# PyAutoFEP user manual

trunk version

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## 1 Getting started

## 1.1 About PyAutoFEP

PyAutoFEP is an automation tool to prepare and analyze FEP calculations. It is written in Python3 and relies on rdkit library to work with molecules, networkx to represent perturbation maps, and alchemlyb to analyze FEP results. Currently, Gromacs is the only supported Molecular Dynamics (MD) code, but we plan to add others in a future release.

PyAutoFEP is divided into three modules: a perturbation map generator, a hybrid-topology and system builder, and an analysis script. It allows complete freedom regarding the choice of the  $\lambda$  values for Van der Waals and Coulomb interactions of states A and B. Also, enhanced sampling techniques Hamiltonian Replica Exchange (HREX), HREX with solute tempering (REST), and HREX with solute scaling (REST2) are supported. Overall, we aim to make PyAutoFEP as flexible as possible.

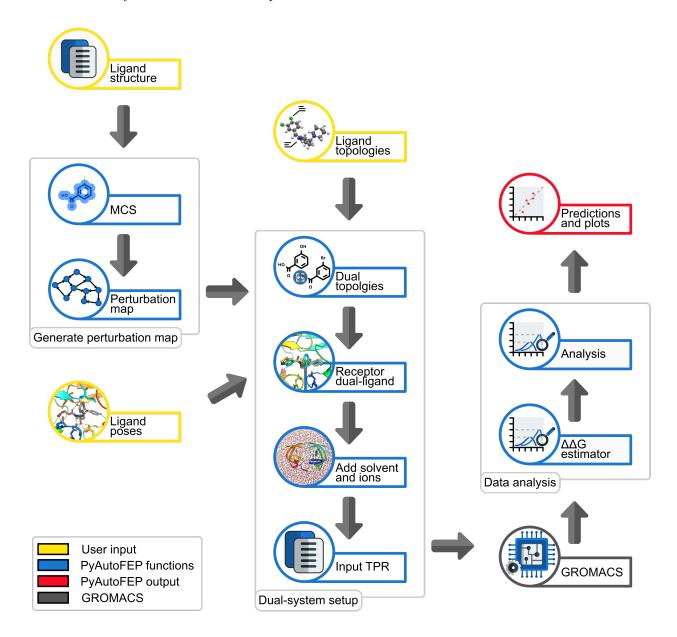


Figure 1: Overall workflow of PyAutoFEP.

PyAutoFEP is open source software and its source code is freely available at https://github.com/lmmpf/PyAutoFEP. Contributions are welcome. Please, report any bugs at https://github.com/luancarvalhomartins/PyAutoFEP/issues.

#### 1.1.1 Legal notice

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#### 1.2 Installation

#### 1.2.1 Requirements

- Common GNU programs: Bash, awk, tar
- Gromacs 2016 or newer
- Python 3.6+
- rdkit 2019.03+
- networkx 2.3
- alchemlyb 0.6.0 & pymbar 3.0.5 OR alchemlyb 0.3.0 & pymbar 3.0.3 (Because of pymbar issue #419)
- openbabel 2.4 or 3.X (sparsely used, mainly to load receptor files in **prepare\_perturbation\_map.py**.)

Optional. The following are not required to run basic calculations in PyAutoFEP but are needed for users to intend to use specific functions.

- matplotlib (to plot data in prepare perturbation map.py and analyze results.py)
- biopython (allows sequence alignment when reading initial pose data)
- mdanalysis (allows use of atom selection language in some contexts)
- pytest (required to run Python tests)

#### 1.3 General notes

PyAutoFEP is Linux-compatible and was not tested on Windows or macOS. All text files are supposed to use Unix line-endings (ie: \n), and paths are supposed to use Unix separator (/).

Across this manual, the following conventions are used.

Output message from PyAutoFEP: [INFO] This is an output message

Command line argument or configuration file option (they are equivalent, see below): argument

Valid value for an option: value

Script: run\_this.py

Implementation notes, relevant for Python users and using PyAutoFEP's functions as an API: This is not required to regular PyAutoFEP operation.

Reference to other sections of this document: subsection 1.3

#### 1.3.1 Configuration files and command-line arguments

All PyAutoFEP scripts accept a configuration file and command-line options. The exact same options can be supplied by either. The value resolution for the options is:

Defaults from internal configuration file  $\rightarrow$  User-supplied configuration file  $\rightarrow$  Command-line arguments

So, any option not present in the user configuration file neither in the command-line arguments will have the default value. If an option is present in both the user configuration file and in the arguments, the argument value will take precedence.

Configuration files follow ini format, read trough configurator (See: configuration). Lines starting with # or ; are comments. Every option must be inside a section, declared by [ and ], for instance, as [this\_section]. Options are read one per line in the format option = value An example of a valid ini file is the following:

```
# This is the configuration section for prepare dual topology.py (which is the only section in this file, but
the [section] is mandatory)
[ prepare_dual_topology ]
# Read ligands and topologies from this folder
input_ligands = lig_data
# Read the macromolecule structure from this file
structure = receptor data/5q17 processed.pdb
# This is the force field directory, it will be copied to each perturbation dir and used to prepare the
MD systems
extradirs = oplsaam.ff
# Options controlling the core-constrained superimposition
# First select the use of it instead of reading all ligand poses
pose loader = superimpose
# Use this pose as the reference for the superimposition
poses reference pose superimpose = receptor data/9mv.pdb
# Name of the output. This will be a self-extracting bash file
perturbations\_dir = tutorial
# Sets the path to GROMACS executable in the run node, uncomment and modify if needed.
# gmx_bin_run = /usr/local/bin/gromacs
# Options controlling the output, see manual for more info.
Uncomment as needed
# FEP legs are to be submitted to a slurm scheduler
output scripttype = slurm
# Run these commands at the beginning of the jog (useful to load modules, importing libs)
output runbefore = module load python3; module load cuda
# Fine-tune job resources
output resources = all cpus: 24
all\_gpus: 2
all_time: 24
# Use a python file instead of a binary during the collect step
output\_collecttype = python
```

On all scripts, a configuration file can be passed via —config argument. Note that you cannot use a config option in the configuration file itself. This is the only case where a command-line argument cannot be passed from a configuration file.

When parsing the arguments, **PyAutoFEP** infer from options or tries to types them. following formats will be readand converted when parsing data. PyAutoFEP uses eval() to parse arguments or options, so any format Python eval() can parse will be understood.

#### Datatype

#### Comments

## ${\bf Dictionary}^1$

A data structure storing key and related values. Keys must be unique. ":" are used to separate key and values and ";" or newlines can be used to separate key:value groups. A List value can be used using "," as a separator. The following formats are accepted:

- {"option a": "value1", "num\_option": 0.123, 2: "also valid", "list \_option": [0, 1, "b"]}
- option a: value1; num\_option: 0.123; 2: also valid; list\_option: 0, 1, b
- option a: value1 num option: 0.123 2: also valid list option: 0, 1, b

Some accepted keys types, eg: tuple, frozenset, can only be passed when the native Python3 formatting is used.

List

A data structure storing a sequence of elements. Any format can be stored. The following formats are accepted:

- ["native", "Python3", "formatting is always", True, "accepted"]
- one, 2, 3.0, 4.0, five and more stuff
- one two several spaces in one value

Currently, nested lists can only be passed using native Python3 format.

## String

A String is any stream for characters, including spaces. The String is the fallback type in PyAutoFEP, so if anything cannot be detected as another type, it will be a String. No special formatting is needed. Examples:

- my\_file\_name.dat
- name with spaces.txt
- some 123 thing

#### Integer

Regular integer. Note that using . in the formatting will force a float type, eg "1.0" is not the same as "1". Decimal numbers only, no "." or ",". Examples:

- 0
- 123
- -456
- 0856 (invalid)

## Float

A number containing a decimal part. Scientific notation is allowed. The number must have either a decimal part, separated by ".", or a scientific notation exponent, separated by and "e". Examples:

- 3.1416
- 6.02214e23
- 1.985875e-3
- 0.593
- 123.0
- -123.0

Table 1: General data types understood by PyAutoFEP

Datatype	Comments		
${\bf Boolean}^2$	A True/False value. The following keywords are accepted:		
	• True		
	• Yes		
	• On		
	• False		
	• No		
	• Off		

<sup>&</sup>lt;sup>1</sup> In most of the places where a dictionary is accepted, a text file containing the same any of the dict structures can also be used. Note that the third allowed format requires a line end between option lines.

All PyAutoFEP scripts accept the following set of global options/arguments:

Table 2: Global PyAutoFEP options accepted by all scripts

Option or argument	Accepted values	Comment	Default
${ m threads}$	Integer, $x \ge 0$	When possible, use this many threads. ${\bf 0}:$ use maximum available.	0
progress_file	File name	Use this progress file to save and load data during the run and between runs. See [1.5.3] for further reference.	Use a hidden file
mcs_type	graph or 3d	Select MCS algorithm. <b>graph</b> is suitable for molecules in which no sterocenters are inverted on perturbations. <b>3d</b> is a spatial-guided MCS, which works on perturbed stereocenters but may break rings. See <b>subsubsection 1.3.4</b> for further reference.	graph
configfile	File name	Read this configuration file. See <b>subsubsection 1.3.1</b> (ie: this very section) for further reference	Do not read a config file
plot	Boolean	Where possible, plot data using matplotlib.	0ff
no_checks	Boolean	Ignore all checks and try to go on.	Off
verbose	Integer or repetition	Controls the verbosity level. If used in a configuration file, please, supply an Integer level. If used as a command line argument, you can pass -v or -verbose multiple times, so that the verbosity level will be the number of -v and -verbose read from command line. See valid levels and their meaning in Table 3. Note that this option is incompatible with quiet.	0

 $<sup>^2</sup>$  Python3 will interpret 0, 0.0, None or an empty string, list or dict as False and anything else as True, but this can lead to problems. Using one of True, On, Yes, False, No, or Off is safer.

Table 2: Global PyAutoFEP options accepted by all scripts

Option or argument	Accepted values	Comment	Default
quiet	Boolean	Suppress all output, but error messages. Note that this option is incompatible with verbose.	Off

## 1.3.2 Output and troubleshooting

PyAutoFEP prints information about the execution to the console. How much is printed is controlled by **verbose** and **quiet** options. The following verbosity levels are available.

Table 3: Verbosity levels used in PyAutoFEP output

Level	What will be printed	Notes
-1	[ERROR]	Quiet level. Nothing, just critical errors (which are almost always fatal and will halt the execution)
0	DEFAULT [ERROR]	Default level. Formatted output, displaying general information about the run and critical errors.
1	[WARNING]  DEFAULT [ERROR]	All the above, plus warnings showing possible non-fatal problems found in the input files or during the execution. This is the recommended verbose level.
2	[INFO] [WARNING] DEFAULT [ERROR]	All the above, plus informational messages useful to identify problems during the execution.
3	[DEBUG] [INFO] [WARNING] DEFAULT [ERROR]	Debug level. Useful mostly for development purposes, will print lots of debug messages with deep details of the execution. Rdkit messages will also be printed.
4	OPENBABEL [DEBUG] [INFO] [WARNING] DEFAULT [ERROR]	Openbabel errors level. All of the above, plus turns on error logging from openbabel, which can be a LOT of messages. Only useful to inspect openbabel errors.

Messages are preceded by the following tags: [ERROR], [WARNING], [INFO], and [DEBUG]. Note that default output, rdkit, and openbabel messages are not preceded by tags.

When something does not work as expected or does not work at all, one may try the following steps to identify the problem.

Table 4: Suggested problem solving steps

Step	Comment	
Verify your input files	Make sure the files exists, formats are correct, and check for typos or incorrect line endings (if you are mixing OS)	
Rerun with a verbosity level <b>2</b> or <b>3</b> (see above)	The printed info can hint for problematic parsing of input files, misplaced options or other problems.	
Check the partial outputs	Sometimes the partial output files can help diagnose the error.	
Fill a bug report at GitHub	Sorry, you may have found a bug. Please, report to the issue tracker at GitHub so we can fix it.	

#### 1.3.3 Progress file

In order to safely save data between the runs and during each run, a progress file (a Python3 pickle file) will be used. The option **progress\_file** is used to supply a progress file to any script. By default, no progress file will be read, but a temporary, hidden progress file will be created and used during the execution of a script.

The progress file is a Python dictionary containing relevant info for the current script that can be later accessed to save time and to communicate between modules. In general, it is and a good idea to use a progress file. It can save your time by safely carrying data from the perturbation map generator to the hybrid topology builder to the analysis script. Also, some pre-computed data (eg: MCS, input molecules) will be stored, speeding up the next module or another run of the same module. Previously saved data is not lost, but rather incrementally saved inside the progress file.

In some situations, a progress file will contain data that is incompatible with a modified option. This will be the case when you switch **mcs\_type** option. When you do so, you have to consistently use the same progress file for either **mcs\_type** = **graph** or **mcs\_type** = **3d**. This also will be the case if you replace a molecule with another one with the same name. In this case, you will have to avoid using your old progress file.

## 1.3.4 MCS selection

PyAutoFEP implements two MCS selection algorithms: a graph-based MCS and a 3D-guided MCS, both relying on rdkit library functions. You can select between them using **mcs\_type**. Graph-based MCS (**mcs\_type** = **graph**) works in most cases and can handle rings smartly. This MCS algorithm will not break rings and will no match equal atoms with different valences. This is the default, and we recommend using it unless a perturbation is inverting a stereocenter.

3D-guided MCS (mcs\_type = 3d) is specially designed to be used when asymmetric centers are being inverted along the perturbation so that graph-based MCS would fail. 3D-guided MCS works by generating matching regions of the input molecules and using core-constrained flexible alignment to obtain conformations with maximum overlap. This procedure is done iteratively, expanding the matching region at each iteration. The algorithm can handle complex molecules, as carbohydrates and macrocycles.

## 2 Perturbation map generation (generate\_perturbation\_map.py)

## 2.1 Algorithms and perturbation maps

PyAutoFEP uses graphs to represent the perturbation maps so that maps are represented as connected, directed graphs, in which each node is a molecule and each edge is a perturbation. No loops are allowed (they would represent perturbing a molecule to itself, which is not supported). Currently, **generate\_perturbation\_map.py** does generate parallel edges (note: prepare\_dual\_topology.py does accepts parallel edges in the form  $A \rightarrow B$ ,  $B \rightarrow A$ , but these are not generated by **generate\_perturbation\_map.py**). Three map types are available in **generate\_perturbation\_map.py**: star, wheel, and optimal (Fig). Each map type is associated with an algorithm to generate correspondingly the graph. Note that MCS between the pairs will be calculated and stored in the progress file **subsubsection 1.3.3** to subsequent use.

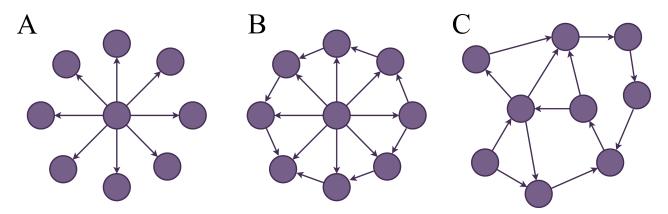


Figure 2: Three map types generated by **generate\_perturbation\_map.py**. (A) Star map, (B) Wheel map. (C) Optimal map.

A star map is a radial graph where all molecules are connected to a user-defined center molecule (**Figure 2**). You must provide one and only one center molecule using the option **map\_bias**. The edges will be simply created connecting the center molecules to all other molecules.

A wheel map is similar to the star map, but non-center molecules are connected to two others, so all molecules belong to a closed cycle, and hysteresis analysis can be performed (Figure 2). You must provide one and only one center molecule using the option map\_bias. generate\_perturbation\_map.py will, then, generate a star map exactly as described above. Then, the MCS between all non-center edges will be calculated. The number of perturbed atoms in a hypothetical perturbation between the edges will be calculated and used in the scoring function (See subsection 2.2). Finally, an And Colony Optimization algorithm will be used to find the best circular n-cycle graph connecting all outer nodes. Briefly, at each run a worker instance (ant) traverses the graph, choosing the edges to be used based on a probability given by the cost of the edge and the amount of deposited pheromone. When all nodes were visited, the ant finishes its run and deposits an amount of pheromone on all used edges. Probability pk(r,s) of choosing the edge  $r\rightarrow s$  when the ant is in node r is given by [3]:

$$p_k(r,s) = \begin{cases} \frac{\tau(r,s)^{\alpha} \cdot \eta(r,s)^{\beta}}{\sum\limits_{u \in J_k(r)} \tau(r,u)^{\alpha} \cdot \eta(r,u)^{\beta}} & \text{if } s \in J_k(r) \\ 0 & \text{otherwise} \end{cases}$$
(1)

Where  $\tau(r,s)$  is the bias towards choosing  $r \to s$  derived from the deposited pheromone,  $\eta(r,s)$  is the bias towards choosing  $r \to s$  derived from the cost of the perturbation,  $\alpha$  and  $\beta$  are parameters to balance cost and pheromone effect on the probability and, Jk(r) is the group of allowed edges from r.

The cost associated with a perturbation  $\eta(r, s)$  is given by [5]:

$$\eta(r,s) = 1 - e^{-\beta(N_A + N_B - 2N_C)} \tag{2}$$

Where  $\beta$  is an arbitrary value,  $N_A$  and  $N_B$  are the number of the atoms in the molecules A and B, respectively, and  $N_C$  is the number of atoms in the common core between A and B.

And the amount of pheromone effectively deposited by an ant run,  $\Delta \tau_{k,\text{eff}}$ , is given by:

$$\Delta \tilde{\tau}_{k} = \frac{\left(\frac{\sum_{solutions} Tot_{cost}(j)}{N_{solutions} - 1}\right)^{d_{e}}}{Tot_{cost}(solution_{i})^{d_{e}}}$$

$$\Delta \tau_{k,\text{eff}} = \begin{cases} max_{d}, & \text{if } \Delta \tilde{\tau}_{k} > max_{d} \\ \Delta \tilde{\tau}_{k}, & \text{otherwise} \end{cases}$$
(3)

Where  $\Delta \tau_k$  is the normalized amount of pheromone deposited,  $d_e$  is exponent for deposited pheromone (**pheromone\_exponent**), Totcost(j) is the total cost of the j-th solution,  $max_d$  is maximum amount of deposited pheromone (**map\_max\_pheromone\_deposited**).

Default parameters for the scoring function will yield a (possible global) best solution minimizing the number of perturbed atoms.

Optimal maps are connected graphs optimizing the number of perturbations, the number of perturbed atoms, and the distance between any pair in the graph (**Figure 2**). PyAutoFEP implementation was inspired by the Lead Optimization Mapper [5]. **generate\_perturbation\_map.py** uses a modified ACO algorithm to obtain a graph minimizing cost function. This modified ACO starts from a complete graph and, at each step, an edge  $r \to s$  is selected to be removed. The probability of choosing the edge  $r \to s$  is given by:

$$p_k(r,s) = \begin{cases} \frac{\tau(r,s)^{\alpha} \cdot \eta(r,s)^{\beta}}{\sum\limits_{(r \to s) \in \Omega*} \tau(r,u)^{\alpha} \cdot \eta(r,u)^{\beta}}, & \text{if } (r \to s) \in \Omega* \\ 0, & \text{otherwise} \end{cases}$$
(4)

Where  $\tau(r,s)$  is the bias towards choosing  $(r \to s)$  derived from the deposited pheromone,  $\eta(r,s)$  is the bias towards choosing  $(r \to s)$  derived from the cost of the perturbation,  $\alpha$  and  $\beta$  are parameters to balance cost and pheromone effect on probability, and  $\Omega$ \* is the group of allowed edges in the graph.

Each step, when an edge is removed,  $\Omega*$  is updated with the available edges. If the removal of an edge would yield a graph with less than **optimal\_min\_edges\_per\_node** edges in any node, that edge is not removed. If **optimal\_min\_edges\_per\_node** is greater than or equal to **1**, a connected graph will be generated. If **optimal\_min\_edges\_per\_node** is greater than or equal to **2**, a connected graph with cycle closures will be generated.

The deposited pheromone equation (**Equation 3**) is equal to the one used on wheel maps. User can freely define all parameters of the scoring function **subsection 2.2**, and graphs with or without closed cycles can be generated.

ACO implementation is parallelized implementing the algorithm described in [6]. However an arbitrary number of ants can be used to update the pheromone matrix (setting map\_elitism). The number of parallel colonies (n\_threads) and the number of runs before each communication step (map\_communication\_frequency) can also be freely set. Be careful about the balance between these values and the number of optimization cycles (map\_runs). All ants will count towards map\_runs, so using too few runs with a large number of parallel colonies (n\_threads) and a large communication step (map\_communication\_frequency), means the pheromone matrix will be updated too few times and the cooperative effect will not be relevant. The automatic value for map\_runs is, for instance, 20\*n\_threads\*map\_communication\_frequency.

**generate\_perturbation\_map.py** can complete the few thousand optimization cycles (**map\_runs**) required to generate a map with 20-30 nodes in under a minute on desktop hardware. Alternatively, the user can input custom maps to **prepare\_dual\_topology.py** without using the automated map generation at all.

## 2.2 Scoring function

Total cost of a solution for the perturbation map,  $Tot_{cost}$  in **Equation 5**, is given by:

$$L_{cost} = \sum_{node_i} \sum_{node_j} (d_{ij})^{l_e}$$

$$D_{cost} = e_m \sum_{node_i} (f_{deg}(node_i) - c_d)^{e_p}$$

$$P_{cost} = p_m \sum_{edge_i} (f_{cost}(edge_i))^{p_e}$$

$$Tot_{cost} = L_{cost} + D_{cost} + P_{cost}$$

$$(5)$$

Where  $L_{cost}$  is the length cost,  $d_{ij}$  is the distance between nodes i and j,  $l_e$  is length cost exponent (**optimal\_length\_exponent**),  $D_{cost}$  is the degree cost,  $f_{deg}(node_i)$  is the degree of node i (ie: the number of edges connected to node i),  $c_d$  is the degree target constant (**optimal\_degree\_target**),  $e_m$  is the degree cost multiplier (**optimal\_degree\_exponent**),  $P_{cost}$  is the perturbation cost,  $p_m$  is the multiplier (**optimal\_perturbation\_multiplier**),  $f_{cost}(edge_i)$  is the cost of edge i (default: the number of atoms perturbed during the correspondingly perturbation), and  $p_e$  is perturbation exponent (**optimal\_perturbation\_exponent**). On classic ACO runs to generate wheel maps,  $L_{cost}$  and  $D_{cost}$  are set to **0.0**, and  $p_m$  and  $p_e$  are set to **1.0**. On modified ACO runs to generate optimal maps, all parameters can be freely chosen.

## 2.3 Script options

**generate\_perturbation\_map.py** accepts the following options or arguments, besides the globals (See Table 2).

Table 5: Options used by generate perturbation map.py

Option or argument	Accepted values	Comment	Default
input	Valid input files	Molecules to be used to generate perturbation map	
use_hs	Boolean	Take hydrogens in account when scoring perturbations.	Off
custom_mcs	SMARTS string or dictionary	Use this/these custom core instead of calculating MCS between pairs. If a single SMARTS is provided, it will be used for all pairs. If a dictionary is provided, only pairs present in the dictionary will use the supplied custom core and for all other pairs, the MCS will be calculated. The dictionary, if used, must be in format {("mol_name_a", "mol_name_b"): "SMARTS"} or "mol_name_a-mol_name_b": "SMARTS" (or other equivalent formats resulting in the same data structure. See subsection 1.3).	
map_type	star, wheel or optimal	Select type of map to be generated.	optimal

Table 5: Options used by **generate\_perturbation\_map.py** 

Option or argument	Accepted values	Comment	Default
map_runs	Integer	Relevant for wheel and optimal maps. Run this many ants in ACO or modified ACO algorithm. Use -1 to select the default value, 20*n_threads*map _communication_frequency.	-1
map _communicati _frequency	Integer on	Relevant for wheel and optimal maps. Run this many rounds of parallel Ant Colonies before selecting the best ants and synchronizing the pheromone matrix.	20
map_bias	Molecule name	For star and wheel maps, this molecule will be the center molecule. For these maps, you must supply one, and only one, molecule to be the center. For optimal maps, the map will be biased toward this molecule or these molecules. In this case, no molecule, or one or more molecules can be supplied.	
map_alpha	Float	Relevant for wheel and optimal maps. Pheromone biasing exponent. Controls the effect of the pheromone on the desirability of an edge.	1.5
map_beta	Float	Relevant for wheel and optimal maps. Perturbation cost biasing exponent. Controls the effect of the perturbation cost on the desirability of an edge.	1.0
map _pheromone _intensity	Float, <b>x</b> ≥ <b>0</b>	Relevant for wheel and optimal maps. The intensity of deposited pheromone. Setting to 0 will disable pheromone, effectively defeating the purpose of the algorithm.	0.1
map _evaporating _rate	Float	Relevant for wheel and optimal maps. How fast the pheromone evaporates. When communicating, pheromone on all edges will be evaporated based on map_evaporating_rate	0.3
map_min _desirability	Float, <b>x</b> ≥ <b>0</b>	Relevant for wheel and optimal maps. Minimal desirability of an edge. Larger values may lead to slower convergence, but more sampling.	0.1
map_max _pheromone _deposited	<i>Float</i> , <b>x&gt;0</b> or <b>x=-1</b>	Relevant for wheel and optimal maps. Caps the amount of deposited pheromone to this value.	-1

Table 5: Options used by **generate\_perturbation\_map.py** 

Option or argument	Accepted values	Comment	Default
map_elitism		Relevant for wheel and optimal maps. Use this many best solutions from each parallel colony to update pheromone matrix.	
	$x \leq 1.0$	• If map_elitism is a Float and 0 < map _elitism <1, it will be taken as a ratio and map_elitism*map_communication _frequency best solutions will be used.	
		• If map_elitism ≥ 1, map_elitism best solutions will be used.	
		• If map_elitism = -1, all map _communication_frequency solutions will be used. See subsection 2.1	
optimal_max _path	Integer, $x \geq 1$	Relevant for optimal maps. Distance between any two nodes on the graph must be at most this value.	Off
optimal _perturbation _multiplier	Float	Relevant for optimal maps. Multiplier for perturbation score. Setting this to <b>0</b> will nullify perturbation cost contribution to total score.	1.0
optimal _perturbation _exponent	Float	Relevant for optimal maps. Exponent for perturbation score.	Off
optimal degree target	Integer	Degree target. If set, map will be biased towards this much edges per node. Setting this to None (the default) will use optimal_min_edges_per_node as target.	None
optimal degree target	Float	Multiplier for degree cost. Set this to 0 to disable degree cost.	0
optimal degree exponent	Float	Exponent for degree cost.	1.5
optimal_min _edges_per _node	Integer	Each molecule must be part of at least this many perturbations. No solution violating this will be generated. Setting this to a value lower than 1 may lead to a disconnected map. Setting this value greater than 1 will generate a map with cycle closures.	1
optimal_min _edge_beta	Float	Extra edge beta parameter. Larger values increase the likelihood of more edges than the minimum	1

amount.

Table 5: Options used by **generate\_perturbation\_map.py** 

Option or argument	Accepted values	Comment	Default
optimal _unbound _runs	<i>Integer</i> , <b>x&gt;0</b> or <b>x=-1</b>	Relevant for optimal maps only. The number of runs when all edges can be removed1: edges can be removed on all runs. When an edge reaches a threshold (optimal_permanent_edge_threshold), it will not be selected by the ant either to be removed, becoming static. It will speed up the algorithm, at expense of an increased probability of reduced sampling.	-1
optimalpermanentedgethreshold	Float, <b>x&gt;0</b>	Relevant for optimal maps only. Edges with this much pheromone become static. <b>-1</b> : edges never become static. Setting this will speed up the execution but may reduce sampling.	-1

# 3 Dual topology generation and system building (prepare\_dual \_perturbation.py)

## 3.1 General workflow

Figure Figure 3 describes the workflow of prepare\_dual\_topology.py. First, the script reads the input molecules and starting poses. The input molecules will be aligned to the poses so that atom ordering, missing hydrogens, and alternative coordinates will be corrected. Then, for each perturbation, a hybrid topology will be prepared, by reading the topology of both molecules and combining them into a new one. If you selected automatic system building, Gromacs tools will be used to prepare a topology for the receptor, and solvate and add ions to the complex. If you supplied a pre-solvated system, the ligands will be inserted in the binding site according to the starting poses read. In both cases, water legs will be automatically generated. Finally, the directories and files required to equilibrate and run the perturbations will be created, along with scripts to automate the run.

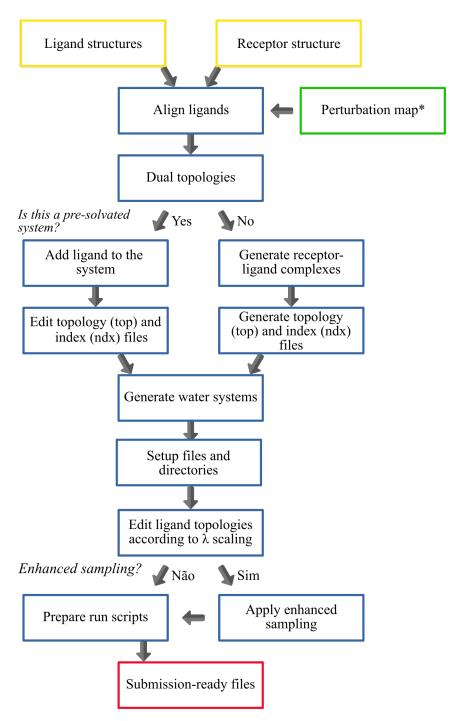


Figure 3: Detailed workflow of prepare\_dual\_perturbation.py. Yellow boxes are user inputs, blue boxes are prepare\_dual\_perturbation.py internals, and the red boxes is the output. \*: the perturbation map (green box) is a input for prepare\_dual\_perturbation.py, but can be automatically generated by generate \_perturbation\_map.py

## 3.2 Starting poses readers

prepare\_dual\_topology.py requires ligand starting poses (from poses\_input) to generate the ligand-receptor complexes and prepare a system to be run. The ligand poses can be read from MOL, MOL2, and PDB formats. (Note that, because PDB format is limited in the description of bonding and valence, assumptions will be made. Users are advised to check the resulting poses.). The pose can, then, be aligned to a reference receptor poses\_reference\_structure via the receptor's  $C\alpha$ . If the protein sequence of the reference structure and the pose structure differs, the sequences will be aligned prior to 3D alignment. The following readers are available.

#### 3.2.1 PDB reader

PDB (pose\_loader = pdb) reader will read one PDB file for each ligand. This file must contain a receptor and the ligand (and possibly other species). Openbabel is used to process the file. This reader is tolerant to some problems in the PDB file, (eg: missing side chains, non-standard atom naming, missing connect info), but alignment will fail for files with multiple occupancies. The starting pose for each ligand will be the PDB file pose, after alignment to the reference structure. Therefore, for this reader, poses\_reference\_structure is not used.

#### 3.2.2 AutoDock4 reader and vina reader

Autodock4 reader (pose\_loader = autodock4) and Vina/QuickVina/Vina-GPU reader (pose\_loader = vina) can parse autodock4 .dlg files and AutoDock4/Vina .pdbqt files and select clusters from it. It will automatically take care of atom renaming and reordering and can read ligands with or without merged hydrogens. This loader requires the receptor PDBQT as input to align to the reference structure. This loader will try to read one pose per ligand and the starting pose for each ligand will be the docking pose, after alignment to the reference structure (poses\_reference\_structure). Note that PDBQT containing multiple molecules (as generated by Vina 1.2) are not yet supported.

#### 3.2.3 Generic reader

The generic pose reader (pose\_loader = generic) reader will read one small molecule file for each ligand. mol2 and mol files are read through RDKit and other formats are transparently read and converted using Openbabel. This file must contain only the ligand - no receptor will be read from it. The starting pose for each ligand will be the read pose.

#### 3.2.4 Superimpose reader

The core-constrained ligand superimposer (pose\_loader = superimpose) is a simple routine to align ligands to a reference. The superimposer will read a pose for a reference ligand (poses\_reference\_pose\_superimpose) and all ligands will be superimposed to the reference using flexible alignment to the MCS. You can use mcs\_custom\_mcs to force a custom core instead of automatic MCS calculation. Note that poses\_input is not used, as input molecules are read from input\_ligands and/or from the progress file (See subsubsection 1.3.3).

#### 3.3 Topology and force-fields

After preparing the poses for all ligands, <code>prepare\_dual\_topology.py</code> will read structures topologies for these molecules, optionally parameterizing molecules (using external tools) when topologies are missing (<code>subsubsection 3.3.1</code>). PyAutoFEP is able to read topologies from common tools as AcPYPE, CGenFF, and LigParGen. Receptor topologies can be read or generated using <code>gmx pdb2gmx</code> (See <code>subsection 3.4</code> and <code>subsection 3.5</code>).

Table 6: Relevant notes on generating small molecules parameters

Parametrization tool	Accepted file formats	Comments
AcPYPE GitHub repository	.top, .itp, .atp	PyAutoFEP can read GROMACS-compatible topologies generated by AcPYPE. AcPYPE can also be used to convert AMBER-compatible topologies to a GROMACS-compatible format, which can be read by PyAutoFEP. The <b>acpype</b> executable can be used automatically (See <b>subsubsection 3.3.1</b> ).
CGenFF webserver (cgenff.umaryland.edu)	.str, .ff	When CGenFF webserver is used, make sure to check "Include parameters that are already in CGenFF". Then, the input _ligands must include both the .str file and a GROMACS-compatible CHARMM force field directory (.ff). The force field directory will be used to read parameters. The input molecule should be the .mol2 output from the CGenFF, specially when lone pairs are.  Alternatively, the .str files can be manually converted using cgenff_charmm2gmx_py3.py script in Tools. In this case, -include_atomtypes must be used.  cgenff_charmm2gmx_py3.py was adapted from a script written by Prabhu Raman and Justin Lemkul, see here
LigParGen webserver zarbi.chem.yale.edu/ligpar	.top	LigParGen GROMACS-compatible topologies are supported. Note that the output <b>.gro</b> should not be used as input, rather the input molecule should be the input <b>.mol2</b> file used in Lig-ParGen.

Both structures and topologies can be supplied using <code>input\_ligands</code>. A structure file describes the 3D coordinates of the molecule and its connectivity. Ideally, a MOL2, MOL or SDF file should be used. Alternatively, PDB or PDBQT files may be used. Because these formats lack bond order information, reading it requires some guesswork, so using it is discouraged.

PDBQT files are read using the following logic. Initially, **meeko** is used to read the file PDBQT. If it fails either because **meeko** is not available or because the input files were not created with **meeko**, files are converted to PDB by prunining PDBQT format-specific lines and read as PDB. In case a line in REMARK contain a SMILES keyword, the SMILES will be read and used to assign bonds and bond orders to the molecule (Note: explict hydrogens will be removed and re-added in the process). In case there is no SMILES REMARK, OpenBabel will be used to read the input. PDBQT files are not directly read using OpenBabel API **pdbqt** format because it generates broken molecules (see issue #2470). OpenBabel will be used to read the PDB-version of the molecule, converted as mentioned above. In this case, non-polar hydrogens will be added to the molecule, if missing. Total charge will be checked against the same of the PDBQT partial charges (q column).

PDB files are read in a similar way as PDBQT. If a SMILES REMARK is found, file will be read using **RDKit** and the SMILES will be used to assign bond orders to the molecule. In case such line is absent, the PDB will be read using **OpenBabel** and hydrogens will be added.

Molecules read as **pybel.Molecule** (or **openbabel.OBMol**) will be converted to **RDKit.Chem.Mol** using **mol\_util.obmol\_to\_rwmol**, which aims to preserve coordinates, atoms and bond information, and generic data associated to the molecule. Dummy atoms (which names are either XX of LP and masses are 0, or, in case there are no atom name, which masses are 0) will be converted to **rdkit.Chem.rdchem.QueryAtom**. Bonds between dummy atoms and regular atoms will be converted to **rdkit.Chem.BondType.UNSPECIFIED**. **RDKit** molecule name (**mol.GetProp("\_Name")**) will be read using **openbabel.OBMol.GetTitle**.

A topology file is a correspondingly GROMACS-compatible .top, .itp, or .atp (or any extension, actually) file. .str CHARMM-compatible topology files will be automatically converted to GROMACS-compatible topologies using a modified version of cgenff\_charmm2gmx.py. Both structures and topologies can be supplied using input\_ligands. A structure file is a mol, mol2, or PDB file describing the 3D coordinates of the molecule and the connectivity. Data can be passed to input\_ligands in the following ways. Missing files will be handled

smartly (see below).

- A file containing ligands names, structure, and topology files. One name, followed by structure and topology, per line. Structure and topology will be guessed from the extension.
- A list of lists containing ligands names, structure, and topology files. One name, followed by structure and topology, per subitem. Structure and topology will be guessed from the extension.
- A dictionary containing ligands names, structure, and topology files. The dictionary key must be a ligand name and the value must be a list of structure and topology files. The order of structure and topology will be guessed. Eg: "Benzene: benzene.mol2 benz\_atoms.atp benz.top".See subsection 1.3 for formatting guide.
- Path to a directory containing files. Files named ligand\_name.ext will be read. All files with the same name (ignoring the extension) will be added to a ligand with that name (Eg: benz.top, bezn.mol2, and benz.atp would be added to a ligand named benz). Structure and topology will be guessed from the extension.
- Path to a directory containing directories. A ligand will be created for each directory inside input \_\_ligands and all files inside it will be added to that ligand. The name of the ligand will be the name of the subdirectory. Structure and topology will be guessed from the extension. Eg: benz/file.mol2 and benz/top.top would be added to a benz ligand.

A pickle file. A dictionary (as described above) will be read from it.

Molecules will also be read from the progress file, if present. If data for a molecule is found in both the progress file and in <code>input\_ligands</code>, the latter will be used. Missing fields from <code>input\_ligands</code> will be read from the progress file, if present. So you can, for instance, supply the molecule structures using the progress file (this is the default if you are using a progress file created by <code>generate\_perturbation\_map.py</code>) and pass only the topologies using <code>input\_ligands</code>.

After the **prepare\_dual\_topologies.py** reads topologies and structures, it will merge the topologies for each pair in the perturbation map (**perturbation\_map** or read from progress file, see also **subsection 2.1**). The topology file loader is rather flexible and should be able to read and merge most Gromacs-compatible topologies. The MCS (See **subsubsection 1.3.4**) will be used to determine the common-core between start and end states. Then, a hybrid topology will be generated, representing the perturbation. The topology reader does have some limitations.

- Online parameters on included files. Currently, prepare\_dual\_topologies.py will not read #include from files, so if you have parameter files to your topology, you will have to pass it manually using input \_ligands or the progress file.
- $\bullet$  *N-body virtual sites.* Currently, N-body virtual sites are not supported. We expect to add it in a future version.
- Virtual site positioning. During manipulations of the structures, several force calculations and minimizations are performed. The small molecule force field employed, United Force Field, lacks a virtual site term. So a simple position restraint to the closest atom of the virtual site will be added to the molecule's force field. This will ensure that the optimized geometry at least makes sense. The actual positioning of the virtual site will not be precise, however. Note that this will likely be corrected during minimization in Gromacs, but the user is advised to make sure their structures are correct.

Along with the perturbation, atom charges and Van der Waals parameters will be scaled according to lambda \_input. PyAutoFEP implements the following equation to construct the Hamiltonian of the perturbed state.

$$\mathcal{H}_{\lambda} = \lambda_{VdW,A} \mathcal{H}_{VdW,A} + \lambda_{VdW,B} \mathcal{H}_{VdW,B} + \lambda_{Coul,A} \mathcal{H}_{Coul,A} + \lambda_{Coul,B} \mathcal{H}_{Coul,B} + \mathcal{H}_{const}$$
(6)

Where  $\mathcal{H}_{\lambda}$  is the total Hamiltonian of the  $\lambda$  state,  $\mathcal{H}_{term,s}$  is the Hamiltonian from the contribution of the term term over atoms of state s (either A or B),  $\lambda_{term,s}$  is scaling factor for the term term over atoms of state s, and  $\mathcal{H}_{const}$  is the Hamiltonian of the unperturbed region.

From **Equation 6** is clear that the contribution of Van der Waals and Coulomb terms for states A and B are not coupled and can be varied arbitrarily. Note that although  $\lambda$  should be a number such as  $\lambda \in [0.0, 1.0]$ , even this restriction can be lifted by running with **no\_checks**. To allow the equation **Equation 6** to be used, PyAutoFEP does not use Gromacs FE code, but rather directly generate several tpr run files for each state (See **Figure 1**). Also, from **Equation 6**, bonded terms and masses are not currently perturbed.

#### 3.3.1 Automatic ligand parameterization

Ligand parameterization using external tools can be automatically done. Currently, AcPYPE is the only external tool supported. See subsection 3.8 for relevant options. The external tool is run in parallel (using threads processes, see Table 2) in a temporary directory and the resulting files are then copied back (to parameterize \_output\_dir) and read. Note that existing files in the output directory will not be overwritten, so that parameter files present in the output directory will be used.

AcPYPE Small molecule ligand parameterization is done by creating an MOL file representing the molecule using RDKit, which is then supplied to AcPYPE executable (see <a href="mailto:parameterize\_bin">parameterize\_bin</a>). The point charge model (<a href="mailto:parameterize\_charge">parameterize\_charge</a>) can be selected. Resulting parameters files will be called <a href="mailto:ligandname.itp">ligandname.itp</a> and <a href="mailto:ligandname.itp">ligandname.itp</a> and <a href="mailto:ligandname.itp">ligandname.itp</a> and <a href="mailto:ligandname.itp">ligandname.itp</a> and <a href="mailto:ligandname.itp">ligandname.itp</a>.

The external executable will be run using **multiprocessing.pool.Pool.starmap**. A stale in the external process will stale **prepare\_dual\_topology.py**. This can be avoided by setting **parameterize\_advanced\_options timeout** to some value.

## 3.4 Automated system builder

The automated system builder is a very simple function which uses **gmx pdb2gmx**, **gmx editconf**, **gmx solvate**, and **gmx genion** under the hood. It automates the building of a simple receptor-ligand system and will fail for complex cases (eg: membrane systems, systems with vacuum regions, solvent mixtures, and systems with nucleic acids on cofactors). Currently, the PDB must not contain other atoms than the protein's. In such cases, please, use the system loader (**subsection 3.5**). Automated system building is the default running mode and will be used unless **pre\_solvated** is used. Options relevant to the system builder are grouped under the prefix **buildsys\_\***. The following steps will be executed by the system builder.

- gmx pdb2gmx. Run to prepare the receptor topology and a corresponding structure file. Force fields from Gromacs' default library directory can be selected using buildsys\_forcefield. Custom force fields can be used by providing a force field directory to extradirs and using buildsys\_forcefield=1 (the default).
- Add small molecule to the system, according to the staring pose read (subsection 3.2). Both the structure and topology will be edited. Ligand parameters will be added to the system topology and position restraints to the protein and to the ligand will be generated.
- gmx editconf. A simulation box will be generated. Size can be set via buildsys\_watershell options.
- gmx solvate. The system will be solvated to fill the box size from the previous item. PyAutoFEP will try to guess the water model. buildsys\_water option can be used to pass the -cs option to gmx solvate, but be aware that non-water solvation is not currently supported.
- gmx genion. Counterions will be added to the system. The default is to neutralize the system, but an ionic concentration can be passed with buildsys\_ionconcentration. Cationic and anionic species can be given with buildsys\_pname and buildsys\_nname, respectively.
- A index file will be generated. Whether it will be done using **gmx genion** depends on **selection\_method**. You can supply custom index groups with **index\_string**.

## 3.5 System loader

As an alternative to system building, a fully prepared system, and topology can be read. Currently, this is required for simulating systems containing a membrane and/or cofactors and using an equilibrated system as the starting point to the FEP.

The system structure will be read from a PDB file with the option **structure**. Header (including **CRYST1**) and atom positions (**ATOM** and **HETATM**) will be read. Note that a **CRYST1** line is required by GROMACS to set up the simulation box. Only a single model can be read from the file. The protein/receptor has to be the first entry.

The topology file will be read (option **topology**) and edited to add the ligand and to reflect (possible) changes in the number of waters and ions. **#include** directives will not be followed, so your [system] must be described in this file. You can omit the topology file by running with **no\_checks**, but this will require you to manually edit/generate the topology afterward.

A GROMACS-compatible index file (.ndx) can be optionally read (index) so that the protein atoms will be read from it. A group called Protein (case-sensitive) is expected on the index file. If such file is not provided, **gmx makendx** will be used to guess the groups present in the **structure** file.

After all the files are read, the ligand will be added to the system immediately after the protein, according to the read pose (subsection 3.2). Water molecules clashing with the ligand will be removed. The option pre \_solvated\_radius controls the cutoff for this removal. The topology file topology will be updated to reflect the changes.

## 3.6 Solvent leg system builder

Regardless of using the Automated system builder (subsection 3.4) or the System loader (subsection 3.5), a system containing the ligand in solution will be built to run the solvent leg of the FEP. The following steps will be run.

- A PDB containing only the ligand will be prepared.
- gmx editconf. A simulation box will be generated using the size given via buildsys\_watershell.
- gmx solvate. The system will be solvated to fill the box size from the previous item. PyAutoFEP will try to guess the water model. buildsys\_water option can be used to pass the -cs option to gmx solvate, but be aware that non-water solvation is not currently supported.
- gmx genion. Counterions will be added to the system to neutralize the system only. Cationic and anionic species can be given with buildsys\_pname and buildsys\_nname, respectively.
- A index file will automatically be generated.

#### 3.7 Output options

The final output of **prepare\_dual\_topologies.py** will be ready-to-run GROMACS input files along with directories and scripts to simplify the submission. The following general directory structure will be used:

[base\_directory] Root directory for this FEP series, set using perturbations\_dir

[ligand1-ligand2] Data for the perturbation ligand1→ligand2

[protein] Data for the complex leg of ligand1→ligand2 FEP.

[build\_system\_hhmmss\_ddmmyyyy] Directory containing files used during the building of the system used to run the complex leg

... Log files, intermediate topologies, and PDB, GROMACS outputs

[lambda0] Minimization and equilibration files for  $\lambda=0$  window. Actual directories will vary depending on the minimization and equilibration scheme for complex leg (complex\_mdp or template\_mdp). Furthermore, files supplied in extrafiles and directories given in extradirs will be copied to this dir.

 $[\mathbf{build\_system\_} hhmmss\_ddmmyyyy]$  Symlink to this directory on parent folder

[md] MDP files that will be used to generate TPR files for the FEP production run. After the minimization and equilibration, a copy of these very TPR files will be placed here.

[min01] Data for first minimization step, name may vary

[min02] Data for second minimization step, name may vary

[nve] Data for NVE equilibration step, name may vary

[nvt] Data for NVT equilibration step, name may vary

[npt] Data for NPT equilibration step, name may vary

**FullSystem.pdb** Symlink to the PDB structure file in the parent directory, name may vary as given by **structure**.

**SystemFull.top** This may be either a symlink to the topology in the parent directory or a complete topology file. The former option is the default when using REST or REST2. The name will be given by **topology** 

index.ndx Symlink to index file in the parent directory, name given by index

**ligand.atp** Ligand atom type data for  $\lambda = 0$ 

**ligand.itp** Ligand topology for  $\lambda = 0$ 

posre\_\*.itp Symlinks to position restraint files in the parent directory

[lambda1] Minimization and equilibration files for  $\lambda = 1$  window

[...]

[md] Directory containing the data for the production run of the ligand1→ligand2, complex leg [analysis] Data generated during the analysis step

[lambda0] Output files fo the analysis of the  $\lambda = 0$  production MD. XVG files for the ligand and protein RMSD, RMSF, SASA, and center of mass distance.

[lambda1] Analysis data for  $\lambda = 1$ 

...

[lambda0] Data generated during the production run for  $\lambda = 0$ 

[lambda1] Data generated during the production run for  $\lambda = 1$ 

...

[rerun] Data generated during the rerun step

lambdaX.xvg Pressure and volume per frame from original MD

rerun\_structX\_coordY.edr GROMACS energy file from the rerun using coordinates from  $\lambda = X$  window and Hamiltonian from  $\lambda = Y$  window

 $rerun\_structX\_coordY.xvg$  Potential energy per frame from the rerun using coordinates from  $\lambda = X$  window and Hamiltonian from  $\lambda = Y$  window

unk matrix.pkl Reduced potential matrix extracted from the EDR files.

**FullSystem.pdb** PDB file for the starting positions for the complex leg system, name may vary as given by **structure** 

index.ndx GROMACS-compatible index file, will containing autogenerated groups and groups
from index\_string, name given by index

**SystemFull.top** GROMACS-compatible topology file for the full system, name given by **topology**. This file will only be used if the topology file inside each lambda dir is a symlink, ie, when no REST or REST2 is used.

posre\_\*.itp Position restraint files for each macromolecule segment in the system [water] Data for the solvent leg of ligand1→ligand2 FEP.

[...] (Same directories as the complex leg)

runall\_ligand1-ligand2\_protein.sh Script to run the complex leg of the perturbation.

runall\_ligand1-ligand2\_water.sh Script to run the solvent leg of the perturbation.

[ligand2-ligand3] Data for the perturbation ligand2→ligand3. The name will vary.

[ligand3-ligand4] Data for the perturbation ligand3→ligand4. Name will vary.

[...]

pack.sh A script used to compress data after the execution all FEP calculations.runall.sh A script containing all the or submission commands for all perturbations.progress\_data.pkl Progress file for the project, used during analysis.

By default, prepare\_dual\_topologies.py will generate a self-extracting bash script using tar. Alternatively, output\_packing can be passed to select a uncompressed directory (output\_packing=dir) or a regular tgz file (output\_packing=tgz). After all calculations are done, pack.py will be run to create a compressed tgz file, base\_directory.tgz (name given by perturbations\_dir). This file will contain [analysis] and [rerun] directories, the log and a xtc file, for all perturbations. Note that, by default, this xtc file will be PBC-corrected and centered using gmx trjconv, as well as subsampled in frames.

By default (output\_scripttype=bash), runall.sh will be a regular bash script to sequentially minimize, equilibrate, run and rerun MD, then run analysis (Figure 1). Alternatively, runall.sh can be a submission script for PBS/Torque (output\_scripttype=pbs) or Slurm (output\_scripttype=slurm), in which case each complex and water leg will be submitted as a single job to the scheduler, and a last, packing job will be submitted depending on the completion of all legs. Using output\_submit\_args will add command line arguments to the submission command. output\_resources can be used to fine tune the submission of run jobs (using all prefix) and the pack job (using pack prefix). output\_resources will read a dictionary in the following form: "prefix\_resource:value;prefix\_resource:value". Currently, four resources will be recognized:

Table 7: Options for fine tuning the resource requirements of jobs submitted by the run script

Resource	Description	PBS/SLURM options	Default value for pertur- bation jobs	Default value for pack jobs
nodes	How many nodes to be used for each job	#SBATCH –nodes #PBS -l nodes	1	1
cpu	How many CPU to be used in each node	#SBATCH –ntasks-per-node #PBS -l ppn	12	1
gpu	How many GPU to be used in each node	#SBATCH –gres:gpu #PBS -l gpus	1	0
time	Maximum job runtime, in hours. Make sure to use a integer value, including - or : may lead to un- expected results		24	1

Options output\_runbefore and output\_runafter can be used to provide commands to be executed at the beginning of the run script and at its end, so before and after the actual GROMACS and analysis commands. This can be useful to load required modules on the run node (output\_runbefore) and to perform cleaning/logging actions (output\_runafter). output\_runbefore can also be used to modify the PATH so that commands (eg, parallel) can be found.

Finally, output\_scripttype accepts any string value, so that will be used as a submission (or run) command. Using a custom command requires output\_template pointing to a file that will be used as the header for the submission script. No substitutions will be performed on this file. Using output\_scripttype and output \_template is useful to prepare submission scripts to other schedulers than PBS or SLURM.

Regardless of which **output\_scripttype** is used, the same steps will be executed by the run script **runall\_ligandX-ligandY\_protein.sh** or **runall\_ligandX-ligandY\_water.sh**. The single exception is analysis, which will only be run for the complex leg.

Table 8: Steps executed during FEP run in run node

Step	Description	Parallel execution
Minimization	The specific minimization jobs will vary, depending on <b>complex_mdp</b> and <b>water_mdp</b> . By default, three minimization steps will be run on the complex leg (min01, min02, and min03) and two on the water leg (min01 and min02). The first one, run only in the complex leg, will minimize the solvent while restraining the ligand and the protein. The second and third will minimize the while system using emtol=1000.0, then emtol=100.0 kJ/mol*nm.	

Table 8: Steps executed during FEP run in run node

Step	Description	Parallel execution
Equilibration	The specific equilibration jobs will vary, depending on <b>complex_mdp</b> and <b>water_mdp</b> . By default, three equilibration steps will be run both on the complex leg and on the water leg (NVE, NVT, and NPT). First, a 200 ps NVE with protein and ligand heavy atoms restrained, or no restraints for the water leg. Then, a unrestrained 200 ps NVT equilibration using a velocity rescaling thermostat will be run. Finally, a 200 ps NPT equilibration using a Parrinello-Rahman isotropic pressure coupling, and no restraints will be used.	No, each $\lambda$ window will be equilibrated on its own.
Run	All $\lambda$ windows will be executed in parallel using GROMACS <b>mpirun gmx mdrun -multidir</b> . All available CPU and GPU, as detected by gmx, will be used and one MPI process per $\lambda$ window will be used. In case of continuations, if HREX is used, all the $\lambda$ windows must be synchronized on the same frame, otherwise, GROMACS will die with errors.	Yes, complete parallelization using GROMACS code -multidir
Rerun	Each trajectory obtained using different $\lambda$ windows will be reevaluated using all Hamiltonians for all $\lambda$ windows. The reevaluation will be done using <b>gmx mdrun -rerun</b> and a .edr file will saved to rerun directory. The rerun step will run <b>gmx</b> $N^2$ times, where $N$ is the number of trajectories (ie, the number of $\lambda$ windows). After all .edr files are ready,	Yes, using GNU parallel. The number of parallel jobs can be supplied using <b>output_njobs</b> . By default, the run script will detect the system layout and run a job per GPU or a job per 2 CPU, if no GPU is present.
Analysis (Only on complex legs)	First, gmx trjconv will be used to generate a PBC-corrected, centered trajectory, skipping 100 frames. The resulting trajectory will be saved in GROMACS compressed format (XTC). Then, gmx rms, gmx rmsf, gmx distance and gmx sasa will be used to calculate RMSD, RMSF, protein-ligand distance and ligand SASA. Results will be saved to analysis/lambdaX directory.	Yes, using GNU parallel. A job per $\lambda$ will be run.
Pack	A pack job will be run only once, after all jobs are completed. The pack job will use <b>tar</b> to create a compressed file containing [analysis] and [rerun] directories, the log and a xtc file, for all perturbations. The same directory structure described above will be used, and the file will contain .xvg, .edr, .tpr, .xtc, and .pkl files.	No. Currently, a <b>tar czf</b> command will be used.

During the analysis step, the potential energy will be read from the edr files from the rerun step. gmx energy will be used to generate the xvg files, which will be read to prepare the reduced potential matrix. This can be done using a Python script (output\_collecttype=python) or a compiled binary (output\_collecttype=bin, the default), or any command (output\_collecttype=[script\_name]). The default option is to use a binary created using PyInstaller and linked to a old version of the glibc, so it should run on most of the systems. In case the python script is selected, Python3 executable must be in \$PATH during runtime (See output\_runbefore), and only modules from the Python Standard Library will be used. output\_collecttype also accepts any program or script name to be used as the collect executable. See output\_collecttype below for details.

## 3.8 Script options

Option or argument	Accepted values	Comment	Default
topology	Valid GROMACS- compatible topology file	If <b>pre_solvated=True</b> (ie, a solvated system is provided), the system topology will be read from this file. If <b>pre_solvated=False</b> no topology will be read. In both cases, the value of <b>topology</b> will be used as the name of topology files created during the setup.	FullSystem.top
structure	Valid PDB file	If pre_solvated=True, the solvated system will be read from this file. If pre_solvated=False, the receptor structure will be read from this file. See subsection 3.4 and subsection 3.5 for further info. Note that if pre_solvated=False, structure structure must not contain other atoms than the protein's ones.	No default: required option
index	Valid GROMACS- compatible index (NDX) file	If <b>pre_solvated=True</b> , this file will be read and used as an index file. The value of <b>index</b> will be used as the name of index files created during the setup.	index.ndx
index_string	Dictionary	A dictionary containing index groups in the format "group1_name:selection_algebra". These groups will be added to the index file (index). See also selection_method.	None
selection _method	mdanalysis, internal	Method to be used when handling atom selections and indexes. With selection _method=mdanalysis, the mdanalysis module will be used to process index_string and to select water molecules to be removed, if pre _solvated=True. Using mdanalysis allows for more a flexible selection algebra. With selection _method=internal, gmx make_ndx will be used to create the index file and a internal method will be used to select water molecules.	internal

 $input\_ligands$ 

Path to a file; path to a directory; list of files (BASHglobbing supported); dictionary The way data is read depends on the format of the input. The underlying idea is that **prepare\_dual\_topology.py** tries to be smart regarding molecule and topology files.

- If a file is supplied, ligands names, mol2, and topology files will be read from the file lines. Ligand's name must be the first entry and subsequent columns will be guessed.
- If a directory is given, this directory must either contain files named ligand\_name.mol2 and ligand\_name.top, or directories named after the ligands containing mol2 and top files.
- If a dictionary is given, it must be in the format "lig1name:lig1name.pdb,lig1name.top; lig2name:lig2name.pdb,lig2name.top".
- If a list of files is given, molecular structures and topologies are guessed from extension. MOL, MOL2, SDF, PDB and PDBQT files will be used as molecular structures. Note that PDB and PDBQT files does not contain bond order information, so that reading from MOL, MOL2, and SDF is far safer. Other files will be taken as tolopogies. See subsection 3.3 for more info regarding topologies.

When reading files, the file type will try to be guessed by extension: mol, mol2, and pdb files will be taken as ligand structures; top, itp, atp, and any other type will be read as topology. Note that data absent from this option will be read from the progress file. Ligand molecules and topologies read from this option will be saved, possibly updating data, to the progress file. prepare\_dual\_topology.py requires at least a structure (mol, mol2 or pdb) and a topology file (top, itp, etc) for each ligand in the perturbation map (perturbation\_map). Multiple topology files per ligand can be supplied, but, currently, they will be concatenated to the same topology file in the same order as read. See subsection 3.2 for info about how the ligands are processed.

None (By default, all data will be read from the progress file, otherwise this is a required option.)

Option or argument	Accepted values	Comment	Default
perturbation _map	Valid text file	Perturbation map to be used as the source for perturbations. By default, the perturbation map is read from the progress file, but giving this option will super seed the map from the progress file, if any. The map file must be a column file, with a perturbation per line. The first ligand name read (first column) is the state A ligand, and the second ligand (second column) is the state B ligand. An optional, third column, may be used to select a lambda scheme for this particular perturbation, superseeding lambdainput. Lines starting with ";" or "#" will be regarded as comments and ignored.  Note that if no perturbation map is read from the progress file nor from this option, the script will fail.	None (By default, a perturbation map will be read from the progress file)
perturbation dir	String	Base name for the pertubation directory structure (See subsection 3.7). This will also be the filename for the compressed file containing the pertubation directory structure, if output_packing is either tgz or bin.	perturbations _hhmmss _ddmmYYYY
extrafiles	list	A list of extra files to be copied to the system building and perturbation directories. <b>prepare_dual_topology.py</b> will not process or modify these file in any fashion. By default, all required files will be generated on the fly. This option allows the user to use custom topologies, index files, etc.	None, no extra files will be copied.
extradirs	list	A list of extra directories to be copied to the system building and perturbation directories. This option is akin to <b>extrafiles</b> , but for dirs. Using a force field not included in your GROMACS distribution can be easily done by passing the GROMACS-compatible force field directory (in general, <b>force_field_name.ff</b> ) to this option.	None, no extra dirs will be copied.
gmx _maxwarn	int	This value will be directly passed to GROMACS gmx grompp -maxwarn during system setup and during the run steps (ie, it will be added to the run scripts). By default, a -maxwarn=1 is used, because the intermediate windows may have non-integer total charges.	1
gmx_bin _local	String	Path to the local GROMACS binary. The local gmx will be used to during the system setup to run pdb2gmx, editconf, grompp, makendx, and genion. The path should be a valid binary path in the local machine (ie, the machine PyAutoFEP is running). By default, a gmx binary in the path will be used.	gmx
gmx_bin _run	String	Path to the GROMACS binary to be used to run the MD. The run <code>gmx_mpi</code> will be used during the minimization, equilibration, run, rerun, and analysis to run <code>grompp</code> and <code>mdrun</code> . The path should be a valid binary path in the run node. By default, the <code>gmx_mpi</code> binary in the \$PATH will be used. Note that the run binary must be compiled with MPI support.	gmx_mpi

Option or argument	Accepted values	Comment	Default
mcs_custom _mcs	String or list, valid SMARTS	Custom SMARTS representing a Maximum Common Substructure to be used instead of MCS calculation. Supplying a String, ie, a single MCS will cause prepare_dual_topology.py to use that SMARTS as the common core for all perturbations and small molecules alignment, if pose_loader=superimpose. A list can be used to supply a custom core for specific molecule pairs. To do such, the format must be: "mol1, mol2, smarts1, mol3, mol4, smarts2", so that mol1 and mol2 will have smarts1 as core.	None
mcs_custom _mcs	String or list, valid SMARTS	Custom SMARTS representing a Maximum Common Substructure to be used instead of MCS calculation. Supplying a String, ie, a single MCS will cause prepare_dual_topology.py to use that SMARTS as the common core for all perturbations and small molecules alignment, if pose_loader=superimpose. A list can be used to supply a custom core for specific molecule pairs. To do such, the format must be: "mol1, mol2, smarts1, mol3, mol4, smarts2", so that mol1 and mol2 will have smarts1 as core.	None
poses_input	String or List of mol2 or mol	Poses to be used as starting poses for the ligands. This can be either a file containing the file names, one per line, or a list or filenames. The name of the molecules read from the corresponding fields from molecule files, will be matched to the names in the perturbation map. If there is no molecule name in the file, the name will be read from the filename.	None. Note: this is a required option for all pose loaders but superimpose.
pose_loader	generic, pdb, superimpose, autodock4, vina	Select poses format to be read. See subsection 3.2.	None
poses _reference _structure	String, valid macromolecular file.	Reference structure for <b>poses_input</b> . The poses read will be aligned to <b>structure</b> using the same translation/rotation used to align <b>poses_reference_structure</b> to <b>structure</b> . If the ligand poses are already aligned to the receptor in <b>structure</b> , this option is not needed. A complex system can be used here.	None. By default, structure will be used. See also poseloader = pdb above.
poses _reference _pose _superimpose	String, valid PDB, mol, or mol2 ligand file.	The ligand pose to be used as source of constraints for <pre>pose_loader = superimpose</pre> .	None. Required option for poseloader = superimpose.

poses \_advanced \_options Dictionary

Advanced options passed to the underlying functions used in the pose loaders. The following options are processed.

ligand\_residue\_name Ligands will be molecules with this residue name in PDB files passed to poses\_inputs. Default: LIG.

autodock4\_loader,vina\_loader Options read
 when pose\_loader=autodock4 or pose
 \_loader=vina

cluster\_docking\_data Dictionary or file
 describing which cluster to read from
 each autodock4 result file. The best
 scored structure from each cluster will be
 used. This can be a dictionary in the
 form "lig1name: 3; lig2name: 2" or
 the path to a file with the same info. Poses
 omitted from this file or dict will use the
 default. Default: read the cluster 1.

Furthermore, the following options will be passed to module functions used by the pose loaders (See rdkit documentation, Biopython documentation):

#### rdkit. All Chem. Embed Molecule

maxAttempts=50, randomSeed=2342, useRandomCoords=True, clearConfs=True, ignoreSmoothingFailures=True, useExpTorsionAnglePrefs=True, enforceChirality=True, boxSizeMult=5.0

#### rdkit.AllChem.EmbedMultipleConfs

maxAttempts=50, numConfs=50, randomSeed=2342, clearConfs=True, ignoreSmoothingFailures=True, useExpTorsion-AnglePrefs=True, enforceChirality=True, boxSizeMult=5.0, numThreads=0

#### rdkit.AllChem.ConstrainedEmbed

 $\begin{tabular}{ll} use Random Coords = True, & ignore Smoothing Failures = True \\ \end{tabular}$ 

Bio.pairwise2.align.globalds seq\_align \_mat=BLOSUM80, gap\_penalt=-1

buildsys Integer
\_forcefield

Only applicable if **pre\_solvated=False** (the default). Force field to be used during the system building. This value will be passed directly to *gmx pdb2gmx-ff*. The meaning of each number may vary depending on the GROMACS installation. A custom force field can be used by passing **1** (the default value) and supplying a force field directory to **extradirs**.

Option or argument	Accepted values	Comment	Default
buildsys _water	default, spc, spce, tip3p, tip4p, tip5p, tips3p	Only applicable if <b>pre_solvated=False</b> (the default). Water model to be used in the system building. If default, "1" will be supplied to <i>gmx pdb2gmx -water</i> , selecting FF's default water model, otherwise the value name will be passed as option to <i>-water</i> .	1.
buildsys _water_mol _name	String	Use this name for the water molecule, both in complex and water legs, when adding ions (ie, when running gmx genion). Note that currently this will NOT force the residue name, but rather use this name when selecting the waters in the system. The default is try to guess from the system and and a list (currently: SOL, WAT, HOH, TIP3)	None, autodetect.
buildsys _watershell	Integer	Distance, in Angstroms, between the solute and the box face in the complex leg if <b>pre</b> _solvated=False, and in the solvent leg. The value will be passed to $gmx$ editconf -d.	10 Å.
buildsys ionconcentra	Float tion	Only applicable if <b>pre_solvated=False</b> (the default). Concentration, in mol/L, of added ions to be added to the system on top of the ions needed to neutralize the system. Using <b>0.0</b> here will cause the adding only of the counterions. The value will be passed to <i>gmx genion -conc</i> .	10 Å.
buildsys _nname	String, valid values depend on the force field.	Name of the positive ion, passed to $\mathit{gmx}$ $\mathit{genion}$ - $\mathit{nname}$	CL.
buildsys _pname	String, valid values depend on the force field.	Name of the positive ion, passed to $\mathit{gmx}$ $\mathit{genion}$ - $\mathit{pname}$	NA.
pre_solvated	Boolean	Use a pre-solvated structure. See <b>subsection 3.4</b> and <b>subsection 3.5</b> for further info.	False.
presolvated _radius	Float	Remove water molecules this close, in Angstroms, to the ligand. Use $\bf 0$ $\bf \mathring{A}$ here to avoid water molecule removal.	1 Å.
presolvated _protein _chains	Float	The number of distinct macromolecular chains in the pre-solvated system passed to <b>structure</b> . Ligand will be inserted immediately after the protein in the <b>structure</b> PDB, so this is required to adjust the topology accordingly.	1

Option or argument	Accepted values	Comment	Default
lambda input	lambda12, lambda24, lambda16wang, lambda23wang or Dictionary	Selects the $\lambda$ scheme to perturb molecule A to molecule B. Users can use one of the four schemes available (See <b>Table 12</b> , <b>Table 13</b> , <b>Table 14</b> and <b>Table 15</b> ) or supply a dictionary (or file with the required structure) to use a custom one. If so, the dictionary must be formatted as follows: vdwA: 1.00000, 1.00000, 1.00000; vdwB: 0.00000, 0.11850, 0.18978; coulA: 1.00000, 0.75000, 0.50000; coulB: 0.00000, 0.00000, 0.00000  Where vdwA and vdwB are the Van der Waals $\lambda$ for states A and B, respectively, and coulA and coulB are the Coulomb $\lambda$ for states A and B, respectively. The length of the lists for each of vdwA, vdwB, coulA, coulB must be equal, so that the $\lambda$ value for the window $n$ , $\lambda_n$ , will be the $n+1$ element of the list. Note that PyAutoFEP does not impose constraints to the $\lambda$ values, so any Float can be used.	lambda12
template _mdp	default_nosc, charmm_nosc	Use these group of mdp templates to setup minimization, equilibration, and run steps. The currently available templates for complex legs are only suitable to simple protein-ligand systems. The water leg templates, on the other hand, can likely be used for any ligand. The default mdp are described in <b>Table 8</b> . See also <b>mdp_substitution</b> , which can be useful in conjunction with this option.	default_nosc
complex _mdp	List of valid file names or a path to a file contain- ing valid file- names	Use these files, in order, as mdp files for each step of the complex leg. Supersedes <b>template_mdp</b> for the complex leg only. The last file in the list must be named md.mdp and will be used as the mdp file for the run step (See <b>Table 8</b> ).	None
water_mdp	List of valid file names or a path to a file contain- ing valid file- names	Use these files, in order, as mdp files for each step of the water leg. Supersedes <b>template_mdp</b> for the water leg only. The last file in the list must be named md.mdp and will be used as the mdp file for the run step (See <b>Table 8</b> ).	None
mdp _substitution	Dict or a path to a file containing substitutions	Replace or add the data in this <i>Dict</i> to the mdp files of both complex and water legs. There are two ways of using this option. All mdp files of both legs can be modified by using a <i>Dict</i> in the format: mdp_parameter1: value1; mdp_parameter2: value2. Keep in mind that the mdp for all steps will be modified. Alternatively, the mdps of specific steps can be modified using a dictionary in the format: {"npt": {"compressibility": 3.72}; "md": {"compressibility": 3.72}}. This would change the compressibility only during the npt equilibration and run steps of both legs. See also md_temperature and md_length.	None

Option or argument	Accepted values	Comment	Default
solute _scaling	Float	Apply solute scaling using this value as $\beta$ in the central window or windows. Note that the $\beta$ will have different meanings depending on the selected solute scaling script.	None
solute scaling selection	Dict	Apply solute scaling using to this solute selection. The <i>Dict</i> must be in the following format: molecule_name1: atom_selection1; molecule_name2: atom_selection2. Molecule name must be a valid molecule name from the topology file	None
solute _scaling _bin	rest1, rest2, or a path to a valid executable file.	Use this script to process the topology file and apply solute scaling. <b>rest2</b> selects the REST2 script from Plumed [9]. <b>rest1</b> selects a implementation of REST1 following Terakawa et al. [8]	None
hrex	Integer	Attempt a Hamiltonian Replica Exchange every this many steps. Using this option requires that the GROMACS binary in the run node (gmx_bin_run) to be patched with PLUMED. Setting this option to 0 will disable Hamiltonian Replica Exchange. Using REST1 or REST2 requires also setting this option.	0
plumed_conf	Valid file or text	Use this file as PLUMED configuration file. By default, an empty file will be created. Supplying a file or text data here will replace this empty file. See the PLUMED manual for info about the formatting and options.	None
md _temperature	Float	Sets the heat bath coupling for all simulations, in Kelvin. This will only set the reference temperature, without selecting any particular thermostat. Multiple coupling groups will be handled.	298.15 K
${ m md\_length}$	Float	Sets the length of the sampling MD, in ps. Note that this will not affect the equilibration steps.	5000.0 ps
parameterize	асруре	Selects automatic ligand parameterization using AcPYPE. Currently, AcPYPE is the only tools supported.	None: do not parameterize ligands, throw an error when topologies are missing.
parameterize _charge	user, gas, bcc	Select charge model for ligand parameterization. This will be passed to the external tool.	None: use the default charge model of the external tool. For AcPYPE, AM1-BCC is the default.
parameterize _bin	Path to a executable	Use this binary as the external parameterization tool.	None: use the binary in path.
parameterize _output_dir	Path to a directory	Save the newly generated ligand topologies to this directory. Existing files will not be overwritten.	None: save to \$PWD.

Option or argument	Accepted values	Comment	Default		
parameterize _advanced _options	Dict	Pass this advanced options to the parameterization tool. <b>timeout</b> sets the maximum execution time for the external process. See the documentation of the tool for the meaning of each option. The following options are recognized:	None: \$PWD.	save	to
		<pre>parameterize=acpype atom_type (one of gaff, amber, gaff2, amber2), qprog, and max _time</pre>			
output	$\mathbf{bin},\mathbf{dir},\mathbf{tgz}$	Selects the formatting of the output.	bin		
_packing		bin A self-extracting, compressed file will be generated. gzip compression will be used and tar xf will be used to deflate data. Note: in future versions, more stuff will be added to the default run mode of the .bin file.			
		$\operatorname{\mathbf{dir}}$ An regular directory will be created			
		tgz A compressed tar.gz will be created. Similar to bin, but not self-extracting.			
output _scripttype	bash, slurm, pbs, other command.	Selects the type of ${\tt run\_all.sh}$ script to be generated.	bash		
	command.	bash A simple Bash script that will execute all legs sequentially. It will be executed using bash.			
		slurm A SLURM/Torque script that will submit each leg of each perturbation as a job to the scheduler. It will be executed using sbatch.			
		pbs A PBS script that will submit each leg of each perturbation as a job to the scheduler. This should be compatible with SGE (untested). It will be executed using qsub.			
		Other command This command will be used to execute run_all.sh in the run node. This option will deselect the using of default headers for the run_all.sh script, so the user must supply a template file using output			
		<b>_template</b> . This option is intended to allow using of exotic job schedulers.			
output submit args	String	Pass this command-line options to the job submission command or run command before the run script name (see <b>output_scripttype</b> for details). This is useful for fine-tuning the job submission.	None		
output _resources	Dict	Define specific resources for the jobs to be submitted. This requires <b>output_scripttype=slurm</b> or <b>output_scripttype=pbs</b> . See <b>Table 7</b> for the recognized resources.	None		

Option or argument	Accepted values	Comment	Default
output _template	Valid file	Use this file as the template run file for each leg of perturbation. Note that the FEP run commands will be added after file contents (see output _runafter for running commands after the execution of each leg). This option is intended to allow using of exotic job schedulers and maybe be combined (not required) with a custom command in output _scripttype.	None
${f output} \ {f \_collecttype}$	<pre>python, bin, no_collect, custom com-</pre>	Select the script used to process the .xvg files generated during rerun step and build the reduced potential matrix.	bin
	mand	<ul> <li>python A Python3 script with no dependencies but built in libraries will be used. Note that this requires python3 in the run node. outputrunbefore maybe useful in case a custom python environment is required.</li> </ul>	
		bin Selects a binary created using PyInstaller. It is linked against an old glibc version, so that is should work in most Unixes. The binary also requires libz.	
		<pre>no_collect This step will be skipped and no unk     _matrix.pkl will be generated. Note that the analyze_results.py can, by default, build a reduced potential matrix automatically. Refer to subsection 4.5 for more info.</pre>	
		Other command This command will be executed as the collect executable. It must accept the following arguments:	
		<u>-temperature</u> will receive the absolute temperature, as float	
		<u>-gmx_bin</u> will receive the path to the GROMACS binary	
		$\frac{-\mathrm{input}}{\mathrm{xvg}}$ will receive the a list of paths to the .xvg files	
output _runbefore	Valid file or String	Execute these commands or the contents of this file immediately before the beginning of the run of each leg. This may be useful for loading modules, environments, libraries or related stuff.	Nothing
output runafter	Valid file or String	Execute these commands or the contents of this file immediately after the ending of the run of each leg. This may be useful for post-processing and analysis commands.	Nothing
output_njobs	Integer	Run this many jobs at once during the rerun step. See Table $8$	None, autodetect

Option or ar-	Accepted val-	Comment
gument	ues	

Default

output
\_hidden
\_temp\_dir

Boolean

By default, **prepare\_dual\_topologies.py** will use a temporary folder to prepare the perturbations and generate intermediate files. This option makes a folder in the current directory to be used instead.

By default, the temporary folder will be created using tempfile. Temporary Directory and contents of such dir will be copied back or compressed and saved to the output directory or file. In some systems, using the tmpfs may lead to problems when files are edited and immediately reread. GROMACS errors when running gmx grompp to generate the .tpr is symptomatic of this case. A error message suggesting to use output \_hidden\_temp\_dir will be issued when such case happens.

## 4 Result analysis (analyze\_results.py)

analyze\_results.py will read a compressed file created from pack.sh or the uncompressed data from this file, and use statistical estimators to obtain  $\Delta\Delta G$  estimative for each perturbation. The perturbation map and the reduced potential matrices will be read from the progress file found in the data file or directory. analyze \_results.py will fail if an unexpected directory structure is found. From the perturbation directories, water and complex perturbations will be read and BAR or MBAR estimators (subsection 4.1) can be used to calculate the  $\Delta\Delta G_{solvent_{A\to B}}$  and  $\Delta\Delta G_{complex_{A\to B}}$ , and, from these,  $\Delta\Delta G_{A\to B}$ . Pairwise  $\Delta\Delta G_{A\to B}$  can be transformed to  $\Delta\Delta G_{A\to ref}$ , where ref is a reference ligand in the perturbation map by summing the respective edges on the map (subsection 4.2). If Replica-Exchange is used, exchange probabilities and occupancy matrices can be read from GROMACS run log and graphs can be plotted (subsection 4.3).

#### 4.1 Estimators

Currently, Bennett Acceptance Ratio (BAR) [1] and Multistate-Bennett Acceptance Ratio (MBAR) [7] are the available estimators in PyAutoFEP. Both are used from pymbar implementation thorough alchemlyb [4]. BAR uses data from two states to estimate  $\Delta G$  using the equation **Equation 7**.

$$\sum_{i=1}^{n_i} \frac{1}{1 + \exp(\ln(n_i/n_j) + \beta \Delta U_{ij} \beta \Delta G)}$$

$$-\sum_{j=1}^{n_j} \frac{1}{1 + \exp(\ln(n_j/n_i) - \beta \Delta U_{ji} + \beta \Delta G)} = 0$$
(7)

Where  $\beta = \frac{1}{RT}$ ;  $n_i$  and  $n_j$  are the number of samples in each state;  $\Delta U_{ij}$  is the difference between reduced potential in states i and j;  $\Delta G$  is the free energy difference.

MBAR is an expansion of BAR using data from several states to estimate  $\Delta G$ . It has been shown that MBAR yields the lowest variance between free energy methods [7], and a estimator for the error is available. This error estimative will be printed together with the pairwise  $\Delta\Delta G$ . When MBAR is used (the default), a state-overlap matrix will be calculated and can be plotted to a graph (if analysis\_types contains overlap\_matrix).

MBAR uses equation **Equation 8**.

$$\hat{G}_{i} = -\beta^{-1} \ln \sum_{j=1}^{K} \sum_{n=1}^{N_{j}} \frac{\exp\left[-\beta U_{i}\right]}{\sum_{k=1}^{K} N_{k} \exp\left[\beta \hat{G}_{k} - \beta U_{k}\right]}$$
(8)

Where  $\beta = \frac{1}{RT}$ ;  $\hat{G}_i$  and  $\hat{G}_k$  are the free energies at states i and k;  $U_i$  and  $U_k$  are the reduced potentials at states i and k;  $N_k$  is the number of samples at state k.

#### 4.2 Graph options

When analyzing the  $\Delta\Delta G$  for a series, is often useful to use one of the molecules as the reference, so all  $\Delta\Delta G$  are calculated with respect to it. PyAutoFEP implements four methods to sum  $\Delta\Delta G$  along edges when more than one path is available. Whether different methods will yield different results, depends on the perturbation map used.

Using shortest path (**center\_ddg\_method** = **shortest**) will simply use the shortest path, in number of perturbations, to connect each molecule to the reference molecule. If multiple paths are available, only one will be used, as given by <code>networkx.single\_source\_shortest\_path</code> (See relevant networkx documentation). This is the default mode and makes sense to be used when no alternative paths are present. Using shortest average path

(center\_ddg\_method = shortest\_average) will average all the shortest paths to the reference molecule and longer paths will be ignored. If a single path is available, it will be used.

Using all averages (**center\_ddg\_method** = **all\_averages**) will average all possible paths connecting the molecule to the reference. A simple averaging will be used, so all paths will contribute equally to the  $\Delta\Delta G$ . Using weighted averages (**center\_ddg\_method** = **all\_weighted\_averages**), will work similarly to all averages, but the contributions of all paths will be weighted by the number of edges in a path.

### 4.3 Analysis types

\_matrix

# Comment Argument replica If during GROMACS MD run Hamiltonian replica-exchange was used using \_exchange Plumed, PyAutoFEP can analyze the replica-exchange acceptance and replica occupancy. First, PyAutoFEP will read the replica-exchange attempts and accepted moves from GROMACS log file, reading for Repl ex lines. Then, the coordinates will be demuxed in respect to Hamiltonians. From the number of accepted moves, an empirical transition matrix will be constructed, normalized, and diagonalized. From the demuxed trajectory, the occupancy of each trajectory in each hamiltonian will be calculated. The occupancy and the Hamiltonians visited by each replica will be plotted. Output files: hrex\_trajectory\_demux.svg Scatter plot of Hamiltonian visited by each replica in each frame. hrex\_transition\_matrix.svg Empirical transition matrix calculated from the accepted RE moves. hrex\_coord\_hamiltonians.svg Bar plot of the Hamiltonian occupancy of each replica. convergency The $\Delta \Delta G_{A \to B}$ and the associated error will be estimated for truncated trajectories at every **convergence** ps (default: **500**). The same will be done using the reversed trajectory, obtained by reversing the frames. Both $\Delta\Delta G$ for the truncated trajectories ate each time will be plotted and can be used te inspect convergency. Output file: $ddg_vs_time.svg$ Forward and reversed trajectories $\Delta\Delta G$ evaluated for different trajectory lengths. neighbor ddg The $\Delta\Delta G$ between adjacent $\lambda$ windows and its associated errors will be calculated. This will be done reading the delta f and d delta f matrices generated by pymbar. See Alchemlyb documentation for more info. Output file: ddg\_vs\_lambda1.svg Bar plot of estimated free energy difference between each adjacent state. overlap Only available when estimator MBAR is used. The estimated state overlap

state i in state j.

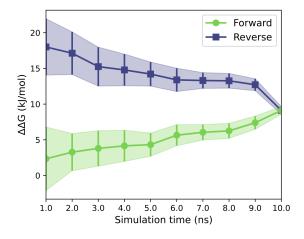
matrix  $O_{ij}$  is an estimate of the probability of observing a sample from state i

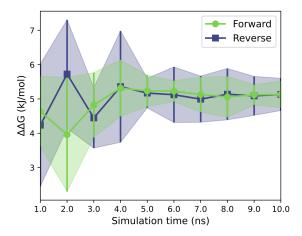
overlap\_matrix.svg Estimated probability matrix of observing a sample of

in state j. See pymbar documentation for further info. Output file:

#### 4.4 Example plots

PyAutoFEP generates some plots using *alchemlyb-analysis.py* library and some plots using built-in code. Users are also advised to refer to the work of Klimovich et al. [4], where alchemlyb-analysis plots are thoroughly discussed.



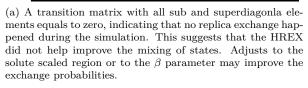


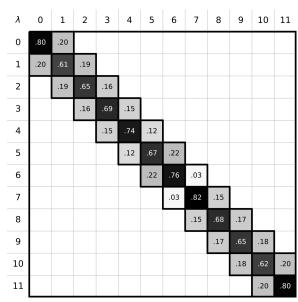
(a) In this plot, after 10ns of simulation, there is a diverging trend between the forward and reverse  $\Delta\Delta G$  predictions. Also the range (note the Y axis) of the predictions along the time is large, suggesting that longer simulation times could converge to another  $\Delta\Delta G$ 

(b) In this plot, after 4-5 ns a stability of the predictions is reached, where both forward and reverse predictions are similar and flustuates around 5 kcal/mol. This plot suggests a converged prediction.

Figure 4: **ddg\_vs\_time.svg**.  $\Delta\Delta G$  calculated using trajectories at truncated time steps. This plot can be useful to assess the convergency of the free energy estimative.

λ	0	1	2	3	4	5	6	7	8	9	10	11
0	1.00											
1		1.00										
2			1.00									
3				1.00								
4					1.00							
5						1.00						
6							1.00					
7								1.00				
8									1.00			
9										1.00		
10											1.00	
11												1.00

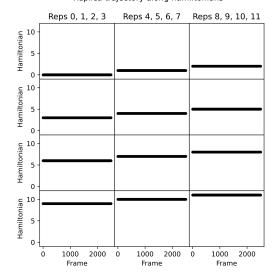




(b) A transition matrix sub and superdiagonal elements greater than zero, indicating that replica exchange happened between all replicas during the simulation. This suggests that the HREX may have improved the mixing of states.

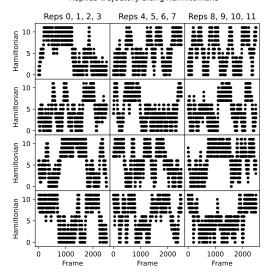
Figure 5: **hrex\_transition\_matrix.svg**. Empirical transition matrix estimated from observed replica exchanges in a MD. Note that only diagonal, super and subdiagonal elements will everbe filled.





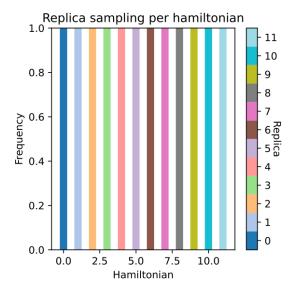
(a) In this plot all the replicas sampled their starting hamiltonians indicating that no replica exchange happened during the simulation. This suggests that the HREX did not help improve the mixing of states. Adjusts to the solute scaled region or to the  $\beta$  parameter may improve the exchange probabilities.

#### Replica trajectory along hamiltonians

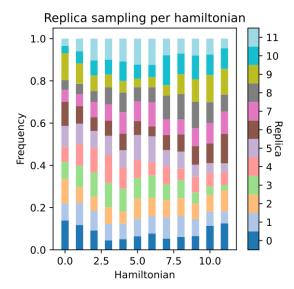


(b) In this plot all replicas transited through all the hamiltonians, indicated by the points in several Y values. Furthermore, It can be seen that all replicas sampled all hamiltonians, as seen by the fact that in all subplots there are point from the bottom to the top of the Y axis.

Figure 6: **hrex\_trajectory\_demux.svg**. In this plot, each point represents a MD frame in which the replica, given by the plot, occupied a certain hamiltonian (Y axis).



(a) Each bar is colored by a single color, indicating that each hamiltonian (X axis) was sampled by a single hamiltonian, therefore, no replica exchange occured.



(b) All bars are colored by several colors, indicating that each hamiltonian (X axis) was sampled by several replicas. Furthermore, it can be seen that all colors are present in all bars, indicating that all replicas sampled all hamiltonians.

Figure 7: hrex\_coord\_hamiltonians.svg. Hamiltonian occupancy for each replica. Each replica is represented by a color in the bars and its height is the probability that a given Hamiltonian (denoted by the X-axis index) will be found occupied by a replica (denoted by the colors) at any moment. The more the bars shows more diverse colors, the better the replicas explored several Hamiltonians, which can lead to enhanced state mixing.

#### 4.5 Script options

Option or argument	Accepted values	Comment	Default
input	Valid .tgz file or directory	FEP data will be read from this file or directory. If a compressed file is read, it will be uncompressed to a temporary location and processed (See also <b>outputuncompressdirectory</b> ). A directory structure is expected ( <b>subsection 3.7</b> ).	No default: required option
center _molecule	Valid molecule name	Use this molecule as a reference to convert pairwise $\Delta\Delta G$ to $\Delta\Delta G$ in reference to a molecule. A molecule name contained in the perturbation map is expected. By default, if a star or wheel map were used, the center molecule will be automatically detected. If an optimal map is used and this option is provided, network analysis will be performed and $\Delta\Delta G$ to reference will be calculated.	None
temperature	Float	The absolute temperature of the sampling. By default, this will be read from the progress file and this option is not required. Use this option to force a different temperature than the read from the progress file.	None
units	$ \begin{array}{c} \text{kJmol}, \text{ kcal } \mathrm{or} \\ \text{kBT} \end{array} $	Select unit to be used in the output plots and text.	kJmol
first_frame	int	First frame (given in ps) to read from the trajectories. By default, frames will be read from the first.	0
last_frame	int	Last frame (given in ps) to read from the trajectories. By default, frames will be read to the last.	-1
convergence	int or list	Calculates the $\Delta\Delta G$ estimate and error for successive truncated trajectories using this step, in ps. Successive estimates will be plotted to a convergency graph. This can be a step $(int)$ or a list of simulation times to use in the convergency analysis $(list)$ .	None, 10-15 evenly-spaced values will be selected by default.
calculate_tau _c	int	Analyses each trajectory, calculates, and print the correlation time $\tau_c$ using the statistical inefficiency method [2]. Note that this option will not affect the results.	False
detect _equilibration	int	Automatically [2] detects a equilibration time in the beginning of each sample and removes the corresponding frames from the analysis.	False
estimators	mbar or bar	Select estimator to estimate $\Delta\Delta G$ (See subsection 4.1)	mbar
$ddg\_systems$	list, currently, the list must contain exactly two items	Select systems X and Y to be used to calculate $\Delta\Delta G$ as $\Delta\Delta G_{A\to B} = \Delta\Delta G_{A\to B_X} - \Delta\Delta G_{A\to B_Y}$ . These will be the names of the folders read from each perturbation directory in the data file or dir. Currently, the default value is likely the only useful choice.	[protein, water]
analysis _types	list	Select which analysis should be executed. Use "all" to run all available analysis. See <b>subsection 4.3</b> .	all

Option or argument	Accepted values	Comment	Default
center_ddg _method	String	A method to calculate the $\Delta\Delta G$ in respect to a reference molecule in the graph. This option only makes sense in conjunction with <b>center_molecule</b> . Valid options are: <b>shortest</b> , <b>shortest_average</b> , <b>all_weighted_averages</b> . See <b>subsection 4.2</b> .	shortest
read_from _xvg	auto, never or always	If this option is set to always, analyze_results.py will ignore any existing unk_matrix.pkl file in the collect results from .xvg files again.  Using never here will force the use of existing unk_matrix.pkl files. In case any of these cannot be read, an error will be raised.  If this option is set to auto (the default), data will be collected from .xvg files if (a) no unk_matrix.pkl is found or (b) it is unreadable or corrupt. Using the default here is likely fine.	auto
output _uncompress _directory	String	By default, if <b>input</b> is a compressed .tgz file, analyze_results.py will extract data to a temporary location and remove such dir upon completion. By using this option, the uncompressed data will be saved to output_uncompress_directory and kept.	None
output_plot _directory	String	Save all plots to this directory. By default, plots will be saved to directories in the <b>\$PWD</b> . If <b>output_uncompress_directory</b> is used, plots will be save to it.	None, save to \$PWD
output_ddg _to_center	String	Save a $.csv$ file containing the $\Delta\Delta G$ to the reference molecule. Use <b>False</b> to suppress this output. File will be saved to <b>output_plot_directory</b> . See also the related option <b>center_molecule</b> .	ddg_to _center.csv

# 5 Tables

Table 12:  $\lambda$  factors for Van der Waals and Coulomb terms for lambda\_input=lambdas12

$\lambda =$	$\mathrm{VdW}_{\mathbf{A}}$	$\mathrm{VdW_B}$	$\mathbf{Coulomb_A}$	$Coulomb_B$
0	1.00000	0.00000	1.00000	0.00000
1	1.00000	0.11850	0.75000	0.00000
2	1.00000	0.18978	0.50000	0.00000
3	1.00000	0.24741	0.25000	0.00000
4	1.00000	0.32525	0.00000	0.00000
5	0.67479	0.45630	0.00000	0.00000
6	0.45630	0.67479	0.00000	0.00000
7	0.32525	1.00000	0.00000	0.00000
8	0.24741	1.00000	0.00000	0.25000
9	0.18978	1.00000	0.00000	0.50000
10	0.11850	1.00000	0.00000	0.75000
11	0.00000	1.00000	0.00000	1.00000

Table 13:  $\lambda$  factors for Van der Waals and Coulomb terms for lambda\_input=lambdas24

$\lambda =$	$VdW_{A}$	$\mathrm{VdW_B}$	$\operatorname{Coulomb}_{\mathbf{A}}$	$Coulomb_B$
0	1.00000	0.00000	1.00000	0.00000
1	1.00000	0.00000	0.75000	0.00000
2	1.00000	0.00000	0.50000	0.00000
3	1.00000	0.00000	0.25000	0.00000
4	1.00000	0.00000	0.00000	0.00000
5	0.76285	0.00000	0.00000	0.00000
6	0.57750	0.00000	0.00000	0.00000
7	0.41884	0.00000	0.00000	0.00000
8	0.28687	0.00000	0.00000	0.00000
9	0.18158	0.00000	0.00000	0.00000
10	0.10297	0.00000	0.00000	0.00000
11	0.05106	0.00000	0.00000	0.00000
12	0.00000	0.05106	0.00000	0.00000
13	0.00000	0.10297	0.00000	0.00000
14	0.00000	0.18158	0.00000	0.00000
15	0.00000	0.28687	0.00000	0.00000
16	0.00000	0.41884	0.00000	0.00000
17	0.00000	0.57750	0.00000	0.00000
18	0.00000	0.76285	0.00000	0.00000
19	0.00000	1.00000	0.00000	0.00000
20	0.00000	1.00000	0.00000	0.25000
21	0.00000	1.00000	0.00000	0.50000
22	0.00000	1.00000	0.00000	0.75000
23	0.00000	1.00000	0.00000	1.00000

Table 14:  $\lambda$  factors for Van der Waals and Coulomb terms for lambda\_input=lambdas16wang [10]

$\lambda =$	$\mathrm{VdW}_{\mathbf{A}}$	$\mathrm{VdW_B}$	$\mathbf{Coulomb_A}$	$Coulomb_{\mathbf{B}}$
0	1.00000	0.00000	1.00000	0.00000
1	1.00000	0.00000	0.75000	0.00000
2	1.00000	0.00000	0.50000	0.00000
3	1.00000	0.00000	0.25000	0.00000
4	1.00000	0.00000	0.00000	0.00000
5	0.85700	0.14300	0.00000	0.00000
6	0.71400	0.28600	0.00000	0.00000
7	0.57100	0.42900	0.00000	0.00000
8	0.42900	0.57100	0.00000	0.00000
9	0.28600	0.71400	0.00000	0.00000
10	0.14300	0.85700	0.00000	0.00000
11	0.00000	1.00000	0.00000	0.00000
12	0.00000	1.00000	0.00000	0.25000
13	0.00000	1.00000	0.00000	0.50000
14	0.00000	1.00000	0.00000	0.75000
15	0.00000	1.00000	0.00000	1.00000

Table 15:  $\lambda$  factors for Van der Waals and Coulomb terms for lambda\_input=lambdas23wang [10]

$\lambda =$	$\mathrm{VdW}_{\mathbf{A}}$	$\mathrm{VdW_B}$	$\operatorname{Coulomb}_{\mathbf{A}}$	$Coulomb_B$
0	1.00000	0.00000	1.00000	0.00000
1	1.00000	0.00000	0.75000	0.00000
2	1.00000	0.00000	0.50000	0.00000
3	1.00000	0.00000	0.25000	0.00000
4	1.00000	0.00000	0.00000	0.00000
5	0.68000	0.00000	0.00000	0.00000
6	0.46000	0.00000	0.00000	0.00000
7	0.33000	0.00000	0.00000	0.00000
8	0.25000	0.00000	0.00000	0.00000
9	0.19000	0.00000	0.00000	0.00000
10	0.12000	0.00000	0.00000	0.00000
11	0.00000	0.00000	0.00000	0.00000
12	0.00000	0.12000	0.00000	0.00000
13	0.00000	0.19000	0.00000	0.00000
14	0.00000	0.25000	0.00000	0.00000
15	0.00000	0.33000	0.00000	0.00000
16	0.00000	0.46000	0.00000	0.00000
17	0.00000	0.68000	0.00000	0.00000
18	0.00000	1.00000	0.00000	0.00000
19	0.00000	1.00000	0.00000	0.25000
20	0.00000	1.00000	0.00000	0.50000
21	0.00000	1.00000	0.00000	0.75000
22	0.00000	1.00000	0.00000	1.00000

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