
OPTALG Documentation

Release 1.1.8

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Welcome! This is the documentation for OPTALG version 1.1.8, last updated Nov 30, 2019.

What is OPTALG?

OPTALG is a Python package that provides algorithms, wrappers, and tools for solving large and sparse optimization problems.

License

OPTALG is released under the BSD 2-clause license.

Contents

This section describes how to get started with OPTALG.

1.1 Installation

In order to install OPTALG, the following tools are needed:

- Linux and Mac OS X:
 - C compiler
 - [Make](#)
 - [Python](#) (2.7 or 3.6)
 - [pip](#)
- Windows:
 - [Anaconda](#) (for Python 2.7)
 - [MinGW](#) (use `pip install -i https://pypi.anaconda.org/carllkl/simple mingwpy`)
 - [7-Zip](#) (update system path to include the 7z executable, typically in C:\Program Files\7-Zip)

After getting these tools, the OPTALG Python module can be installed using:

```
pip install numpy cython
pip install optalg
```

By default, no wrappers are built for any external solvers. If the environment variable `OPTALG_IPOPT` has the value `true` during the installation, OPTALG will download and build the solver [IPOPT](#) for you, and then build its Python wrapper. Similarly, if the environment variables `OPTALG_CLP` and `OPTALG_CBC` have the value `true` during the installation, OPTALG will download and build the solvers [Clp](#) and [Cbc](#) for you, and then build their Python wrappers.

Note: Currently, the installation with `Clp` and `Cbc` does not work on Windows.

To install the module from source, the code can be obtained from <https://github.com/ttinoco/OPTALG>, and then the following commands can be executed on the terminal or Anaconda prompt from the root directory of the package:

```
pip install numpy cython
python setup.py install
```

Running the unit tests can be done with:

```
pip install nose
python setup.py build_ext --inplace
nosetests -s -v
```

Optimization Solvers

In OPTALG, optimization solvers are objects of type *OptSolver*, and optimization problems are objects of type *OptProblem* and represent general problems of the form

$$\begin{aligned} &\text{minimize} && \varphi(x) \\ &\text{subject to} && Ax = b \quad : \lambda \\ & && f(x) = 0 \quad : \nu \\ & && l \leq x \leq u \quad : \pi, \mu \\ & && Px \in \mathbb{Z}^m, \end{aligned}$$

where P is a matrix that extracts a sub-vector of x .

Before solving a problem with a specific solver, the solver parameters can be configured using the method *set_parameters()*. Then, the *solve()* method can be invoked with the problem to be solved as its argument. The status, optimal primal variables, and optimal dual variables can be extracted using the class methods *get_status()*, *get_primal_variables()*, and *get_dual_variables()*, respectively.

2.1 NR

This solver, which corresponds to the class *OptSolverNR*, solves problems of the form

$$\begin{aligned} &\text{find} && x \\ &\text{subject to} && Ax = b \\ & && f(x) = 0 \end{aligned}$$

using the Newton-Raphson algorithm. It requires the number of variables to be equal to the number of constraints.

2.2 Clp and ClpCMD

These are wrappers of the solver `Clp` from COIN-OR. They corresponds to the classes `OptSolverClp` and `OptSolverClpCMD`, and solve problems of the form

$$\begin{aligned} &\text{minimize} && c^T x \\ &\text{subject to} && Ax = b \quad : \lambda \\ &&& l \leq x \leq u \quad : \pi, \mu. \end{aligned}$$

Linear optimization problems solved with these solvers must be instances of the class `LinProblem`, which is a subclass of `OptProblem`.

2.3 Cbc and CbcCMD

These are wrappers of the solver `Cbc` from COIN-OR. They correspond to the classes `OptSolverCbc` and `OptSolverCbcCMD`, and solve problems of the form

$$\begin{aligned} &\text{minimize} && c^T x \\ &\text{subject to} && Ax = b \\ &&& l \leq x \leq u \\ &&& Px \in \mathbb{Z}^m. \end{aligned}$$

Mixed-integer linear optimization problems solved with these solvers must be instances of the class `MixIntLinProblem`, which is a subclass of `OptProblem`.

2.4 CplexCMD

This is a wrapper of the solver CPLEX and uses a command-line interface. It corresponds to the class `OptSolverCplexCMD` and solves problems of type `MixIntLinProblem`.

2.5 IQP

This solver, which corresponds to the class `OptSolverIQP`, solves convex quadratic problems of the form

$$\begin{aligned} &\text{minimize} && \frac{1}{2} x^T H x + g^T x \\ &\text{subject to} && Ax = b \quad : \lambda \\ &&& l \leq x \leq u \quad : \pi, \mu \end{aligned}$$

using a primal-dual interior-point algorithm. Quadratic problems solved with this solver must be instances of the class `LinProblem`, which is a subclass of `OptProblem`. The following example shows how to solve the quadratic problem

$$\begin{aligned} &\text{minimize} && 3x_1 - 6x_2 + 5x_1^2 - 2x_1x_2 + 5x_2^2 \\ &\text{subject to} && x_1 + x_2 = 1 \\ &&& 0.2 \leq x_1 \leq 0.8 \\ &&& 0.2 \leq x_2 \leq 0.8 \end{aligned}$$

using `OptSolverIQP`:

```

>>> import numpy as np
>>> from optalg.opt_solver import OptSolverIQP, QuadProblem

>>> g = np.array([3., -6.])
>>> H = np.array([[10., -2],
...               [-2., 10]])

>>> A = np.array([[1., 1.]])
>>> b = np.array([1.])

>>> u = np.array([0.8, 0.8])
>>> l = np.array([0.2, 0.2])

>>> problem = QuadProblem(H, g, A, b, l, u)

>>> solver = OptSolverIQP()

>>> solver.set_parameters({'quiet': True,
...                       'tol': 1e-6})

>>> solver.solve(problem)

>>> print solver.get_status()
solved

```

Then, the optimal primal and dual variables can be extracted, and feasibility and optimality can be checked as follows:

```

>>> x = solver.get_primal_variables()
>>> lam, nu, mu, pi = solver.get_dual_variables()

>>> print x
[ 0.20  0.80 ]

>>> print x[0] + x[1]
1.00

>>> print l <= x
[ True  True ]

>>> print x <= u
[ True  True ]

>>> print pi
[ 9.00e-01  1.80e-06 ]

>>> print mu
[ 1.80e-06  9.00e-01 ]

>>> print np.linalg.norm(g+np.dot(H, x)-np.dot(A.T, lam)+mu-pi)
1.25e-15

>>> print np.dot(mu, u-x)
2.16e-06

>>> print np.dot(pi, x-l)
2.16e-06

```

2.6 INLP

This solver, which corresponds to the class `OptSolverINLP`, solves general nonlinear optimization problems of the form

$$\begin{array}{ll}\text{minimize} & \varphi(x) \\ \text{subject to} & Ax = b \quad : \lambda \\ & f(x) = 0 \quad : \nu \\ & l \leq x \leq u \quad : \pi, \mu\end{array}$$

using a primal-dual interior-point algorithm. It computes Newton steps for solving modified KKT conditions and does not have any global convergence guarantees.

2.7 AugL

This solver, which corresponds to the class `OptSolverAugL`, solves optimization problems of the form

$$\begin{array}{ll}\text{minimize} & \varphi(x) \\ \text{subject to} & Ax = b \quad : \lambda \\ & f(x) = 0 \quad : \nu \\ & l \leq x \leq u \quad : \pi, \mu\end{array}$$

using an Augmented Lagrangian algorithm. It requires the objective function φ to be convex.

2.8 Ipopt

This is a wrapper of the solver `IPOPT` from COIN-OR. It corresponds to the class `OptSolverIpopt`, and solves optimization problems of the form

$$\begin{array}{ll}\text{minimize} & \varphi(x) \\ \text{subject to} & Ax = b \quad : \lambda \\ & f(x) = 0 \quad : \nu \\ & l \leq x \leq u \quad : \pi, \mu.\end{array}$$

3.1 Linear Solvers

`optalg.lin_solver.new_linsolver` (*name*='default', *prop*='unsymmetric')

Creates a linear solver.

Parameters

name [string]

prop [string]

Returns

solver [LinSolver]

class `optalg.lin_solver.lin_solver.LinSolver` (*prop*='unsymmetric')

Linear solver class.

Parameters

prop [{symmetric, unsymmetric}]

analyze (*self*, *A*)

Analyzes structure of *A*.

Parameters

A [matrix]

analyzed = **None**

Flag that specifies whether the matrix has been analyzed.

factorize (*self*, *A*)

Factorizes *A*.

Parameters

A [matrix]

factorize_and_solve (*self*, *A*, *b*)

Factorizes *A* and solves $Ax=b$.

Returns

x [vector]

is_analyzed (*self*)

Determine whether the matrix has been analyzed.

Returns

flags [{True, False}]

name = None

Name (string)

prop = None

Linear system property {'symmetric', 'unsymmetric'}.

solve (*self*, *b*)

Solves system $Ax=b$.

Parameters

b: vector

Returns

x [vector]

class optalg.lin_solver.mumps.**LinSolverMUMPS** (*prop*='unsymmetric')

Linear solver based on MUMPS.

class optalg.lin_solver.superlu.**LinSolverSUPERLU** (*prop*='unsymmetric')

Linear solver based on SuperLU.

class optalg.lin_solver.umfpack.**LinSolverUMFPACK** (*prop*='unsymmetric')

Linear solver based on UMFPACK.

3.2 Optimization Problems

class optalg.opt_solver.problem.**OptProblem**

Class for representing general optimization problems.

Parameters

problem [Object]

A = None

Matrix for linear equality constraints

H_combined = None

Linear combination of Hessians of nonlinear constraints

Hphi = None

Objective function Hessian (lower triangular)

J = None

Jacobian of nonlinear constraints

P = None

Integer flags (boolean array)

b = None
Right-hand side for linear equality constraints

combine_H(*self*, *coeff*, *ensure_psd=False*)
Forms and saves a linear combination of the individual constraint Hessians.

Parameters

coeff [vector]
ensure_psd [{True, 'False'}]

eval(*self*, *x*)
Evaluates the objective value and constraints at the give point.

Parameters

x [vector]

f = None
Nonlinear equality constraint function

get_num_linear_equality_constraints(*self*)
Gets number of linear equality constraints.

Returns

num [int]

get_num_nonlinear_equality_constraints(*self*)
Gets number of nonlinear equality constraints.

Returns

num [int]

get_num_primal_variables(*self*)
Gets number of primal variables.

Returns

num [int]

gphi = None
Objective function gradient

l = None
Lower limits

lam = None
Lagrange multipliers for linear equality constraints

mu = None
Lagrange multipliers for upper limits

nu = None
Lagrange multipliers for nonlinear equality constraints

phi = None
Objective function value

pi = None
Lagrange multipliers for lower limits

recover_dual_variables(*self*, *lam*, *nu*, *mu*, *pi*)
Recovers dual variables for original problem.

Parameters**lam** [ndarray]**nu** [ndarray]**mu** [ndarray]**pi** [ndarray]**recover_primal_variables** (*self*, *x*)

Recovers primal variables for original problem.

Parameters**x** [ndarray]**show** (*self*, *inf*=100000000.0)

Displays information about the problem.

to_lin (*self*)

Converts problem to linear problem.

Returns**p** [*LinProblem*]**to_mixintlin** (*self*)

Converts problem to mixed integer linear problem.

Returns**p** [*MixIntLinProblem*]**to_quad** (*self*)

Converts problem to quadratic problem.

Returns**p** [*LinProblem*]**u = None**

Upper limits

wrapped_problem = None

Wrapped problem

x = None

Initial point

```
class optalg.opt_solver.problem_lin.LinProblem(c, A, b, l, u, x=None, lam=None,  
                                              mu=None, pi=None)
```

Linear program class.

Parameters**c** [vector]**A** [matrix]**l** [vector]**u** [vector]**x** [vector]

class optalg.opt_solver.problem_mixintlin.**MixIntLinProblem**(*c, A, b, l, u, P, x=None*)

Mixed integer linear program class.

Parameters

c [vector]

A [matrix]

l [vector]

u [vector]

P [boolean array]

class optalg.opt_solver.problem_quad.**QuadProblem**(*H, g, A, b, l, u, x=None, lam=None, mu=None, pi=None*)

Quadratic program class.

Parameters

H [symmetric matrix]

g [vector]

A [matrix]

l [vector]

u [vector]

x [vector]

3.3 Optimization Solvers

class optalg.opt_solver.opt_solver.**OptSolver**

Optimization solver class.

add_callback(*self, c*)

Adds callback funtion to solver.

Parameters

c [Function]

add_termination(*self, t*)

Adds termination condition to solver.

Parameters

t [Function]

callbacks = None

List of callback functions.

fdata = None

Function data container.

get_dual_variables(*self*)

Gets dual variables.

Returns

lam [vector]

nu [vector]

mu [vector]

pi [vector]

get_error_msg (*self*)

Gets solver error message.

Returns

message [string]

get_iterations (*self*)

Gets number of iterations.

Returns

iters [int]

get_primal_variables (*self*)

Gets primal variables.

Returns

variables [ndarray]

get_results (*self*)

Gets results.

Returns

results [dictionary]

get_status (*self*)

Gets solver status.

Returns

status [string]

info_printer = **None**

Information printer (function).

is_status_solved (*self*)

Determines whether the solver solved the given problem.

Returns

flag [{True, False}]

line_search (*self*, *x*, *p*, *F*, *GradF*, *func*, *smax=inf*, *maxiter=40*)

Finds steplength along search direction *p* that satisfies the strong Wolfe conditions.

Parameters

x [current point (ndarray)]

p [search direction (ndarray)]

F [function value at *x* (float)]

GradF [gradient of function at *x* (ndarray)]

func [function of *x* that returns function object with attributes *F* and *GradF* (function)]

smax [maximum allowed steplength (float)]

Returns

s [stephlength that satisfies the Wolfe conditions (float).]

parameters = None

Parameters dictionary.

reset (*self*)

Resets solver data.

set_error_msg (*self*, *msg*)

Sets solver error message.

Parameters

msg [string]

set_info_printer (*self*, *printer*)

Sets function for printing algorithm progress.

Parameters

printer [Function.]

set_parameters (*self*, *parameters*)

Sets solver parameters.

Parameters

parameters [dict]

set_status (*self*, *status*)

Sets solver status.

Parameters

status [string]

solve (*self*, *problem*)

Solves optimization problem.

Parameters

problem [OptProblem]

supports_properties (*self*, *properties*)

Checks whether solver supports properties.

Parameters

properties: list

Returns

flag [{True, False}]

terminations = None

List of termination conditions.

class optalg.opt_solver.nr.**OptSolverNR**

Newton-Raphson algorithm.

class optalg.opt_solver.iqp.**OptSolverIQP**

Interior-point quadratic program solver.

class optalg.opt_solver.inlp.**OptSolverINLP**

Interior-point non-linear programming solver.

```
class optalg.opt_solver.augl.OptSolverAugL
    Augmented Lagrangian algorithm.

class optalg.opt_solver.ipopt.OptSolverIpopt
    Interior point nonlinear optimization algorithm from COIN-OR.

class optalg.opt_solver.clp.OptSolverClp
    Linear programming solver from COIN-OR.

class optalg.opt_solver.clp_cmd.OptSolverClpCMD
    Linear programming solver from COIN-OR (via command-line interface, version 1.15.3).

class optalg.opt_solver.cbc.OptSolverCbc
    Mixed integer linear “branch and cut” solver from COIN-OR.

class optalg.opt_solver.cbc_cmd.OptSolverCbcCMD
    Mixed integer linear “branch and cut” solver from COIN-OR (via command-line interface, version 2.8.5).

class optalg.opt_solver.cplex_cmd.OptSolverCplexCMD
    CPLEX solver interface (via command-line interface).
```

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