## exacthessian

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This file is part of CasADi.

CasADi -- A symbolic framework for dynamic optimization.

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## 1 Exact Hessian

```
[1]: from casadi import *
from numpy import *
import casadi as c
```

We will investigate the use of an exact Hessian with the help of the Rosenbrock function

```
[2]: x=SX.sym('x')
y=SX.sym('y')
obj = (1-x)**2+100*(y-x**2)**2
constr = x**2+y**2
nlp={'x':vertcat(x,y), 'f':obj, 'g':constr}
```

We solve the problem with an exact Hessian (default)

```
[3]: solver = nlpsol('solver', 'ipopt', nlp)
    sol = solver(lbx=-10, ubx=10, lbg=0, ubg=1)
    print('Optimal solution (exact Hessian): %s' % sol['x'])
    This program contains Ipopt, a library for large-scale nonlinear optimization.
     Ipopt is released as open source code under the Eclipse Public License (EPL).
            For more information visit https://github.com/coin-or/Ipopt
    This is Ipopt version 3.14.11, running with linear solver MUMPS 5.4.1.
    Number of nonzeros in equality constraint Jacobian ...:
    Number of nonzeros in inequality constraint Jacobian.:
                                                              2
    Number of nonzeros in Lagrangian Hessian ...:
    Total number of variables ...:
                       variables with only lower bounds:
                                                              0
                  variables with lower and upper bounds:
                                                              2
                       variables with only upper bounds:
                                                              0
    Total number of equality constraints ...:
    Total number of inequality constraints ...:
           inequality constraints with only lower bounds:
                                                              0
      inequality constraints with lower and upper bounds:
                                                              1
           inequality constraints with only upper bounds:
    iter
                       inf pr
                                inf_du lg(mu) ||d|| lg(rg) alpha_du alpha_pr
           objective
      0 1.0000000e+00 0.00e+00 2.00e+00 -1.0 0.00e+00
                                                        - 0.00e+00 0.00e+00
       1 6.8309610e+01 0.00e+00 4.32e+02 -1.0 9.09e-01
                                                        - 1.36e-02 1.00e+00H 1
      2 6.2418830e+00 0.00e+00 7.25e+01 -1.0 3.06e-01
                                                        - 6.76e-01 1.00e+00F
      3 6.3023184e-02 0.00e+00 5.46e-01 -1.0 2.58e-01
                                                        - 9.97e-01 1.00e+00f
      4 6.5589711e-02 0.00e+00 5.27e-03 -1.7 4.84e-02
                                                        - 1.00e+00 1.00e+00h
      5 5.0619847e-02 0.00e+00 3.07e-01 -3.8 9.95e-02
                                                        - 9.05e-01 1.00e+00f
      6 4.6180852e-02 0.00e+00 2.45e-02 -3.8 3.71e-02
                                                        - 1.00e+00 1.00e+00h
      7 4.5822797e-02 0.00e+00 1.76e-04 -3.8 3.26e-03
                                                        - 1.00e+00 1.00e+00h
      8 4.5677137e-02 0.00e+00 3.59e-05 -5.7 1.20e-03
                                                        - 1.00e+00 1.00e+00h 1
      9 4.5676652e-02 0.00e+00 3.22e-10 -5.7 4.39e-06
                                                        - 1.00e+00 1.00e+00h
                       inf_pr
                               inf_du lg(mu) ||d|| lg(rg) alpha_du alpha_pr ls
    iter
           objective
      10 4.5674810e-02 0.00e+00 5.78e-09 -8.6 1.52e-05
                                                        - 1.00e+00 1.00e+00h 1
    Number of Iterations...: 10
                                     (scaled)
                                                            (unscaled)
                                         4.5674810088672947e-02
    Objective ...:
                 4.5674810088672947e-02
    Dual infeasibility...:
                         5.7761012971635439e-09
                                                 5.7761012971635439e-09
```

0.0000000000000000e+00

0.000000000000000e+00

Constraint violation...:

```
2.5919940506206774e-09
                                                  2.5919940506206774e-09
    Complementarity...:
    Overall NLP error...:
                          5.7761012971635439e-09
                                                    5.7761012971635439e-09
    Number of objective function evaluations
                                                         = 14
    Number of objective gradient evaluations
                                                         = 11
    Number of equality constraint evaluations
    Number of inequality constraint evaluations
    Number of equality constraint Jacobian evaluations
    Number of inequality constraint Jacobian evaluations = 11
    Number of Lagrangian Hessian evaluations
                                                         = 10
    Total seconds in IPOPT
                                                         = 0.007
    EXIT: Optimal Solution Found.
          solver :
                                  (avg) t_wall
                                                      (avg)
                      t_proc
                                                               n_{eval}
           nlp_f | 190.00us ( 13.57us) 23.90us ( 1.71us)
                                                                   14
           nlp_g | 158.00us (11.29us) 37.31us (2.66us)
                                                                   14
      nlp_grad_f | 91.00us ( 7.58us) 24.61us ( 2.05us)
                                                                   12
      nlp_hess_1 | 73.00us ( 7.30us) 18.64us ( 1.86us)
                                                                   10
       nlp jac g | 77.00us ( 6.42us) 19.85us ( 1.65us)
                                                                   12
           total | 29.86ms (29.86ms)
                                        7.93ms ( 7.93ms)
                                                                    1
    Optimal solution (exact Hessian): [0.786415, 0.617698]
    Same problem but with limited memory BFSG
[4]: solver = nlpsol('solver', 'ipopt', nlp, {'ipopt.hessian_approximation':
     sol = solver(lbx=-10, ubx=10, lbg=0, ubg=1)
    print('Optimal solution (BFGS): %s' % sol['x'])
    This is Ipopt version 3.14.11, running with linear solver MUMPS 5.4.1.
    Number of nonzeros in equality constraint Jacobian ...:
    Number of nonzeros in inequality constraint Jacobian .:
                                                                  2
    Number of nonzeros in Lagrangian Hessian ...:
    Total number of variables ...:
                         variables with only lower bounds:
                                                                  0
                    variables with lower and upper bounds:
                                                                  2
                         variables with only upper bounds:
    Total number of equality constraints...:
    Total number of inequality constraints...:
            inequality constraints with only lower bounds:
                                                                  0
       inequality constraints with lower and upper bounds:
                                                                  1
            inequality constraints with only upper bounds:
                                                                  0
                                  inf_du lg(mu) ||d|| lg(rg) alpha_du alpha_pr ls
    iter
            objective
                         inf_pr
```

0.000000000000000e+00

0.000000000000000e+00

Variable bound violation:

```
0 1.0000000e+00 0.00e+00 2.00e+00
                                       0.0 0.00e+00
                                                        - 0.00e+00 0.00e+00
     8.1099664e-01 0.00e+00 8.51e+00
                                                          8.49e-01 1.24e-01f
                                      -5.2 1.67e+00
     7.8913241e-01 0.00e+00 7.56e+00
                                      -0.7 3.79e-01
                                                          2.45e-01 1.00e+00F
   3 5.1038399e-01 0.00e+00 2.00e+00
                                      -1.6 1.47e-01
                                                        - 1.00e+00 1.00e+00h
     9.4636921e-01 0.00e+00 1.66e+01
                                      -1.7 2.10e-01
                                                           6.36e-01 1.00e+00H
     4.3659026e-01 0.00e+00 8.99e-01
                                      -2.6 1.70e-01
                                                          1.00e+00 1.00e+00f
   5
     3.9428196e-01 0.00e+00 8.08e-01
                                      -3.2 5.30e-02
                                                          1.00e+00 1.00e+00h
     1.5277780e+00 0.00e+00 3.32e+01
                                       -4.2 3.31e-01
                                                          4.87e-01 1.00e+00H
    3.5006028e-01 0.00e+00 1.56e+00
                                      -3.3 5.71e-01
                                                           1.00e+00 1.00e+00f
     3.1926755e-01 0.00e+00 1.63e+00
                                      -3.9 1.60e-01
                                                           1.00e+00 1.00e+00h
                     inf_pr
                             inf_du lg(mu) ||d|| lg(rg) alpha_du alpha_pr
iter
        objective
  10 2.7958742e-01 0.00e+00 4.47e+00
                                      -4.1 8.31e+00
                                                           1.00e+00 1.15e-02f
  11 4.1529404e-01 0.00e+00 1.74e+01
                                       -4.6 3.79e-01
                                                          7.49e-01 1.00e+00H
  12 1.9552435e-01 0.00e+00 7.94e+00
                                      -3.4 1.93e-01
                                                        - 1.00e+00 1.00e+00f
                                      -4.6 5.10e-02
     1.0284176e-01 0.00e+00 1.20e+00
                                                          1.00e+00 1.00e+00f
  14 7.9168874e-02 0.00e+00 1.74e+00
                                      -6.0 1.24e-01
                                                          1.00e+00 1.00e+00f
  15 6.4711554e-02 0.00e+00 3.50e+00
                                      -7.3 1.52e-01
                                                        - 1.00e+00 1.00e+00h
  16 5.5234143e-02 4.93e-03 3.01e+00
                                      -4.6 1.34e-01
                                                       - 1.00e+00 3.44e-01h
  17 4.7148548e-02 0.00e+00 9.32e-01
                                      -4.3 7.45e-03
                                                          1.00e+00 1.00e+00h
  18 4.5698648e-02 0.00e+00 1.46e-01 -6.0 6.27e-03
                                                          1.00e+00 8.55e-01h 1
  19 4.5674859e-02 0.00e+00 1.07e-03 -6.7 1.78e-04
                                                       - 1.00e+00 9.95e-01h
                             inf du lg(mu) ||d|| lg(rg) alpha du alpha pr ls
iter
        objective
                     inf pr
                                                           1.00e+00 1.00e+00h
  20 4.5674809e-02 0.00e+00 1.79e-07 -8.8 1.52e-06
  21 4.5674808e-02 0.00e+00 2.24e-09 -11.0 1.39e-08
                                                           1.00e+00 1.00e+00h 1
Number of Iterations...: 21
                                   (scaled)
                                                            (unscaled)
             4.5674807514535586e-02
Objective ...:
                                       4.5674807514535586e-02
                       2.2446746822391006e-09
                                                 2.2446746822391006e-09
                        0.000000000000000e+00
                                                   0.000000000000000e+00
                           0.000000000000000e+00
                                                      0.000000000000000e+00
```

Dual infeasibility...: Constraint violation...: Variable bound violation:

Complementarity...: 1.0000913016783289e-11 1.0000913016783289e-11 Overall NLP error...: 2.2446746822391006e-09 2.2446746822391006e-09

```
Number of objective function evaluations
                                                      = 36
Number of objective gradient evaluations
                                                      = 22
Number of equality constraint evaluations
                                                      = 0
Number of inequality constraint evaluations
                                                      = 36
Number of equality constraint Jacobian evaluations
                                                      = 0
Number of inequality constraint Jacobian evaluations = 22
Number of Lagrangian Hessian evaluations
                                                      = 0
Total seconds in IPOPT
                                                      = 0.037
```

EXIT: Optimal Solution Found.

```
solver
            t_proc
                         (avg)
                                 t_wall
                                             (avg)
                                                      n_{eval}
nlp_f | 221.00us ( 6.14us) 52.77us ( 1.47us)
                                                          36
```

```
nlp_g | 388.00us ( 10.78us) 84.29us ( 2.34us) 36

nlp_grad_f | 161.00us ( 7.00us) 37.70us ( 1.64us) 23

nlp_jac_g | 136.00us ( 5.91us) 33.06us ( 1.44us) 23

total | 151.20ms (151.20ms) 37.82ms ( 37.82ms) 1

Optimal solution (BFGS): [0.786415, 0.617698]
```