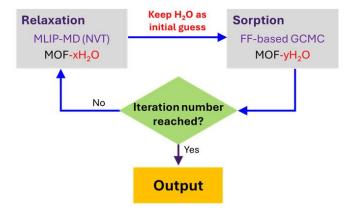
MOFAFF Code Overview and Tutorial

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1. Introduction of MOFAFF

The MOF Adsorption with Framework Flexibility (MOFAFF) package is a Python tool designed to run **Sorption-Relaxation (SR) simulations**: iteratively run machine-learning potential (MLP)-based molecular dynamics (MD) simulations using LAMMPS and Monte Carlo (MC) simulations using gRASPA. It enables the calculation of gas uptake in porous materials while explicitly accounting for framework flexibility.



Download the code from Xijun's github repository: https://github.com/xwsci/mofaff/tree/main

2. Installing and Running MOFAFF.

2.1. Clone the MOFAFF Repository

Download: Go to your directory on Quest and download the code from github:

cd /your_directory/
git clone https://github.com/xwsci/mofaff.git
cd /your_directory/mofaff/
Is

```
(/projects/b1013/xijun/python_env/env_mofaff) [xwb7910@quser32 mofaff]$ ls *
LICENSE README.md setup.py
build:
bdist.linux-x86_64 lib

example:
conf.lmp conf.lmp.initial gcmc in.lammps input run.py script-GPU

mofaff:
    __init__.py
    module_adtach_charge_to_cif.py
    module_add_elements_outdump.py
    module_adjust_h2o.py

mofaff.egg-info:
dependency_links.txt entry_points.txt PKG-INFO requires.txt SOURCES.txt top_level.txt
```

2.2. Set Up the Conda Environment

```
conda create -n mofaff_env python=3.8
```

conda activate mofaff env

conda install numpy=1.24.4

conda install -c conda-forge ase=3.22.1

2.3. Install MOFAFF

cd /your_directory/mofaff/

pip install. Or to update an existing installation: pip install. -upgrade

2.4. Preparing Input Files

Example input files can be found on Quest:

/projects/b1013/2ijun/NBO5/rerun_SR_5_9/example_SR_input/

In this directory, you can find the following files:

- charge 222.txt: charge files containing the DDEC06 charge for each atom.
- conf.lmp: LAMMPS input structure file. *Make sure in your conf.lmp, put all O_h2o after O mof, and all H h2o after H mof.*
- conf.lmp.initial: Backup copy of conf.lmp (since conf.lmp updates over the simulation).
- in.lammps: LAMMPS input file, containing all MD settings.
- gcmc/: This is a folder containing all gRASPA files, including force_field.def, force_field_mixing_rules.def, pseudo_atoms.def, simulation.input, TIP4P.def
- input: Main SR simulation settings, including N_cycle: the maximum SR iteration you want to reach; MLP_path: the path to the MLP file (graph-compress.pb); N_mof_O=32: the first 32 O atoms belong to MOF.

• run.py: Script to launch the SR simulation: python run.py.

Note: In in.lammps, the pressure should be set as the pressure value (if using NPT), whereas in gcmc/simulation.inp, the pressure should be set as the fugacity value.

2.5. Run SR simulation:

Example Slurm script for submitting SR jobs:

```
#!/bin/bash
#SBATCH -A p31504
#SBATCH -p gengpu
#SBATCH -gres=gpu:a100:1
#SBATCH -N 1
#SBATCH -n 1
#SBATCH -t 48:00:00
#SBATCH -mem=32G
#SBATCH -error=e.%J
#SBATCH -output=o.%J
python3 run.py
```

2.6. Output files

As the simulation runs, you will see folders: cycle_1/ cycle_2/ ... cycle_100/

Inside each, you will see 1.lmp/ and 2.gcmc/ subfolders containing LAMMPS and gRASPA input and output files.

```
(base) [xwb7910@quser32 p10]$ ls
          charge_222.txt
                                cycle_2 cycle_36 cycle_52 cycle_69 cycle_85
          conf.lmp
                                  cycle_20 cycle_37 cycle_53 cycle_7
                                                                         cycle_86
          conf.lmp.bk
                                  cycle_21 cycle_38 cycle_54 cycle_70 cycle_87
          conf.lmp.initial
                                  cycle_22 cycle_39 cycle_55 cycle_71 cycle_88
          count_accepted_moves.sh cycle_23 cycle_4
                                                     cycle_56 cycle_72
                                                                         cycle_89
          count_accepted_moves.txt cycle_24 cycle_40 cycle_57
                                                               cycle_73 cycle_9
          cycle 1
                                  cycle_25 cycle_41 cycle_58 cycle_74 cycle_90
          cycle_10
                                   cycle_26 cycle_42 cycle_59 cycle_75 cycle_91
          cycle_100
                                  cycle_27 cycle_43 cycle_6
                                                               cycle_76 cycle_92
          cycle_11
                                  cycle_28 cycle_44 cycle_60 cycle_77 cycle_93
          cycle_12
                                  cycle_29 cycle_45 cycle_61 cycle_78 cycle_94
          cycle_13
                                  cycle_3 cycle_46 cycle_62 cycle_79 cycle_95
          cycle_14
                                  cycle_30 cycle_47 cycle_63 cycle_8
                                                                         cycle_96
          cycle_15
                                  cycle_31 cycle_48 cycle_64 cycle_80 cycle_97
          cycle_16
                                  cycle_32 cycle_49 cycle_65 cycle_81 cycle_98
          cycle_17
                                  cycle_33 cycle_5 cycle_66 cycle_82 cycle_99
                                  cycle_34 cycle_50 cycle_67 cycle_83
          cycle_18
                                                                         gcmc
                                   cycle_35 cycle_51 cycle_68 cycle_84
          cycle_19
                                                                         in.lammps
(base) [xwb7910@quser32 p10]$ cd cycle_2
(base) [xwb7910@quser32 cycle_2]$ ls
(base) [xwb7910@quser32 cycle_2]$ ls *
1.lmp:
conf.lmp graph-compress.pb in.lammps log.lammps mof_H2O_md.cif out.dump out_elements.dump
2.gcmc:
AllData
                           H20_adjust.cif mof_md_charged.cif pseudo_atoms.def
                                                                             result
FirstBead
                           H20_md.cif
                                         mof md.cif
                                                          Restart
                                                                             simulation.input
force field.def
                           Lambda
                                         Movies
                                                           restartfile ini H20 TIP4P.def
force_field_mixing_rules.def mof_H2O_md.cif Output
                                                          RestartInitial
                                                                             TMMC
You can see a few 'cif' files.
mof H2O md.cif: The MOF+H2O CIF from 1.lmp
mof md.cif: MOF part without charge.
mof md charged.cif: MOF part with charge.
H2O md.cif: H2O part.
```

The H2O uptake values for each SR iteration are collected in the 'workflow.out' file in your calculation directory:

H2O adjust.cif: H2O part but adjust all H2O molecules to TIP4P.

```
(base) [xwb7910@quser32 p10]$ head workflow.out
1 3.46735
2 2.84882
3 2.62073
4 2.40618
5 2.58592
6 2.521
7 2.55836
8 2.7546
9 2.49728
10 2.35801
```

2.7. Create Input Files for Multiple Pressures

A bash script can be used to generate separate folders for each target pressure. An example can be found at: /projects/b1013/xijun/NBO5/rerun SR 5 9/example SR multiple jobs/

First, prepare all necessary files in

```
/projects/b1013/xijun/NBO5/rerun_SR_5_9/example_SR_multiple_jobs/inputfiles/

(base) [xwb7910@quser42 example_SR_multiple_jobs]$ ls *
script-10 script-20 script-30 script-5 script-60 script-7.5 script-90
script-100 script-2.5 script-40 script-50 script-70 script-80 t

inputfiles:
charge_222.txt conf.lmp conf.lmp.initial gcmc in.lammps input run.py visualize-workflow.py
```

Then, execute the bash script ./t_NPT (this is for NPT MD, for example, see the bash script below) or ./t_NVT (this is for NVT MD) to generate subfolders for each pressure:

#!/bin/bash

direct='pwd'

x_list=(2.5 5 7.5 10 20 30 40 50 60 70 80 90 100)

pressure_list=(0.00130 0.00260 0.00390 0.00520 0.01039 0.01559 0.02079 0.02598 0.03118 0.03638 0.04157 0.04677 0.05197) # unit: bar

fugacity_list=(125.936681 251.83038 377.681175 503.488999 1005.295208 1507.348018 2008.675037 2508.309254 3008.171091 3507.291647 4004.707549 4502.329854 4998.786223) # unit: Pa

for i in "\${!x list[@]}"; do

 $x = \{x_list[\$i]\}$

pressure=\${pressure_list[\$i]}

fugacity=\${fugacity_list[\$i]}

echo \$x

mkdir -p \$direct/p\$x

cp -r \$direct/inputfiles/* \$direct/p\$x/

sed -i "/pressure/c pressure = \$fugacity" \$direct/p\$x/input

sed -i "s/fix 1 all nvt temp 300.0 300.0 0.04/fix 1 all npt temp 300.0 300.0 0.04 iso

\$pressure \$pressure 1.0/g" \$direct/p\$x/in.lammps

sed -i "s/fix 1 all npt temp 300.0 300.0 0.04 iso 1.0 1.0 1.0/fix 1 all npt temp 300.0

300.0 0.04 iso \$pressure \$pressure 1.0/g" \$direct/p\$x/in.lammps # I used this and previous lines to control set NPT parameters in in.lammps.

cd \$direct/p\$x

```
#rm -rf cycle_*
#sbatch script-GPU
#python3 run.py

#H2O_uptake=`cat workflow.out|awk'{print $2}'|awk'{sum += $1; count += 1} END {if (count > 0) print sum / count}'`

#echo $x $H2O_uptake
cd $direct
done
```

Feel free to modify the script as needed to meet your specific goals.

Note: Always double-check all the parameter settings in cycle_XX/1.lmp and 2.gcmc to ensure the simulations are set up correctly.

3. Overview of Source Files

The MOFAFF package consists of several Python modules:

• module_attach_charge_to_cif.py:

Defines the function attach_charge('filename.cif', 'charge_path') that inserts atomic charge data from charge.txt into a given CIF file.

• module_add_elements_outdump.py:

Defines the function out_dump_add_element(input_file, output_file, mapping) that adds element labels to the LAMMPS output file.

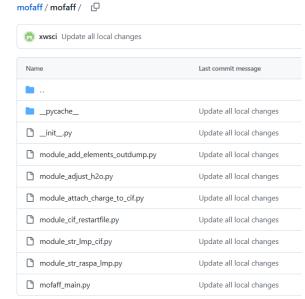
Example:

out_dump_add_element('out.dump',
'out_elements.dump', type_to_element)

• module str lmp cif.py:

Defines 2 functions:

1. convert_dump_cif(input_dump, output_cif) → Converts LAMMPS dump files with element data to CIF format. For example:



convert_dump_cif('out_elements.dump','mof_H2O_md.cif')

2. remove_water(input_filename,output_filename,n_mof_o): Remove water from the a MOF+H2O CIF file. For example:

remove water('mof H2O md.cif','mof md.cif', 32)

Remove H2O from 'mof_H2O_md.cif' and creating a cif file for dry MOF 'mof_md.cif'. '32' means the first 32 O atoms belong to MOF.

• module adjust h2o.py:

Defines 2 functions:

- 1. def separate_H2O(input_filename, output_filename, n_mof_o): Separate H2O and MOF atoms from a MOF+H2O cif file, creating a cif file for H2O. For example: separate_H2O('mof_H2O_md.cif','H2O_md.cif', 32)
 - Separate mof_H2O_md.cif into H2O_md.cif, where '32' means the first 32 O atoms belong to MOF.
- 2. def adjust_H2O_TIP4P(input_filename): Adjust all H2O molecules to TIP4P structure, overwriting the original file. For example:

 adjust H2O TIP4P('H2O adjust.cif')
- module cif restartfile.py:

Defines convert_H2O_raspa_restartfile(input_cif, output_restartfile) to transform H2O coordinates obtained from LAMMPS MD simulations into a restart file for gRASPA. GCMC simulations will read the restartfile as the initial guess for water. For example: module_cif_restartfile.convert_H2O_raspa_restartfile('H2O_adjust.cif','restartfile_ini_H2O')

Convert 'H2O adjust.cif' into 'restartfile ini H2O'

• module str raspa lmp.py:

Defines the function "raspa_to_lmp(raspa_data, output, N_mof_O, mapping, hybrid_FF)": Convert Movies/System_0/result_XXX.data (the last snapshot in a GCMC simulation) into LAMMPS input format for the next SR iteration. For example:

```
raspa_to_lmp('result_495000.data','conf.lmp', 32, type_to_element, False)
```

Convert the GCMC movie file 'result_495000.data' into 'conf.lmp'. The first '32' O atoms belongs to MOF structure. 'type_to_element' are element mapping defined in 'input' file. 'False' means not using hybrid FF (*I didn't write hybrid FF code, so, always set it to False in the 'input' file*).

- mofaff main.py: The central driver script managing the full SR iteration workflow.
 - Part 1. Import all the module files listed above.

```
import os
import subprocess
import numpy as np
import pacmof
from . import module_add_elements_outdump
from . import module_attach_charge_to_cif
from . import module_str_lmp_cif
from . import module_str_raspa_lmp
from . import module_cif_restartfile
from . import module_adjust_h2o
import module_adjust_h2o
```

Part 2. Read SR parameter settings from the 'input' file, such as pressure, N_cyle, MLP path, N mof O, start cycle, charge path, remove H2O, adjust H2O, hybrid FF.

```
12 V def main(input_path='input'):
            # Read parameters fro
settings = {}
type_to_element - {}
             reading_dict = False
                                                                                                                                                                                              settings[key.strip()] = float(value)
            dict_name -
            with open(input path, 'r') as file: # Make sure to provide the correct path to 'input'
                                                                                                                                      46
                                                                                                                                                                                        except ValueError:
                                                                                                                                      47
                                                                                                                                                                                             if value.lower() == 'true':
                      # Strip comments
line = line.split('#', 1)[0].strip()
                                                                                                                                       48
                                                                                                                                                                                                    settings[key.strip()] = True
                    if line.endswith('{'):
    # Start reading a dictionary
                                                                                                                                      49
                                                                                                                                                                                             elif value.lower() == 'false':
                         " >com*c reading a dictionary
reading_dict = True
dict_name = line.split('=')[0].strip()
continue
                                                                                                                                      50
                                                                                                                                                                                                    settings[key.strip()] = False
                                                                                                                                       51
                   elif reading dict:
                                                                                                                                      52
                                                                                                                                                                                                    settings[key.strip()] = value
                        if line == '}':
# Stop read
                                            ding the dictionary
                                                                                                                                      53
                               reading_dict = False
continue
                                                                                                                                                         pressure = settings['pressure']
                                                                                                                                                     N_cycle = settings['N_cycle']
                                                                                                                                      55
                         # Read dictionary entries
                                                                                                                                  56 MLP_path = settings['MLP_path']
tes 57 N_mof_O = settings['N_mof_O']
58 start_cycle = settings['start_cycle']
                         kev value = line.split(':')
                 key -int(key-value[0].strip()) # Assuming keys are integers as per the input example
value - key_value[1].strip().strip(',').strip("'") # Strip extra commas and single quotes
type_to_element[key] - value
elif "-" in line:

58
                     key, value = line.split('=', 1)
                                                                                                                                   charge_path = settings['charge_path']
charge_path = settings['remove_H20']
charge_path = settings['remove_H20']
charge_path = settings['adjust_H20']
charge_path = settings['hybrid_FF']
                          value = value.strip()
# Try to convert to int, float, boolean, or use as string
                               settings[key.strip()] = int(value)
```

Part 3. Read the LAMMPS and gRASPA environmental settings from the 'input' file.

```
64
         # Read commands LAMMPS and commands gRASPA from input
         commands_LAMMPS = ""
65
        commands_gRASPA = ""
66
         with open(input_path, 'r') as file:
          start_collecting_LAMMPS = False
            start_collecting_gRASPA = False
for line in file:
69
70
              line = line.strip()
                if line.startswith('commands_LAMMPS'):
                   start_collecting_LAMMPS = True
                    start_collecting_gRASPA = False
74
75
                     continue
            elif line.startswith('commands_gRASPA'):
                    start_collecting_gRASPA = True
                    start_collecting_LAMMPS = False
79
                     continue
              elif line.strip() == "":
                   start_collecting_LAMMPS = False
                    start_collecting_gRASPA = False
82
                    continue
83
          if start_collecting_LAMMPS:
84
                  if not line.startswith('"""):
85
                       commands_LAMMPS += line + "\n"
          elif start_collecting_gRASPA:
                   if not line.startswith('"""):
88
                        commands_gRASPA += line + "\n"
```

Part 4. Restart setup. If restart_cycle is set to x in the 'input' file, where x > 1, then the SR iteration will start from iteration x. The input structure for the LAMMPS part in iteration x is obtained from the final snapshot of GCMC from iteration x-1.

```
91
           ## Prepare for the workflow
 92
           direct = os.getcwd()
           subprocess.run(['cp', 'conf.lmp', 'conf.lmp.bk']) # Backup initial conf.lmp
       # restart setting
          if start_cycle > 1:
 96
               os.chdir(f"{direct}/cycle {start cycle-1}/2.gcmc/Movies/System 0/")
              last_snapshot = max((f for f in os.listdir('.') if f.startswith("result_") and f.endswith(".data")), key=lambda x: int(x[7:-5]), default="No files found")
 97
 98
              subprocess.run(['cp', last_snapshot, os.path.join(direct, 'mof_raspa.data')])
 99
              subprocess.run(['sed', '-i', r's/\(TIP4P \ \ \ d_charged\.cif \ \)//g', \ 'mof_raspa.data'])
101
              module_str_raspa_lmp.raspa_to_lmp('mof_raspa.data','conf.lmp', N_mof_0, type_to_element, hybrid_FF)
102
          # Modify in.lammps file for pressure (Change if this is a NPT calculation)
103
       # with open('in.lammps', 'r') as file: For now, Ignore these lines.
104
105
106
           content = content.replace("p_start", f"{pressure/100000:.6f}")
     # content = content.replace("p_end", f"{pressure/100000:.6f}")
107
108
      # with open('in.lammps', 'w') as file:
109
                file.write(content)
```

Part 5. Automatically update the Pressure value in gcmc/simulation.input according to the pressure setting in the 'input' file.

```
# Modify gcmc/simulation.input
           with open(f'{direct}/gcmc/simulation.input', 'r') as file:
112
               lines = file.readlines()
           with open(f'{direct}/gcmc/simulation.input', 'w') as file:
              for line in lines:
                   if remove H20 == False and line.strip().startswith('RestartFile'):
                       line = line.replace(line.strip(), "RestartFile yes")
                   if line.startswith('Pressure'):
119
                       file.write(f'Pressure {pressure}\n')
120
                   else:
121
                        file.write(line)
122
```

Part 6. Run LAMMPS simulations using SR iterations (in the code, these are referred to as SR "cycles," though our recent manuscript refers to them as SR "iterations"). After completing the LAMMPS simulations, add element information into the LAMMPS output file 'out.dump', creating a new 'out_elements.dump' file, and then convert it into a cif file 'mof_H2O_md.cif'.

```
123
          # Start the cycle of simulations
124
          for n in np.arange(start_cycle,N_cycle+1):
125
             print(f"Cycle: {n}")
             # Setup cycle_{n} directories
126
             cycle_dir = os.path.join(direct, f'cycle_{n}')
127
128
             os.makedirs(cycle_dir, exist_ok=True)
129
             os.chdir(cycle_dir)
130
             # LAMMPS simulations
131
             os.makedirs(os.path.join(cycle_dir, '1.lmp'), exist_ok=True)
132
133
             os.chdir(os.path.join(direct, f'cycle {n}', '1.lmp'))
134
              subprocess.run(['cp', os.path.join(direct, 'conf.lmp'), os.path.join(direct, 'in.lammps'), os.path.join(direct, f'cycle_{n}', '1.lmp')])
             subprocess.run(['ln', '-s', MLP_path])
135
136
             137
             subprocess.run(commands_LAMMPS, shell=True, executable='/bin/bash')
138
              module_add_elements_outdump.out_dump_add_element('out.dump', 'out_elements.dump', type_to_element)
139
              module_str_lmp_cif.convert_dump_cif('out_elements.dump','mof_H20_md.cif')
140
```

Part 7. Separate H2O and MOF atoms in 'mof_H2O_md.cif' into two files: 'mof_md.cif' and 'H2O_md.cif'. Next, add charge (the charge file path is defined in the 'input' file) for each atom in 'mof_md.cif', creating 'mof_md_charged.cif'. If you set adjust_H2O = True in the 'input' file, the H2O molecules in 'H2O_md.cif' will be adjusted into TIP4P in 'H2O_adjust.cif', which will then be converted into GCMC restart file and be put in /RestartInitial/System_0/restartfile. Such that GCMC simulations can utilize the water molecules as the initial guess.

```
141
                # gRASPA GCMC calculations
142
143
                os.chdir(os.path.join(direct, f'cycle_{n}'))
144
               os.makedirs('2.gcmc', exist_ok=True)
145
               os.chdir(os.path.join(direct, f'cycle_{n}', '2.gcmc'))
                subprocess.run(['cp', '../../gcmc/force_field.def', '.'])
                subprocess.run(['cp', '../../gcmc/force_field_mixing_rules.def', '.'])
147
               subprocess.run(['cp', '../../gcmc/pseudo_atoms.def', '.'])
148
               subprocess.run(['cp', '../../gcmc/simulation.input', '.'])
               subprocess.run(['cp', '../../gcmc/TIP4P.def', '.'])
150
               subprocess.run(['cp', '../1.lmp/mof_H20_md.cif', '.'])
151
152
                module_str_lmp_cif.remove_water('mof_H2O_md.cif','mof_md.cif',N_mof_0) # output mof_md.cif with H2O removed
153
               # Add charge into mof_md.cif
               # data = pacmof.get_charges_single_serial('mof_md.cif', create_cif=True) # run PACMOF for each cycle, output mof_md_charged.cif
154
155
               module_attach_charge_to_cif.attach_charge('mof_md.cif', charge_path) # output mof_md_charged.cif
               # generate restartfile for H2O if remove H2O == False
157
158
                if remove H20 == False:
                    module_adjust_h2o.separate_H2O('mof_H2O_md.cif', 'H2O_md.cif', N_mof_0)
159
160
                    if adjust H20 == "TIP4P":
                       module adjust h2o.rearrange H2O('H2O md.cif', 'H2O adjust.cif')
161
162
                        module_adjust_h2o.adjust_H2O_TIP4P('H2O_adjust.cif')
163
                        module_cif_restartfile.convert_H20_raspa_restartfile('H20_adjust.cif','restartfile_ini_H20')
164
                        module_cif_restartfile.convert_H2O_raspa_restartfile('H2O_md.cif','restartfile_ini_H2O')
                    subprocess.run('mkdir -p RestartInitial/System_0', shell=True, executable='/bin/bash')
166
                    subprocess.run(['cp', './restartfile_ini_H2O', './RestartInitial/System_0/restartfile'])
167
168
169
                subprocess.run(commands_gRASPA, shell=True, executable='/bin/bash')
```

Part 8. Output the H₂O loading results from GCMC to the output file 'workflow.out'. Then, covert the final snapshot of GCMC to the LAMMPS input file 'conf.lmp' for use in the next SR iteration. Continue this SR iteration until the specified N_cycle value set in the 'input' file is reached.

```
170
                # Output pressure and H2O loading
171
                subprocess.run('cat Output/System\_0\_*.data >> result', shell=True, executable='/bin/bash')
                H20_loading = float(subprocess.getoutput("grep -A 20 'LOADING: mol/kg' result | grep 'Overall' | tail -1 | awk '{print $3}' | sed 's/,//g'"))
173
                with open(os.path.join(direct, 'workflow.out'), 'a') as f:
174
                   f.write(f"{n} {H20_loading}\n")
175
                # Copy the last snapshot of GCMC to direct/conf.lmp
176
177
                os.chdir(f"\{direct\}/cycle\_\{n\}/2.gcmc/Movies/System\_0/")
178
                last\_snapshot = max((f \ for \ f \ in \ os.listdir('.') \ if \ f.startswith("result\_") \ and \ f.endswith(".data")), \ key=\\ lambda \ x: \ int(x[7:-5]), \ default="No \ files \ found")
179
                subprocess.run(['cp', last_snapshot, os.path.join(direct, 'mof_raspa.data')])
180
181
                subprocess.run(['sed', '-i', r's/\(TIP4P \|mof_md_charged\.cif \)//g', 'mof_raspa.data'])
182
                module_str_raspa_lmp.raspa_to_lmp('mof_raspa.data','conf.lmp', N_mof_0, type_to_element, hybrid_FF)
183
184
                # Check for convergence
185
                if n > 10:
186
                     with open(os.path.join(direct, 'workflow.out'), 'r') as f:
187
                         lines = f.readlines()
188
                         if \ abs(float(lines[-1].split()[1])-float(lines[-2].split()[1])) \ < \ 0.01:
189
190
            # After finishing all cycles
191
192
            print("Workflow complete!")
193
```

194