN_{ref} = 4$$

Lattice constants from DFT-D3



• Resulting lattice constants of layered materials are significantly improved compared to PBE





Average Error (15 layered materials)	PBE	PBE-D2	PBE-D3	PBE-D3 refit
in a (%)	1.2	0.62	0.73	0.66
in c (%)	19.7	2.5	1.2	0.75

van-der-Waals functionals



non-local "vdW kernel" that is tailored to complement a

specific XC functional

- Non-local correlation methods:
 - Include non-covalent binding through a density-dependent correlation functional

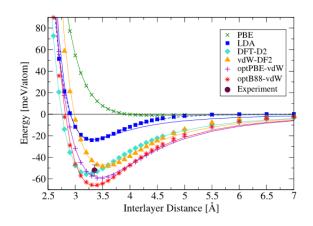
$$E_{tot} = E_{DFT} + E_c^{nl}[n] \qquad E_c^{nl}[n] = \iint n(r)n(r')\phi(r,r')drdr'$$

- Several proposals:
 - vdW-DF/DF2/DF3 and variations

Phys. Rev. Lett. 92, 246401 (2004)

- rVV10 Phys. Rev. B 87, 041108(R) (2013)
- opt88-vdW Phys. Rev. B 82, 081101 (2010)
- BEEF-vdW Phys. Rev. B, 85, 235149 (2012)

• ...



- Advantages: More consistent than London-type corrections, potentially more accurate and flexible
- Disadvantages: More difficult to develop and implement

van-der-Waals interactions should be included



Non-local vdW functionals perform well for layered materials compared to "bare" DFT

						-	-							
Method	Graphite	h-BN	TiS ₂	TiSe ₂	MoS_2	MoSe ₂	MoTe ₂	HfTe ₂	\overline{WS}_2	WSe ₂	ME	MAE	MRE	MARE
		E_b (binding energy between layers)												
Without dispersion:									,					
LDA	10 (-48)	10(-30)	20 (7)	21 (24)	13(-35)	14(-29)	15(-26)	19 (3)	13(-37)	13(-32)	-4	5	-20.4	27.4
TM	11(-38)	12(-19)	13 (-31)	14(-19)	10(-50)	11 (-42)	13 (-36)	13(-28)	10(-50)	11 (-44)	-7	7	-35.7	35.7
SCAN	7(-59)	8 (-45)	6(-68)	6(-64)	6(-73)	5 (-72)	7 (-65)	7(-60)	6(-72)	5 (-73)	-12	12	-65.2	65.2
PBEsol	2(-92)	2(-86)	7 (-62)	10(-44)	3 (-84)	5 (-75)	8 (-62)	10(-45)	3 (-86)	4(-77)	-13	13	-71.4	71.4
PBE	1 (-97)	1 (-96)	1 (-93)	2(-90)	1 (-97)	1(-97)	1(-94)	2(-90)	1(-97)	1(-97)	-18	18	-94.8	94.8
With dispersion:														
SCAN+rVV10	20 (7)	19 (<u>34</u>)	18(-3)	18 (3)	20(-3)	19(-1)	21 (2)	19 (0)	21 (4)	20(-1)	1	1	4.3	5.8
PBE+rVV10L	15(-19)	14 (-4)	19 (2)	20 (18)	19(-6)	20(2)	22 (4)	20 (6)	19(-5)	20(1)	-0	1	-0.1	6.7
vdW-DF2	20 (8)	19 (29)	19 (1)	18 (2)	19(-6)	18 (-9)	16(-21)	15(-19)	19(-5)	18 (-10)	-1	2	-3.0	10.9
vdW-DF	20 (12)	19 (<u>35</u>)	19 (0)	18 (2)	19(-7)	18 (-10)	16(-21)	15(-18)	19(-5)	18(-11)	-1	2	-2.3	12.0
PBEsol+rVV10s	12 (<u>-32</u>)	12(-20)	20 (7)	21 (21)	17(-15)	17(-11)	21 (3)	22 (19)	17 (-14)	17(-12)	-1	3	-5.4	15.3
rev-vdW-DF2	23 (23)	21 (<u>47</u>)	25 (30)	24 (40)	23 (14)	22 (15)	23 (9)	22 (16)	23 (14)	22 (12)	4	4	22.0	22.0
PBE-D3(BJ)	17(-9)	16 (9)	27 (<u>45</u>)	30 (72)	24 (17)	26 (<u>34</u>)	30 (<u>44</u>)	27 (<u>46</u>)	26 (28)	28 (38)	6	7	32.5	34.2
vdW-DF-cx	25 (<u>36</u>)	24 (<u>67</u>)	27 (<u>43</u>)	27 (<u>59</u>)	25 (21)	25 (26)	26 (25)	25 (<u>35</u>)	24 (21)	24 (23)	6	6	35.6	35.6
optB88-vdW	27 (<u>47</u>)	26 (<u>80</u>)	27 (<u>45</u>)	26 (<u>52</u>)	26 (28)	25 (29)	24 (16)	23 (23)	26 (29)	25 (27)	7	7	37.5	37.5
optB86b-vdW	27 (<u>47</u>)	26 (<u>80</u>)	28 (48)	28 (60)	26 (29)	26 (31)	26 (24)	25 (<u>33</u>)	26 (30)	26 (28)	7	7	41.0	41.0
rVV10	26 (<u>44</u>)	25 (<u>72</u>)	28 (48)	29 (<u>65</u>)	29 (42)	29 (<u>50</u>)	29 (40)	26 (<u>40</u>)	29 (44)	29 (48)	9	9	49.2	49.2
C09-vdW	29 (<u>59</u>)	28 (<u>96</u>)	32 (72)	33 (88)	30 (<u>44</u>)	29 (<u>49</u>)	30 (<u>44</u>)	30 (<u>59</u>)	29 (44)	29 (<u>45</u>)	11	11	59.9	59.9
revPBE-D3(BJ)	26 (41)	25 (71)	48 (153)	51 (<u>196</u>)	45 (118)	49 (152)	55 (<u>163</u>)	46 (<u>147</u>)	50 (147)	53 (167)	26	26	135.5	135.5
Reference	18.3	14.4	18.8	17.3	20.5	19.6	20.8	18.6	20.2	19.9			J	

Phys. Rev. Mat. 3, 063602 (2019)

- Also good performance for lattice constants (also for covalently bonded crystals!)
- Computationally efficient, only slightly slower than LDA or GGAs
- Should always be used for systems with possible non-covalent bonding