# **BOPcat Documentation**

Release 1.0

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**CHAPTER** 

ONE

### INTRODUCTION

### 1.1 About

The **BOPcat** package is a software written in Python to generate new tight-binding or bond-order potentials or optimize existing models using the **BOPfox** code. The parameters of the models are determined by reproducing various target properties including energies, forces, stresses, defect formation energies, elastic constants, etc. The structures and their properties are taken from a DFT database but can also include experiments or other data sources. It employs the optimization libraries of **Scipy** but external optimization modules can also be used. The structures and their properties are handled using the **ASE** Atoms object. These are read from a text file which are generated from an external database.

### 1.2 Installation

Prior to using the code, BOPfox should be compiled and the path to the executable should be included in \$PATH. As some BOPfox source files are read to generate some variables, it is recommended to keep the executable in the bopfox/src folder. BOPcat utilizes a number of python modules such as numpy (http://www.numpy.org/), ASE (https://wiki.fysik.dtu.dk/ase/), Scipy (http://www.scipy.org/), matplotlib (http://www.matplotlib.org/) and pyspglib (https://atztogo.github.io/spglib/). BOPcat depends on the the BOPfox-ASE interface to calculate the properties of the structure which is not yet included in the original ASE module. The relevant files are included in the BOPcat source files. The files bopio.py and bopcal.py should be copied to the ase/io and ase/calculators folders respectively. Both files should be renamed bopfox.py. In order to know the path to your ase libraries, simpy execute the following in python:

```
import ase
ase.__file__
```

In case you do not have permission to make changes to the ase folder, it is necessary to install a local version of ASE (https://wiki.fysik.dtu.dk/ase/). A more straightforward way is to install **Anaconda** (https://www.continuum.io/downloads). The latter is recommended as this will also update and consolidate all your python modules in a local directory.

**Note:** It may be necessary to restart your computer.

To make sure that you have set the correct path to ase, execute the following in python:

```
from ase.calculators import bopfox as bopcal
from ase.io import bopfox as bopio
```

To install BOPcat, run the installation script

```
python setup.py install
```

Alternatively, one simply specify the path to the BOPcat source files, i.e. you should append the following to your .bashrc:

```
export PYTHONPATH=<path to bopcat>:/bopcat:$PYTHONPATH
PYTHONPATH=<path to bopcat>:$PYTHONPATH
```

These make it possible to execute:

```
from bopcat import variables
import variables
```

To test if the required paths are set correctly, execute

```
python test_install.py path
```

# 1.3 Examples

The examples to test the basic functionalities of the code are found in examples/. To get started, run the examples in the following order:

- 1. ASE The usage of the BOPfox ASE interface is illustrated. See example 1.py and example 2.py
- 2. **strucscan** BOPcat reference data are constructed from strucscan. See example.py
- 3. optimize\_Fe-Madsen-2011 An existing Fe model is optimized. See input2.py and main2.py
- 4. optimize\_Re-Cak-2014 An existing W model is optimized for Re. See input3.py and main3.py
- 5. **construct\_Fe** A new Fe model is constructed. See input4.py and main4.py
- 6. construct\_FeNb A new FeNb model is constructed. See input5.py and main5.py
- 7. test\_Fe\_Madsen-2011 BOPcat utilities are illustrated. See input6.py and main6.py

BOPcat is a collection of tools for the optimizing models. It is necessary for the user to write a script to specify the procedure. In addition, the input controls should also be provided which are handled by the cat\_controls object. Assuming that the main script is main.py and the input file is input.py, the scripts should be executed as

```
python main.py input.py
```

The basic form of the script is as follows:

1. Execute and initialize the input controls. These are then attributes of the cat\_controls object:

```
execfile(sys.argv[-1])
cat_contols.initialize()
```

2. Generate reference data. The cat\_data object essentially reads the text file of structures and their properties (see *Reference structures database*):

```
cat_data = CATData(controls=cat_controls)
```

3. Generate or read initial model. The cat\_param object can also be used to store the resulting models at each level of optimization:

```
cat_param = CATParam(controls=cat_controls,data=cat_data)
```

4. Set up the calculator. To set up the calculator, one provides the input controls and a model, in the following, we use the last model (models[-1]) saved in cat\_param

```
cat_calc = CATCalc(controls=cat_controls, model=cat_param.models[-1])
```

5. To proceed with the optimization, one needs to determine which structures are included in the target set. These are then assigned to the calculator:

```
ref_atoms = cat_data.get_ref_atoms(structures=['Fe/229/0/1/*'],quantities=['energy'])
cat_calc.set_atoms(ref_atoms)
ref_data = cat_data.get_ref_data()
```

6. The optimization kernel is also necessary which takes in the calculator, the array of reference data, the constraints on variables, the weights and the input controls:

7. The optimization is run and the resulting model is saved in cat\_param:

```
optfunc.optimize()
new_model = optfunc.get_optimized_model()
cat_param.models.append(new_model)
```

This can be done iteratively for different sets of target structures, constraints, starting parameters or even a completely different functional form.

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# REFERENCE STRUCTURES DATABASE

BOPcat requires a list of structures each is an ase. Atoms object. These are extracted from a generic database which takes in general identifiers depending on the data type. Currently, only dft data are handled in but can be extended to include data from experiments or other calculation schemes. The Atoms also contain the calculation parameters, details of the crystal structure and various properties that are required for fitting. The data are extracted from the database once and are written in a readable text format for future use.

#### **General DFT identifiers**

key	val	description	val	description
code	0	abinit	100	crystal
	1	castep	101	fhi-aims
	2	dacapo	102	gaussian
	3	gpaw	103	octopus
	4	qbox	104	siesta
	5	quantum-espresso	105	turbomole
	6	sphinx		
	7	vasp		
	200	exciting	999	unknown
	201	fleur		
	202	wien2k		
basis_set	0	plane waves		
	1	atomic orbitals		
	2	gaussians		
	9	unknown		
xc_functional	0	hf ab-initio	100	pw lda
	1	sx ab-initio	101	pz lda
			102	vwn lda
	200	blyp gga	300	tpss meta
	201	pbe gga		
	202	pw91 gga		
	203	rpbe gga		
	204	pbesol gga		
	205	wc gga		
	206	lm gga		
	400	b3lyp hybrid	999	unknown
	401	hse hybrid		
	402	pbe0 hybrid		
	403	tpssh hybrid		
pseudopotential	0	all electron	10	martins-troullier nc
		•		Continued on next page

Table	2.1	<ul><li>continued</li></ul>	from	previous page
iabio		COLLUITACA		providuo pago

key	val	description	val	description
			11	bachelet-hamman-schlueter nc
			12	morrison-bylander-kleinman nc
	20	vanderbilt us	30	kresse-joubert paw
	21	rappe-rabe-kaxiras-joannopoulos us	99	unknown

For dft reference data, four general identifiers namely code, xc\_functional, pseudopotential and basis set are passed to the database. Each of these identifiers have a corresponding integer value for the purpose of classification (see *General DFT identifiers*). The DFT codes are arranged in the following manner. The first set use mainly plawe wave basis while those from 100-199 use local atomic orbital basis while the third are all-electron DFT codes. The classification for the other identifiers are are also evident from *General DFT identifiers*. The database returns a list of Atoms that meet these criteria for the general identifiers. The database is expected to also supply supplementary identifiers listed in *Supplementary DFT identifiers* in Atoms.info. The information are used in BOPcat to filter the data. To extend the supplementary identifiers, one simply add keywords in variables.data\_keys()

### **Supplementary DFT identifiers**

key	val	description
hubbard	0.0	U value
lr_correction	0/1	long-range correction
relativistic	0/1	relativistic
valency	3pd7s1	valence states
nlc_correction	0/1	non-linear core correction
encut	0.0	cut-off energy
deltak	0.0	k-points(1/Angstroem)
encut_ok	0/1	converged wrt encut
deltak_ok	0/1	converged wrt deltak
author	Pedro5	author ID

The database should also return identifiers for the structure. These include the stoichiometry, space group number, sytem type, calculation type and calculation order. The system\_type can refer to any of the following: bulk, cluster, defect, surface or interface. An integer value is also assigned to the system types, i.e.

0-bulk 1-cluster 2-defect 3-surface 4-interface

#### Todo

Extend system types.

The nature of calculation\_type and calculation\_order vary depending on system\_type. These are listed in *Structure identifiers*.

#### Structure identifiers

calc_type	description	calc_order	description
bulk			
0	relaxation	N	0-unrelax, 1-relax ion, 2-relax vol, 3-relax all
1	volume	0.0	volume per atom
2	elastic	v.x	v-strain(Voigt), x-displacement
3	phonon	Iv.x	I-atom index, v-strain(Voigt), x-displacement
4	transformation	Td.x	T-transformation type, d.x-deformation factor
99	unknown	99.99	unknown

### Todo

Determine identifier for other system types.

Each structure may contain an energy, forces,stresses, eigenvalues and orbital\_character, vacancy energy and other properties. To extend this to include other properties, one simply needs to add the key to the variables.data\_keys().

### **THREE**

# **CLASSES AND MODULES**

# 3.1 Input controls

```
class catcontrols.CATControls(**kwargs)
     Handles all input controls.
     Parameters are categorized as either data-, opt- calculator- and model-specific
           Parameters
                  •elements: list
                     list of chemical symbols. Bond pairs will be generated from the list.
                  •calculator_settings: dict
                     options to be passed to the calculator
                  •calculator: str
                     name of the calculator
                  •calculator_nproc: int
                     number of parallel processes
                     None: will not parallelize
                  •data_parameters: dict
                     specifications for the data, e.g.:
                      data_parameters = {'xc_functional':30, 'encut':400}
                  •data_system_parameters: dict
                     specifications for the structures, e.g.:
                      data_system_parameters = {'stoichiometry':['Fe2','Fe']}
                  •data_filename: str
                      filename or path to file containing the structures and properties
                  •data_free_atom_energies: dict
                     dictionary of element:free atom energies
                      dimer: will generate free_atom_energies from dimers
                     None: will read from atomic_properties in variables
```

•opt\_variables: list

list of dictionary of contraints on the parameters:

•opt\_structures: list

list of structures in target set:

```
structures = ['Fe*/*/0/1/*']

•opt_test_structures: list
    list of structures in test set

•opt_optimizer: str
    name of optimizer
```

controls to be passed to the optimizer

•opt\_objective: str

name of the objective function

•model: str

name of the model

•opt\_optimizer\_options: dict

•model pathtomodels: str

filename or path to file containing model

•model\_pathtobetas: str

filename or path to file containing bond integrals

•model\_pathtoonsites: str

filename or path to file containing onsites

•model\_functions: dict

dictionary of keyword:bondpair:function or keyword:function, function is one of the instances in functions module. The latter implies that all bond pairs will have the same functional form:

 $\bullet model\_valences$ : dict

dictionary of element:valency:

```
valences = {'Fe':'d','Nb':'d'}
```

•model\_valenceelectrons: dict

dictionary of element:number of valence electrons:

valenceelectrons = {'Fe':7.1,'Nb':4.0}

```
None: will read valenceelectrons from variables.atomic_properties()
            •model_orthogonal: bool
                 orthogonal or non-orthogonal model
            •model betafitstruc: str
                 structure from which the betas were derived (see format of betas files)
            •model_betatype: str
                 method used in bond integral generation
            •model_betabasis: str
                 basis used in bond integral generation
            •model_cutoff: dict
                 dictionary of cutoff keyword:bondpair:value or keyword:value.
                 The latter implies that all bond pairs will have the same value:
                 cutoff = {'rcut' : {'Nb-Nb':4.5,'Fe-Fe':4.5,'Fe-Nb':4.5}
                            ,'dcut' :0.5}
            •verbose: int
                 prints details at different levels
check_input()
     Checks the consistency of input data type.
convert_params()
     Convert data and system parameters into integers.
gen functions()
     Set default functions. Returns dictonary of key:functions
initialize()
     Initializes input controls.
     Calls check_input(), make_lower(), make_pairs(), convert_params()
make_lower()
     Change case of all strings in calculator_settings.
```

### 3.2 Reference data

```
class catdata.CATData(**kwargs)
```

Defines a set of reference data for parametrization.

It stores the structures and their properties as ASE Atoms objects.

Extended properties used in the parametrization such as eigenvalues, formation energies and elastic constants are stored in the info dictionary.

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#### Todo

extend ASE Atoms object

The main functionality of this object is to query structures for parameterization.

```
Parameters
```

•controls: instance of CATControls

CATControls object to initialize parameters

•atoms: list of ASE Atoms instances

None: will read from file.

•filename: str

file containing the structures and their properties, can also be path to file.

•dataparams: dict

dictionary of data specifications used to filter structures.

sample keywords: deltak, encut

•sysparams: dict

dictionary of system specifications used to filter structures.

sample keywords: calculation\_type, spin

•elements: list

list of chemical symbols

•free\_atom\_energies: dict

dictionary of element:free atom energies.

dimer: will generate free\_atom\_energies from dimers.

None: will read from atomic\_properties in variables.

•verbose: int

controls verbosity e.g.

prints out structures if verbose > 1

#### get atoms()

Returns list of all ASE atoms objects of all structures. Builds them from file if not initialized.

#### get\_atoms\_info(key)

Returns the *info[key]* values of all atoms

### **Parameters**

•key: str

key of entry in info dictionary

#### get\_equilibrium\_distance(structure)

Returns the smallest bond length of the lowest energy structure in the group

#### **Parameters**

```
•structure: str
```

strucname, e.g. 'dimer'

system\_ID, e.g. 'Fe/229/0/1/\*': all bcc-Fe E-V structures

#### get\_free\_atom\_energies()

Returns a ditionary of free atom energies corresponding to each of the elements.

#### get\_ground\_state (elements=None, out='atoms', spin=0)

Returns the lowest energy structure containing all the elements in elements.

For alloys, energy of formation is calculated.

#### **Parameters**

•elements: listlist of chemical symbols

```
•out: strdirective for output, if 'atoms' will return the ASE Atoms object, otherwise will return info[out]•spin: int0 : all 1 : only non-mag 2 : only mag
```

#### get\_parent (atom)

Returns the system\_ID of the parent of atom.

If parent is not found will return system ID of atom.

**Note:** Only considers bulk atoms with different volumes from parent but should be generalized for other calculation types However, for the structure map, even if two atoms are related but have different cells, e.g transformation path they will have different moments hence should be treated as separate structures.

#### **Parameters**

•atom: instance of ase.Atoms child of the parent atom

get\_ref\_atoms (structures=None, quantities=None, sort\_by=None, refene=None)

Returns list of ASE atoms objects specified in structures and with property in quantities.

#### **Parameters**

```
•structures: list
list of strings of strucname of part of strucname, e.g. 'bcc' or system_ID, wildcards are permitted, e.g. Fe*/*/1/* (see definition of system_ID)
•quantities: list
```

list of desired properties that a structure must possess to be included. If a structure has more than one property, it will be included multiple times.

if quantities is None will simply return what is stored in memory.

#### get\_ref\_data (structures=None, quantities=None)

Returns the properties of the reference atoms. See get\_ref\_atoms () for description of parameters.

If quantities is None, it will return what is stored in memory, otherwise, it will initialize ref\_atoms if quantities is not the same as stored.

#### get\_ref\_weights (structures=None, quantities=None)

Returns the weights of the reference atoms in the optimization. See  $get\_ref\_atoms$  () for description of parameters.

If quantities is None, it will return what is stored in memory, otherwise, it will initialize ref\_atoms if quantities is not the same as stored.

If any of the reference atoms has no weight then all the weights will be nullified.

#### get\_structuremap\_distance (struc0, strucs, index='total')

Returns the distance of the strucs from struc0 in the structure map

#### **Parameters**

```
*struc0: str strucname, e.g. 'dimer'
system_ID, e.g. 'Fe/229/0/1/*': all bcc-Fe E-V structures
ASE Atoms object, coordinates is expected to be normalized globally
*strucs: list list of structures (format similar to struc0)
*mode: str
```

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average/total/maximum of the distances

•index: list, int, str

list of atom indices corresponding to each struc in strucs whose distance from struc0 is returned, if int will apply same index to all strucs, if total will average the coordinates

#### get\_structures (name=False)

Returns the system\_ID or structure (name=True) of all structures. The definition of system\_ID varies depending on data type of structure.

### 3.3 Model

```
class catparam.CATParam(**kwargs)
```

Defines the model for optimization.

It includes functionalities to read or generate models.

The models are stored as list of model objects, e.g. modelsbx.

#### Todo

generalize models format for other calculators

#### **Parameters**

```
•controls: instance of CATControls
      CATControls object to initialize parameters
•elements: list
      list of chemical symbols
•model: str
      model version
•model_filename: str
      file containing model, can also be path to file
•valences: dict
      dictionary of element:valency
•valenceelectrons: dict
      dictionary of element:number of valence electrons
            None:
                            will
                                     read
                                              valenceelectrons
                                                                   from
            variables.atomic_properties()
•functions: dict
      dictionary of keyword:bondpair:function or keyword:function, function is
      one of the instances in functions module. The latter implies that all bond
      pairs will have the same functional form
•cutoff: dict
      dictionary of cutoff keyword:bondpair:value or keyword:value. The latter
      implies that all bond pairs will have the same value
•pathtobetas: str
      path to betas files
      None: will use variables.pathtobetas()
•pathtoonsites: str
      path to onsites files
      None: will use variables.pathtoonsites()
•betafitstruc: str
```

```
structure from which the betas were derived (see format of betas files)
                        None: will default to 'dimer'
                 •betatype: str
                        method used in beta generation
                        None: will default to 'loewdin'
                 •betabasis: str
                        basis used in beta generation None: will default to 'tz0'
                 •calculator: str
                        name of the calculator
                 •calculator_settings: dict
                        dictionary of controls passed to the calculator
                 •orthogonal: bool
                        orthogonal or non-orthogonal model
                 •data: instance of CATData
                        CATData object to required to generate models
average_modelsbx (iterations='all')
            Returns a model by averaging models in iterations.
            Parameters
                       •iterations: list
                              indices of the models to be averaged
                              all: include all models
calc_rcut (pair, debug=False)
      Returns a dictionary of cut-off keyword: value.
      rcut is set to the distance when the value of the most long-ranged bond integral is 5 percent its value at
      the equilibrium dimer distance. The hierarcy of the range of the bond integrals (m=0) for simplicity is
      assumed as follows:
      ppsigma, spsigma, sssigma, pdsigma, sdsigma, ddsigma
     The cut-off function starts at 15 percent. r2cut is 1.5*rcut and d2cut is 2*dcut
      It also sets the cutoff versions to cosine.
            Parameters
                       •bondpair: list
                              pair of chemical symbols
                       •debug: bool
                              if debug will plot the cut-off values with the reference bond integral
gen jii(elem)
      Returns the Jii parameter. This is read from variables.atomic_properties().
            Parameters
                       •elem: str
                              chemical symbol
gen_model(**kwargs)
            Returns model specific to the calculator.
            Generates model. Calls calculator-specific function to generate model.
            Todo
            Extend to other calculators.
```

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#### **Parameters**

•kwargs: dict

directives for future extensions.

#### gen\_modelsbx (\*\*kwargs)

Returns a modelsbx object. See bopmodel.modelsbx

Generates modelsbx. Calls \_gen\_atomsbx() and \_gen\_bondsbx()

#### **Parameters**

•kwargs : dict

directives for future extensions. For example, *part* can be set to *bond*, *rep* or *all* to specify part of modelsbx that is generated.

#### gen\_onsite(elem)

Returns a dictionary of the valence:onsites read from the onsite file.

It calls the function \_read\_onsites().

The filename must follow the format

```
[structure]_[elem] [elem]_[basis]_[betatype].onsites
```

The structure, basis and betatype are similar to the bond integrals. The onsite is taken as the average over a range of distances.

#### **Todo**

fit distance dependence of onsites

**Note:** Determine if onsite should just be set to zero.

#### **Parameters**

•elem: str

chemical symbol

```
gen_stoner(elem, struc='gs')
```

Returns the Stoner parameter. This is read from variables.atomic\_properties().

..todo:: fit to mag-non mag energy difference of struc

#### **Parameters**

•elem: str

chemical symbol

#### gen\_valenceelectrons(elem)

Returns the number of valence electrons and orbitals. This is read from variables.atomic\_properties().

#### **Parameters**

•elem: str

chemical symbol

#### get\_SED (elem, model, strucs=None)

Returns an array of the bond energy differences of the structures in strucs. The reference is the first structure not necessarily the lowest in energy in order to simplify fitting where one does not need the index of the lowest energy structure.

Calls sedt.energy\_diff() to calculate bond energies of structures adjusted to have the same average second moment.

#### **Parameters**

•elem: str

```
chemical symbol
                      •model: calculator-specific object
                             model to be used by the calculator
                      •strucs: list
                             list of system_ID's corresponding to relaxed structures
                             None: will include all relaxed structures
get_atoms_properties (elem)
     Returns the mass, number of orbitals and valence electrons, Jii, onsite and Stoner parameters. This calls
      gen_valenceelectrons(), gen_jii(), gen_stoner(), gen_onsite().
           Parameters
                      •elem: str
                             chemical symbol
get_cutoffpara(bondpair)
     Returns a dictionary of cut-off keyword: value. Calls calc_rcut()
           Parameters
                      •bondpair: list
                             pair of chemical symbols
get_fitfunc(bondpair)
     Returns a dictionary of keyword:functions
           Parameters
                      •bondpair: list
                             pair of chemical symbols
get initial bondparam(bondpair)
     Returns a dictionary of keyword:functions resulting from the initial fitting of the bond/overlap integrals.
           Parameters
                      •bondpair: list
                             pair of chemical symbols
get_initial_repparam(bondpair)
      Returns a dictionary of keyword:functions resulting from the initial fitting of the dimer repulsive energy
           Parameters
                      •bondpair: list
                             pair of chemical symbols
get_model (iteration=0)
           Returns the model generated at N=iteration step.
           Parameters
                      •iteration: int
                             index of the model in list
read model(**kwargs)
           Returns model specific to the calculator.
           Reads model. Calls calculator-specific function to read model.
           Todo
           Extend to other calculators.
           Parameters
                      •kwargs: dict
```

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directives for future extensions.

```
read modelsbx (**kwargs)
           Returns a modelsbx object. See bopmodel.modelsbx
           Reads modelsbx. Calls bopmodel.read_modelsbx()
                 Parameters
                            •kwargs: dict
                                   directives for future extensions.
class beta.Beta (**kwargs)
     Defines a set of bond integrals for constructing the hamiltonian.
     It reads the data points from a file stored in pathtobetas. A set of functions in fitfuncs is parametrized with
     respect to the data.
     The betas file should be named as [struc]_[ele1][ele2]_[basis]_[betatype].betas
     See the folder betas in the examples folder for reference.
           Parameters
                      •structure: str
                             structure from which the bond integrals were derived
                      •bondpair: tuple
                             pair of chemical symbols
                      •basis: str
                             basis used for downfolding
                      •betatype: str
                             can be unscreened, overlap, loewdin or other beta type
                      •valence: tuple
                             pair of valency, e.g. sd
                      •pathtobetas: str
                             path to betas file
     read_betas()
           Reads in bond integrals from a betamaker output file(.betas) saved in pathtobeta.
                                                                                                        If not
           provided, will read from folder: /betas.
                                                           The filenames must follow the format:
                                                                                                        [struc-
           ture]_[elementA][elementB]_[basis]_[betatype].betas
     set_fitfuncs (fitfuncs)
           Set fitting function, default(sum_exponential)
     zip betas()
```

### 3.4 Calculator

```
class catcalc.CATCalc(**kwargs)
```

Defines a set of calculators to determine required properties.

Returs a dictionary of the bond integrals

The calculators are stored as list of instances of the calculator.

#### **Parameters**

```
    *calculator: str
        name of the calculator
    *calculator_settings: dict
        dictionary of calculator-specific parameters
    *nproc: int
        number of parallel processes
    None: will not parallelize
```

```
default: number of cpu * 2
                 •controls: instance of CATControls
                        CATControls object to initialize parameters
                 •parallel: string
                        serial, multiprocessing, mpi
static calc def ene(atom, kwargs)
     Returns the Atoms object with the calculated defect energy.
     The reference bulk structures are in atom.info['reference atoms'].
           Parameters
                       •atom: instance of ASE Atoms object
                             structure to calculate
                       •kwargs: dict
                             directives for calculator
static calc_ebs (atom, kwargs)
     Returns the Atoms object with the calculated eigenvalues.
            Parameters
                       •atom: instance of ASE Atoms object
                             structure to calculate
                       •kwargs: dict
                             directives for calculator
static calc_efs (atom, kwargs)
     Returns the Atoms object with the calculated energy, forces and stresses.
           Parameters
                       •atom: instance of ASE Atoms object
                             structure to calculate
                       •kwargs: dict
                             directives for calculator
static calculate (atom, kwargs)
     Returns the Atoms object with the calculated property.
     The required property is defined by atom.info['required_property']
     Calls calc_ebs(), calc_efs(), calc_def_ene()
           Parameters
                       •atom: instance of ASE Atoms object
                             structure to calculate
                       •kwargs: dict
                             directives for calculator
get atoms()
      Returns a list of the structures each an ASE Atoms object assigned for calculation.
get calculator(i, update)
      Returns the calculator. If None will initialize the calculator.
           Parameters
                       •update: bool
                             True: will update the model used by the calculator
get_calculators()
     Returns a list of calculators corresponding to each structure
     calls get_calculator()
get_property (**kwargs)
     Returns list of calculated properties for all structures.
```

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```
Calls calculate()
                  Parameters
                             •kwargs: dict
                                    directives for calculator
      get_structures()
            Returns a list of the system ID of all the structures
      pack atoms()
            Pack all properties for the same structure so do only one calculation of all properties for one structure.
      set_atoms (atoms)
            Set the structures for calculation. The calculators and results are reset.
                  Parameters
                             •atoms: list
                                    list of ASE Atoms objects
      set_model (model)
            Set the model for the calcuator. The calculators and results are reset.
                  Parameters
                             •model: instance of calculator-specific model
                                    model used for the calculator
3.5 Optimization kernel
class catkernel.CATKernel(**kwargs)
      Defines the optimization kernel.
      It generates the objective function and the optimizer.
            Parameters
                       •controls: instance of CATControls
                              CATControls object to initialize parameters
                       •calc: instance of CATcalc
                              CATcalc object to define the calculator
                       •ref_data: list
                              list of calculated properties
                       •variables: list
                              list of dictionary of contraints on the parameters
                       •objective: callable object
                              should take parameters as argument and return the error
                              None: will generate default objective function
                              str: name of the objective function, should be implemented in
                              CATobjective
                       •optimizer: callable object
                              should return optimized parameters
                              str: name of the optimizer, should be implemented in CAToptimizer
                       •optimizer_options: dict
                              controls to be passed to the optimizer
                       •weights: list
                              weight of each structure in the error
                              None: will assign weight from variables.fit_weights()
                       •log: str
```

output file for writing parameters and error at each optimization step

```
•verbose: int
                              controls verbosity e.g.
                              prints on screen rms at each optimization step if verbose >= 1
                       •dump min model: bool
                              logical flag to switch on dumping of best model at each iteration
      gen objective()
            "Generates the objective function. Standard setting is unknown.
      get_optimized_model()
            Returns the optimized model.
      optimize()
            Builds objective and optimizer objects if not initialized and runs optimization. The resulting model is
            assigned to optimized_model.
      test (param_weights=None)
            Calculates the error for current model with parameters weighted by param_weights
      write_summary()
            Prints to screen the starting and ending parameters.
class catkernel.CATobjective (**kwargs)
      Defines the objective function. Callable with the parameters as argument, will return the corresponding error.
            Parameters
                       •calc: instance of CATcalc
                              CATcalc object to define the calculator
                       •ref data: list
                              list of calculated properties
                       •variables: list
                              list of dictionary of contraints on the parameters
                       •penalty_coeffs: list
                              list of penalty coefficients for individual coefficients
                       •weights: list
                              weight of each structure in the error
                              None: will assign weight from variables.fit_weights()
                       •log: str
                              output file for writing parameters and error at each optimization step
                       •error vec log: str
                              output file for writing error for each structure at each optimization step
                       •verbose: bool
                              prints on screen rms at each optimization step
                       •array: bool
                              if error is vector or scalar
                       •name: str
                              name of the objective function
                       •dump_min_model: bool
                              logical flag to switch on dumping of best model at each iteration
      default(x0)
            Default objective function.
            Returns the diffferences between the calculated properties and the reference.
      difference(x0)
```

3.5. Optimization kernel

Objective function for energy differences calculations.

Returns the differences between delta(calculated properties) and delta(reference):

```
delta_data = data[:len(data)/2] - data[len(data)/2:]
```

#### is\_bond\_required()

Checks if bond-related parameters are included in fit

#### write()

Dumps the parameters and errors at each step on files.

### class catkernel.CAToptimizer(\*\*kwargs)

Defines the optimizer. Callable and returns the optimized parameters.

#### **Parameters**

•objective: callable object

should take parameters as argument and return the error

•*x0*: list

initial guess for parameters

•optimizer\_options: dict

controls to be passed to the optimizer

•name: str

name of the optimizer

### 3.6 BOPfox-ASE interface

In order to define a calculator, the user should provide a modelsbx, or atomsbx and bondsbx. These can either be objects (see modelsbx, atomsbx and bondsbx), filenames or paths. In addition, bopfox input controls (infox parameters) can be optionally provided, otherwise the calculator is expecting an infox.bx file on current working directory. The calculator has other attributes on top of those of ASE such as <code>get\_moments()</code>

#### Todo

extend ASE Atoms object to call BOPfox native functions.

#### **Parameters**

•atomsbx: str or instance of atomsbx used to create atoms.bx

None: will use modelsbx •bondssbx: str or instance of bondsbx used to create bonds.bx

None: will use modelsbx
•modelsbx: str or instance of modelsbx
used to create models.bx

None: will use modelsbx

•bopfox: str

bopfox executable

•savelog: bool

logical flag to save log file for further anaylis

```
•mem limit: float
                             sets memory limit for bopfox calculation
                       •ignore errors: bool
                             logical flag to skip bopfox errors
                       •root_tmp_folder: str
                             directory where a tmp folder will be generated
                       •debug: bool
                             logical flag for debugging purposes, will not delete temporary folders
                       •kpoints: list
                             coordinates of kpoints to be used for tight-binding band structure calcula-
                       •kwargs:
                             optional keyword arguments to be written in infox, if not provided will use
                             infox.bx
     calculate(*args)
           Sets up a temporary foler for perfoming a BOPfox calculation. Then writes the corresponding files and
           performs a calculation. Cleans up afterwards.
     get mode()
           Returns the calculation mode (string).
     get_moments (atom_index=0, moment=2)
           Returns the moments.
           If the atom index is 0, then average will be returned If the atom index is NOT an integer, it will return all
           moments
     get_name()
            Returns the name of the calculator (string).
     inspect_modelsbx (key, vtype=<type 'str'>)
            Checks the value of key in modelsbx.
     write_infox(**kwargs)
            Writes infox.bx from input parameters, atomsbx and bondsbx compatible.
     write_infox_new(**kwargs)
            Writes infox.bx from input parameters, models.bx compatible.
class bopmodel.atomsbx (**kwargs)
     Defines an atoms.bx object for BOPfox.
     get_atom()
           Returns the element in the atoms.bx object
     get mass()
           Returns the mass of the element
     get_version()
            Returns the version of the atoms.bx object
     rattle (var='all', factor='random', maxf=0.1)
            Generate a modified atomsbx with parameters defined in var modified by factor.
                 Parameters
                 •var: dictionary of key, constraints
                 •factor: float
     write(filename='atoms.bx', update=False)
            Writes out atomsbx object to file. The keyword update does not necessarily mean that atomsbx is updated.
```

```
It just means that succeeding entries will not have the header 'Version'.
```

```
class bopmodel.bondsbx (**kwargs)
```

Defines a bonds.bx object for BOPfox.

#### get\_bond()

Returns the elements in the bonds object

#### get\_version()

Returns the version of the bonds object

```
rattle (var='all', factor='random', maxf=0.1)
```

Generate a modified bondsbx with parameters defined in var modified by factor.

#### **Parameters**

```
•var: dictionary of key, constraints
```

•factor: float

```
write (filename='bonds.bx', update=False)
```

Writes bondsbx object to file update means that you read the current bonds.bx file and write it with bopbonds

```
class bopmodel.modelsbx (**kwargs)
```

Defines a modelsbx object in BOPfox

```
bond_parameters_to_functions (bondlist='all', variables=None)
```

Convert list of parameters in bondsbx to corresponding function (see :mod functions)

```
rattle (var='all', factor='random', maxf=0.1)
```

Generate a modified bondsbx with parameters defined in var modified by factor.

#### **Parameters**

### 3.7 Miscellaneous

```
class beta.Beta(**kwargs)
```

Defines a set of bond integrals for constructing the hamiltonian.

It reads the data points from a file stored in pathtobetas. A set of functions in fitfuncs is parametrized with respect to the data.

The betas file should be named as [struc]\_[ele1][ele2]\_[basis]\_[betatype].betas

See the folder betas in the examples folder for reference.

#### **Parameters**

```
    *structure: str
        structure from which the bond integrals were derived
    *bondpair: tuple
        pair of chemical symbols
    *basis: str
        basis used for downfolding
    *betatype: str
        can be unscreened, overlap, loewdin or other beta type
    *valence: tuple
        pair of valency, e.g. sd
```

### •pathtobetas: str path to betas file

#### read\_betas()

Reads in bond integrals from a betamaker output file(.betas) saved in pathtobeta. If not provided, will read from folder: /betas. The filenames must follow the format: [structure]\_[elementA][elementB]\_[basis]\_[betatype].betas

### set\_fitfuncs (fitfuncs)

Set fitting function, default(sum\_exponential)

### zip\_betas()

Returs a dictionary of the bond integrals

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