Dive into computational physical chemistry

Lecture 9: Intro to density functional theory and cheminformatics

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# **Reminder: Electronic structure in Born Oppenheimer approximation** $\widehat{H}\Psi = E\Psi$ $\widehat{H} = -\frac{\hbar^2}{2m_e} \sum_{i} \nabla_i^2 - \frac{\hbar^2}{2} \sum_{A} \frac{\nabla_A^2}{2M_A} - \sum_{A,i} \frac{Z_A e^2}{4\pi\epsilon_0 r_{Ai}} + \sum_{A>R} \frac{Z_A Z_B e^2}{4\pi\epsilon_0 r_{AB}} + \sum_{i>i} \frac{e^2}{4\pi\epsilon_0 r_{ij}}$

Exact: Evaluate matrix elements of  $\hat{H}$  in a basis, then solve the eigenvalue problem to get wave functions and energy levels

Approximate: Hartree-Fock, Perturbation theory, coupled-cluster etc (discussed more later)

Hartree-Fock is a *mean field theory*. Only treats correlation between electrons in an average way

#### Alternative approach: Density functional theory

- Hohenberg-Kohn theorems:
  - Everything about the ground state properties of a many electron system is determined by the electron density, which is a function of only 3 special coordinates  $\rho(x, y, z)$
  - The ground state  $\rho(x, y, z)$  is the one which minimizes the energy and the energy is a *functional* of the density  $E[\rho(x, y, z)]$
- But what does this  $\rho(x, y, z)$  look like and how do we find it?

## Kohn-Sham DFT

- Instead of solving the problem for the fully interacting system, solve the non-interactive Schrodinger equation for a fake system of non-interacting particles that have the same density as the interacting system
- $\circ\,$  These non-interacting particles feel an effective potential

$$\circ \left(-\frac{\hbar^2}{2m}\nabla^2 + v_{eff}(r)\right)\phi_i(\mathbf{r}) = \varepsilon_i\phi_i(\mathbf{r}) \text{ and } \rho(\mathbf{r}) = \sum_{i=1}^N |\phi_i(r)|^2$$

 $\circ$  (note, ignoring spin for now)

### Kohn-Sham potential

$$\circ E[\rho] = T_s[\rho] + \int dr \, v_{ext}(r)\rho(r) + E_H[\rho] + E_{xc}[\rho]$$

 Kinetic energy, external potential and interaction with nuclei, coulomb repulsion, and "exchange correlation" (everything else!)

• 
$$T_s[\rho] = \sum_{i=1}^N \int d\boldsymbol{r} \, \phi_i^*(\boldsymbol{r}) \left(-\frac{\hbar^2}{2m} \nabla^2\right) \phi_i(\boldsymbol{r})$$

• 
$$E_H[\rho] = \frac{e^2}{2} \int d\mathbf{r} \int d\mathbf{r}' \frac{\rho(\mathbf{r})\rho(\mathbf{r}')}{|\mathbf{r}-\mathbf{r}'|}$$

• From this, functional derivative:  $v_{eff(r)} = v_{ext(r)} + e^2 \int \frac{\rho(r')}{|r-r'|} dr' + \frac{\delta E_{xc}[\rho]}{\delta \rho(r)}$ 

•  $v_{xc(r)} = \frac{\delta E_{xc}[\rho]}{\delta \rho(r)}$  is the exchange correlation potential

 Hartree term and exchange correlation functional depend on density, so this has to be done iteratively/self-consistently

### Approximations to the XC functional

- $^{\circ}\,$  Local density approximation (LDA) only depends on density at a point
- Gradient corrected (GGA): depends on density and gradient of density
- Meta-GGA: density, gradient, second derivative
- Hybrid DFT: fraction of exchange from Hartree fock calculation. Includes B3LYP, PBE

## **SMILES strings**

- Simplified molecular-input line-entry system
- Non hydrogens are represented by atomic symbol, hydrogens are assumed based on valence: "C"=methane, "N"=Amonia, "O"= water
- $\circ\,$  Bonds are represented as '-', '=', and '#', with single bonds implied
  - "C"=methane, "CC"=ethane, "CCC"=propane etc.
- Read some more about it in exercises

### **RDKit**

- Very powerful and extensive python package for dealing with molecules and cheminformatics
- $\circ\,$  Has interfaces for dealing with molecules, reactions, etc
- Also good for drawing lewis structures in 2d, and also can get 3d structures and minimize them with molecular mechanics tools
- $\circ\,$  Can use this too feed structures into quantum calculations
- I also installed package psikit which is a wrapper for combining rdkit and psi4

### Pandas

- Framework in python for making tables of data
- Very important for data science
- Good interface with RDKit and jupyter
- You will make a pandas "dataframe" with your results

## Today

1. Pull updates on comp-lab-class github page

https://github.com/hockyg/comp-lab-class-2023/blob/main/Week11/Assignment.md

- 2. Do some rdkit practice
- 3. Build some dataframes with rdkit
- 4. Fill in some properties with psi4/psikit