Lecture #2: Python for atomistic materials modeling

# Previously on

- What is materials informatics
- Python crash course
- HWO announcement

## Goals

- Introduce python libraries for materials modeling
- Explain the advantages of using programming over the manual approach

# Agenda

- Materials modeling toy example
- Why use python?
- ASE and Pymatgen

### Toy example: Band gap vs. X in cubic LiX, X = F, Cl, Br, I

#### Task

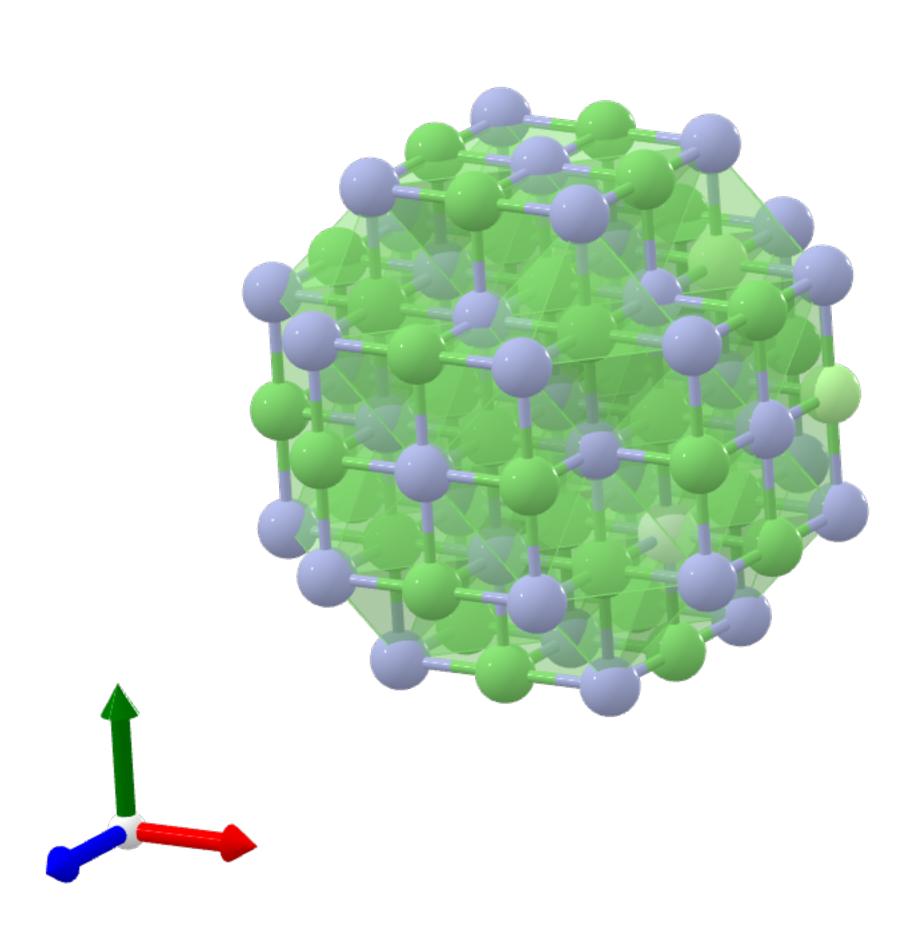
- Calculate a band gap of LiX using a software "Y"
- Perform correlation analysis
- Explain the trend

The software "Y" takes the following input files:

- structure file
- parameters of the calculation
- other specific files

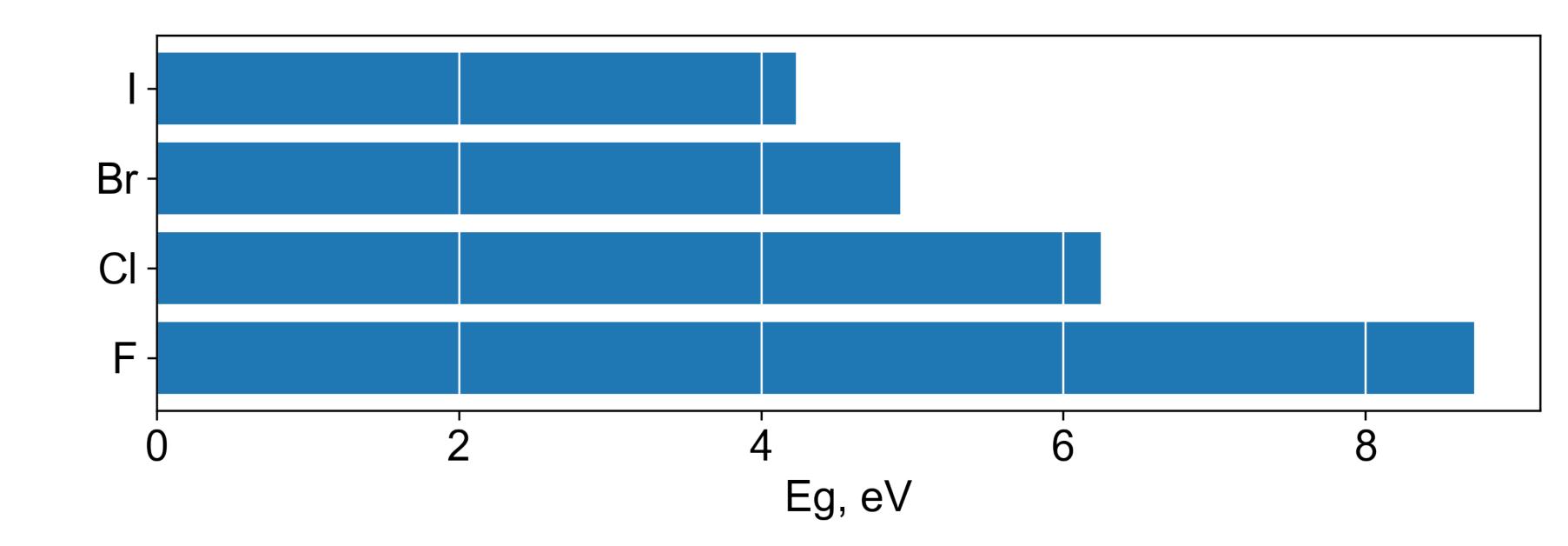
... and outputs:

- 100,000 lines of text
- and one of these contains the  $E_g$  value



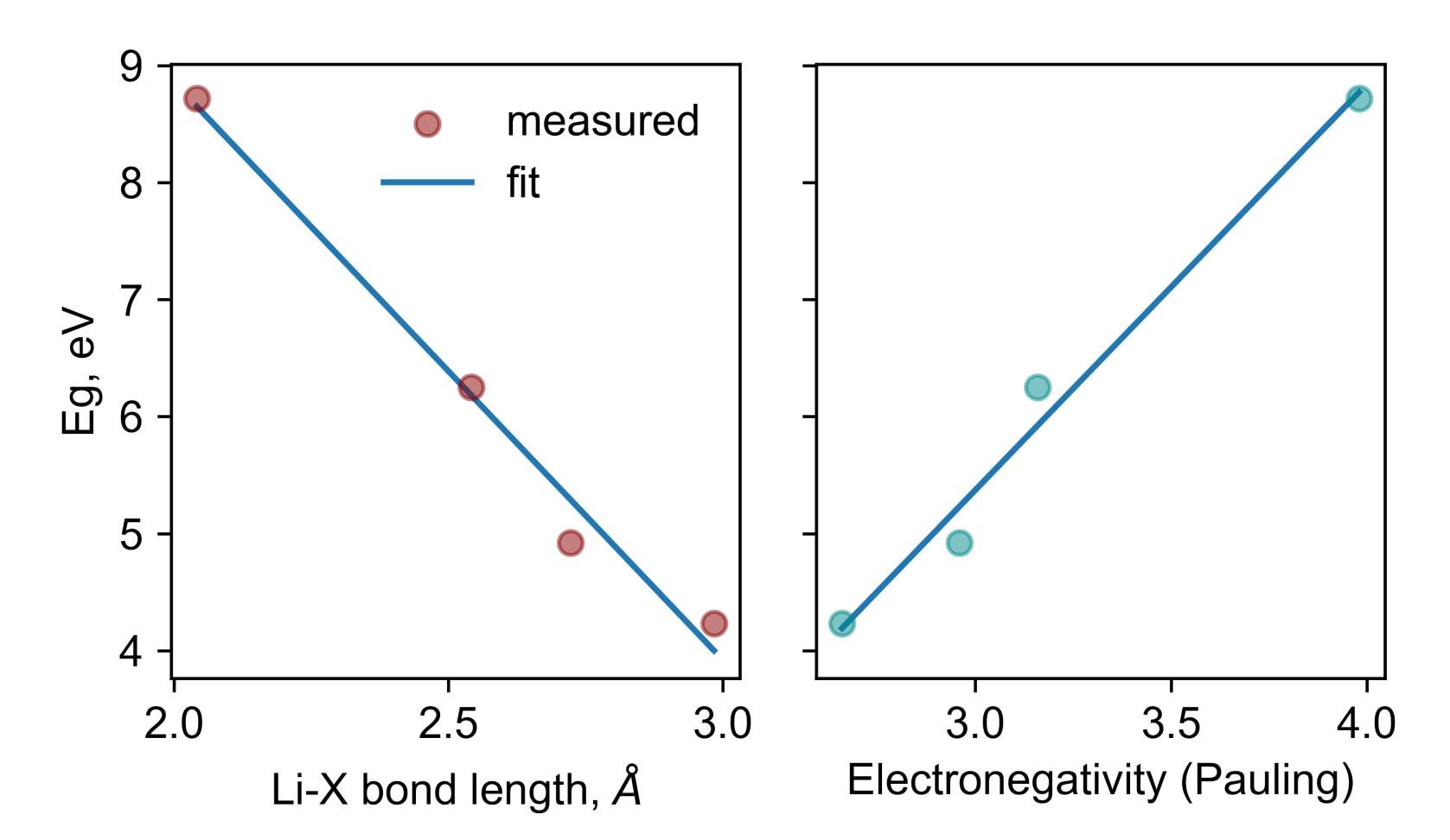
## The trend

The higher atomic number the lower  $E_g$ 



## **Correlation analysis**

- Li-X bond length vs. Eg
- Electronegativity (X) vs. Eg



### Workflow

- Get(Create) structure file
- Prepare input files
- Run calculations
- Parse output
- Repeat the above steps for other structures
- Collect observables
- Analyze correlations
- Make conclusions

Which step takes the longest?

Which can be automated?

#### Manual vs. Automation

#### Manual

- Typing input files by hands
- Getting output data by opening files in text editors and copy/paste numbers
- Analysis of output data using Excel and Origin-like programs
- Relying on programs with graphical interface (in some cases its is efficient but in many cases you need to press many buttons every time to accomplish routine tasks)

Slow, easy to make a mistake, boring for repeating tasks

When there's a task that can be done manually in 10 minutes but you find a way to automate it in 10 days



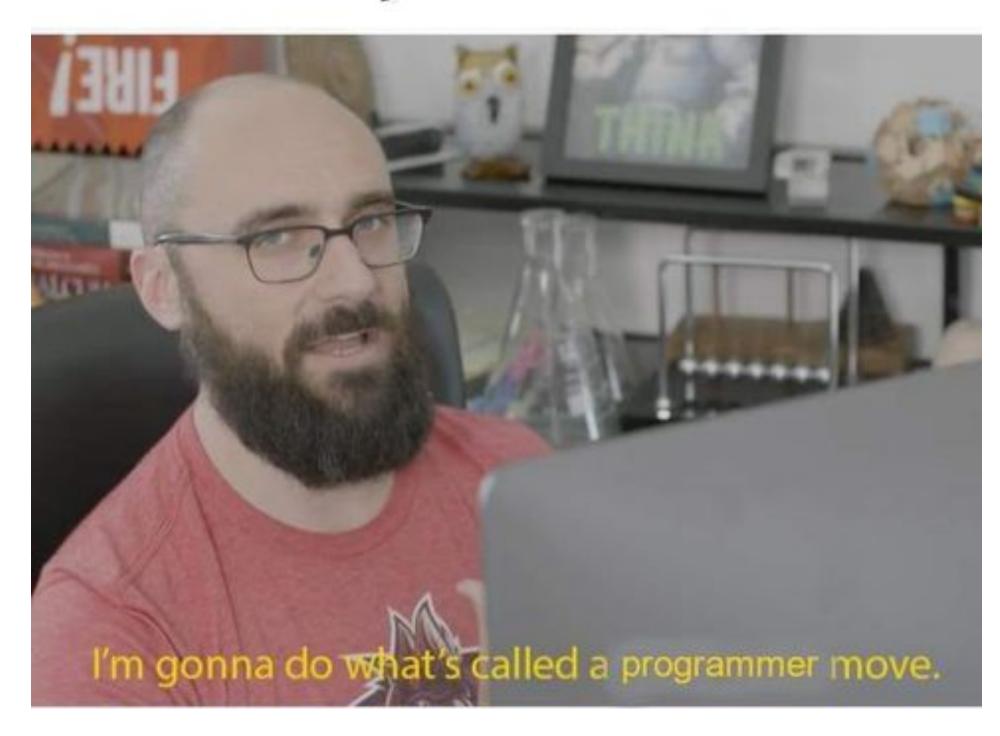
### Manual vs. Automation

#### Automation

- All input files are created by scripts (only small changes are needed)
- Comprehensive and very flexible analysis specific for your needs
- Easy reuse of code for routine tasks
- Information can be stored in a database
- Takes more time in the beginning, but then is much faster

#### Fast, error-proof, fun

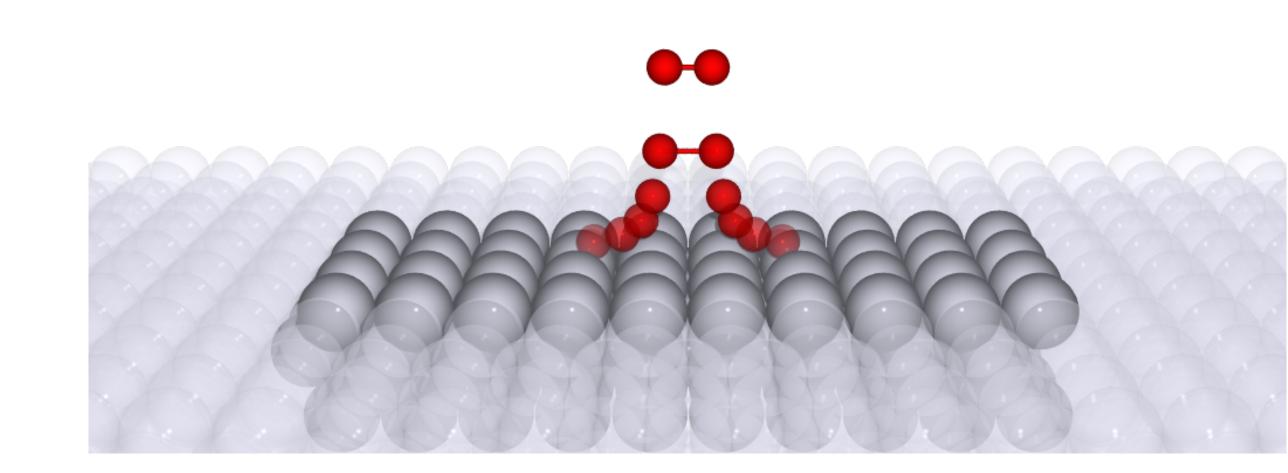
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## Python libraries for atomistic materials modeling:

#### **ASE**

- ASE is an Atomic Simulation Environment written in the Python programming language with the aim of setting up, steering, and analyzing atomistic simulations.
- Good documentation with tutorials Interfaces for most popular modeling simulation codes for density functional theory, molecular dynamics, etc
- Main features:
  - Atoms object for handling molecules/crystals
  - Read/write input files | Parse output files
  - Optimizers
  - Calculators
  - Visualization
  - Surface modeling



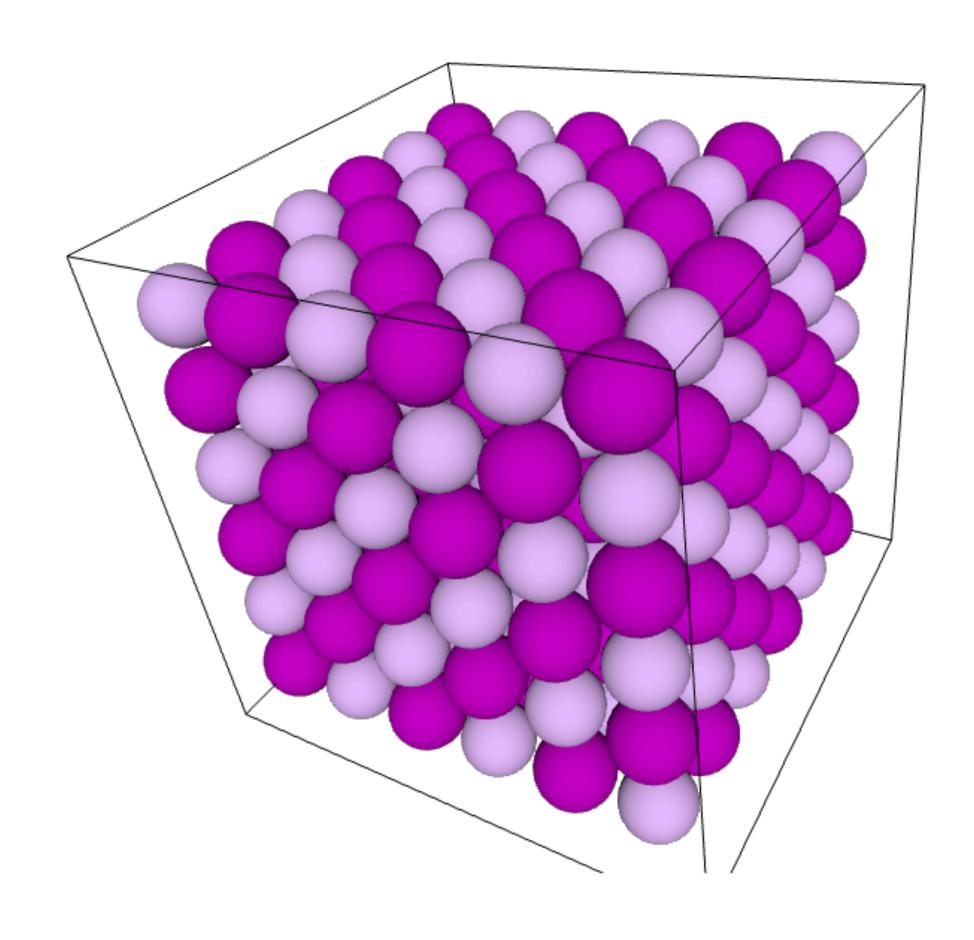
ASE documentation

#### ASE minimum usage example

- read .cif file
- create supercell
- visualize
- save supercell
- more at the seminar

```
from ase.io import read, write
from ase.visualize import view
from ase.build import make_supercell

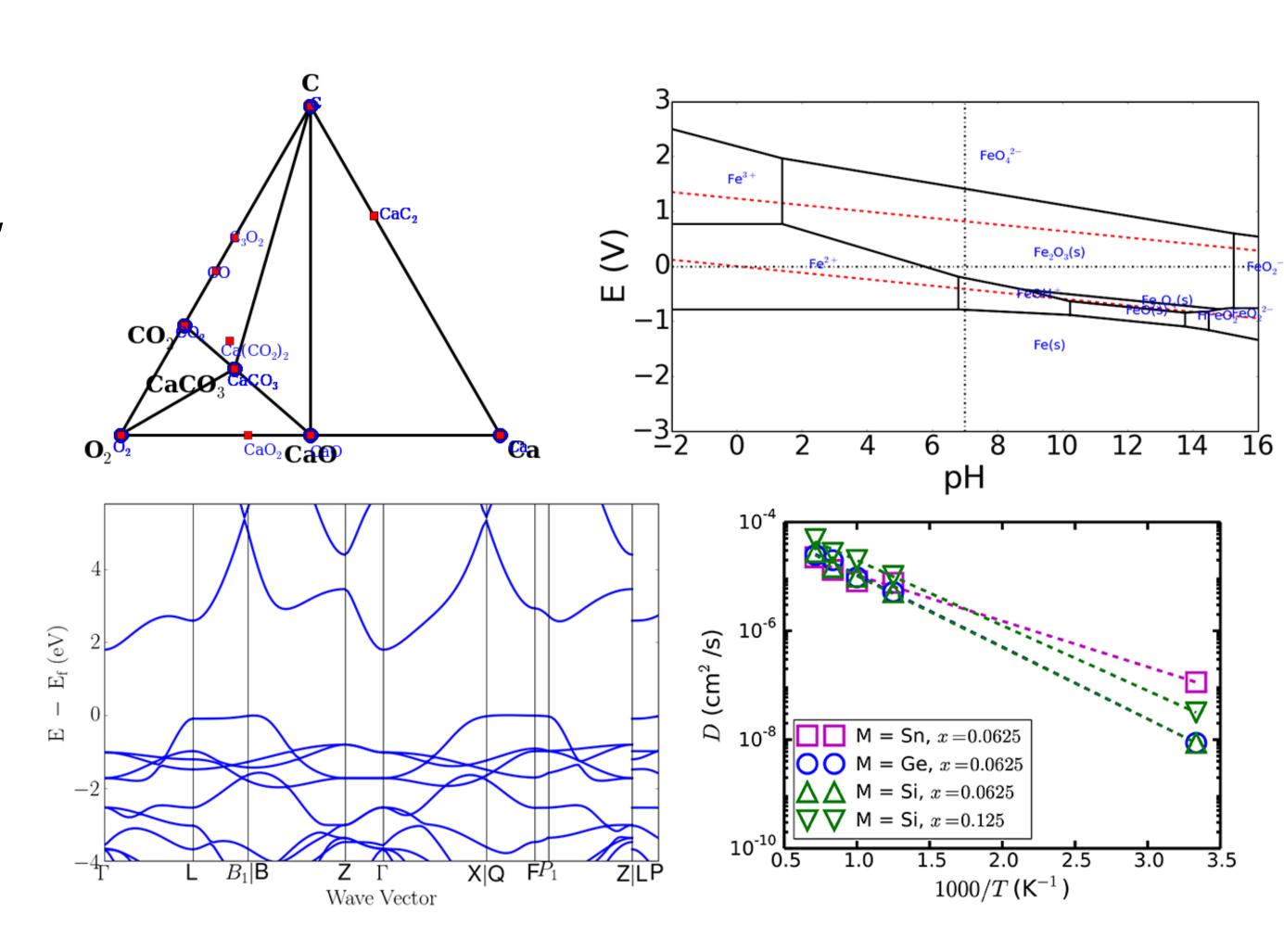
atoms = read('data/LiI.cif')
sc = make_supercell(atoms,
    [[3, 0, 0],
    [0, 3, 0],
    [0, 0, 3]]
    )
view(sc, viewer='x3d')
write('data/LiI_3x3x3.cif', sc)
```



ASE documentation

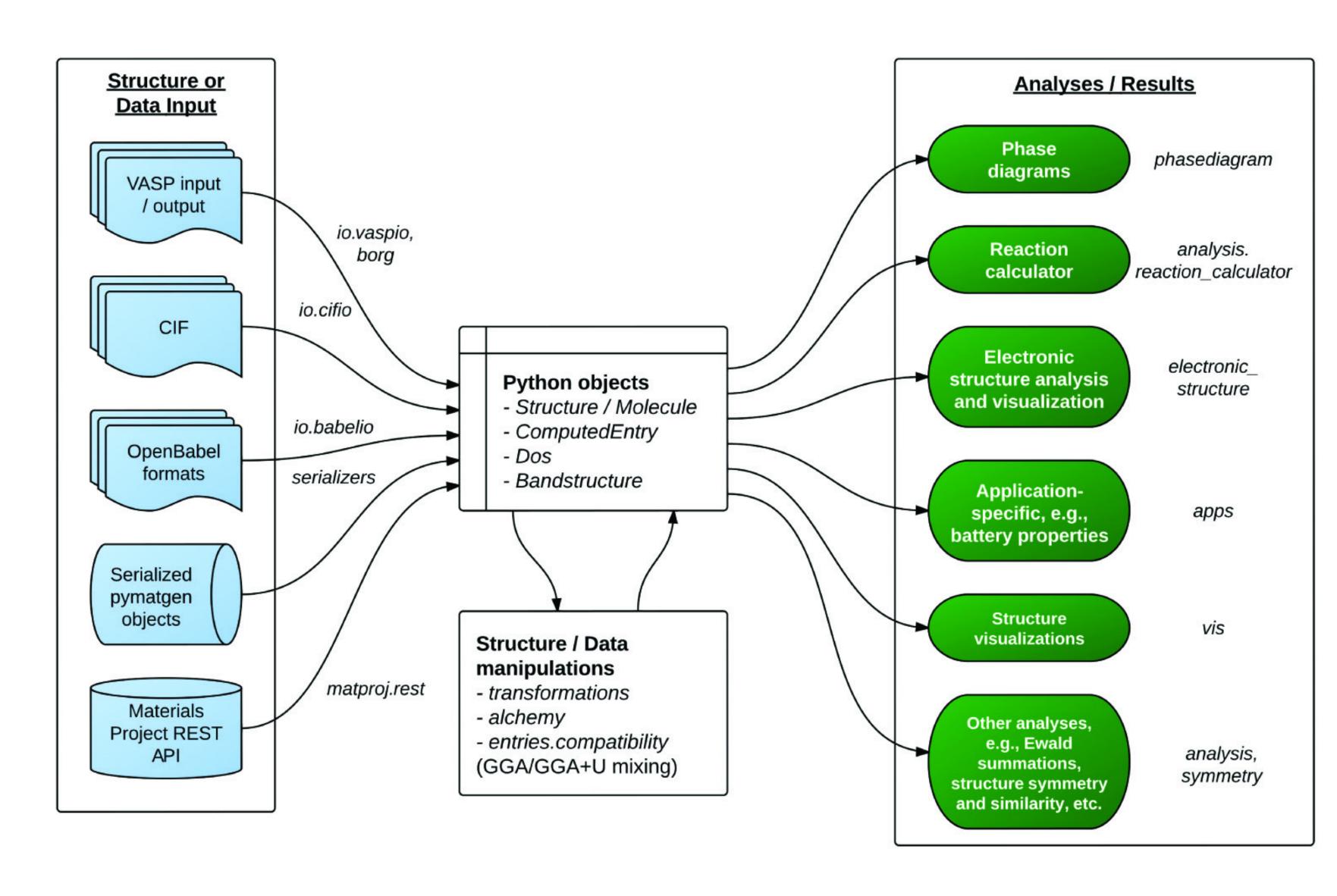
## Python libraries for atomistic materials modeling: Pymatgen

- Pymatgen (Python Materials Genomics) a robust,
   open-source Python library for materials analysis
- Main features
- Highly flexible classes for the representation of Element, Site, Molecule, Structure objects.
- Powerful analysis tools, including generation of phase diagrams, Pourbaix diagrams, diffusion analysis, reactions, etc.
- Electronic structure analysis
- Integration with The Materials Project REST API (next lecture)



Pymatgen documentation

Basic workflow with pymatgen

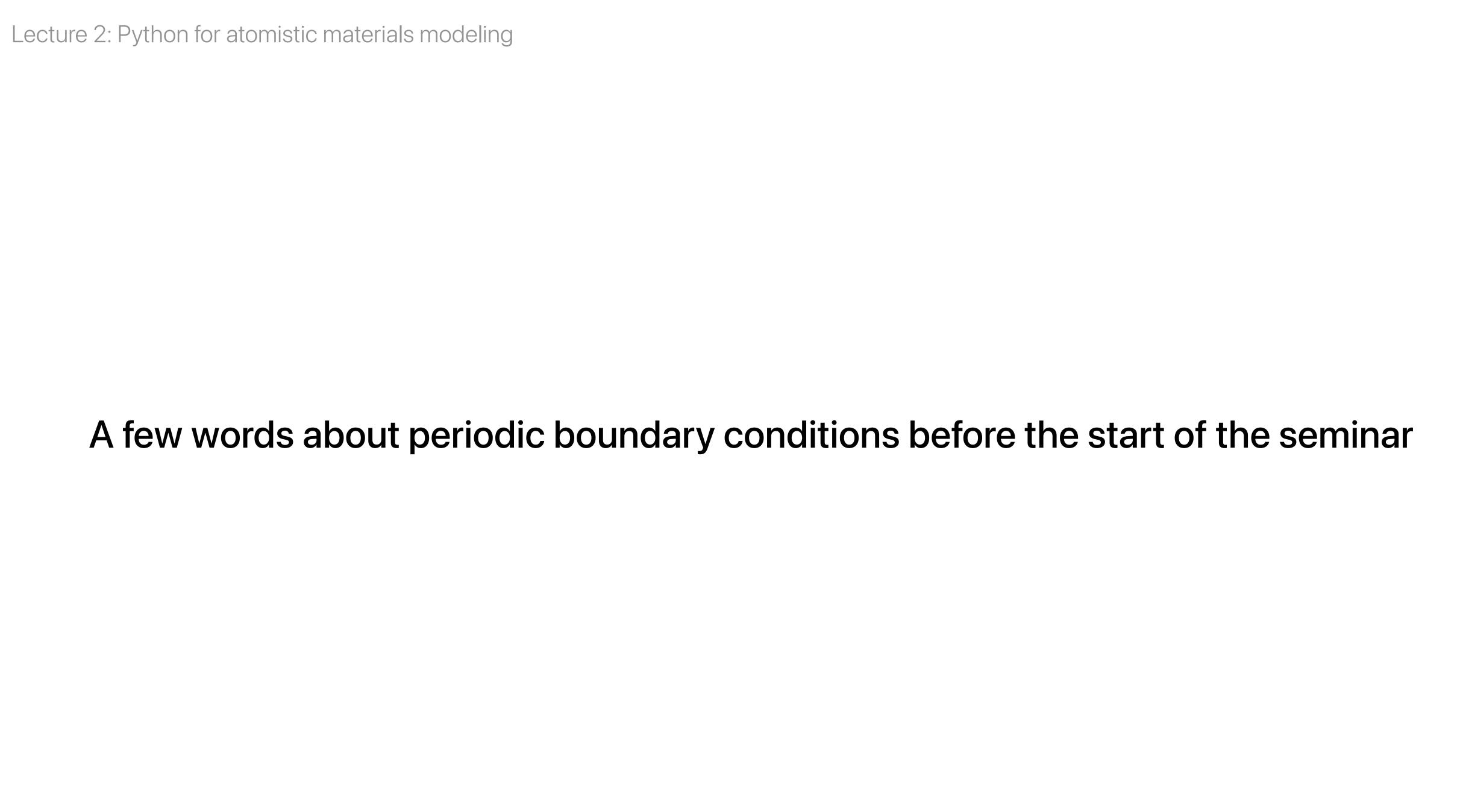


Pymatgen documentation 15

# Take home message

### **Automation:**

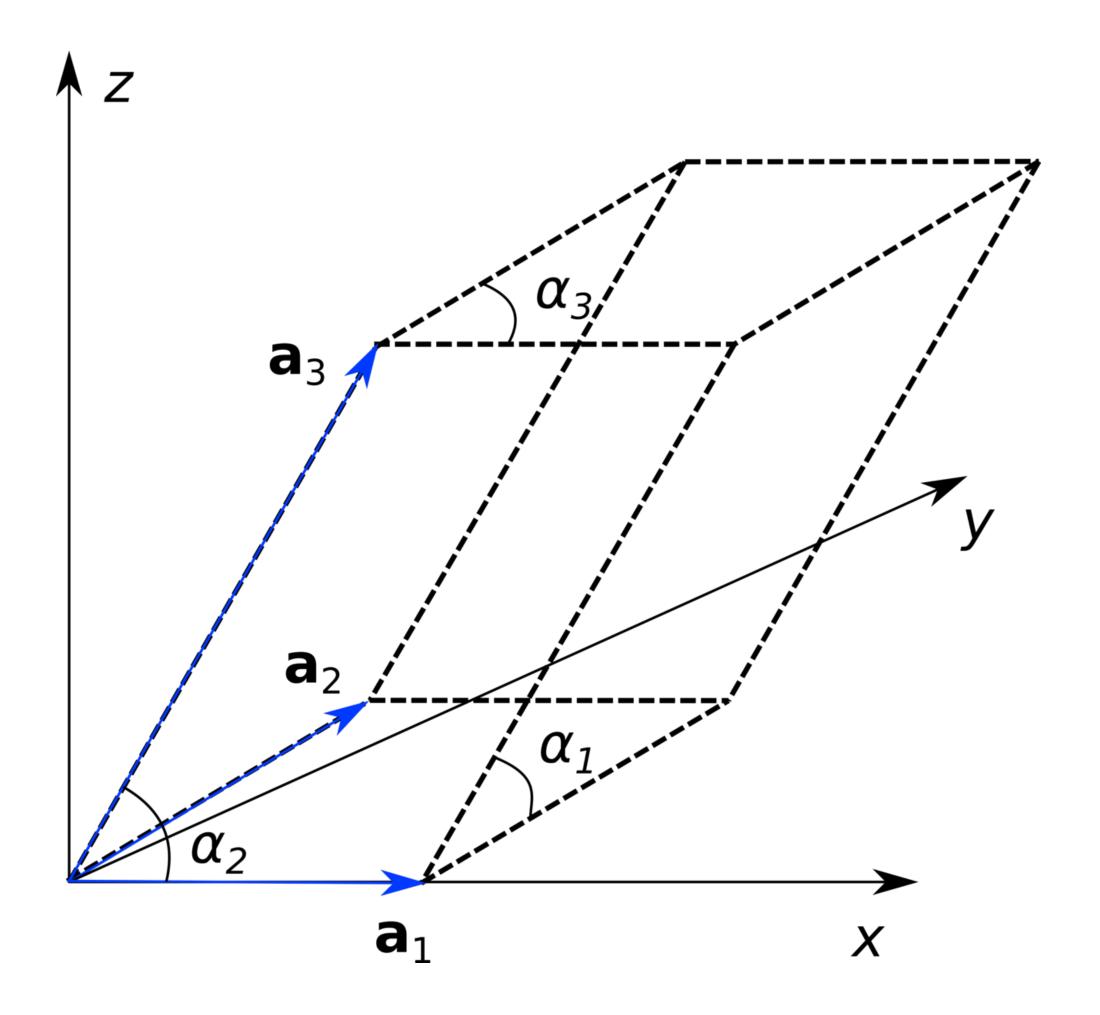
- saves your time
- gives you the opportunity (tools) to realize your ideas
- reduces number of mistakes (typos) made



### Fractional coordinates:

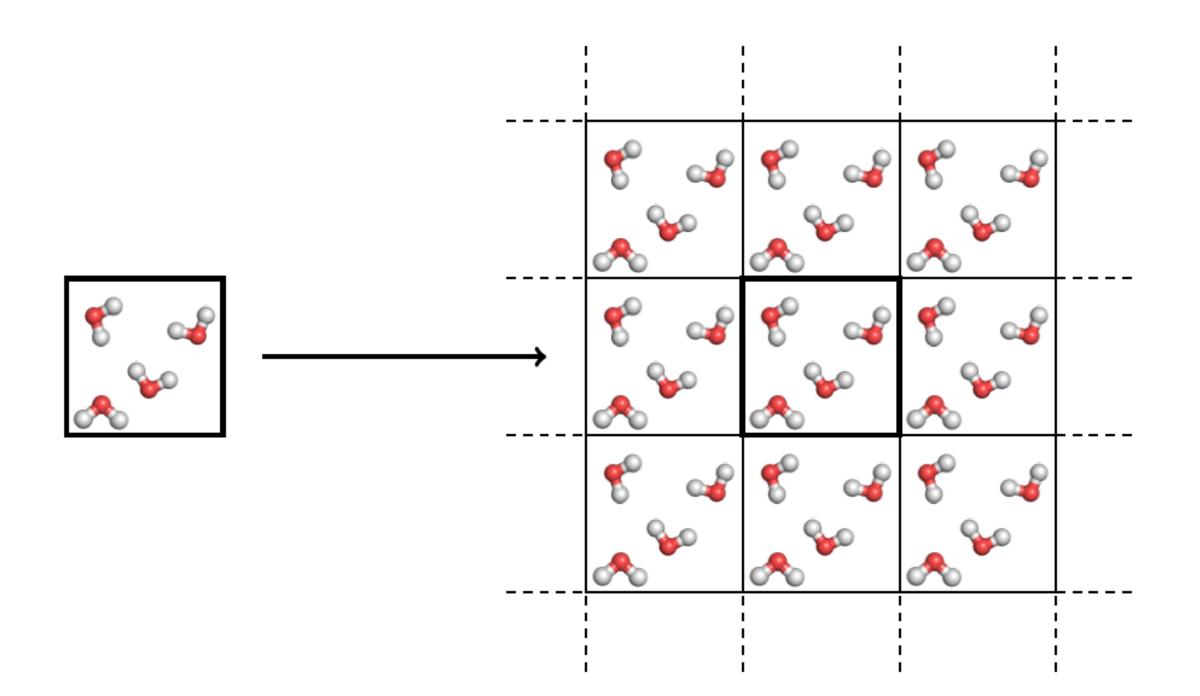
- Crystallographic basis (a, b, c) = basis vectors of the coordinate system
- Coordinate of an atom:  $\mathbf{r} = (x, y, z)$  Fractional coordinate of the atom:  $(x/|\mathbf{a}|, y/|\mathbf{b}|, z/|\mathbf{c}|)$

https://en.wikipedia.org/wiki/Fractional\_coordinates



# There is a three dimensional periodicity crystals = translational symmetry

- The smallest repeating unit, unit cell, describes the whole crystal
  - translation (basis) vectors (a, b, c)
  - coordinates of atoms in the unit cell {r<sub>i</sub>}
- Any atomic position,  $\mathbf{r}$ , in the crystal is given  $\mathbf{r}$  $\mathbf{r}$  $\mathbf{r}$  $\mathbf{r}$  $\mathbf{r}$  $\mathbf{r}$  $\mathbf{r}$ =  $\mathbf{r}$  $\mathbf{i}$  + ma + nb + kc
  - o m, n, k integer numbers



# Thank you for your attention!