# **OPTALG Documentation**

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**Tomas Tinoco De Rubira** 

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Welcome! This is the documentation for OPTALG, last updated February 11, 2017.

#### 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.

#### Contact

• Tomas Tinoco De Rubira

### **Documentation Contents**

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**CHAPTER** 

ONE

#### **GETTING STARTED**

This section describes how to get started with OPTALG. In particular, it covers required packages, installation, and provides a quick example showing how to use this package.

- Numpy (>=1.8.2)
- Scipy (>=0.13.3)
- Dill (>=0.2.5)
- MUMPS (==4.10) (optional)
- IPOPT (>=3.12.6) (optional)

## 1.1 Download

The latest version of OPTALG can be downloaded from https://github.com/ttinoco/OPTALG.

#### 1.2 Installation

The OPTALG Python module can be installed using:

```
> sudo -E python setup.py install
```

from the root directory of the package. If MUMPS is not available, then the option <code>--no\_mumps</code> should be added to the above command. If IPOPT is not available, then the option <code>--no\_ipopt</code> should be added to the above command. Otherwise, you need to define an environment variable <code>IPOPT</code> such that the directories <code>IPOPT/lib</code> and <code>IPOPT/include/coin</code> contain the libraries and header files, respectively, needed by IPOPT.

To test, first execute the command:

```
> python setup.py build_ext --inplace
with --no_mumps or --no_ipopt if necessary, and then nosetests -s -v.
```

## 1.3 Example

As a quick example of how to use OPTALG, consider the task of solving a quadratic program. This can be done as follows:

>>> coming soon

**CHAPTER** 

**TWO** 

#### **OPTIMIZATION SOLVERS**

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

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

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

find 
$$x$$
  
subject to  $Ax = b$   
 $f(x) = 0$ .

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

#### 2.2 IQP

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

$$\begin{array}{ll} \text{minimize} & \frac{1}{2}x^THx + g^Tx \\ \\ \text{subject to} & Ax = b & : \lambda \\ & l \leq x \leq u. & : \pi, \mu \end{array}$$

using an interior point method. Quadratic problems solved with this solver must be instances of the class QuadProblem, which is a subclass of OptProblem. The following example shows how to solve the quadratic

problem

```
3x_1 - 6x_2 + 5x_1^2 - 2x_1x_2 + 5x_2^2
                             subject to x_1 + x_2 = 1
                                       0.2 \le x_1 \le 0.8
                                       0.2 \le x_2 \le 0.8
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])
>>> 1 = 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 1 <= 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
```

## **2.3 LCCP**

This solver, which corresponds to the class <code>OptSolverLCCP</code>, solves convex linearly-constrained problems of the form

```
\begin{array}{ll} \text{minimize} & \varphi(x) \\ \text{subject to} & Ax = b & : \lambda \\ & l < x < u. & : \pi, \mu \end{array}
```

using an interior point method.

## 2.4 AugL

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

$$\begin{array}{ll} \text{minimize} & \varphi(x) \\ \text{subject to} & Ax = b & : \lambda \\ & f(x) = 0. & : \nu \end{array}$$

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

## 2.5 Ipopt

This is a Python wrapper of the interior-point solver IPOPT. It corresponds to the class <code>OptSolverIpopt</code>, and solves optimization problems of the form

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

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## **API REFERENCE**

### 3.1 Linear Solvers

```
optalg.lin_solver.new_linsolver(name, prop)
     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}
     \mathtt{analyze}(A)
          Analyzes structure of A.
              Parameters A: matrix
     analyzed = None
          Flag that specifies whether the matrix has been analyzed.
     factorize(A)
          Factorizes A.
              Parameters A: matrix
     factorize\_and\_solve(A, b)
          Factorizes A and solves Ax=b.
              Returns x: vector
     is_analyzed()
          Determine whether the matrix has been analyzed.
              Returns flags: {True, False}
     prop = None
          Linear system property {'symmetric', 'unsymmetric'}.
     solve(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.
3.2 Optimization Problems
class optalg.opt_solver.problem.OptProblem
     Class for representing general optimization problems.
     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
     b = None
          Right-hand side for linear equality constraints
     combine_H (coeff, ensure_psd=False)
          Forms and saves a linear combination of the individual constraint Hessians.
              Parameters coeff: vector
                  ensure_psd : {True, "False"}
     eval(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()
          Gets number of linear equality constraints.
              Returns num: int
     get_num_nonlinear_equality_constraints()
          Gets number of nonlinear equality constraints.
              Returns num: int
     get_num_primal_variables()
          Gets number of primal variables.
              Returns num: int
     gphi = None
          Objective function gradient
     1 = None
```

Lower limits

## lam = None

Lagrande multipliers for linear equality constraints

#### mu = None

Lagrande multipliers for upper limits

#### nu = None

Lagrande multipliers for nonlinear equality constraints

#### phi = None

Objective function value

#### pi = None

Lagrande multipliers for lower limits

#### show()

Displays information about the problem.

#### u = None

Upper limits

#### x = None

Initial point

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

1: vector

 $\mathbf{u}$ : vector

x : vector

## 3.3 Optimization Solvers

```
{\bf class} \; {\tt optalg.opt\_solver.opt\_solver.OptSolver}
```

Optimization solver class.

#### $add_callback(c)$

Adds callback funtion to solver.

Parameters c: Function

#### $add\_termination(t)$

Adds termination condition to solver.

Parameters t: Function

#### callbacks = None

List of callback functions.

#### fdata = None

Function data container.

#### get\_dual\_variables()

Gets dual variables.

```
Returns lam: vector
             nu: vector
             mu: vector
             pi: vector
get_error_msg()
     Gets solver error message.
         Returns message: string
get_iterations()
     Gets number of iterations.
         Returns iters: int
get_primal_variables()
     Gets primal variables.
         Returns variables: ndarray
get_results()
     Gets results.
         Returns results: dictionary
get_status()
     Gets solver status.
         Returns status: string
info\_printer = None
     Information printer (function).
is status solved()
     Determines whether the solver solved the given problem.
         Returns flag: {True, False}
line_search (x, p, F, GradF, func, smax=inf)
     Finds steplength along search direction p that satisfies the strong Wolfe conditions.
         Parameters x: current point (ndarray)
             p: search direction (ndarray)
             \mathbf{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()
     Resets solver data.
set_error_msg(msg)
     Sets solver error message.
         Parameters msg: string
```

#### set\_info\_printer(printer)

Sets function for printing algorithm progress.

Parameters printer: Function.

#### set\_parameters (parameters)

Sets solver parameters.

Parameters parameters: dict

#### set\_status(status)

Sets solver status.

Parameters status: string

#### solve (problem)

Solves optimization problem.

Parameters problem: OptProblem

#### 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.lccp.OptSolverLCCP
 Interior-point solver for linearly-constrained convex programs.

class optalg.opt\_solver.augl.OptSolverAugL
 Augmented Lagrangian algorithm.

class optalg.opt\_solver.ipopt.OptSolverIpopt
 Interior point nonlinear optimization algorithm.

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