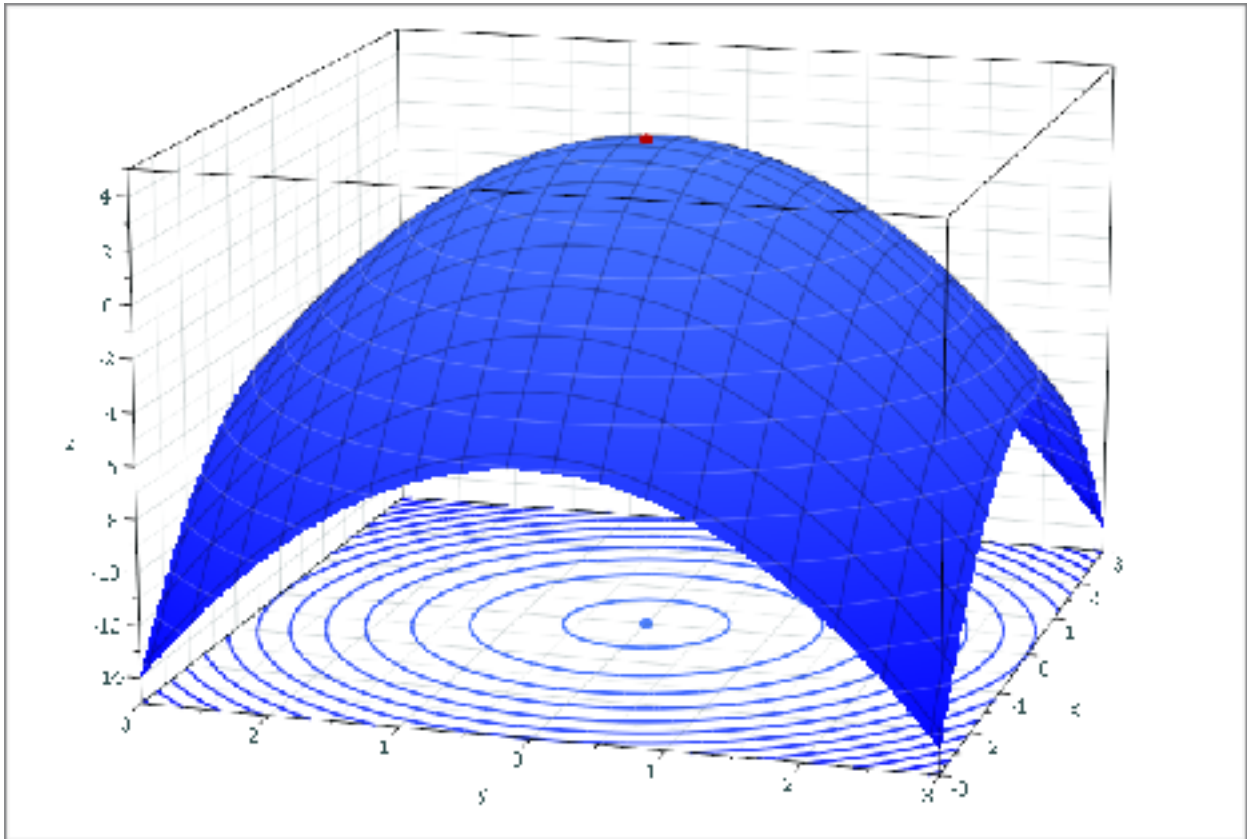


# ISYE 4133: Advanced Optimization



## Homework 1

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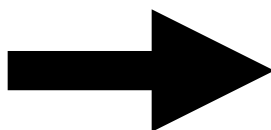
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Fall 2019

Problem 1: (10 points) Transforms the following linear programs in the standard form.

(a)

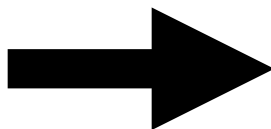
$$\begin{array}{ll}\text{minimize} & x_1 + 2x_2 \\ \text{subject to} & \\ & x_1 + x_2 \geq 10 \\ & 2x_1 + 5x_2 \leq 40 \\ & x_1, x_2 \geq 0\end{array}$$



$$\begin{array}{ll}\text{minimize} & x_1 + 2x_2 \\ \text{subject to} & \\ & x_1 + x_2 - s_1 = 10 \\ & 2x_1 + 5x_2 - s_2 = 40 \\ & x_1, x_2, s_1, s_2 \geq 0\end{array}$$

(b)

$$\begin{array}{ll}\text{maximize} & x_1 - x_2 \\ \text{subject to} & \\ & x_1 + x_2 \leq 4 \\ & 2x_1 + 5x_2 = 30 \\ & x_1 \leq 0 \\ & x_2 \geq 0\end{array}$$



$$\begin{array}{ll}\text{minimize} & x_1 + x_2 \\ \text{subject to} & \\ & -x_1 + x_2 + s_1 = 4 \\ & -2x_1 + 5x_2 = 30 \\ & x_1, x_2, s_1 \geq 0\end{array}$$

Problem 2: (10 points) Implement and solve the linear programs in the above question in the given form as well as the standard form in Gurobi. Note the optimal solutions of the given LP and the LP in its standard form. Show how these solutions are related.

(a)

Original Code:

```
from gurobipy import *

try:

    # Create my model
    m = Model('hw1p1a_regular')

    # Create my variables
    x = m.addVars(2, vtype= GRB.CONTINUOUS, name=['x1', 'x2'])

    # Set an objective function
    m.setObjective(x[0]+2*x[1], GRB.MINIMIZE)

    # Add regular constraints
    m.addConstr(x[0]+x[1] >= 10)
    m.addConstr(2*x[0]+5*x[1] <= 40)

    # Add non-negativity constraints
    m.addConstrs((x[i] >= 0 for i in range(2)))

    # Optimize model
    m.optimize()

    for v in m.getVars():
        print('%s %g' % (v.varName, v.x))
```

```

print('Obj: %g' % m.objVal)

except GurobiError as e:
    print('Error code ' + str(e.errno) + ": " + str(e))

except AttributeError:
    print('Encountered an attribute error')

```

Original Output:

```

Optimize a model with 4 rows, 2 columns and 6 nonzeros
Coefficient statistics:
  Matrix range      [1e+00, 5e+00]
  Objective range   [1e+00, 2e+00]
  Bounds range      [0e+00, 0e+00]
  RHS range         [1e+01, 4e+01]
Presolve removed 2 rows and 0 columns
Presolve time: 0.00s
Presolved: 2 rows, 2 columns, 4 nonzeros

```

Iteration	Objective	Primal Inf.	Dual Inf.	Time
0	0.0000000e+00	2.500000e+00	0.000000e+00	0s
1	1.0000000e+01	0.000000e+00	0.000000e+00	0s

```

Solved in 1 iterations and 0.00 seconds
Optimal objective 1.000000000e+01
x1 10
x2 0
Obj: 10

```

Standard Code:

```

from gurobipy import *

try:

    # Create my model
    m = Model('hw1p1a_standard')

```

```
# Create my variables
x = m.addVars(2, vtype= GRB.CONTINUOUS, name=['x1', 'x2'])
s = m.addVars(2, vtype= GRB.CONTINUOUS, name=['s1', 's2'])
```

```
# Set an objective function
m.setObjective(x[0]+2*x[1], GRB.MINIMIZE)
```

```
# Add regular constraints
m.addConstr(x[0]+x[1]-s[0] == 10)
m.addConstr(2* x[0]+5*x[1]+s[1] == 40)
```

```
# Add non-negativity constraints
m.addConstrs((x[i] >= 0 for i in range(2)))
m.addConstrs((s[i] >= 0 for i in range(2)))
```

```
# Optimize model
m.optimize()
```

```
for v in m.getVars():
    print('%s %g' % (v.varName, v.x))
```

```
print('Obj: %g' % m.objVal)
```

```
except GurobiError as e:
    print('Error code ' + str(e.errno) + ": " + str(e))
```

```
except AttributeError:
    print('Encountered an attribute error')
```

Standard Output:

```
Optimize a model with 6 rows, 4 columns and 10 nonzeros
Coefficient statistics:
  Matrix range      [1e+00, 5e+00]
  Objective range   [1e+00, 2e+00]
  Bounds range      [0e+00, 0e+00]
```

```

RHS range      [1e+01, 4e+01]
Presolve removed 4 rows and 2 columns
Presolve time: 0.00s
Presolved: 2 rows, 2 columns, 4 nonzeros

```

Iteration	Objective	Primal Inf.	Dual Inf.	Time
0	0.0000000e+00	2.500000e+00	0.000000e+00	0s
1	1.0000000e+01	0.000000e+00	0.000000e+00	0s

```

Solved in 1 iterations and 0.00 seconds
Optimal objective 1.000000000e+01
x1 10
x2 0
s1 0
s2 20
Obj: 10

```

Explanation:

Both answers are quite similar, except for the the second slack variable being used as a 20 point shift.

(b)

Original Code:

```

from gurobipy import *

try:

    # Create my model
    m = Model('hw1a1b_regular')

    # Create my variables
    x1 = m.addVar(name="x1", lb = -GRB.INFINITY, ub = 0.0)
    x2 = m.addVar(name="x2", lb = 0.0)

    # Set an objective function
    m.setObjective(x1-x2, GRB.MAXIMIZE)

    # Add regular constraints

```

```
m.addConstr(x1+x2 <= 4)
m.addConstr(2*x1+5*x2 == 30)
```

```
# Optimize model
m.optimize()
```

```
print(' worked')
for v in m.getVars():
    print('%s %g' % (v.varName, v.x))
```

```
print('Obj: %g' % m.objVal)
```

```
except GurobiError as e:
    print('Error code ' + str(e.errno) + ": " + str(e))
```

```
except AttributeError:
    print('Encountered an attribute error')
```

Original Output:

```
Optimize a model with 2 rows, 2 columns and 4 nonzeros
Coefficient statistics:
  Matrix range      [1e+00, 5e+00]
  Objective range   [1e+00, 1e+00]
  Bounds range      [0e+00, 0e+00]
  RHS range         [4e+00, 3e+01]
Presolve removed 2 rows and 2 columns
Presolve time: 0.00s
Presolve: All rows and columns removed
Iteration   Objective          Primal Inf.    Dual Inf.      Time
     0      -1.0666667e+01    0.000000e+00  0.000000e+00     0s

Solved in 0 iterations and 0.00 seconds
Optimal objective -1.06666667e+01
worked
x1 -3.33333
x2 7.33333
Obj: -10.6667
```

Standard Code:

```
from gurobipy import *

try:

    # Create my model
    m = Model('hw1a1b_standard')

    # Create my variables
    x = m.addVars(2, vtype= GRB.CONTINUOUS, name=['x1','x2'], lb
= 0.0)
    s = m.addVars(1, vtype= GRB.CONTINUOUS, name=['s'], lb = 0.0)

    # Set an objective function
    m.setObjective(x[0]+x[1], GRB.MINIMIZE)

    # Add regular constraints
    m.addConstr(-x[0]+x[1]+s[0] == 4)
    m.addConstr(-2*x[0]+5*x[1] == 30)

    # Optimize model
    m.optimize()

    print(' worked')
    for v in m.getVars():
        print('%s %g' % (v.varName, v.x))

    print('Obj: %g' % m.objVal)

except GurobiError as e:
    print('Error code ' + str(e.errno) + ": " + str(e))

except AttributeError:
    print('Encountered an attribute error')
```



Standard Output:

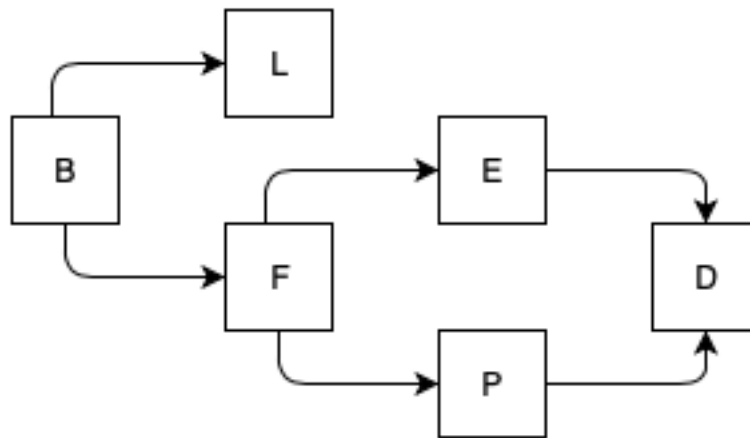
```
Optimize a model with 2 rows, 3 columns and 5 nonzeros
Coefficient statistics:
  Matrix range      [1e+00, 5e+00]
  Objective range   [1e+00, 1e+00]
  Bounds range      [0e+00, 0e+00]
  RHS range         [4e+00, 3e+01]
Presolve removed 2 rows and 3 columns
Presolve time: 0.00s
Presolve: All rows and columns removed
Iteration   Objective          Primal Inf.    Dual Inf.      Time
     0      1.0666667e+01    0.000000e+00    0.000000e+00     0s

Solved in 0 iterations and 0.00 seconds
Optimal objective  1.06666667e+01
worked
x1 3.33333
x2 7.33333
s[0] 0
Obj: 10.6667
```

Explanation:

The regular and standard form problems have the same absolute objective value output.

Problem 3: (10 points) Formulate a linear program that solves the problem. Explain your formulation. Note, there is no limit on the number of tasks that can be done in parallel. Solve the linear program using Gurobi and report the optimal solution.



Formulation:

$$\begin{aligned}
 &\text{minimize } S_D + d_D \\
 &\text{subject to} \\
 &S_D \geq S_E + D_E \\
 &S_D \geq S_P + D_P \\
 &S_E \geq S_F + D_F \\
 &S_P \geq S_F + D_F \\
 &S_F \geq S_B + D_B \\
 &S_L \geq S_B + D_B
 \end{aligned}$$

$$S_t \geq 0 \forall t \in \{B, F, E, P, D, L\}$$

Where duration  $= d_t = \{3, 2, 3, 4, 1, 2\} \forall t \in \{B, F, E, P, D, L\}$

Formulation: I optimized for the end time of task d (start time of D + duration time of D) given that it is the last task that can be done, requires the completion of E and P, and is the last task that must be completed before the project is considered completed. If the duration data was random (or had some sort of variance), I would have created a more general objective function.

Problem 4: (10 points) For  $m \in \{10, 20, 50, 100, 500, 1000, 10000\}$  and  $n \in \{10, 20, 50, 100, 1000, 10000\}$  generate matrices  $A \in \mathbb{R}^{m \times n}$  whose entries are uniformly random between  $[0, 1]$ . Similarly generate  $b \in \mathbb{R}^m$  randomly with entries randomly between  $[0, 1000]$ . Also generate a cost function  $c \in \mathbb{R}^n$  with entries randomly between  $[0, 1000]$ .

- (a) Formulate the linear program  $\{\min c^T x : Ax \geq b, x \geq 0\}$  for the above random data. Solve 10 instances of the program for each pair of values of  $m$  and  $n$  with a time out of 2 minutes. Note the time taken and objective value for each run and average over the 10 runs for each pair of  $(m, n)$ .

Continuous Code:

```
from gurobipy import *
import numpy as np
import csv

with open('problem_4_data.csv', mode='w') as problem_4_data:
    p4_writer = csv.writer(problem_4_data, delimiter=',', quoting=csv.QUOTE_MINIMAL)
    p4_writer.writerow(["Rows", "Columns", "Avg Obj Val", "Avg R
T", "Iterations"])
    #Define Proportions

    # m=[10,20,50,100,500,1000,10000]
    # n=[10,20,50,100,1000,10000]
    """
    m == 10000 and n == 10000 were not used due to time constraints
    """
    m=[10,20,50,100,500,1000]
    n=[10,20,50,100,1000]

    for r in m:
```

```
for c in n:
```

```
    outDict = {}
```

```
        for i in range(10):  
            i += 1
```

```
            # Create A  
            A = np.random.rand(r,c)*1000  
            # Create b  
            b = np.random.randint(0,1000,r)  
            # Create cost function  
            cost = np.random.randint(0,1000,c)  
            # Create dictionary for output
```

```
        try:
```

```
            # Create my model  
            m = Model('hw1p4a')  
            m.setParam('TimeLimit',  
120, 0) # Sets time limit to 2 minutes  
            m.setParam('OutputFlag', 0) # Mutes output  
  
            # Create my variables  
            x = m.addVars(c, vtype= GRB.CONTINUOUS)  
  
            # Create objective function expression  
            expression = quicksum(np.transpose(cost)  
[j]*x[j] for j in range(c))
```

```
            #Set objective function  
            m.setObjective(expression, GRB.MINIMIZE)
```

```
            # Add regular constraints  
            m.addConstrs(
```

```

        (quicksum(A[i,j] * x[j] for j in range(c
    ))
        >= b[i]
        for i in range(r)))

    # Optimize model
    m.optimize()

    # Append results to output dictionary
    outDict[i] = (m.objVal, m.runTime)

except GurobiError as e:
    print('Error code ' + str(e.errno) + ": " +
str(e))

except AttributeError:
    print('Encountered an attribute error')

average_objVal = float(sum(v[0] for v in outDict.val
ues()))/float(len(outDict))
average_runTime = float(sum(v[1] for v in outDict.va
lues()))/float(len(outDict))
print(
    "Rows: " + str(r) +
    ", Cols: " + str(c) +
    ", Avg Obj: " + str(average_objVal) +
    ", Average RT: " + str(average_runTime) +
    ", Iterations: " + str(10) + "\n"
)
p4_writer.writerow([str(r), str(c), str(average_objV
al), str(average_runTime), str(10)])

```

Continuous Output:

Rows	Columns	R x C	Avg Obj Val	Avg RT	Iterations
10	10	100	267.10200758122500	0.0004413004730028130	10
10	20	200	110.86204777630800	0.0005420744720458090	10
10	50	500	73.19295081167900	0.0010250091352734400	10
10	100	1000	37.270192382752400	0.0008771181106587380	10
10	1000	10000	1.3152189688001800	0.000849107309687700	10
20	10	200	480.598296000281700	0.00003355264383968290	10
20	20	400	89.44367118888790	0.0003612041473388870	10
20	50	1000	63.53374777249680	0.0006245613098144530	10
20	100	2000	30.027008644827700	0.0008089303970036910	10
20	1000	20000	1.3094143547087100	0.0003244495391845700	10
50	10	500	544.7916211823890	0.00002042732238789500	10
50	20	1000	265.17163027834700	0.0006035568329556060	10
50	50	2500	64.55353273960980	0.0010224103327612300	10
50	100	5000	63.11174726616620	0.0016416072345459000	10
50	1000	50000	2.308586420007390	0.001065208911895750	10
100	10	1000	477.6998653507580	0.0005019187327246090	10
100	20	2000	283.3250162197110	0.0007595300574438480	10
100	50	5000	125.37113520660000	0.0015504598317553700	10
100	100	10000	62.77988203973680	0.0002430171366552700	10
100	1000	100000	2.3940841683527300	0.0002617616353442400	10
500	10	5000	744.6194010008380	0.0001213293075561500	10
500	20	10000	366.24853308778100	0.0001814813313891600	10
500	50	25000	169.08908246645000	0.0006853539581298830	10
500	100	50000	88.22650674885030	0.001696019172668460	10
500	1000	500000	3.593384487962500	0.19883641334259000	10
1000	10	10000	535.0283205183090	0.00039608000170898440	10
1000	20	20000	319.44847552835800	0.0007132897105407720	10
1000	50	50000	115.2582962365500	0.0016473793383459500	10
1000	100	100000	100.9408178118720	0.003492862251739500	10
1000	1000	1000000	0.3567803607110900	0.48083478332244900	10

- (b) Update the formulation to insist the variables are integers. Repeat the experiment. Note the time taken and objective value for each run.

Integer Code:

```
from gurobipy import *
import numpy as np
import csv

with open('problem_4_data_integer.csv', mode='w') as problem_4_data:
    p4_writer = csv.writer(problem_4_data, delimiter=',', quoting=csv.QUOTE_MINIMAL)
    p4_writer.writerow(["Rows", "Columns", "Avg Obj Val", "Avg Runtime", "Iterations"])
    #Define Proportions

    # m=[10,20,50,100,500,1000,10000]
    # n=[10,20,50,100,1000,10000]
    """
    m == 10000 and n == 10000 were not used due to time constraints
    """
    m=[10,20,50,100,500,1000]
    n=[10,20,50,100,1000]

    for r in m:
        for c in n:

            outDict = {}

            for i in range(10):
                i += 1

            # Create A
            A = np.random.rand(r,c)*1000
```

```

# Create b
b = np.random.randint(0,1000,r)
# Create cost function
cost = np.random.randint(0,1000,c)
# Create dictionary for output

try:

# Create my model
m = Model('hw1p4a')
m.setParam('TimeLimit',
120, 0) # Sets time limit to 2 minutes
m.setParam('OutputFlag', 0) # Mutes output

# Create my variables
x = m.addVars(c, vtype= GRB.INTEGER)

# Create objective function expression
expression = quicksum(np.transpose(cost)
[j]*x[j] for j in range(c))

#Set objective function
m.setObjective(expression, GRB.MINIMIZE)

# Add regular constraints
m.addConstrs(
    (quicksum(A[i,j] * x[j] for j in range(c
)))
    >= b[i]
    for i in range(r))

# Optimize model
m.optimize()

# Append results to output dictionary
outDict[i] = (m.objVal, m.runTime)

```



```
        except GurobiError as e:
            print('Error code ' + str(e.errno) + ": " +
                  str(e))
```

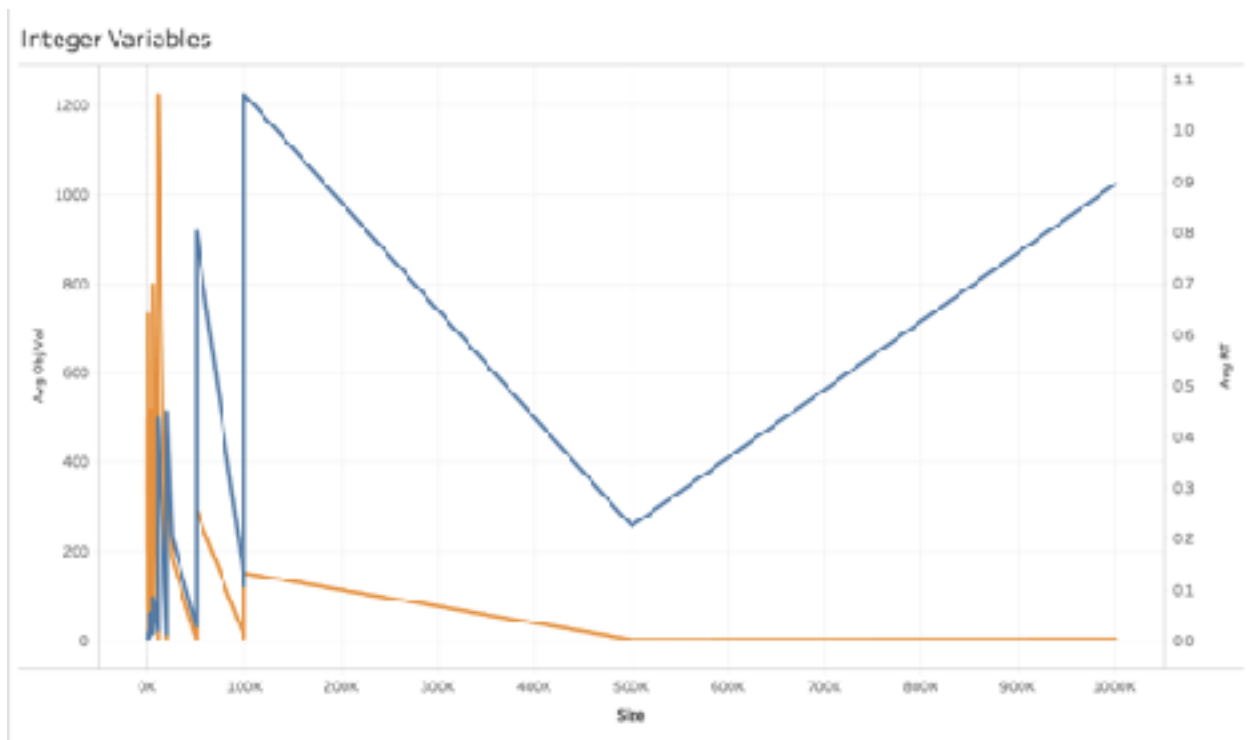
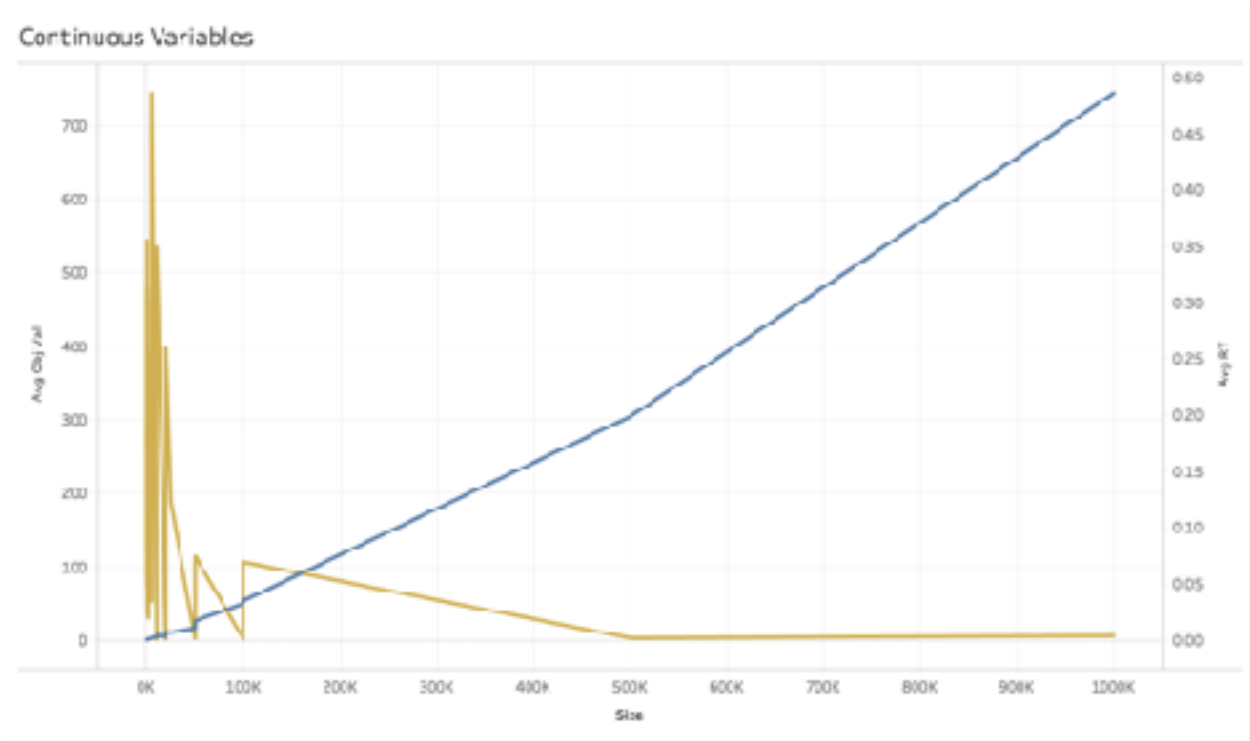
```
        except AttributeError:
            print('Encountered an attribute error')
```

```
        average_objVal = float(sum(v[0] for v in outDict.values()))/float(len(outDict))
        average_runTime = float(sum(v[1] for v in outDict.values()))/float(len(outDict))
        print(
            "Rows: " + str(r) +
            ", Cols: " + str(c) +
            ", Avg Obj: " + str(average_objVal) +
            ", Average RT: " + str(average_runTime) +
            ", Iterations: " + str(10) + "\n"
        )
        p4_writer.writerow([str(r), str(c), str(average_objVal), str(average_runTime), str(10)])
```

Integer Output:

Rows	Columns	R x C	Avg Obj Val	Avg RT	Iterations
10	10	100	357.1	0.004083641571044320	10
10	20	200	208.3	0.0024032115936279300	10
10	30	300	69.3	0.0033563613821601500	10
10	100	1000	17.5	0.0021613356451253200	10
10	1000	10000	2.6	0.020534396171529800	10
20	10	200	499.3	0.0037323852279663100	10
20	20	400	238.5	0.005616283416748050	10
20	30	1000	84.5	0.005693316459655760	10
20	100	2000	45.5	0.006035159111102295	10
20	1000	20000	0.8	0.013233732967346200	10
50	10	500	732.6	0.01743350026921700	10
50	20	1000	350.3	0.01672096051706540	10
50	30	2500	123.1	0.017633015747070300	10
50	100	5000	35.1	0.014810967445373500	10
50	1000	50000	1.6	0.02677697944641110	10
100	10	1000	410.6	0.016640700238321100	10
100	20	2000	517.9	0.06486726760864260	10
100	30	3000	160.3	0.064623866031237800	10
100	100	10000	67.2	0.06279600390870860	10
100	1000	100000	4.3	0.10743071338653600	10
500	10	5000	799.0	0.0663332936327666	10
500	20	10000	324.9	0.026407437324623000	10
500	30	25000	184.6	0.0204796772371951900	10
500	100	60000	137.0	0.06686837768654700	10
500	1000	100000	2.3	0.0264390007237000	10
1000	10	10000	1224.6	0.43673376063201900	10
1000	20	20000	508.7	0.4610216337887770	10
1000	30	30000	293.6	0.8023282796342160	10
1000	100	100000	160.6	1.070122937077470	10
1000	1000	1100000	3.3	0.694726767876831	10

(c) Plot the time and objective value as the y-axis and size ( $m + n$ ) as the x-axis.



Problem 5: (10 points) A furniture manufacturing company makes two models of tables for libraries and other university facilities. Both models use the same table tops but model A has 4 short (18-inch) legs and model B has 4 longer ones (30 inches). It takes 0.10 labor hour to cut and shape a short leg from stock, 0.15 labor hour to do the same for a long leg and 0.50 labor hour to produce a tabletop. An additional 0.30 labor hour is needed to attach the set of legs for either model after all parts are available. Estimated profit is 30 for each model A sold and 45 for each model B sold. Plenty of top material is on hand but the company wants to decide how to use the available 5000 feet of leg stock and 800 labor hours to maximize profit assuming that everything made can be sold.

- (a) Formulate a LP to choose the optimal plan. Assume that the number of tables and legs manufactured can take fractional values.

$$\begin{aligned}
 & \text{maximize } 30Q_A + 45Q_B \\
 & \text{subject to} \\
 & 72Q_A + 120Q_B \leq 60,000 \\
 & (0.4 + 0.5 + 0.3)Q_A + (0.6 + 0.5 + 0.3)Q_B \leq 800 \\
 & Q_A, Q_B \geq 0
 \end{aligned}$$

- (b) Solve the linear program using Gurobi.

Code:

```

from gurobipy import *

try:

    # Create my model
    m = Model('hw1p5a')

    # Create my variables

```

```

q = m.addVars(2, vtype= GRB.CONTINUOUS, name=['qa', 'qb'])

# Set an objective function
m.setObjective(30*q[0]+45*q[1], GRB.MAXIMIZE)

# Add regular constraints
m.addConstr(72*q[0] + 120*q[1] <= 60000)
m.addConstr(1.2*q[0] + 1.4 * q[1] <= 800)

# Add non-negativity constraints
m.addConstrs((q[i] >= 0 for i in range(2)))

# Optimize model
m.optimize()

for v in m.getVars():
    print('%s %g' % (v.varName, v.x))

print('Obj: %g' % m.objVal)

except GurobiError as e:
    print('Error code ' + str(e.errno) + ": " + str(e))

except AttributeError:
    print('Encountered an attribute error')

```

Output:

```
Optimize a model with 4 rows, 2 columns and 6 nonzeros
Coefficient statistics:
  Matrix range      [1e+00, 1e+02]
  Objective range   [3e+01, 4e+01]
  Bounds range      [0e+00, 0e+00]
  RHS range         [8e+02, 6e+04]
Presolve removed 2 rows and 0 columns
Presolve time: 0.00s
Presolved: 2 rows, 2 columns, 4 nonzeros

Iteration    Objective          Primal Inf.    Dual Inf.      Time
     0        2.5000000e+04    3.659990e+02    0.000000e+00    0s
     2        2.3333333e+04    0.000000e+00    0.000000e+00    0s

Solved in 2 iterations and 0.00 seconds
Optimal objective  2.33333333e+04
qa 277.778
qb 333.333
Obj: 23333.3
```

(c) Can you justify the assumption that the variables can take fractional values?

Yes! You can partially build a table. If these constraints were for a calendar month (say, January), then it would be optimal to use as much of our time and stock resources to build as many tables as possible. Any table partially built could be finished in February.