

# Lecture #2: Python for atomistic materials modeling

## Previously on

- What is materials informatics
- Python crash course
- HW0 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

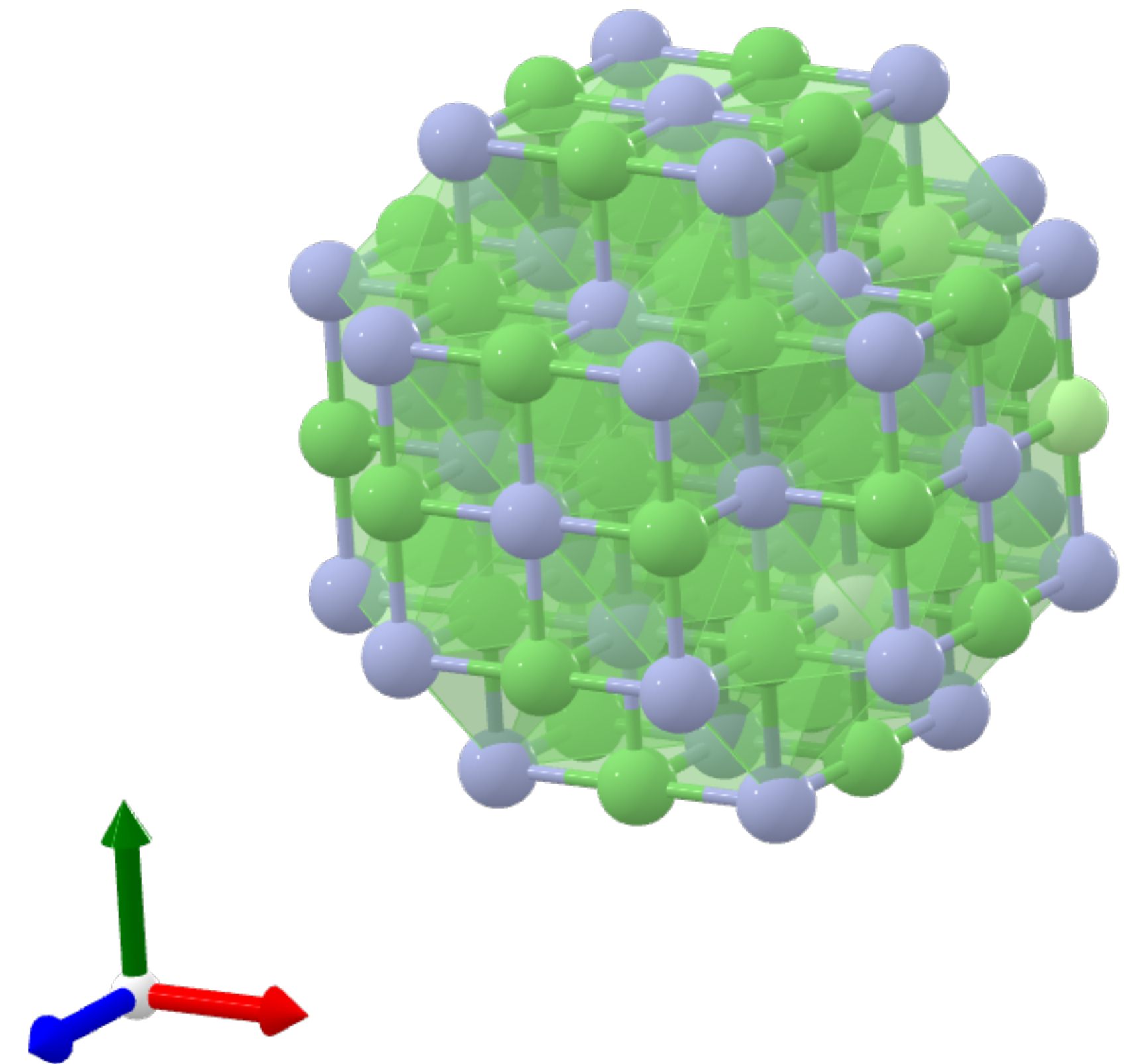
- Calculate a band gap of LiX using a software "Y"
- Perform correlation analysis
- Explain the trend

The software "Y" takes the following input files:

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

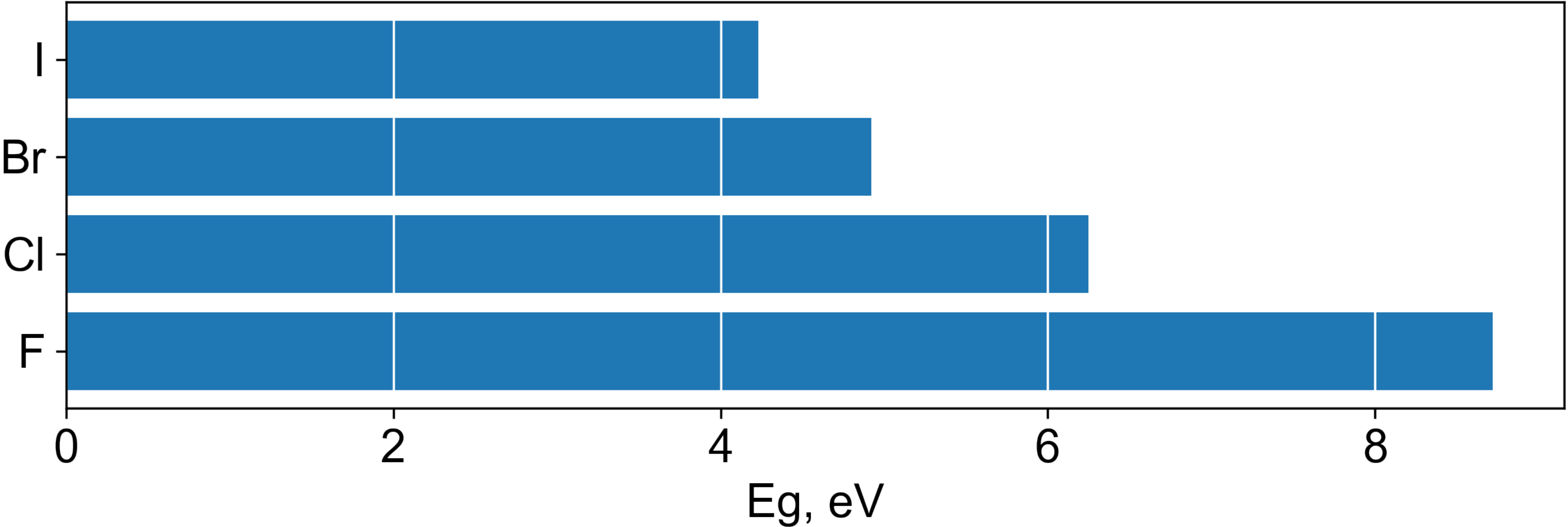
...and outputs:

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



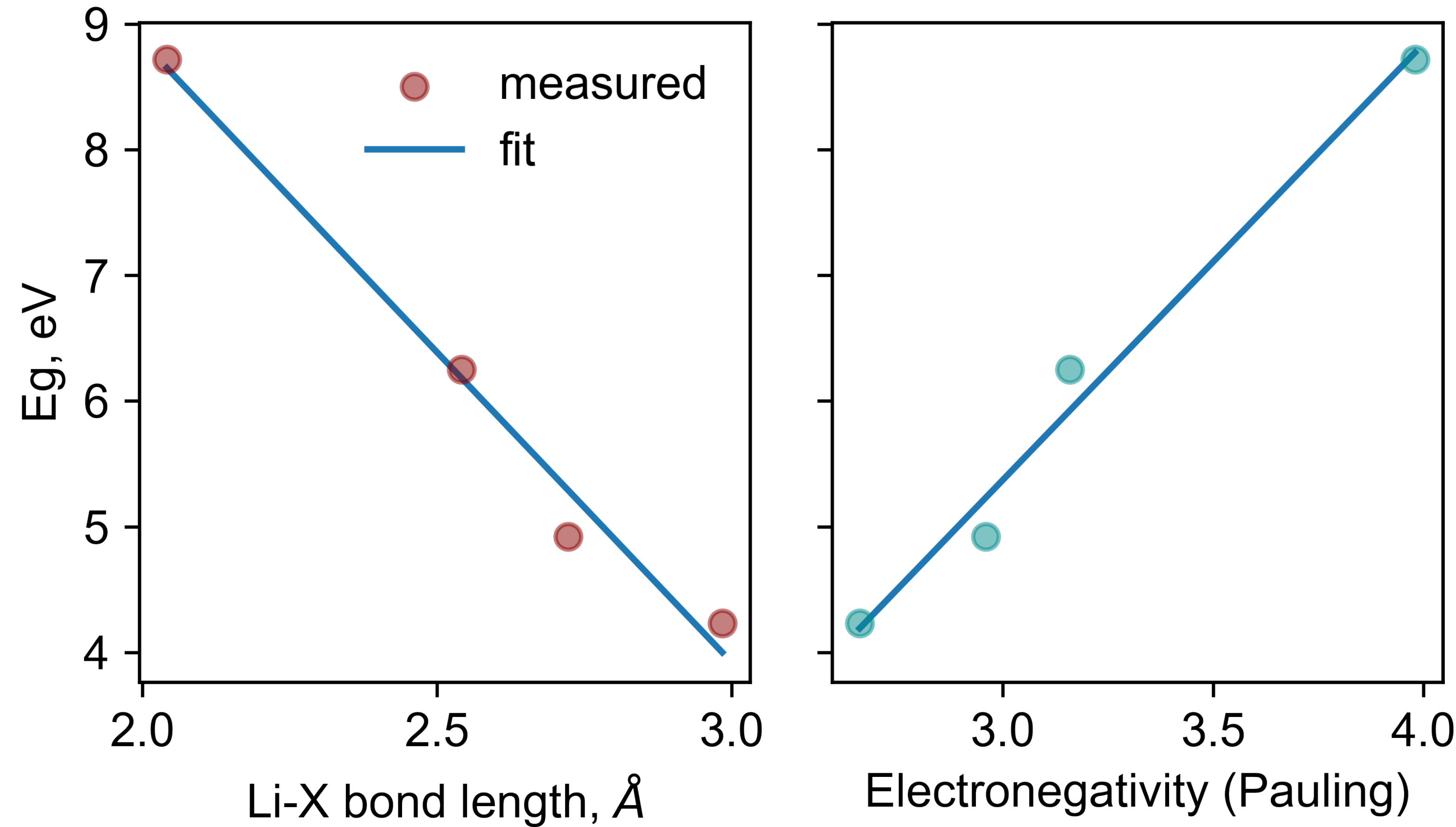
The trend

The higher atomic  
number the lower  $E_g$



Correlation analysis

- Li-X bond length vs.  $E_g$
- Electronegativity (X) vs.  $E_g$



## 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**

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

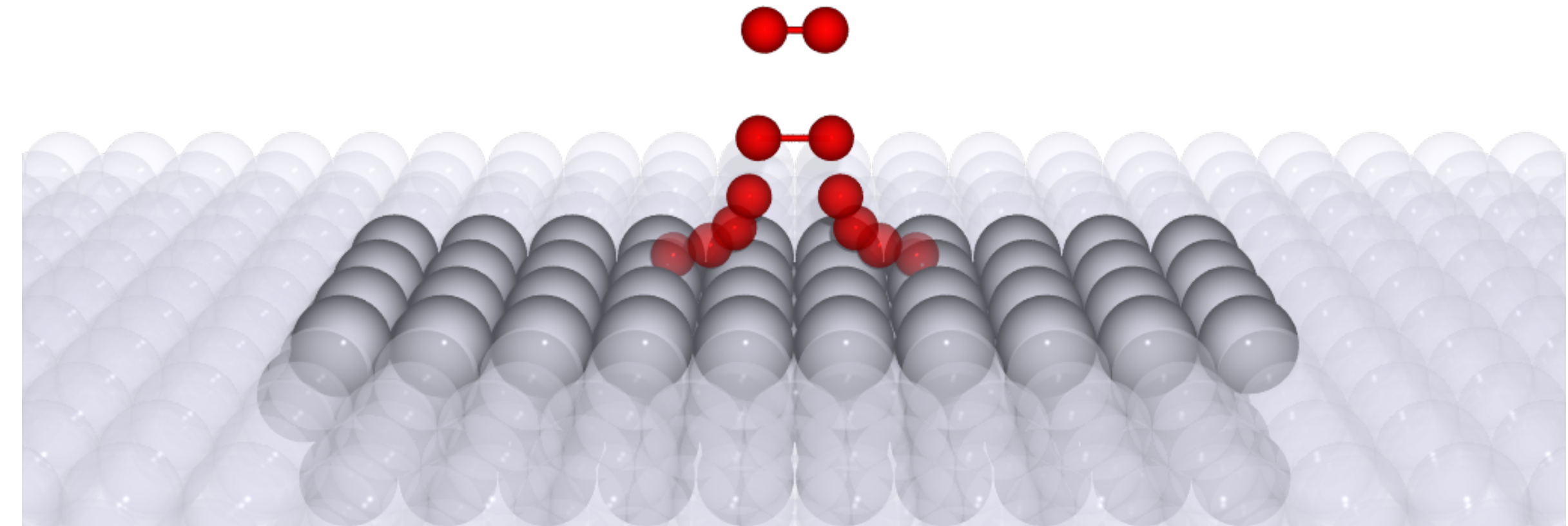




## Python libraries for atomistic materials modeling:

### 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

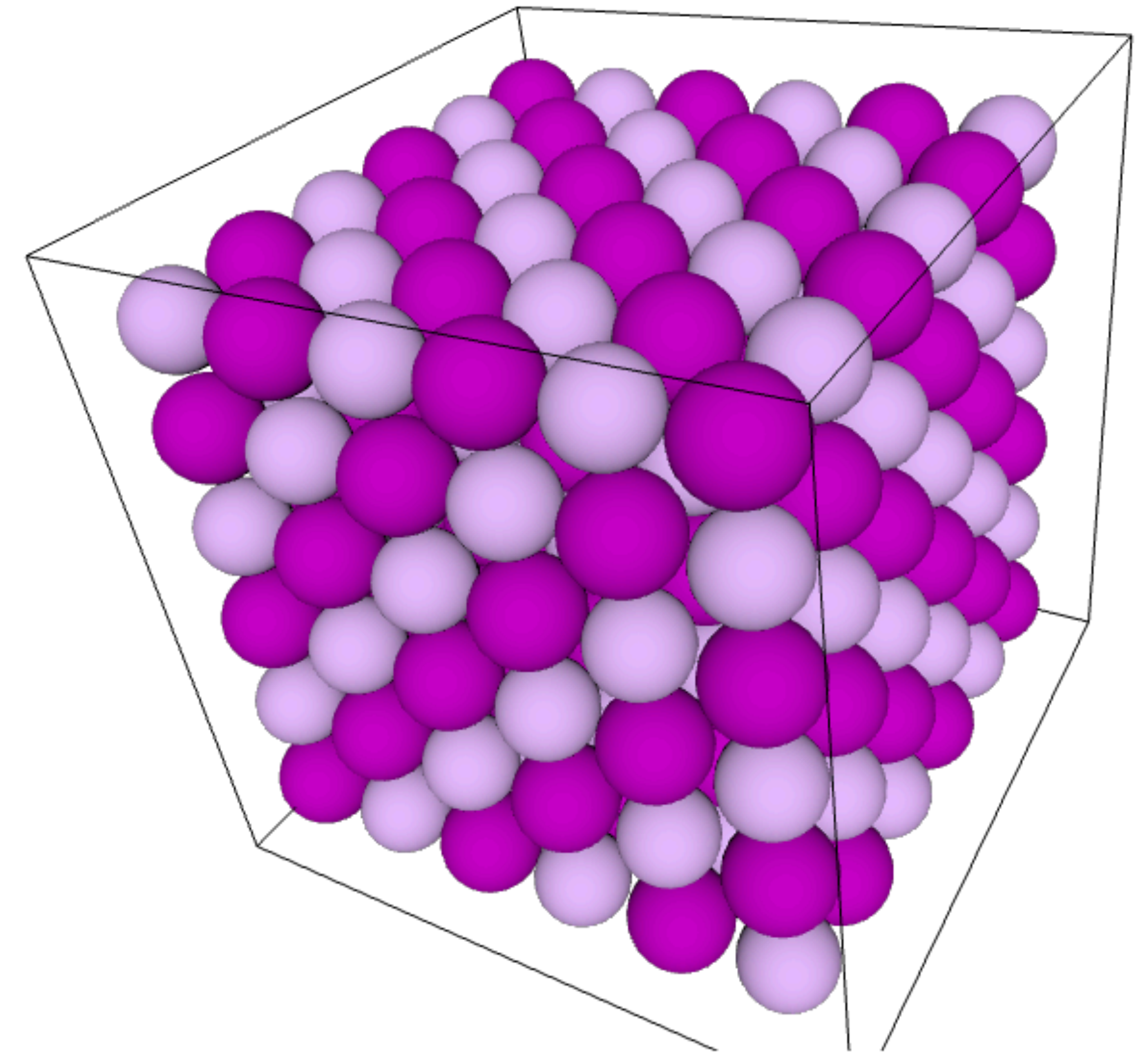


## ASE minimum usage example

- 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)
```

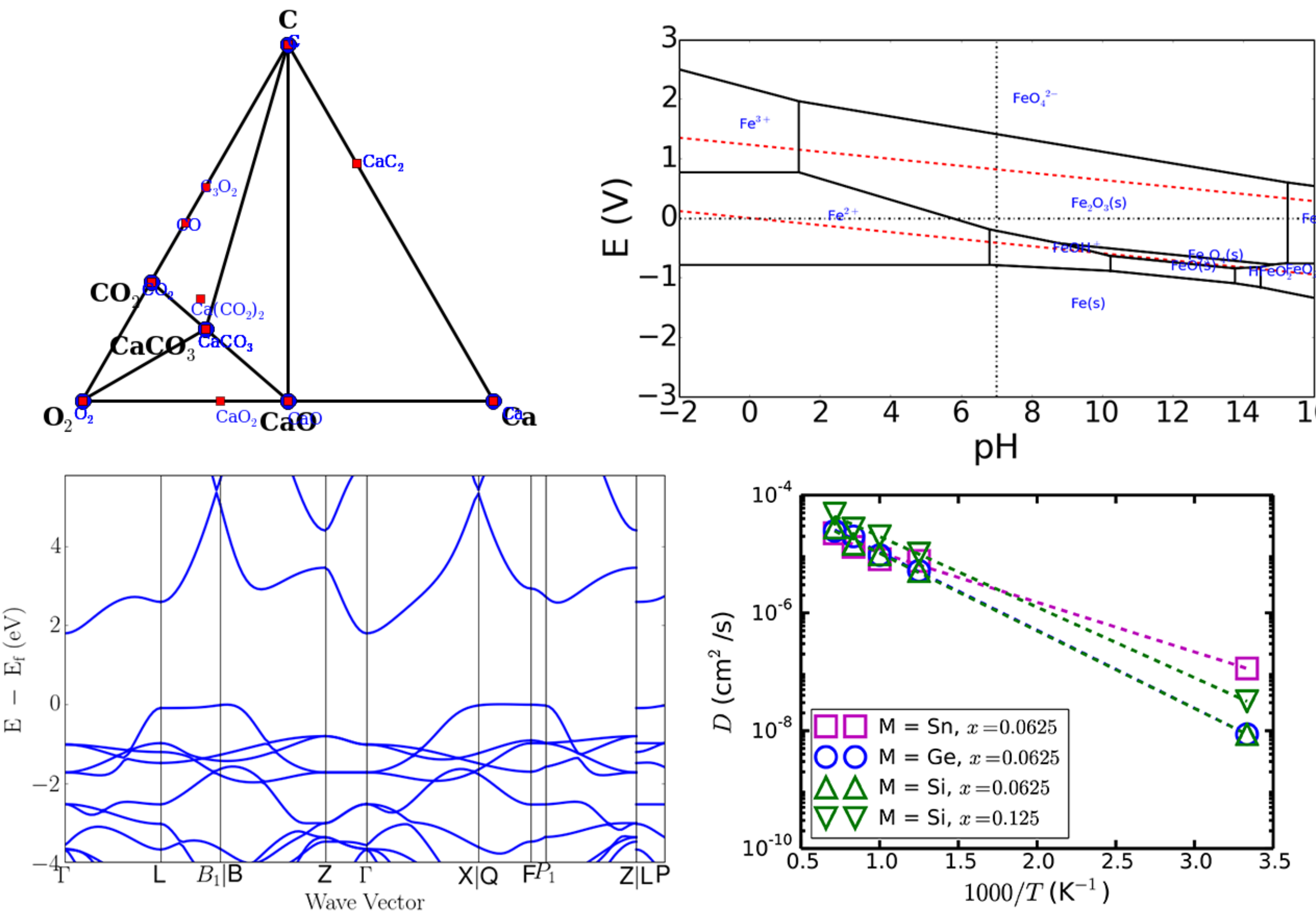




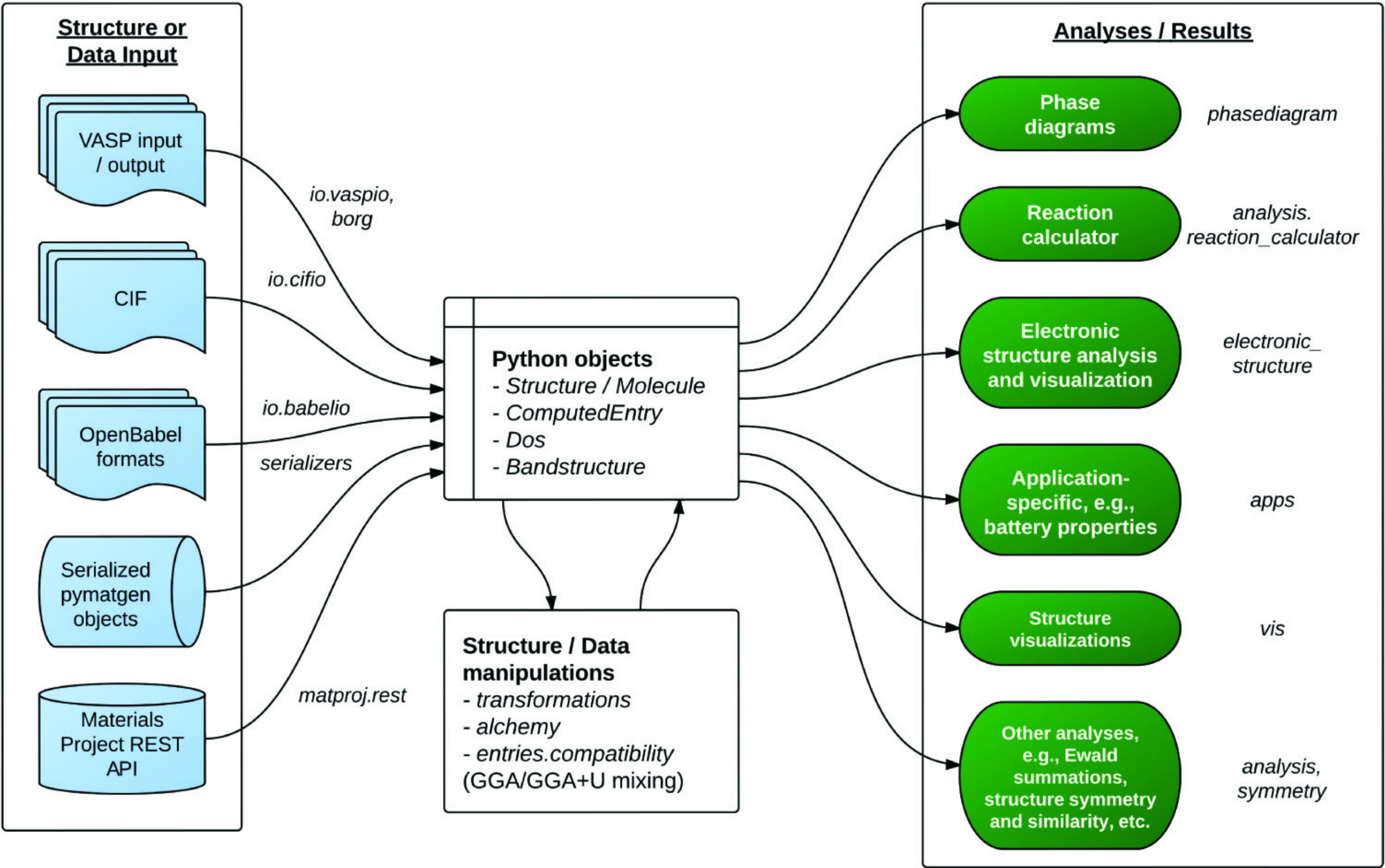
Python libraries for atomistic materials modeling:

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)



Basic workflow with pymatgen



## Take home message

### Automation:

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

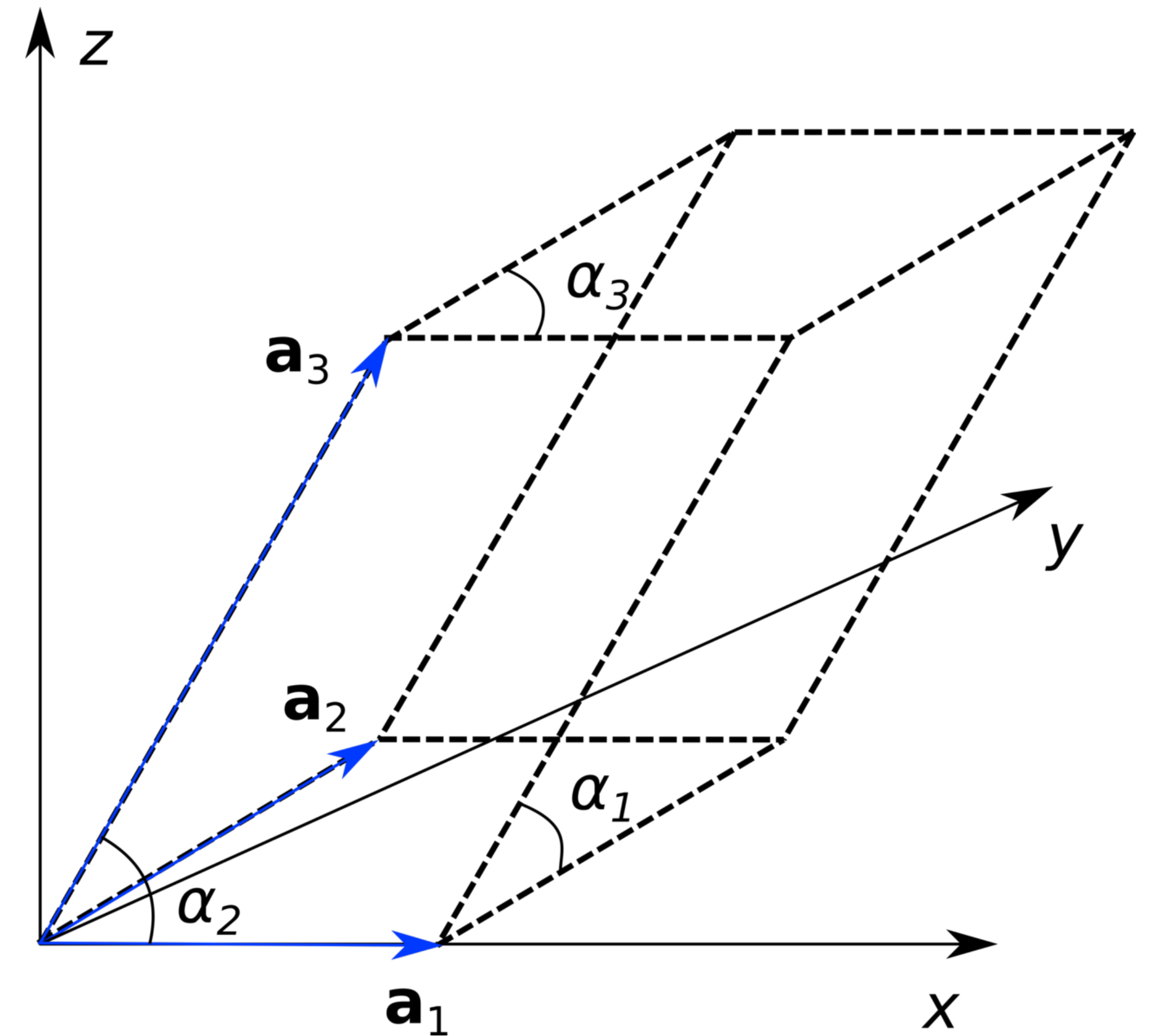


**A few words about periodic boundary conditions before the start of the seminar**

## Fractional coordinates:

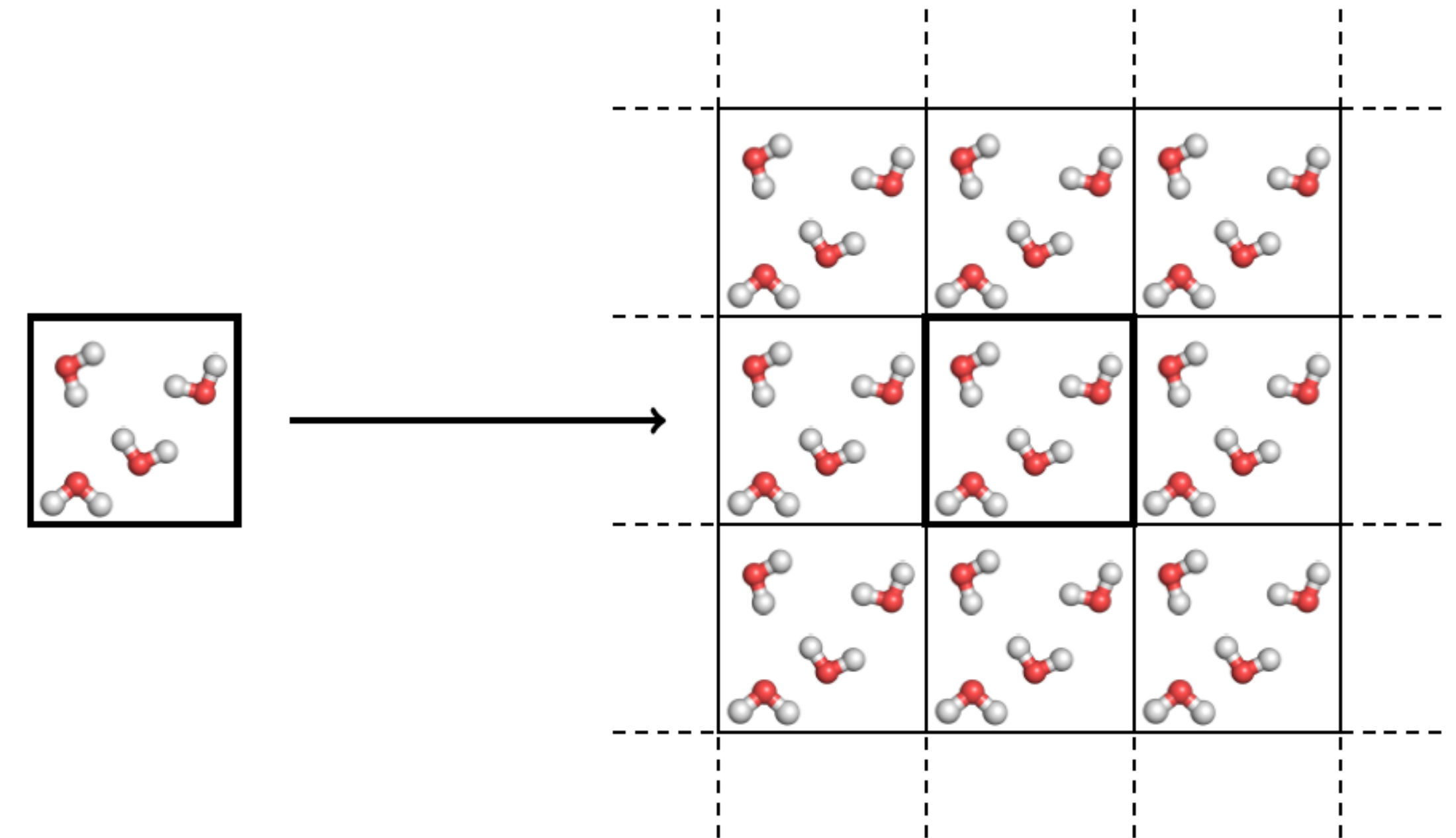
- Crystallographic basis ( $\mathbf{a}_1, \mathbf{a}_2, \mathbf{a}_3$ ) = basis vectors of the coordinate system
- Coordinate of an atom:  $\mathbf{r} = (x, y, z)$
- Fractional coordinate of the atom:  $(x/|\mathbf{a}_1|, y/|\mathbf{a}_2|, z/|\mathbf{a}_3|)$

[https://en.wikipedia.org/wiki/Fractional\\_coordinates](https://en.wikipedia.org/wiki/Fractional_coordinates)



## There is a three dimensional periodicity in 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  $\{\mathbf{r}_i(x, y, z)\}$
- Any atomic position,  $\mathbf{r}$ , in the crystal is given by
$$\mathbf{r}_i^{mnk} = \mathbf{r}_i + m\mathbf{a} + n\mathbf{b} + k\mathbf{c}$$
  - $m, n, k$  - integer numbers



**Thank you for your attention!**