MPC COVID-19

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1 MPC COVID-19

Modelling and simulation of a COVID-19 compartmental system.

1.1 Modelling

1.1.1 Variables

Variable	Description
$\overline{P_k}$	Total individuals in age group k
S_k	Susceptible individuals from age group k
I_k	Infected individuals from age group k
R_k	Recovered individuals from age group k
D_k	Deceased individuals from age group k
U_k	Vaccination rate for age group k
λ_k	Infection rate for age group k
$C_{j,k}$	Contact rate between age groups j and k
$\gamma_{R,k}$	Recovery rate for age group k
$\gamma_{D,k}$	Decease rate for age group k
n_a	Number of age groups
Δ_t	Sampling Period

1.1.2 Continous Model

$$\begin{aligned} & \text{mtinous Model} \\ & \begin{cases} \frac{dS_k(t)}{dt} = -\lambda_k \cdot S_k(t) \cdot \sum_{j=1}^{n_a} C_{j,k} \cdot I_j(t) - U_k(t) \\ \frac{dI_k(t)}{dt} = \lambda_k \cdot S_k(t) \cdot \sum_{j=1}^{n_a} C_{k,j} \cdot I_j(t) - (\gamma_{R,k} + \gamma_{D,k}) \cdot I_k(t) \\ \frac{dR_k(t)}{dt} = \gamma_{R,k} \cdot I_k(t) + U_k(t) \\ \frac{dD_k(t)}{dt} = \gamma_{D,k} \cdot I_k(t) \end{cases}, k = 1, \dots, n_a \end{aligned}$$

1.1.3 Discrete Model

$$\begin{cases} S_k(n+1) = S_k(n) + \Delta_t \cdot \left(-\lambda_k \cdot S_k(n) \cdot \sum_{j=1}^{n_a} C_{j,k} \cdot I_j(n) - U_k(n) \right) \\ I_k(n+1) = I_k(n) + \Delta_t \cdot \left(\lambda_k \cdot S_k(n) \cdot \sum_{j=1}^{n_a} C_{k,j} \cdot I_j(n) - (\gamma_{R,k} + \gamma_{D,k}) \cdot I_k(n) \right), k = 1, \dots, n_a \\ R_k(n+1) = R_k(n) + \Delta_t \cdot \left(\gamma_{R,k} \cdot I_k(n) + U_k(n) \right) \\ D_k(n+1) = D_k(n) + \Delta_t \cdot \left(\gamma_{D,k} \cdot I_k(n) \right) \end{cases}$$

Considering $\Delta_t = 1$

$$\begin{cases} S_k(n+1) = S_k(n) - \lambda_k \cdot S_k(n) \cdot \sum_{j=1}^{n_a} C_{j,k} \cdot I_j(n) - U_k(n) \\ I_k(n+1) = I_k(n) + \lambda_k \cdot S_k(n) \sum_{j=1}^{n_a} C_{k,j} \cdot I_j(n) - (\gamma_{R,k} + \gamma_{D,k}) \cdot I_k(n) \; , k = 1, \dots, n_a \\ R_k(n+1) = R_k(n) + \gamma_{R,k} \cdot I_k(n) + U_k(n) \\ D_k(n+1) = D_k(n) + \gamma_{D,k} \cdot I_k(n) \end{cases}$$

1.2 Pre-Simulation

1.2.1 Definitions

```
[]: import numpy as np
from helpers import *

P, S_0, I_0, R_0, D_0, 1, C, g_R, g_D, u_max = definitions()
y_0 = wrap(S_0, I_0, R_0, D_0)
n_a = len(P)

t_span = [0, 80]

print(f'Population Total: {sum(P):.0f}')
```

Population Total: 3645243

1.3 Continuous Simulation

```
[]: def system_continuous(t, y, u, u_max, 1, C, g_R, g_D):
    S, I, R, D = unwrap(y)
    dSdt = -1 * S * (C @ I) - u(t, y, u_max)
    dIdt = 1 * S * (C @ I) - (g_R + g_D) * I
    dRdt = g_R * I + u(t, y, u_max)
    dDdt = g_D * I
    return wrap(dSdt, dIdt, dRdt, dDdt)
```

1.3.1 No Vaccination

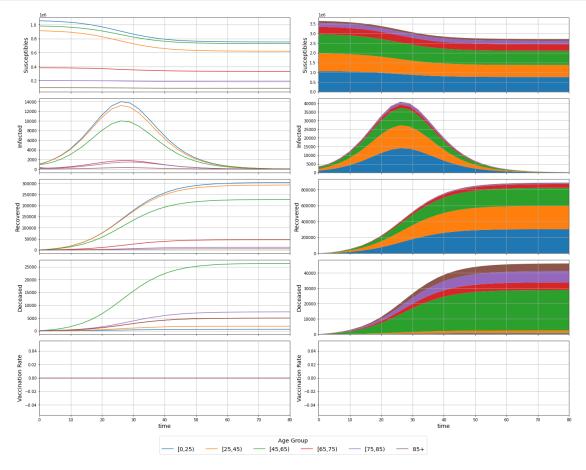
```
[]: from scipy.integrate import solve_ivp

def control(t, y, max):
    return np.zeros(n_a)

sol = solve_ivp(system_continuous, t_span, y_0, args=(control, u_max, l, C,u_sg_R, g_D))
assert(sol.success)

t = sol.t
y = sol.y
S, I, R, D = unwrap(y)
u = recover_control(t, y, control, u_max)

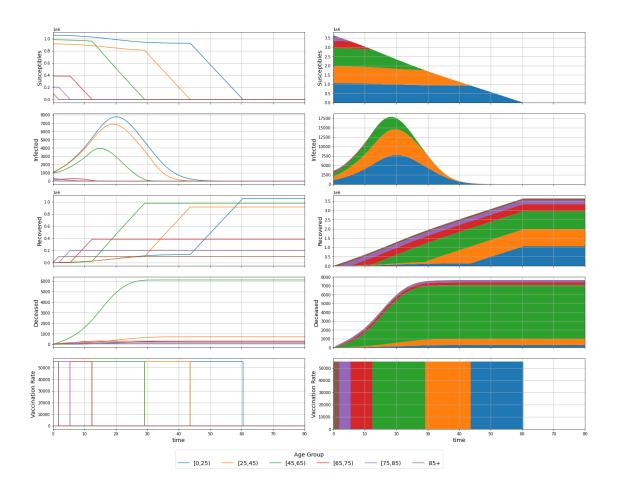
plot(t, y, u)
print(f'Deceased Total: {sum(D[:,-1]):.0f}')
```



Deceased Total: 46089

1.3.2 Vaccination of Older Groups with Exclusivity

```
[]: from scipy.integrate import solve_ivp
     def control(t, y, u_max):
       S, I, R, D = unwrap(y)
       u = np.zeros(n_a)
       for i in reversed(range(n_a)):
         if S[i] > 0:
           u[i] = u_max
           break
       return u
     sol = solve_ivp(system_continuous, t_span, y_0, args=(control, u_max, 1, C,_
      \hookrightarrowg_R, g_D))
     assert(sol.success)
     t = sol.t
     y = sol.y
     S, I, R, D = unwrap(y)
     u = recover_control(t, y, control, u_max)
     plot(t, y, u)
     print(f'Deceased Total: {sum(D[:,-1]):.0f}')
```



1.3.3 Vaccination of Older Groups with Intersection

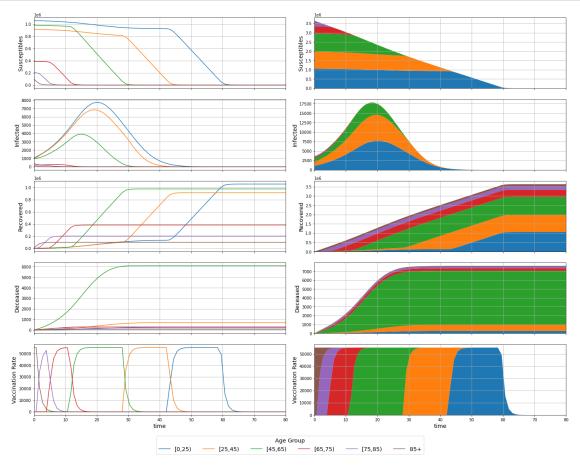
```
[]: from scipy.integrate import solve_ivp

def control(t, y, u_max):
    S, I, R, D = unwrap(y)
    u = np.zeros(n_a)
    remaining = u_max
    for i in reversed(range(n_a)):
        u[i] = min([S[i], remaining])
        remaining = remaining - u[i]
    return u

sol = solve_ivp(system_continuous, t_span, y_0, args=(control, u_max, 1, C,u_sg_R, g_D))
    assert(sol.success)
```

```
t = sol.t
y = sol.y
S, I, R, D = unwrap(y)
u = recover_control(t, y, control, u_max)

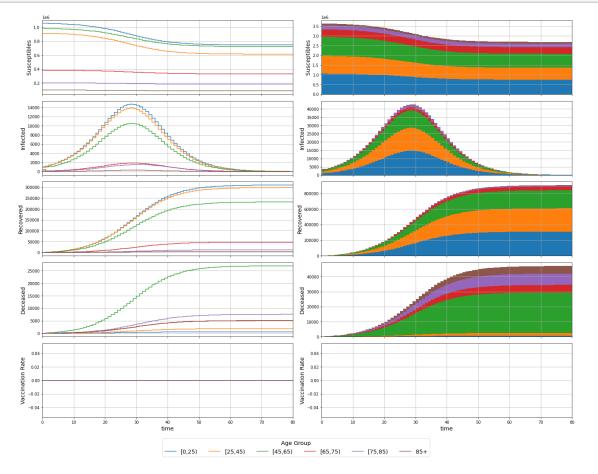
plot(t, y, u)
print(f'Deceased Total: {sum(D[:,-1]):.0f}')
```



1.4 Discrete Simulation

```
[]: def system_discrete(t, y, u, u_max, 1, C, g_R, g_D):
    S, I, R, D = unwrap(y)
    S_ = S - 1 * S * (C @ I) - u(t, y, u_max)
    I_ = I + 1 * S * (C @ I) - (g_R + g_D) * I
    R_ = R + g_R * I + u(t, y, u_max)
    D_ = D + g_D * I
    return wrap(S_, I_, R_, D_)
```

1.4.1 No Vaccination



Deceased Total: 47115

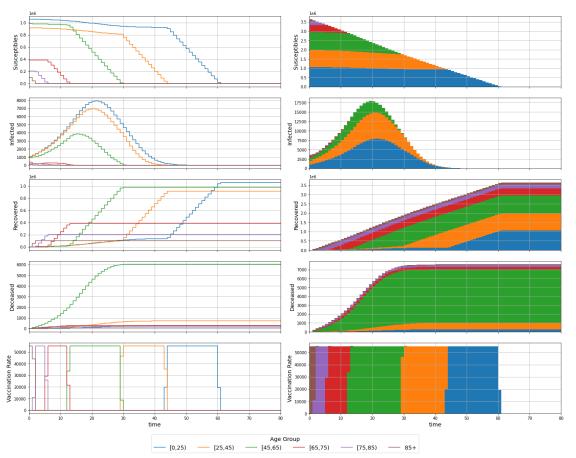
1.4.2 Vaccination of Older Groups

```
[]: def control(t, y, u_max):
    S, I, R, D = unwrap(y)
    u = np.zeros(n_a)
    remaining = u_max
    for i in reversed(range(n_a)):
        u[i] = min([S[i], remaining])
        remaining = remaining - u[i]
    return u

t, y = solve_ivp_discrete(system_discrete, t_span, y_0, args=(control, u_max,u_l, C, g_R, g_D))

S, I, R, D = unwrap(y)
    u = recover_control(t, y, control, u_max)

plot(t, y, u, discrete=True)
    print(f'Deceased Total: {sum(D[:,-1]):.0f}')
```



1.5 MPC

1.5.1 Definitions

```
[]: import numpy as np
     import casadi
     from helpers import *
     P, S_0, I_0, R_0, D_0, 1, C, g_R, g_D, u_max = definitions()
     X_0 = wrap(S_0, I_0, R_0, D_0)
     n_a = len(P)
     S = casadi.MX.sym('S', n_a)
     I = casadi.MX.sym('I', n_a)
     R = casadi.MX.sym('R', n_a)
     D = casadi.MX.sym('D', n_a)
     U = casadi.MX.sym('U', n_a)
     X = wrap(S, I, R, D)
     def system_discrete(X, U):
       S, I, R, D = unwrap(X)
       S_{-} = S - 1 * S * (C @ I) - U
       I_{-} = I + 1 * S * (C @ I) - (g_R + g_D) * I
       R_{-} = R + g_{-}R * I + U
       D_{-} = D + g_{-}D * I
       return wrap(S_, I_, R_, D_)
     f = casadi.Function('f',[X, U],[system_discrete(X, U)],['X', 'U'],['X+'])
     print(f)
```

 $f:(X[24],U[6]) \rightarrow (X+[24])$ MXFunction

1.5.2 Optimization

```
[]: opti = casadi.Opti()

N = 60 # prediction horizon

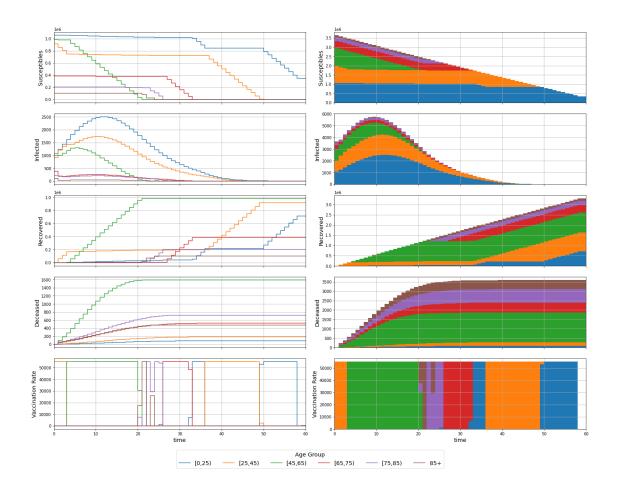
s = opti.variable(n_a, N + 1)
i = opti.variable(n_a, N + 1)
r = opti.variable(n_a, N + 1)
d = opti.variable(n_a, N + 1)
u = opti.variable(n_a, N)
x = wrap(s, i, r, d)
s_0 = opti.parameter(n_a, 1)
```

```
i_0 = opti.parameter(n_a,1)
r_0 = opti.parameter(n_a,1)
d_0 = opti.parameter(n_a,1)
x_0 = wrap(s_0, i_0, r_0, d_0)
opti.minimize(0.1*casadi.sumsqr(i) + 0.9*casadi.sumsqr(d))
opti.subject_to(x[:,0] == x_0) # initial conditions
for k in range(N):
  opti.subject_to(x[:,k+1] == f(x[:,k], u[:,k])) # dynamics
  opti.subject_to(u[:,k] <= s[:,k]) # dynamic control bound</pre>
opti.subject_to(opti.bounded(0,u,u_max)) # individual control bounds
opti.subject to(opti.bounded(0,casadi.sum1(u),u max)) # joint control bounds
opti.set_value(x_0, X_0)
opti.solver('ipopt', {}, {
  'print_level': 0,
})
sol = opti.solve()
t_grid = range(N + 1)
x grid = sol.value(x)
u_grid = np.hstack((sol.value(u), np.nan*np.ones((n_a,1))))
plot(t_grid, x_grid, u_grid, discrete=True)
print(f'Deceased Total: {sum(x_grid[3*n_a:4*n_a,-1]):.0f}')
```

Ipopt is released as open source code under the Eclipse Public License (EPL).

For more information visit https://github.com/coin-or/Ipopt

```
solver :
               t_proc
                           (avg)
                                  t wall
                                              (avg)
                                                      n eval
                    0 (
                                  4.43ms ( 7.32us)
                                                         606
    nlp f |
                             0)
    nlp_g | 210.00ms (346.53us) 157.29ms (259.55us)
                                                         606
               8.00ms (13.96us) 11.82ms (20.63us)
                                                         573
nlp_grad_f |
nlp_hess_l |
               1.47 s ( 2.57ms) 1.43 s ( 2.50ms)
                                                         570
               1.68 s ( 2.93ms)
                                 1.80 s ( 3.13ms)
                                                         574
nlp_jac_g |
    total | 28.03 s (28.03 s) 28.03 s (28.03 s)
                                                           1
```



1.5.3 MPC

```
[]: 0 = opti.to_function('M',[x_0],[u[:,0]],['x_0'],['u'])
    print(0)

M = 1 # control horizon [?]

x_ = X_0
    x_log = np.empty((0, x_0.shape[0]))
    u_log = np.empty((0, u.shape[0]))
    for i in range(N):
        if i % M == 0:
            u_ = np.array(0(x_))[:,0]

        x_log = np.vstack((x_log, x_))
        u_log = np.vstack((u_log, u_))

        x_ = np.array(f(x_,u_))[:,0]
```

```
t_log = range(N)
x_log = x_log.T
u_log = u_log.T
plot(t_log, x_log, u_log, discrete=True)
print(f'Deceased Total: {sum(x_log[3*n_a:4*n_a,-1]):.0f}')
M:(x_0[24]) \to (u[6]) MXFunction
      solver
                  t_proc
                               (avg)
                                       t_{wall}
                                                    (avg)
                                                             n_{eval}
                 13.00ms (21.45us)
                                       4.83ms (7.97us)
                                                                606
       nlp_f
              | 172.00ms (283.83us) 166.29ms (274.40us)
                                                                606
       nlp_g
  nlp_grad_f
                        0 (
                                  0)
                                      13.06ms (22.79us)
                                                                573
  nlp_hess_l
                  1.50 s (
                            2.63ms)
                                       1.47 s ( 2.59ms)
                                                                570
                   1.85 s ( 3.22ms)
                                       1.89 s ( 3.29ms)
                                                                574
   nlp_jac_g
                 31.26 s ( 31.26 s)
                                      31.25 s ( 31.25 s)
                                                                   1
       total
      solver
                  t proc
                               (avg)
                                       t wall
                                                    (avg)
                                                             n_eval
                 13.00ms (11.29us)
                                       9.46ms ( 8.22us)
       nlp_f
                                                               1151
       nlp_g
              | 416.00ms (361.42us) 327.05ms (284.14us)
                                                               1151
    nlp_grad
                        0 (
                                  0) 561.00us (561.00us)
                                                                   1
                  9.00ms (
                                      25.88ms (23.55us)
  nlp_grad_f
                            8.19us)
                                                               1099
  nlp_hess_1
                  2.92 s ( 2.67ms)
                                       2.89 s ( 2.64ms)
                                                               1094
                  3.62 s ( 3.28ms)
                                       3.74 s ( 3.39ms)
   nlp_jac_g
                                                               1102
       total
                 31.08 s ( 31.08 s)
                                      31.08 s ( 31.08 s)
                                                                   1
      solver
                  t_proc
                               (avg)
                                       t_{wall}
                                                    (avg)
                                                             n_{eval}
                            7.68us)
       nlp_f
                 13.00ms (
                                      14.02ms ( 8.28us)
                                                               1693
       nlp_g
                606.00ms (357.94us) 481.18ms (284.22us)
                                                               1693
    nlp_grad
                        0 (
                                  0)
                                       1.11ms (557.50us)
                                                                   2
  nlp_grad_f
                 18.00ms ( 11.09us)
                                      38.43ms ( 23.68us)
                                                               1623
                  4.46 s ( 2.75ms)
                                       4.30 s ( 2.65ms)
  nlp_hess_l
                                                               1621
                  5.47 s ( 3.35ms)
                                       5.58 s ( 3.41ms)
                                                               1635
   nlp_jac_g
       total
                 31.14 s ( 31.14 s)
                                      31.14 s ( 31.14 s)
                                                                   1
                                       t wall
      solver
                  t_proc
                               (avg)
                                                    (avg)
                                                             n_eval
       nlp_f
                 20.00ms ( 8.90us)
                                      18.82ms ( 8.37us)
                                                               2247
              | 751.00ms (334.22us) 646.41ms (287.68us)
                                                               2247
       nlp_g
                                       1.79ms (596.33us)
    nlp_grad
                        0 (
                                  0)
                                                                   3
  nlp_grad_f
                 20.00ms ( 9.33us)
                                      50.96ms (23.77us)
                                                               2144
                  6.00 s ( 2.80ms)
                                       5.77 s ( 2.69ms)
  nlp_hess_1
                                                               2145
                  7.44 s ( 3.44ms)
                                       7.49 s ( 3.46ms)
                                                               2165
   nlp_jac_g
       total
                 31.68 s ( 31.68 s)
                                      31.68 s ( 31.68 s)
                                                                   1
      solver
                  t_proc
                               (avg)
                                       t_wall
                                                    (avg)
                                                             n_{eval}
                 20.00ms ( 7.37us)
                                      22.68ms ( 8.35us)
                                                               2715
       nlp_f
                855.00ms (314.92us) 779.73ms (287.19us)
       nlp_g
                                                               2715
    nlp_grad
                        0 (
                                  0)
                                       2.43ms (607.00us)
                                                                   4
  nlp_grad_f
                 29.00ms (11.21us)
                                      61.89ms (23.92us)
                                                               2588
  nlp_hess_l
                  7.12 s ( 2.75ms)
                                       6.96 s ( 2.69ms)
                                                               2587
                  9.13 s ( 3.50ms)
                                       9.10 s ( 3.48ms)
                                                               2611
   nlp_jac_g
                 26.71 s ( 26.71 s)
                                      26.71 s ( 26.71 s)
       total
                                                                   1
```

```
solver
                             (avg)
                                     t_wall
                                                           n_{eval}
                t_proc
                                                  (avg)
                                    28.24ms ( 8.28us)
                                                             3409
     nlp_f
               20.00ms ( 5.87us)
                1.02 s (298.33us) 977.86ms (286.85us)
     nlp_g
                                                             3409
  nlp_grad
                      0 (
                                0)
                                     3.12ms (624.80us)
                                                                 5
nlp grad f
               36.00ms (11.48us)
                                    75.15ms (23.97us)
                                                             3135
nlp_hess_1
                8.62 s (
                           2.74ms)
                                     8.50 s ( 2.71ms)
                                                             3141
 nlp_jac_g
               11.16 s ( 3.52ms)
                                    11.13 s ( 3.51ms)
                                                             3173
     total
               35.61 s ( 35.61 s)
                                    35.62 s ( 35.62 s)
                                                                 1
    solver
                                     t wall
                t proc
                             (avg)
                                                  (avg)
                                                           n eval
               32.00ms ( 8.11us)
                                    33.01ms (
     nlp_f
                                               8.37us)
                                                             3945
                1.12 s (282.89us)
                                     1.14 s (290.17us)
                                                             3945
     nlp_g
  nlp_grad
                      0 (
                                     3.83ms (637.83us)
                                                                 6
                                0)
               37.00ms ( 10.14us)
                                    88.14ms ( 24.15us)
nlp_grad_f
                                                             3650
nlp_hess_l
                9.96 s ( 2.72ms)
                                    10.02 s ( 2.74ms)
                                                             3661
               13.10 s ( 3.54ms)
                                    13.10 s ( 3.54ms)
                                                             3699
nlp_jac_g
               35.42 s ( 35.42 s)
                                    35.42 s ( 35.42 s)
                                                                 1
     total
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_eval
     nlp_f
               33.00ms ( 7.45us)
                                    37.12ms ( 8.38us)
                                                             4432
     nlp_g
                1.19 s (267.60us)
                                     1.28 s (289.08us)
                                                             4432
                                                                7
  nlp_grad
                      0 (
                                0)
                                     4.34ms (619.57us)
                                    99.06ms (24.09us)
nlp_grad_f
               37.00ms (
                           9.00us)
                                                             4112
nlp hess 1
               11.15 s ( 2.71ms)
                                    11.23 s ( 2.72ms)
                                                             4121
nlp_jac_g
               14.65 s ( 3.52ms)
                                    14.64 s ( 3.52ms)
                                                             4161
     total
               28.91 s ( 28.91 s)
                                    28.91 s ( 28.91 s)
                                                                 1
    solver
                t_proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n_eval
               35.00ms (
                                    40.81ms ( 8.37us)
     nlp_f
                           7.18us)
                                                             4874
                1.24 s (254.62us)
                                     1.41 s (288.97us)
                                                             4874
     nlp_g
                      0 (
                                     5.00ms (625.50us)
                                                                 8
  nlp_grad
                                0)
               37.00ms (
                           8.16us) 109.29ms ( 24.09us)
nlp_grad_f
                                                             4537
nlp_hess_l
               12.33 s ( 2.71ms)
                                    12.35 s ( 2.72ms)
                                                             4544
               16.11 s ( 3.51ms)
                                    16.10 s ( 3.51ms)
                                                             4586
 nlp_jac_g
     total
               26.90 s ( 26.90 s)
                                    26.89 s ( 26.89 s)
                                                                 1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_{eval}
               36.00ms ( 6.84us)
                                    44.15ms ( 8.39us)
                                                             5265
     nlp_f
                1.38 s (261.73us)
                                     1.52 s (289.35us)
                                                             5265
     nlp_g
                      0 (
                                     5.79ms (643.89us)
  nlp_grad
                                0)
                                                                 9
nlp grad f
               51.00ms (10.35us) 118.93ms (24.13us)
                                                             4929
nlp_hess_1
               13.38 s ( 2.71ms)
                                    13.49 s ( 2.74ms)
                                                             4934
 nlp_jac_g
               17.71 s ( 3.56ms)
                                    17.49 s ( 3.51ms)
                                                             4978
               24.40 s ( 24.40 s)
                                    24.40 s ( 24.40 s)
     total
                                                                 1
    solver
                t_proc
                                     t_wall
                             (avg)
                                                  (avg)
                                                           n_eval
                                    47.60ms ( 8.43us)
               40.00ms ( 7.08us)
                                                             5648
     nlp_f
     nlp_g
                1.48 s (261.86us)
                                     1.63 s (289.35us)
                                                             5648
  nlp_grad
                1.00ms (100.00us)
                                     6.52ms (652.00us)
                                                                10
               55.00ms (10.36us) 127.85ms (24.09us)
nlp_grad_f
                                                             5307
nlp_hess_l
               14.32 s ( 2.70ms)
                                    14.50 s ( 2.73ms)
                                                             5310
 nlp_jac_g
               19.14 s ( 3.57ms)
                                    18.80 s ( 3.51ms)
                                                             5356
     total
               23.71 s ( 23.71 s)
                                    23.71 s ( 23.71 s)
                                                                 1
```

```
solver
                             (avg)
                                     t_wall
                                                           n_eval
                t_proc
                                                  (avg)
                                    50.04ms ( 8.30us)
                                                             6027
     nlp_f
               56.00ms ( 9.29us)
                                     1.72 s (284.61us)
     nlp_g
                1.58 s (261.99us)
                                                             6027
  nlp_grad
                1.00ms (90.91us)
                                     7.17ms (652.18us)
                                                               11
nlp grad f
               56.00ms ( 9.86us) 134.72ms ( 23.71us)
                                                             5682
nlp_hess_1
               15.13 s (
                           2.66ms)
                                    15.26 s ( 2.68ms)
                                                             5683
 nlp_jac_g
               20.07 s ( 3.50ms)
                                    19.78 s ( 3.45ms)
                                                             5731
                                    17.28 s ( 17.28 s)
     total
               17.28 s ( 17.28 s)
                                                                1
    solver
                t proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n eval
               56.00ms (
                                    51.95ms (
     nlp_f
                           8.76us)
                                               8.13us)
                                                             6390
                1.60 s (250.08us)
                                     1.77 s (277.58us)
                                                             6390
     nlp_g
  nlp_grad
                1.00ms (83.33us)
                                     7.83ms (652.92us)
                                                               12
               71.00ms (11.77us) 139.53ms (23.12us)
nlp_grad_f
                                                             6034
               15.60 s ( 2.59ms)
                                    15.76 s ( 2.61ms)
                                                             6033
nlp_hess_l
 nlp_jac_g
               20.67 s ( 3.40ms)
                                    20.43 s ( 3.36ms)
                                                             6083
               11.03 s ( 11.03 s)
                                    11.02 s ( 11.02 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_eval
     nlp_f
               58.00ms ( 8.61us)
                                    53.71ms ( 7.97us)
                                                             6739
     nlp_g
                1.62 s (241.13us)
                                     1.83 s (271.65us)
                                                             6739
  nlp_grad
                1.00ms (76.92us)
                                     8.49ms (653.00us)
                                                               13
nlp grad f
               75.00ms (11.75us) 144.15ms (22.58us)
                                                             6384
nlp hess 1
               16.19 s ( 2.54ms)
                                    16.24 s ( 2.55ms)
                                                             6381
 nlp_jac_g
               21.36 s ( 3.32ms)
                                    21.08 s ( 3.28ms)
                                                             6433
     total
               11.89 s ( 11.89 s)
                                    11.89 s ( 11.89 s)
                                                                1
    solver
                t_proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n_eval
               58.00ms (
                                    56.23ms ( 7.94us)
                                                             7086
     nlp_f
                          8.19us)
                1.66 s (234.26us)
                                     1.92 s (270.35us)
                                                             7086
     nlp_g
                1.00ms (71.43us)
                                     8.84ms (631.57us)
  nlp_grad
                                                               14
               75.00ms (11.17us) 151.00ms (22.50us)
nlp_grad_f
                                                             6712
nlp_hess_l
               16.96 s ( 2.53ms)
                                    16.98 s ( 2.53ms)
                                                             6705
               22.36 s ( 3.31ms)
                                    22.02 s ( 3.26ms)
                                                             6763
 nlp_jac_g
               18.32 s ( 18.32 s)
     total
                                    18.32 s ( 18.32 s)
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_{eval}
               58.00ms ( 7.84us)
                                    59.72ms ( 8.08us)
                                                             7395
     nlp_f
                1.75 s (237.05us)
                                     2.02 s (272.89us)
                                                             7395
     nlp_g
                1.00ms (66.67us)
  nlp_grad
                                     9.53ms (635.33us)
                                                               15
               98.00ms (13.99us) 159.34ms (22.74us)
nlp grad f
                                                             7007
nlp_hess_l
               18.00 s ( 2.57ms)
                                    17.89 s ( 2.56ms)
                                                             6998
 nlp_jac_g
               23.41 s ( 3.32ms)
                                    23.19 s ( 3.29ms)
                                                             7058
               20.74 s ( 20.74 s)
                                    20.73 s ( 20.73 s)
     total
                                                                1
    solver
                                     t_wall
                t_proc
                             (avg)
                                                  (avg)
                                                           n_eval
               66.00ms (
                           8.56us)
                                    64.31ms (
                                               8.34us)
     nlp_f
                                                             7714
     nlp_g
                1.93 s (250.58us)
                                     2.13 s (276.35us)
                                                             7714
  nlp_grad
                1.00ms (62.50us)
                                    10.43ms (651.81us)
                                                               16
            | 116.00ms ( 15.84us) 169.14ms ( 23.09us)
nlp_grad_f
                                                             7325
nlp_hess_l
               19.06 s ( 2.61ms)
                                    18.93 s ( 2.59ms)
                                                             7314
 nlp_jac_g
               24.72 s ( 3.35ms)
                                    24.56 s ( 3.33ms)
                                                             7376
     total
               24.06 s ( 24.06 s)
                                    24.06 s ( 24.06 s)
                                                                1
```

```
solver
                             (avg)
                                     t_wall
                                                           n_eval
                t_proc
                                                  (avg)
                                    67.10ms ( 8.39us)
                                                             7995
     nlp_f
                66.00ms ( 8.26us)
                2.00 s (250.66us)
                                     2.23 s (278.59us)
     nlp_g
                                                             7995
  nlp_grad
                 1.00ms ( 58.82us)
                                    11.08ms (651.82us)
                                                               17
nlp grad f
              118.00ms (15.51us) 176.68ms (23.23us)
                                                             7606
nlp_hess_1
                19.93 s (
                           2.62ms)
                                    19.80 s ( 2.61ms)
                                                             7593
 nlp_jac_g
               25.82 s ( 3.37ms)
                                    25.70 s ( 3.36ms)
                                                             7657
               18.85 s ( 18.85 s)
                                    18.85 s ( 18.85 s)
     total
                                                                 1
    solver
                                     t_wall
                t proc
                             (avg)
                                                  (avg)
                                                           n eval
               66.00ms (
                                    69.70ms (
                                                             8291
     nlp_f
                           7.96us)
                                                8.41us)
                2.09 s (252.08us)
                                     2.32 s (279.61us)
                                                             8291
     nlp_g
  nlp_grad
                 1.00ms (55.56us)
                                    11.60ms (644.56us)
                                                               18
              141.00ms ( 17.84us) 184.68ms ( 23.37us)
nlp_grad_f
                                                             7903
nlp_hess_l
                20.80 s ( 2.64ms)
                                    20.64 s ( 2.62ms)
                                                             7888
                26.90 s ( 3.38ms)
                                    26.79 s ( 3.37ms)
 nlp_jac_g
                                                             7954
               18.38 s ( 18.38 s)
                                    18.38 s ( 18.38 s)
     total
                                                                 1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_eval
               66.00ms ( 7.71us)
                                    70.76ms ( 8.27us)
                                                             8555
     nlp_f
     nlp_g
                2.11 s (246.99us)
                                     2.35 s (274.71us)
                                                             8555
  nlp_grad
                 1.00ms (52.63us)
                                    11.89ms (625.63us)
                                                               19
nlp grad f
            | 141.00ms ( 17.26us) 187.29ms ( 22.93us)
                                                             8168
               21.09 s ( 2.59ms)
                                    20.92 s ( 2.57ms)
nlp hess 1
                                                             8151
 nlp_jac_g
               27.30 s ( 3.32ms)
                                    27.14 s ( 3.30ms)
                                                             8219
                6.89 s ( 6.89 s)
                                     6.89 s ( 6.89 s)
     total
                                                                 1
    solver
                t_proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n_eval
               66.00ms (
                                    71.99ms (
     nlp_f
                           7.45us)
                                               8.12us)
                                                             8862
                2.14 s (241.48us)
                                     2.39 s (269.15us)
                                                             8862
     nlp_g
                1.00ms (50.00us)
                                    12.07ms (603.65us)
                                                               20
  nlp_grad
              141.00ms (16.67us) 190.23ms (22.50us)
nlp_grad_f
                                                             8456
nlp_hess_l
                21.47 s ( 2.54ms)
                                    21.21 s ( 2.51ms)
                                                             8437
               27.64 s (
                          3.25 ms)
                                    27.52 s (
                                               3.24ms)
                                                             8507
 nlp_jac_g
     total
                8.23 s (
                           8.23 s)
                                     8.23 s (
                                                8.23 s)
                                                                 1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_{eval}
               66.00ms ( 7.06us)
                                    73.89ms ( 7.91us)
                                                             9342
     nlp_f
                2.19 s (234.32us)
                                     2.44 s (261.41us)
                                                             9342
     nlp_g
                1.00ms (47.62us)
                                    12.26ms (583.62us)
  nlp_grad
                                                               21
            | 153.00ms ( 17.26us) 194.54ms ( 21.94us)
nlp grad f
                                                             8866
nlp_hess_l
               21.91 s ( 2.47ms)
                                    21.66 s ( 2.44ms)
                                                             8864
 nlp_jac_g
               28.21 s ( 3.16ms)
                                    28.10 s ( 3.14ms)
                                                             8938
               15.13 s ( 15.13 s)
                                    15.14 s ( 15.14 s)
     total
                                                                 1
    solver
                                     t_wall
                t_proc
                             (avg)
                                                  (avg)
                                                           n_eval
               66.00ms (
                           6.76us)
                                    75.44ms (
                                                7.73us)
                                                             9759
     nlp_f
     nlp_g
                2.25 s (231.07us)
                                     2.49 s (255.27us)
                                                             9759
  nlp_grad
                1.00ms (45.45us)
                                    12.47ms (566.77us)
                                                               22
            | 153.00ms ( 16.63us) 198.10ms ( 21.54us)
nlp_grad_f
                                                             9199
nlp_hess_l
                22.27 s ( 2.42ms)
                                    22.02 s ( 2.39ms)
                                                             9194
 nlp_jac_g
               28.62 s ( 3.09ms)
                                    28.58 s ( 3.08ms)
                                                             9274
     total
               10.20 s ( 10.20 s)
                                    10.20 s ( 10.20 s)
                                                                 1
```

```
solver
                                     t_wall
                                                           n_eval
                t_proc
                             (avg)
                                                  (avg)
                                    76.65ms ( 7.62us)
                                                            10060
     nlp_f
               66.00ms ( 6.56us)
                                     2.53 s (251.35us)
                2.26 s (224.95us)
                                                            10060
     nlp_g
  nlp_grad
                1.00ms (43.48us)
                                    12.65ms (549.83us)
                                                               23
nlp grad f
              153.00ms (16.13us) 201.16ms (21.21us)
                                                             9484
nlp_hess_1
               22.61 s (
                           2.39ms)
                                    22.32 s ( 2.35ms)
                                                             9477
 nlp_jac_g
               29.04 s ( 3.04ms)
                                    28.98 s ( 3.03ms)
                                                             9559
     total
                8.45 s (
                           8.45 s
                                     8.45 s (
                                               8.45 s
                                                                1
    solver
                t proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n eval
                                    77.91ms (
     nlp_f
               66.00ms (
                           6.37us)
                                               7.52us)
                                                            10357
                2.29 s (220.91us)
                                     2.56 s (247.56us)
                                                            10357
     nlp_g
                 1.00ms (41.67us)
                                    12.92ms (538.37us)
  nlp_grad
                                                               24
              179.00ms (18.32us) 204.18ms (20.90us)
nlp_grad_f
                                                             9770
               22.92 s (
                          2.35ms)
                                    22.61 s ( 2.32ms)
nlp_hess_l
                                                             9759
               29.36 s (
                           2.98ms)
                                    29.37 s (
 nlp_jac_g
                                               2.98ms)
                                                             9847
                8.95 s (
                          8.95 s)
                                     8.96 s (
                                               8.96 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_eval
               66.00ms ( 6.17us)
                                    79.26ms ( 7.41us)
                                                            10692
     nlp_f
                2.31 s (216.14us)
                                     2.61 s (243.65us)
                                                            10692
     nlp_g
  nlp grad
                 1.00ms (40.00us)
                                    13.12ms (524.68us)
                                                               25
nlp grad f
            | 191.00ms ( 18.93us) 207.55ms ( 20.57us)
                                                            10088
               23.21 s ( 2.30ms)
                                    22.94 s ( 2.28ms)
nlp hess 1
                                                            10075
 nlp_jac_g
               29.79 s ( 2.93ms)
                                    29.80 s ( 2.93ms)
                                                            10165
               12.02 s ( 12.02 s)
                                    12.01 s ( 12.01 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n_eval
               66.00ms (
                                    80.27ms (
     nlp_f
                          6.03us)
                                               7.33us)
                                                            10943
                2.33 s (212.74us)
                                     2.64 s (240.80us)
                                                            10943
     nlp_g
                 1.00ms ( 38.46us)
                                    13.31ms (511.77us)
  nlp_grad
                                                               26
              191.00ms (18.50us) 209.99ms (20.34us)
                                                            10325
nlp_grad_f
nlp_hess_1
               23.43 s ( 2.27ms)
                                    23.19 s ( 2.25ms)
                                                            10310
               30.15 s (
                          2.90ms)
                                    30.13 s (
                                               2.90ms)
                                                            10402
 nlp_jac_g
     total
                7.73 s (
                           7.73 s)
                                     7.73 s (
                                               7.73 s)
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_{eval}
               66.00ms ( 5.89us)
                                    81.24ms ( 7.25us)
                                                            11205
     nlp_f
                2.37 s (211.51us)
                                     2.67 s (237.89us)
     nlp_g
                                                            11205
                1.00ms ( 37.04us)
                                    13.53ms (501.26us)
  nlp_grad
                                                               27
              203.00ms (19.21us) 212.51ms (20.11us)
nlp grad f
                                                            10567
nlp_hess_1
               23.60 s ( 2.24ms)
                                    23.43 s ( 2.22ms)
                                                            10550
               30.49 s ( 2.86ms)
                                    30.45 s ( 2.86ms)
                                                            10644
 nlp_jac_g
                7.98 s ( 7.98 s)
                                     7.98 s (
     total
                                               7.98 s)
                                                                1
                                     t_wall
    solver
                t_proc
                             (avg)
                                                  (avg)
                                                           n_eval
               66.00ms (
                           5.75us)
                                    82.30ms (
                                               7.17us)
                                                            11475
     nlp_f
     nlp_g
                2.42 s (211.07us)
                                     2.70 s (235.03us)
                                                            11475
  nlp_grad
                1.00ms (35.71us)
                                    13.92ms (497.11us)
                                                               28
              203.00ms (18.73us) 215.10ms (19.85us)
nlp_grad_f
                                                            10836
nlp_hess_l
               23.80 s ( 2.20ms)
                                    23.70 s ( 2.19ms)
                                                            10817
 nlp_jac_g
               30.80 s ( 2.82ms)
                                    30.80 s ( 2.82ms)
                                                            10913
     total
               10.43 s ( 10.43 s)
                                    10.43 s ( 10.43 s)
                                                                1
```

```
solver
                             (avg)
                                     t_wall
                                                           n_eval
                t_proc
                                                  (avg)
                                    85.99ms ( 6.89us)
                                                            12476
     nlp_f
               66.00ms ( 5.29us)
                2.51 s (201.59us)
                                     2.81 s (225.08us)
                                                            12476
     nlp_g
  nlp_grad
                1.00ms ( 34.48us)
                                    14.50ms (499.93us)
                                                               29
nlp grad f
              216.00ms (18.61us) 222.74ms (19.19us)
                                                            11607
nlp_hess_1
               24.67 s ( 2.13ms)
                                    24.46 s ( 2.11ms)
                                                            11586
 nlp_jac_g
               31.81 s ( 2.72ms)
                                    31.79 s ( 2.72ms)
                                                            11684
                                    45.24 s ( 45.24 s)
     total
               45.23 s (45.23 s)
                                                                1
    solver
                                     t_wall
                t proc
                             (avg)
                                                  (avg)
                                                           n eval
               66.00ms (
                                    87.07ms (
     nlp_f
                          5.17us)
                                               6.83us)
                                                            12755
                2.55 s (200.08us)
                                     2.84 s (222.71us)
                                                            12755
     nlp_g
  nlp_grad
                1.00ms (33.33us)
                                    14.68ms (489.30us)
                                                               30
              216.00ms (18.19us) 225.39ms (18.98us)
                                                            11875
nlp_grad_f
               24.91 s ( 2.10ms)
                                    24.74 s ( 2.09ms)
nlp_hess_l
                                                            11852
               32.10 s ( 2.69ms)
                                    32.15 s ( 2.69ms)
 nlp_jac_g
                                                            11952
               10.92 s ( 10.92 s)
                                    10.93 s ( 10.93 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_eval
               66.00ms ( 5.08us)
                                    87.94ms ( 6.77us)
                                                            12996
     nlp_f
                2.55 s (196.45us)
                                     2.87 s (220.64us)
                                                            12996
     nlp_g
  nlp grad
                 1.00ms ( 32.26us)
                                    14.85ms (479.13us)
                                                               31
nlp grad f
            | 216.00ms ( 17.91us) 227.22ms ( 18.84us)
                                                            12062
               25.20 s ( 2.09ms)
                                    24.97 s ( 2.07ms)
nlp hess 1
                                                            12085
 nlp_jac_g
               32.41 s ( 2.66ms)
                                    32.45 s ( 2.66ms)
                                                            12189
                7.37 s (7.37 s)
                                     7.37 s (7.37 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n_eval
               67.00ms (
                                    89.65ms (
     nlp_f
                          5.02us)
                                               6.72us)
                                                            13341
                                     2.92 s (219.02us)
                2.60 s (194.66us)
                                                            13341
     nlp_g
                1.00ms ( 31.25us)
                                    15.08ms (471.12us)
  nlp_grad
                                                               32
              216.00ms (17.46us) 231.36ms (18.70us)
                                                            12369
nlp_grad_f
nlp_hess_1
               25.65 s ( 2.07ms)
                                    25.40 s ( 2.05ms)
                                                            12390
               32.95 s ( 2.64ms)
                                    33.05 s ( 2.64ms)
                                                            12496
 nlp_jac_g
                                    20.87 s ( 20.87 s)
     total
               20.88 s ( 20.88 s)
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_{eval}
               68.00ms ( 4.97us)
                                    92.82ms ( 6.78us)
                                                            13694
     nlp_f
                2.74 s (200.31us)
                                     3.04 s (221.80us)
                                                            13694
     nlp_g
                1.00ms (30.30us)
                                    15.73ms (476.67us)
  nlp_grad
                                                               33
            | 216.00ms ( 17.00us) 240.02ms ( 18.89us)
nlp grad f
                                                            12706
nlp_hess_1
               26.65 s ( 2.09ms)
                                    26.41 s ( 2.08ms)
                                                            12724
               34.19 s ( 2.66ms)
                                    34.37 s ( 2.68ms)
 nlp_jac_g
                                                            12834
               38.77 s ( 38.77 s)
                                    38.77 s ( 38.77 s)
     total
                                                                1
    solver
                                     t_wall
                t_proc
                             (avg)
                                                  (avg)
                                                           n_eval
                                    94.98ms (
               68.00ms (
                          4.88us)
                                               6.82us)
                                                            13924
     nlp_f
     nlp_g
                2.86 s (205.62us)
                                     3.11 s (223.59us)
                                                            13924
  nlp_grad
                1.00ms (29.41us)
                                    16.39ms (482.12us)
                                                               34
            | 221.00ms ( 17.08us) 246.03ms ( 19.02us)
nlp_grad_f
                                                            12936
nlp_hess_l
               27.32 s ( 2.11ms)
                                    27.11 s ( 2.09ms)
                                                            12952
 nlp_jac_g
               35.14 s ( 2.69ms)
                                    35.28 s ( 2.70ms)
                                                            13064
     total
               25.50 s ( 25.50 s)
                                    25.51 s ( 25.51 s)
                                                                1
```

```
solver
                                     t_wall
                                                           n_eval
                t_proc
                             (avg)
                                                  (avg)
                                                            14159
     nlp_f
               68.00ms ( 4.80us)
                                    97.15ms ( 6.86us)
                                     3.19 s (225.28us)
     nlp_g
                2.95 s (208.35us)
                                                            14159
  nlp_grad
                1.00ms ( 28.57us)
                                    17.33ms (495.11us)
                                                               35
nlp grad f
              236.00ms (17.92us) 251.95ms (19.14us)
                                                            13166
nlp_hess_1
               28.05 s ( 2.13ms)
                                    27.80 s ( 2.11ms)
                                                            13179
                                    36.21 s ( 2.72ms)
 nlp_jac_g
               36.01 s ( 2.71ms)
                                                            13295
               24.49 s ( 24.49 s)
                                    24.49 s ( 24.49 s)
     total
                                                                1
    solver
                                     t_wall
                t proc
                             (avg)
                                                  (avg)
                                                           n eval
               68.00ms (
                                    99.16ms (
     nlp_f
                          4.73us)
                                               6.90us)
                                                            14375
                2.99 s (207.72us)
                                     3.26 s (226.82us)
                                                            14375
     nlp_g
  nlp_grad
                1.00ms ( 27.78us)
                                    18.01ms (500.42us)
                                                               36
              243.00ms (18.16us) 257.43ms (19.24us)
nlp_grad_f
                                                            13382
               28.81 s ( 2.15ms)
                                    28.46 s ( 2.12ms)
nlp_hess_l
                                                            13393
               36.85 s ( 2.73ms)
                                    37.07 s ( 2.74ms)
 nlp_jac_g
                                                            13511
               25.89 s ( 25.89 s)
                                    25.88 s ( 25.88 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_eval
               68.00ms ( 4.64us) 101.64ms ( 6.94us)
                                                            14652
     nlp_f
                3.07 s (209.60us)
                                     3.35 s (228.50us)
                                                            14652
     nlp_g
  nlp grad
                 1.00ms ( 27.03us)
                                    18.55ms (501.49us)
                                                               37
nlp grad f
            | 243.00ms ( 17.83us) 263.88ms ( 19.36us)
                                                            13631
               29.50 s ( 2.16ms)
                                    29.21 s ( 2.14ms)
nlp hess 1
                                                            13640
 nlp_jac_g
               37.90 s ( 2.75ms)
                                    38.05 s ( 2.76ms)
                                                            13760
               32.42 s ( 32.42 s)
                                    32.42 s ( 32.42 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n_eval
               85.00ms (
                          5.74us) 118.19ms ( 7.98us)
     nlp_f
                                                            14809
                3.10 s (209.53us)
                                     3.40 s (229.53us)
                                                            14809
     nlp_g
                1.00ms ( 26.32us)
                                    19.93ms (524.58us)
  nlp_grad
                                                               38
              243.00ms (17.63us) 267.91ms (19.44us)
nlp_grad_f
                                                            13783
nlp_hess_1
               30.00 s ( 2.18ms)
                                    29.67 s ( 2.15ms)
                                                            13790
               38.47 s ( 2.77ms)
                                    38.64 s ( 2.78ms)
                                                            13912
 nlp_jac_g
               14.71 s ( 14.71 s)
                                    14.71 s ( 14.71 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_{eval}
               88.00ms ( 5.88us) 119.54ms ( 7.99us)
                                                            14967
     nlp_f
                3.15 s (210.66us)
                                     3.44 s (230.14us)
                                                            14967
     nlp_g
                1.00ms (25.64us)
                                    20.60ms (528.15us)
  nlp_grad
                                                               39
             256.00ms (18.36us) 271.55ms (19.48us)
nlp grad f
                                                            13940
nlp_hess_l
               30.41 s ( 2.18ms)
                                    30.08 s ( 2.16ms)
                                                            13945
 nlp_jac_g
               38.96 s ( 2.77ms)
                                    39.18 s ( 2.79ms)
                                                            14069
               12.29 s ( 12.29 s)
                                    12.29 s ( 12.29 s)
     total
                                                                1
    solver
                t_proc
                                     t_wall
                             (avg)
                                                  (avg)
                                                           n_eval
               88.00ms ( 5.81us) 120.52ms (
                                               7.96us)
                                                            15134
     nlp_f
     nlp_g
                3.20 s (211.18us)
                                     3.48 s (229.68us)
                                                            15134
  nlp_grad
                1.00ms (25.00us)
                                    20.79ms (519.72us)
                                                               40
            | 272.00ms (19.28us) 274.07ms (19.43us)
nlp_grad_f
                                                            14106
nlp_hess_l
               30.65 s ( 2.17ms)
                                    30.36 s ( 2.15ms)
                                                            14109
 nlp_jac_g
               39.39 s ( 2.77ms)
                                    39.56 s ( 2.78ms)
                                                            14235
     total
               13.46 s ( 13.46 s)
                                    13.47 s ( 13.47 s)
                                                                1
```

```
solver :
                             (avg)
                                     t_wall
                                                           n_eval
                t_proc
                                                 (avg)
                                                            15501
     nlp_f
               88.00ms ( 5.68us) 123.54ms ( 7.97us)
                3.24 s (208.89us)
                                     3.58 s (230.69us)
                                                            15501
     nlp_g
  nlp_grad
                1.00ms (24.39us)
                                    21.46ms (523.44us)
                                                               41
nlp grad f
              287.00ms (19.86us) 281.83ms (19.50us)
                                                            14453
nlp_hess_l
               31.67 s (
                          2.19ms)
                                    31.24 s ( 2.16ms)
                                                            14454
 nlp_jac_g
               40.49 s ( 2.78ms)
                                    40.70 s ( 2.79ms)
                                                            14582
     total
               43.11 s ( 43.11 s)
                                    43.12 s ( 43.12 s)
                                                                1
    solver
                                     t wall
                t proc
                             (avg)
                                                 (avg)
                                                           n eval
               88.00ms (
                          5.61us) 124.29ms (
     nlp_f
                                               7.92us)
                                                            15683
                3.24 s (206.47us)
                                     3.60 s (229.60us)
     nlp_g
                                                            15683
                1.00ms (23.81us)
                                    21.67ms (515.90us)
                                                               42
  nlp_grad
              287.00ms (19.64us) 283.53ms (19.40us)
nlp_grad_f
                                                            14613
               31.84 s ( 2.18ms)
                                    31.42 s ( 2.15ms)
nlp_hess_l
                                                            14612
               40.71 s (
                          2.76ms)
                                    40.94 s (
 nlp_jac_g
                                               2.78ms)
                                                            14742
                7.33 s (7.33 s)
                                     7.33 s (7.33 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_eval
               95.00ms ( 6.00us) 125.13ms ( 7.90us)
                                                            15842
     nlp_f
                3.28 s (207.30us)
                                     3.62 s (228.78us)
                                                            15842
     nlp_g
  nlp grad
                1.00ms (23.26us)
                                    21.94ms (510.16us)
                                                               43
nlp grad f
            | 287.00ms ( 19.43us) 285.52ms ( 19.33us)
                                                            14773
               32.05 s ( 2.17ms)
                                    31.63 s ( 2.14ms)
nlp hess 1
                                                            14770
 nlp_jac_g
               40.98 s ( 2.75ms)
                                    41.20 s ( 2.76ms)
                                                            14902
                8.33 s ( 8.33 s)
                                     8.34 s ( 8.34 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n_eval
               95.00ms (
                          5.94us) 125.71ms (
                                                            15995
     nlp_f
                                               7.86us)
                                     3.64 s (227.64us)
                3.31 s (206.88us)
                                                            15995
     nlp_g
                1.00ms ( 22.73us)
                                    22.17ms (503.89us)
  nlp_grad
                                                               44
              287.00ms (19.23us) 286.91ms (19.22us)
                                                            14926
nlp_grad_f
nlp_hess_l
               32.22 s ( 2.16ms)
                                    31.77 s ( 2.13ms)
                                                            14921
               41.15 s (
                          2.73ms)
                                    41.39 s ( 2.75ms)
                                                            15055
 nlp_jac_g
     total
                6.48 s (
                          6.48 s)
                                     6.48 s (
                                               6.48 s)
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_{eval}
               97.00ms ( 5.96us) 126.90ms ( 7.80us)
                                                            16266
     nlp_f
                3.36 s (206.81us)
                                     3.68 s (226.07us)
                                                            16266
     nlp_g
                1.00ms ( 22.22us)
                                    22.48ms (499.51us)
  nlp_grad
                                                               45
            | 287.00ms ( 18.94us) 289.37ms ( 19.10us)
nlp grad f
                                                            15150
nlp_hess_l
               32.50 s ( 2.15ms)
                                    32.05 s ( 2.12ms)
                                                            15143
               41.50 s ( 2.72ms)
                                    41.75 s ( 2.73ms)
                                                            15281
 nlp_jac_g
               11.11 s ( 11.11 s)
                                    11.11 s ( 11.11 s)
     total
                                                                1
                                     t_wall
    solver
                t_proc
                             (avg)
                                                  (avg)
                                                           n_eval
               97.00ms ( 5.91us) 127.51ms (
                                               7.76us)
                                                            16422
     nlp_f
     nlp_g
                3.38 s (205.64us)
                                     3.70 s (225.03us)
                                                            16422
  nlp_grad
                1.00ms (21.74us)
                                    22.67ms (492.89us)
                                                               46
              287.00ms (18.77us) 290.74ms (19.01us)
nlp_grad_f
                                                            15293
nlp_hess_1
               32.65 s ( 2.14ms)
                                    32.20 s ( 2.11ms)
                                                            15284
 nlp_jac_g
               41.68 s ( 2.70ms)
                                    41.94 s ( 2.72ms)
                                                            15424
     total
                6.29 s ( 6.29 s)
                                     6.29 s ( 6.29 s)
                                                                1
```

```
solver
                                     t_wall
                                                           n_eval
                t_proc
                             (avg)
                                                  (avg)
                                                            16525
     nlp_f
               97.00ms ( 5.87us) 127.91ms ( 7.74us)
                                     3.71 s (224.33us)
                3.38 s (204.54us)
                                                            16525
     nlp_g
  nlp_grad
                1.00ms (21.28us)
                                    22.87ms (486.70us)
                                                               47
nlp grad f
              287.00ms (18.64us) 291.65ms (18.95us)
                                                            15394
nlp_hess_1
               32.78 s (
                          2.13ms)
                                    32.30 s ( 2.10ms)
                                                            15383
 nlp_jac_g
               41.83 s ( 2.69ms)
                                    42.07 s ( 2.71ms)
                                                            15525
     total
                3.85 s ( 3.85 s)
                                     3.85 s ( 3.85 s)
                                                                1
    solver
                t proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n eval
                          5.77us) 130.31ms (
     nlp_f
               97.00ms (
                                               7.75us)
                                                            16811
                3.43 s (204.33us)
                                     3.79 s (225.23us)
     nlp_g
                                                            16811
                1.00ms ( 20.83us)
                                    23.39ms (487.35us)
                                                               48
  nlp_grad
              287.00ms (18.42us) 296.02ms (18.99us)
nlp_grad_f
                                                            15584
               33.22 s ( 2.13ms)
                                    32.84 s ( 2.11ms)
nlp_hess_l
                                                            15590
               42.49 s ( 2.70ms)
                                    42.79 s ( 2.72ms)
 nlp_jac_g
                                                            15739
               22.73 s ( 22.73 s)
                                    22.72 s ( 22.72 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_eval
               98.00ms ( 5.80us) 131.23ms ( 7.76us)
                                                            16911
     nlp_f
                3.49 s (206.32us)
                                     3.81 s (225.55us)
                                                            16911
     nlp_g
  nlp grad
                1.00ms ( 20.41us)
                                    23.92ms (488.18us)
                                                               49
nlp grad f
            | 287.00ms ( 18.30us) 298.18ms ( 19.01us)
                                                            15684
               33.46 s ( 2.13ms)
                                    33.09 s ( 2.11ms)
nlp hess 1
                                                            15688
 nlp_jac_g
               42.79 s ( 2.70ms)
                                    43.12 s ( 2.72ms)
                                                            15839
                9.02 s ( 9.02 s)
                                     9.03 s ( 9.03 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_eval
                          5.75us) 132.47ms (
                                               7.78us)
                                                            17036
     nlp_f
               98.00ms (
                                     3.85 s (226.01us)
                3.56 s (208.73us)
                                                            17036
     nlp_g
                1.00ms ( 20.00us)
                                    24.47ms (489.44us)
  nlp_grad
                                                               50
              287.00ms (18.16us) 301.17ms (19.05us)
                                                            15807
nlp_grad_f
nlp_hess_l
               33.79 s ( 2.14ms)
                                    33.41 s ( 2.11ms)
                                                            15809
               43.35 s ( 2.72ms)
                                    43.54 s ( 2.73ms)
                                                            15962
 nlp_jac_g
     total
               13.49 s ( 13.49 s)
                                    13.49 s ( 13.49 s)
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_{eval}
               98.00ms ( 5.72us) 133.31ms ( 7.78us)
                                                            17133
     nlp_f
                3.56 s (207.55us)
                                     3.88 s (226.36us)
     nlp_g
                                                            17133
                1.00ms (19.61us)
                                    25.19ms (493.84us)
  nlp_grad
                                                               51
              287.00ms (18.06us) 303.14ms (19.07us)
nlp grad f
                                                            15895
nlp_hess_1
               33.96 s ( 2.14ms)
                                    33.64 s ( 2.12ms)
                                                            15895
               43.75 s ( 2.73ms)
                                    43.84 s ( 2.73ms)
                                                            16050
 nlp_jac_g
                7.96 s ( 7.96 s)
                                     7.96 s (
     total
                                               7.96 s)
                                                                1
                                     t_wall
    solver
                t_proc
                             (avg)
                                                  (avg)
                                                           n_eval
               98.00ms (
                          5.66us) 134.74ms (
                                               7.79us)
     nlp_f
                                                            17308
     nlp_g
                3.60 s (208.17us)
                                     3.93 s (226.80us)
                                                            17308
  nlp_grad
                1.00ms (19.23us)
                                    25.86ms (497.25us)
                                                               52
              287.00ms (17.91us) 306.29ms (19.11us)
nlp_grad_f
                                                            16027
nlp_hess_l
               34.35 s ( 2.14ms)
                                    33.98 s ( 2.12ms)
                                                            16025
 nlp_jac_g
               44.33 s ( 2.74ms)
                                    44.29 s ( 2.74ms)
                                                            16182
     total
               15.62 s ( 15.62 s)
                                    15.64 s ( 15.64 s)
                                                                1
```

```
solver
                                     t_wall
                                                           n_eval
                t_proc
                             (avg)
                                                  (avg)
            | 114.00ms ( 6.54us) 135.65ms ( 7.78us)
                                                            17427
     nlp_f
                                     3.96 s (227.05us)
                3.62 s (207.67us)
                                                            17427
     nlp_g
  nlp_grad
                1.00ms ( 18.87us)
                                    26.41ms (498.32us)
                                                               53
nlp grad f
              287.00ms (17.82us) 308.19ms (19.13us)
                                                            16110
nlp_hess_l
               34.60 s ( 2.15ms)
                                    34.20 s ( 2.12ms)
                                                            16106
 nlp_jac_g
               44.61 s ( 2.74ms)
                                    44.57 s ( 2.74ms)
                                                            16265
     total
                7.45 s (7.45 s)
                                     7.47 s (7.47 s)
                                                                1
    solver
                t proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n eval
            | 114.00ms (
                          6.51us) 136.42ms (
     nlp_f
                                               7.79us)
                                                            17513
                3.67 s (209.44us)
                                     3.98 s (227.34us)
     nlp_g
                                                            17513
  nlp_grad
                1.00ms (18.52us)
                                    26.96ms (499.26us)
                                                               54
              287.00ms (17.72us) 310.17ms (19.15us)
nlp_grad_f
                                                            16193
               34.75 s ( 2.15ms)
                                    34.42 s ( 2.13ms)
nlp_hess_l
                                                            16187
               44.88 s (
                          2.75ms)
                                    44.86 s (
 nlp_jac_g
                                               2.74ms)
                                                            16348
                7.97 s (7.97 s)
                                     7.98 s ( 7.98 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_eval
            | 114.00ms ( 6.40us) 138.64ms ( 7.78us)
                                                            17814
     nlp_f
                3.74 s (210.23us)
                                     4.06 s (228.06us)
                                                            17814
     nlp_g
  nlp grad
                1.00ms ( 18.18us)
                                    27.66ms (502.87us)
                                                               55
            | 288.00ms ( 17.59us) 314.16ms ( 19.19us)
                                                            16373
nlp grad f
               35.17 s ( 2.15ms)
                                    34.88 s ( 2.13ms)
nlp hess 1
                                                            16365
 nlp_jac_g
               45.44 s ( 2.75ms)
                                    45.46 s ( 2.75ms)
                                                            16528
               26.33 s ( 26.33 s)
                                    26.34 s ( 26.34 s)
     total
                                                                1
    solver
                t_proc
                             (avg)
                                     t wall
                                                  (avg)
                                                           n_eval
            | 114.00ms ( 6.37us) 139.36ms ( 7.78us)
                                                            17908
     nlp_f
                3.76 s (210.02us)
                                     4.09 s (228.21us)
                                                            17908
     nlp_g
                1.00ms ( 17.86us)
                                    28.21ms (503.82us)
  nlp_grad
                                                               56
              288.00ms (17.52us) 315.81ms (19.21us)
nlp_grad_f
                                                            16442
nlp_hess_l
               35.39 s ( 2.15ms)
                                    35.05 s ( 2.13ms)
                                                            16432
               45.64 s (
                         2.75 ms)
                                    45.69 s ( 2.75ms)
                                                            16597
 nlp_jac_g
     total
                6.36 s (
                          6.36 s)
                                     6.36 s (
                                               6.36 s)
                                                                1
    solver
                t_proc
                             (avg)
                                     t_wall
                                                  (avg)
                                                           n_{eval}
            | 114.00ms ( 6.29us) 140.93ms ( 7.77us)
                                                            18129
     nlp_f
                3.82 s (210.88us)
                                     4.14 s (228.56us)
                                                            18129
     nlp_g
                1.00ms (17.54us)
                                    28.90ms (507.09us)
  nlp_grad
                                                               57
             288.00ms (17.40us) 318.44ms (19.24us)
nlp grad f
                                                            16547
nlp_hess_l
               35.64 s ( 2.16ms)
                                    35.33 s ( 2.14ms)
                                                            16535
               45.96 s ( 2.75ms)
                                    46.05 s ( 2.76ms)
                                                            16702
 nlp_jac_g
               13.33 s ( 13.33 s)
                                    13.33 s ( 13.33 s)
     total
                                                                1
                t_proc
                                     t_wall
    solver
                             (avg)
                                                  (avg)
                                                           n_eval
            | 114.00ms ( 6.20us) 142.03ms (
                                               7.73us)
                                                            18385
     nlp_f
     nlp_g
                3.84 s (209.08us)
                                     4.18 s (227.49us)
                                                            18385
  nlp_grad
                1.00ms (17.24us)
                                    30.17ms (520.26us)
                                                               58
              288.00ms (17.28us) 320.95ms (19.26us)
nlp_grad_f
                                                            16664
nlp_hess_1
               35.96 s ( 2.16ms)
                                    35.56 s ( 2.14ms)
                                                            16652
 nlp_jac_g
               46.28 s ( 2.75ms)
                                    46.37 s ( 2.76ms)
                                                            16825
     total
                8.83 s ( 8.83 s)
                                     8.83 s ( 8.83 s)
                                                                1
```

```
solver :
               t_proc (avg)
                                  t_wall
                                           (avg)
                                                      n_eval
    nlp_f
           | 125.00ms ( 6.67us) 144.07ms ( 7.68us)
                                                       18754
               3.90 s (207.96us)
                                  4.26 s (227.09us)
                                                        18754
    nlp_g
 nlp_grad |
               1.00ms (16.95us) 30.59ms (518.42us)
                                                          59
nlp_grad_f
          | 288.00ms ( 17.11us) 323.80ms ( 19.24us)
                                                       16829
              36.26 s ( 2.16ms) 35.88 s ( 2.13ms)
nlp_hess_l
                                                        16815
              46.70 s ( 2.75ms) 46.79 s ( 2.75ms)
                                                        16990
 nlp_jac_g |
              20.75 s ( 20.75 s) 20.75 s ( 20.75 s)
     total
                                                           1
```

