Computational Chemistry

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What is this course about?

Computational Chemistry

- 1. Start from Schrödinger equation
- 2. Realise it is impractical to solve exactly
- 3. Neglect effects: build, explain and justify approximations
 - Force fields, Density Functional Theory
 - Degree of electron correlation
- 4. For each system, find appropriate approximations









What is this course about?



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Potential Energy Surfaces

Which compounds are stable? Which reactions take place?

Molecular mechanics How do atoms move?

Machine Learning models

How can one automate approximations?

Electronic structure calculations

Which methods have predictive power?

Simulation of molecules, materials, and interfaces How to get started?

Perturbation Theory

How does the system react to changes?

Differentiable Chemistry How can one get derivatives conveniently?

Where can I use this knowledge?

Direct

- Molecular / Materials design
- Bio / Medical applications
- Method development

Indirect

- Machine learning
- Data science
- Research in general

Guide experiment Understand chemical process Widen applicability

Data-driven approximations Extract and manage large databases Strategies and methods

R. Van Noorden, B. Maher, R. Nuzzo, Nature, 2014.

Lecture

Questions anytime lecture, moodle, <u>vonrudorff@uni-kassel.de</u>, ...

Live recording: POLYGLOTT

Slides and notes as PDF after the lecture

Related: Machine Learning (summer term)

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Introduction

Exercise

Python-based: the language of data science and glue code



Weekly assignments:

- At first: concepts / programming
- Later: computational chemistry
- End: modern research problems
- Typically: 2 regular tasks + one harder one if you consider research in this area

About me



BSc/MSc Physics BerlinForce fieldsPhD PhysicsLondonQuantum chemistryPostDocBasel, ViennaMachine Learning & Alchemy

Machine Learning



Quantum Alchemy



Born-Oppenheimer Approximation



Formal picture



Electronic Electron-nuclei Nuclear repulsion attraction repulsion

Formal picture

$\hat{\mathrm{H}}(\mathbf{r}_i, \mathbf{R}_I) = \hat{\mathrm{T}}_{\mathrm{n}}(\mathbf{R}_I) + \hat{\mathrm{T}}_{\mathrm{e}}(\mathbf{r}_i) + \hat{\mathrm{V}}_{\mathrm{ee}}(\mathbf{r}_i) + \hat{\mathrm{V}}_{\mathrm{en}}(\mathbf{r}_i, \mathbf{R}_I) + \hat{\mathrm{V}}_{\mathrm{nn}}(\mathbf{R}_I) + \hat{\mathrm{V}}_{\mathrm{ext}}$

What if Hamiltonian would be separable into electronic and nuclear parts?

Equipartition theorem (thermodynamics):

The time-averaged kinetic energy in a degree of freedom only depends on the temperature.

$$E_{\text{kin,n}} \approx E_{\text{kin,e}}$$

$$\Rightarrow m_n v_n^2 \approx m_e v_e^2$$

$$\Rightarrow \frac{v_e}{v_n} \approx \sqrt{\frac{m_n}{m_e}} \qquad \frac{m_n}{m_e} \approx 1800$$

Separation: slow nuclei and fast electrons live on different time scales.

Born-Oppenheimer approximation

Approximation: Hamiltonians and wave functions of the two are separable by time scales.

$$\hat{\mathrm{H}}(\mathbf{r}_i, \mathbf{R}_I) \equiv \hat{\mathrm{H}}_{\mathrm{e}}(\mathbf{r}_i | \mathbf{R}_I) + \hat{\mathrm{H}}_{\mathrm{n}}(\mathbf{R}_I)$$

$$\Psi(\mathbf{r}_i, \mathbf{R}_I) \equiv \Psi_{\mathrm{e}}(\mathbf{r}_i | \mathbf{R}_I) \Psi_{\mathrm{n}}(\mathbf{R}_I)$$

$$f(x|b) = f_b(x) \equiv \log_b x$$
Parameter (static)

Argument (changeable)

- 1. Consider nuclei fixed (and potentially classically).
- 2. Solve Schrödinger equation for electrons only.

$$\hat{\mathbf{H}}_{\mathbf{e}}(\mathbf{r}_i | \mathbf{R}_I) \Psi(\mathbf{r}_i | \mathbf{R}_I) = E \Psi(\mathbf{r}_i | \mathbf{R}_I)$$

System defines molecular Hamiltonian \widehat{H}

 $\hat{H} = \hat{T} + \hat{V} = \hat{T}_{e} + \hat{V}_{en} + \hat{V}_{ee} + \hat{V}_{nn} + \hat{V}_{ext}$



$$-\sum_{i,j}\frac{Z_ie^2}{4\pi\varepsilon_0\left|\mathbf{R}_i-\mathbf{r}_j\right|}$$

 $= -\sum_{i} \frac{\hbar^2}{2m_e} \nabla^2_{\mathbf{r}_i}$

Coulomb interaction electrons-nuclei

$$+\sum_{i,j>i}\frac{e^2}{4\pi\varepsilon_0\left|\mathbf{r}_i-\mathbf{r}_j\right|}$$

Coulomb interaction electrons-electrons

$$+\sum_{i,j>i}\frac{Z_iZ_je^2}{4\pi\varepsilon_0\left|\mathbf{R}_i-\mathbf{R}_j\right|}$$

Coulomb interaction nuclei-nuclei

Wave function

$$\Psi = \Psi(\mathbf{r}_1, \mathbf{r}_2, \mathbf{r}_3, \dots, \mathbf{r}_n)$$

Wave function

$$\Psi = \Psi(\mathbf{r}_1, \mathbf{r}_2, \mathbf{r}_3, \dots, \mathbf{r}_n)$$

Impractical:

- 3n dimensions for n electrons
- Almost always no closed form expression
- Numerical solution: discretisation in basis functions

Costly:
$$[s] \simeq \exp(2n)/10^4$$
 $[MB] \simeq \exp(n)/2$

Methane CH4









https://gist.github.com/ferchault/1e6009e78310200673969ef96c9dad1d

- 1. In principle, properties could be done arbitrarily accurately, but that is too expensive.
- 2. Two core approximations:

Electrons feel static nuclei and nuclei feel averaged electrons. ("Born-Oppenheimer")

Finite accuracy of wave function / numerics.

("Discretisation")

3. Mental picture: static atoms and electron density.

Chemical Space

Hierarchies



https://doi.org/10.1063/5.0095674

Scaling

Scaling with chemical diversity

Elements	# atoms	# sum formulas	# graphs ^[1]	#confomers
CONF	5	169	4,715	16,797 ^[2]
CONFS	5	349	9,917	51,710
CONFSP	5	757	31,550	
CONFSPCI	5	1,142	37,908	
CONFSPCIBr	5	1,647	45,132	
CONFSPCIBrI	5	2,291	53,285	328,591 ^[2]

Scaling with number of heavy atoms

Elements	# atoms	# sum formulas	# graphs	#confomers ^[2]
CONF	1	4	4	
CONF	2	19	19	
CONF	3	49	94	
CONF	4	97	621	
CONF	5	169	4,715	
CONF	6	276	42,087	
CONF	7	425	417,923	7,039,390
CONFS	1	5	5	
CONFS	2	28	28	
CONFS	3	82	160	
CONFS	4	180	1,161	
CONFS	5	349	9,917	
CONFS	6	625	97,607	
CONFS	7	1,050	1,064,343	23,016,417

https://gist.github.com/ferchault/9ae958b637a255475b502fc63c652835