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# **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**



## 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` ( $\geq 1.8.2$ )
- `Scipy` ( $\geq 0.13.3$ )
- `Dill` ( $\geq 0.2.5$ )
- `MUMPS` ( $= 4.10$ ) (optional)
- `IPOPT` ( $\geq 3.12.6$ ) (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 `--no_mumps` should be added to the above command. If `IPOPT` is not available, then the option `--no_ipopt` should be added to the above command. Otherwise, you need to define an environment variable `IPOPT` such that the directories `IPOPT/lib` and `IPOPT/include/coin` contain the libraries and header files, respectively, needed by `IPOPT`.

### 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
```





## 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

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

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

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

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

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

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

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

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
```

## 2.3 LCCP

This solver, which corresponds to the class `OptSolverLCCP`, solves convex linearly-constrained problems of the form

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

using an interior point method.

## 2.4 AugL

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

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

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 `OptSolverIpopt`, and solves optimization problems of the form

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



## 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`}

**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

**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

**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

**l** : vector

**u** : vector

**x** : vector

### 3.3 Optimization Solvers

**class** optalg.opt\_solver.opt\_solver.**OptSolver**  
Optimization solver class.

**add\_callback** (*c*)  
Adds callback function 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)

**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* : steplength 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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