
Descent Documentation

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`descent` is a library for performing optimization.

Contents:

1.1 Basic

The easiest way to install is with `pip`:

```
$ pip install descent
```

You can also install from source by grabbing the code from GitHub:

```
$ git clone https://github.com/nirum/descent.git
$ cd descent
$ pip install -r requirements.txt
$ python setup.py install
```

1.2 Dependencies

Descent works on Python 3.4-3.5. It has only been tested on CPython (not tested on PyPy yet!).

In addition, descent requires the following packages:

- `numpy`
- `toolz`
- `multipledispatch`
- `future`

And the following are optional:

- `scipy`

1.3 Development

Please submit any issues to the [GitHub issue tracker](#).

To contribute to descent, you'll need to also install `sphinx` and `numpydoc` for documentation and `nose` for testing. We adhere to the [NumPy/SciPy documentation standards](#).

2.1 Overview

This document is a work in progress, but for now, check out example code:

2.2 Gradient-based algorithms

Each of the gradient based algorithms has the following interface. Given a function `f_df` that computes the objective and gradient of the function you want to minimize:

```
>>> opt = descent.GradientDescent(theta_init, f_df, 'sgd', {'lr': learning_rate})
>>> opt.run(maxiter=1000)
>>> plt.plot(opt.theta)
```

2.3 Proximal algorithms

Example code for ADMM, for solving a linear system with a sparsity penalty:

```
>>> opt = descent.Consensus(theta_init)
>>> opt.add('linsys', A, b)
>>> opt.add('sparse', 0.1)
>>> opt.run()
>>> plt.plot(opt.theta)
```

2.4 Storage

After calling the `run` command, the history of objective values is stored on the optimizer object:

```
>>> opt.run(maxiter=1000)
>>> plt.plot(opt.storage['objective'])
```

2.5 Utilities

Some other features that might be of interest:

- memoization (see: `descent.utils.wrap`)
- function wrapping (see: `descent.utils.destruct` and `descent.utils.restruct`)
- gradient checking (see: `descent.check_grad`)

2.6 Tutorial

There is a tutorial consisting of jupyter notebooks demoing the features of descent at: github.com/nirum/descent-tutorial.

Proximal Operators

The `proximal_operators` module contains functions to compute the following proximal operators:

- Proximal operator of the nuclear norm (`nucnorm`)
- Proximal operator of the l1 norm (`sparse`)
- Proximal operator corresponding to solving a linear system of equations (`linsys`)
- Proximal operator of the l2 norm, a squared error penalty (`squared_error`)
- Proximal operator for minimizing an arbitrary smooth function given an oracle that computes the function value and gradient (`lbfgs`)
- Proximal operator for the l2 penalty of the discrete different operator, to encourage smoothness (`smooth`)
- Projection onto the non-negative orthant (`nonneg`)
- Projection onto the semidefinite cone (`semidefinite_cone`)

4.1 Main optimization loops

class `descent.main.Consensus` (*tau*=(10.0, 2.0, 2.0), *tol*=(1e-06, 0.001))

Bases: `descent.main.Optimizer`

add (*operator*, **args*)

Adds a proximal operator to the list of operators

minimize (*x0*, *display*=None, *maxiter*=inf)

`descent.main.gradient_optimizer` (*coro*)

Turns a coroutine into a gradient based optimizer.

4.2 Gradient algorithms

First order gradient descent algorithms

`descent.algorithms.sgd`

alias of `GradientOptimizer`

`descent.algorithms.nag`

alias of `GradientOptimizer`

`descent.algorithms.rmsprop`

alias of `GradientOptimizer`

`descent.algorithms.sag`

alias of `GradientOptimizer`

`descent.algorithms.smorms`

alias of `GradientOptimizer`

`descent.algorithms.adam`

alias of `GradientOptimizer`

4.3 Proximal operators

Proximal operators / mappings

`descent.proxops.nucnorm`
alias of `ProxOp`

`descent.proxops.sparse`
alias of `ProxOp`

class `descent.proxops.linsys` (A, b)
Bases: `descent.proxops.ProximalOperatorBaseClass`

`descent.proxops.squared_error`
alias of `ProxOp`

`descent.proxops.identity`
alias of `ProxOp`

`descent.proxops.lbfgs`
alias of `ProxOp`

`descent.proxops.tvd`
alias of `ProxOp`

`descent.proxops.smooth`
alias of `ProxOp`

`descent.proxops.linear`
alias of `ProxOp`

`descent.proxops.fantope`
alias of `ProxOp`

4.4 Objectives

Example objectives

`descent.objectives.rosenbrock` (θ)
Objective and gradient for the rosenbrock function

`descent.objectives.sphere` (θ)
l2-norm of the parameters

`descent.objectives.matyas` (θ)
Matyas function

`descent.objectives.beale` (θ)
Beale's function

`descent.objectives.booth` (θ)
Booth's function

`descent.objectives.mccormick` (θ)
McCormick function

`descent.objectives.camel` (θ)
Three-hump camel function

`descent.objectives.michalewicz` (θ)

`descent.objectives.bohachevsky1(theta)`
One of the Bohachevsky functions

`descent.objectives.zakharov(theta)`
Zakharov function

`descent.objectives.dixon_price(theta)`
Dixon-Price function

4.5 Utilities

`descent.utils.check_grad(f_df, xref, stepsize=1e-06, tol=1e-06, width=15, style='round', out=<_io.TextIOWrapper name='<stdout>' mode='w' encoding='UTF-8'>)`
Compares the numerical gradient to the analytic gradient

Parameters

- **f_df** (*function*) – The analytic objective and gradient function to check
- **x0** (*array_like*) – Parameter values to check the gradient at
- **stepsize** (*float, optional*) – Stepsize for the numerical gradient. Too big and this will poorly estimate the gradient. Too small and you will run into precision issues (default: 1e-6)
- **tol** (*float, optional*) – Tolerance to use when coloring correct/incorrect gradients (default: 1e-5)
- **width** (*int, optional*) – Width of the table columns (default: 15)
- **style** (*string, optional*) – Style of the printed table, see `tableprint` for a list of styles (default: 'round')

`descent.utils.destruct(*args, **kwargs)`
Deconstructs the input into a 1-D numpy array

`descent.utils.restruct(*args, **kwargs)`
Reshapes the input into the type of the second argument

`descent.utils.wrap(f_df, xref, size=1)`
Memoizes an objective + gradient function, and splits it into two functions that return just the objective and gradient, respectively.

Parameters

- **f_df** (*function*) – Must be unary (takes a single argument)
- **xref** (*list, dict, or array_like*) – The form of the parameters
- **size** (*int, optional*) – Size of the cache (Default=1)

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