#### Part 0:

```
Optimize a model with 248 rows, 60 columns and 772 nonzeros
 Model fingerprint: 0xd6346155
 Variable types: 0 continuous, 60 integer (52 binary)
Validate types of continuous, our coefficient statistics:
Matrix range [1e+00, 1e+07]
Objective range [1e+00, 4e+00]
Bounds range [1e+00, 1e+00]
RHS range [1e+00, 2e+07]
 RHS range [1e+00, 2e+07]
Found heuristic solution: objective 10.0000000
Presolve removed 86 rows and 21 columns
Presolve time: 0.00s
 Presolved: 162 rows, 39 columns, 503 nonzeros
Variable types: 0 continuous, 39 integer (34 binary)
 Root relaxation: objective 1.000000e+00, 33 iterations, 0.00 seconds (0.00 work units)
         ah_0_2
sh_0_3
ah_0_3
 Root relaxation: objective 2.333333e+02, 2 iterations, 0.00 seconds (0.00 work units)
 Nodes | Current Node | Objective Bounds | Work
Expl Unexpl | Obj Depth IntInf | Incumbent BestBd Gap | It/Node Time

    0
    0
    233.33333
    0
    2 155.00000
    233.33333
    50.5%

    0
    0
    230.0000000
    233.33333
    1.45%

    0
    0
    233.33333
    0
    2 230.00000
    233.33333
    1.45%

                                                                                                         0s
0s
Explored 1 nodes (2 simplex iterations) in 0.01 seconds (0.00 work units) Thread count was 16 (of 16 available processors)
 Solution count 3: 230 155 150
x1 6
x2 7
Obj: 230
PS C:\Users\laure\Desktop\Masters\Spring 2023\503\HW\3>
```

This part is fairly straightforward as I was just running the python file that was in the given homework assignment.

### Part 1:

```
# linearized scheduling constraint 1
for i in range(num_tasks):
    for j in range(num_tasks):
        if i!=j:
            # complete this part
            m.addConstr(s_var[i] + t_var[i] <= s_var[j] + (1 - sh_var[i][j])*my_infty + (1 - ah_var[i][j])*my_infty,
name="schedulingConstraint1"+str(i)+"_"+str(j))
# linearized scheduling constraint 2
for i in range(num_tasks):
    for j in range(num_tasks):
        if i!=j:</pre>
```

```
# complete this part

m.addConstr(s_var[j] + t_var[j] <= s_var[i] + (1 -
sh_var[i][j])*my_infty + ah_var[i][j]*my_infty,
name="schedulingConstraint2"+str(i)+"_"+str(j))</pre>
```

This part was fairly straightforward as I simply applied these two scheduling constraints to the pre-existing skeleton code as given in the hw document and the slides we went over in class that cover linear programming optimization.

▶ For all 
$$v_i$$
,  $v_j \in V$ , s.t.  $i \neq j$   
▶  $s_i + t_i \leq s_j + (1 - sh_{i,j})^{*\infty} + (1 - ah_{i,j})^{*\infty}$   
▶  $s_i + t_i \leq s_i + (1 - sh_{i,j})^{*\infty} + ah_{i,j}^{*\infty}$ 

The screenshots below show the optimization results for each latency value tested.

## Latency:2

## Latency: 3

```
Solution count 1: 10
Optimal solution found (tolerance 1.00e-04)
Best objective 1.0000000000000e+01, best bound 1.00000000000e+01, gap 0.0000%
Optimization Results:
   Variable X
     m 0 0 1
m 1 1 1
m 2 2 1
m 3 3 1
s 1 1
s 2 1
s 3 2
t 0 1
t 1 1
        t_2
         t_3
      ah 0 1
      ah_0_3
                       1
      ah_1_3
      ah_2_3
                       1
      used 0
      used 1
                       1
      used_2
      used 3
                         1
```

## Latency: 4

```
Solution count 2: 6 10
Optimal solution found (tolerance 1.00e-04)
Best objective 6.0000000000000e+00, best bound 6.00000000000e+00, gap 0.0000%
Optimization Results:
  Variable X
    m_0_0
    m_1_1
m_2_2
                1
     m_3_0
                1
                 1
     s_1
                 1
     5_2
      s_3
                 2
      t_0
                 1
      t_1
                 1
                 1
      t_2
      t_3
                 2
    ah_0_1
                 1
                 1
    ah 0 2
                 1
    sh_0_3
                 1
    ah 0 3
    ah_1_2
                 1
    ah_2_1
                  1
                 1
    sh_3_0
                  1
    used 0
    used 1
                  1
    used 2
                  1
```

## Latency: 5

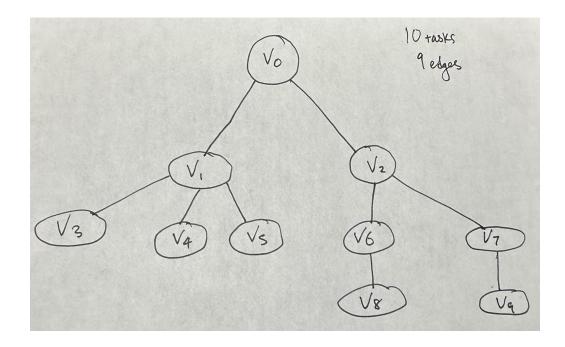
```
Solution count 4: 3 7 8 10
Optimal solution found (tolerance 1.00e-04)
Best objective 3.0000000000000e+00, best bound 3.00000000000e+00, gap 0.0000%
Optimization Results:
   Variable
      m_0_0
      m_1_1
      m_2_0
      m_3_0
       s_1
       s_2
        s_3
        t_0
        t_1
        t_2
        t_3
                       2
     ah_0_1
     sh 0 2
     ah_0_2
     sh_0_3
     ah_0_3
     ah_1_2
     ah_1_3
     sh_2_0
     ah_2_1
     sh_2_3
     ah_2_3
     sh_3_0
     sh 3 2
     used 0
     used_1
```

# Part 2: New intialized values:

```
# num tasks: 10
num_tasks = 10
# num procs: 4
num_procs = 4
# latency constraint
latency_const = 18
# exec. info
exec_time = [
[1,2,3,4],
[2,1,3,4],
[2,3,1,4],
```

```
[2,3,4,1],
[1,2,3,4],
[2,1,3,4],
[2,3,1,4],
[2,3,4,1],
[1,2,3,4],
[2,1,3,4]
# edge info
edge = [
[0,1,1,0,0,0,0,0,1,0], #v0->v1,v2
[0,0,0,1,1,1,0,0,0,0], #v1->v3,v4,v5
[0,0,0,0,0,0,1,1,0,0], #v2->v6,v7
[0,0,0,0,0,0,0,0,0], #v3->
[0,0,0,0,0,0,0,0,0], #v4->
[0,0,0,0,0,0,0,0,0], #v5->
[0,0,0,0,0,0,0,0,1,0], \#v6->v8
[0,0,0,0,0,0,0,0,0,1], \#v7->v9
[0,0,0,0,0,0,0,0,0], #v8->
[0,0,0,0,0,0,0,0,0] #v9->
```

Picture visualizing the new graph with 10 nodes and 9 edges



## M. optmizations

```
# objective
lat = m.addVar(vtype=GRB.INTEGER, name="lat")

# update latency constraints and redefine them as completion time constraints
for i in range(num_tasks):
    m.addConstr(s_var[i] + t_var[i] <= lat,
name="completion_time_const_"+str(i))

# objective - minimize latency
m.setObjective(lat, GRB.MINIMIZE)

m.write("formulation.lp")
m.optimize()</pre>
```

The main portion of this code that I changed areas shown above. In part 2, we are trying to minimize the latency with respect to the cost constraint. The key points that i show in the code above is that we initialized 10 tasks with 9 edges. And set the exec\_time and cost tables that reflect this. This is initialized in such a way that many multiple feasible solutions exist.

The screenshot below shows the run of the code with the input values as num\_tasks = 10, num\_procs = 4, and latency\_const = 18.

```
Explored 1 nodes (234 simplex iterations) in 0.03 seconds (0.04 work units)
Thread count was 16 (of 16 available processors)
Solution count 2: 4 18
Optimal solution found (tolerance 1.00e-04)
Best objective 4.0000000000000e+00, best bound 4.000000000000e+00, gap 0.0000%
Optimization Results:
   Variable
                    Х
     ah 0 4
                    1
     sh 0 8
                    1
                    1
     ah 08
     ah 1 3
                    1
     ah_1_4
                    1
     sh 1 5
                    1
     ah_1_5
                    1
     sh_1_9
     ah_1_9
                    1
     sh_2_6
     ah_2_6
     ah 2 7
     sh_3_7
                    1
     sh 4 0
                    1
     sh 4 8
     ah 48
                    1
     sh 5 1
                    1
     sh_5_9
                    1
     ah_5_9
     sh 6 2
                    1
     ah 68
                    1
     sh_7_3
     ah 7 3
                    1
     ah_7_9
                    1
                    1
     sh 8 0
     sh 8 4
     sh 9 1
                    1
     sh_9_5
                    1
     used 0
                    1
     used 1
     used 2
                    1
     used 3
                    1
        lat
                     4
```

### Part 3:

```
# Extending edge constraints using sh_var
for i in range(num_tasks):
    for j in range(num_tasks):
        if edge[i][j] == 1:
```

```
m.addConstr(s_var[i] + t_var[i] + 1 <= s_var[j] + my_infty *
(1 - sh_var[i][j]), name="edge_const_extended_"+str(i)+"_"+str(j))</pre>
```

As shown in the code above we are extending a communication delay extending from the basic formulation which we created in part 1. By assuming that each dependency results in communication delay of 1 time unit if the source and destination tasks are mapped do different processors. The communication delay which we created is conditional that checks for all  $ei,j \in E$ , but applies only for existing k such that mi,k=mj,k=1. We have a predefined constraint to find the sh value in shvars which is a list of binary variables. So if shij is 1, then we define the edge constraint as  $si + ti \le sj$ . If it is 0, then we set it as  $si + ti + 1 \le sj$ .

The below is the optimization screenshot of a latency constraint of 5 based on the skeleton code.

```
Solution count 3: 3 6 10
Optimal solution found (tolerance 1.00e-04)
Best objective 3.0000000000000e+00, best bound 3.00000000000e+00, gap 0.0000%
_____
Optimization Results:
                    X
   Variable
     m 0 0
                    1
     m_1_1
                   1
     m 2 0
                    1
                   1
     m 3 1
       5_2
                   2
       s_3
                   2
       t_0
                   1
       t_1
                    1
       t_2
                   2
                    3
       t_3
     ah 0 1
                    1
     sh 0 2
                    1
     ah 0 2
                    1
     ah 0 3
                    1
     ah 1 2
                    1
     sh 1 3
                    1
                    1
     ah 1 3
                    1
     sh 2 0
     ah 2 3
                   1
     sh 3 1
                    1
     used 0
                    1
     used 1
```

# **Code Dictionary**

product.py:

```
#!/usr/bin/env python3.7
# Copyright 2020, Gurobi Optimization, LLC
import gurobipy as gp
from gurobipy import GRB
try:
   m = gp.Model("prod")
   x1 = m.addVar(vtype=GRB.INTEGER, name="x1")
   x2 = m.addVar(vtype=GRB.INTEGER, name="x2")
   m.setObjective(15 * x1 + 20 * x2, GRB.MAXIMIZE)
   m.addConstr(x1 + 2 * x2 \le 20, "c2")
   m.addConstr(x1 >= 0, "c4 1")
```

```
# Optimize model
m.optimize()

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

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

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

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

### Map skel.py

```
[2,1,3,4],
[2,3,1,4],
[2,3,3,1],
# edge info
edge = [
[0,1,1,0],
[0,0,0,1],
[0,0,0,1],
[0,0,0,0],
# cost info
cost = [1, 2, 3, 4]
# model generation
m = gp.Model("mapping")
# mapping variables m
m var = [] \# m variables
for i in range(num tasks):
   temp m var = []
   mylhs = gp.LinExpr(0.0)
    for j in range(num procs):
        temp m var.append(m.addVar(vtype=GRB.BINARY, name="m " +str(i) +
' " + str(j)))  # binary variable m i j
       mylhs.add(temp m var[j])
   m.addConstr(lhs=mylhs, sense=GRB.EQUAL, rhs=1,
name="mapping const "+str(i))
   m var.append(temp m var)
# starting time variables s
s var = [] # s variables
for i in range(num tasks):
    s var.append(m.addVar(vtype=GRB.INTEGER, name="s " + str(i))) #
integer variable s i
```

```
for i in range(num tasks):
    t var.append(m.addVar(vtype=GRB.INTEGER, name="t " + str(i))) #
   myrhs = gp.LinExpr(0.0)
    for j in range(num procs):
        myrhs.add(exec_time[i][j]* m_var[i][j])
    m.addConstr(lhs=t var[i], sense=GRB.EQUAL, rhs=myrhs,
name="exec time const "+str(i))
for i in range(num tasks):
   mylhs = qp.LinExpr(0.0)
   mylhs.add(s var[i])
   mylhs.add(t var[i])
   m.addConstr(lhs=mylhs, sense=GRB.LESS EQUAL, rhs=latency const,
name="latency const "+str(i))
# edge constraints
for i in range(num tasks):
   for j in range(num tasks):
        if edge[i][j] == 1:
            m.addConstr(s var[i] + t var[i] <= s var[j],</pre>
name="edge const "+str(i)+" "+str(j))
sh var = []
ah var = []
for i in range(num tasks):
    temp sh var = []
    temp_ah var = []
    for j in range(num tasks):
        temp sh var.append(m.addVar(vtype=GRB.BINARY, name="sh " + str(i)
+ " " + str(j)))  # binary variable sh i j
        temp ah var.append(m.addVar(vtype=GRB.BINARY, name="ah " + str(i)
 " " + str(j))) # binary variable ah i j
    sh var.append(temp sh var)
   ah var.append(temp ah var)
```

```
for i in range(num tasks):
       if i!=j:
           m.addConstr(s_var[i] + t_var[i] <= s_var[j] + (1 -</pre>
sh_var[i][j])*my_infty + (1 - ah_var[i][j])*my_infty,
name="schedulingConstraint1"+str(i)+" "+str(j))
for i in range(num tasks):
   for j in range(num tasks):
       if i!=j:
           m.addConstr(s var[j] + t var[j] \le s var[i] + (1 -
name="schedulingConstraint2"+str(i)+" "+str(j))
used vars = []
for i in range(num procs):
   used vars.append(m.addVar(vtype=GRB.BINARY, name="used "+str(i)))
   myrhs = gp.LinExpr(0.0)
   for j in range(num tasks):
       m.addConstr(lhs=used vars[i], sense=GRB.GREATER EQUAL,
rhs=m var[j][i], name="used const "+str(i)+" "+str(j))
for k in range(num procs):
       for i in range(num tasks):
               for j in range(num tasks):
                       if i!=j:
                               mylhs = gp.LinExpr(0.0)
                               myrhs = gp.LinExpr(0.0)
                               m.addConstr(sh var[i][j] >= m var[i][k] +
m var[j][k] -1, name="sh const "+str(k)+" "+str(i)+" "+str(j))
for k in range(num procs):
```

```
for 1 in range(num procs):
              for i in range(num tasks):
                                   mylhs = gp.LinExpr(0.0)
                                   myrhs = gp.LinExpr(0.0)
                                   m.addConstr(sh var[i][j] <=</pre>
(1-m_var[i][k])*my_infty + (1-m_var[j][l])*my_infty ,
name="sh const sec "+str(k)+" "+str(l)+" "+str(i)+" "+str(j))
# objective
myobj = gp.LinExpr(0.0)
for i in range(num procs):
   myobj.add(used vars[i] * cost[i])
m.setObjective(myobj, GRB.MINIMIZE)
m.write("formulation.lp")
m.optimize()
print("============="")
print("Optimization Results:")
m.printAttr('X')
P2.pv
```

```
num tasks = 10
# num procs: 4
num procs = 4
# latency constraint
latency_const = 18
# exec. info
exec time = [
[1,2,3,4],
[2,1,3,4],
[2,3,1,4],
[2,3,4,1],
[1,2,3,4],
[2,1,3,4],
[2,3,1,4],
[2,3,4,1],
[1,2,3,4],
[2,1,3,4]
# edge info
edge = [
[0,1,1,0,0,0,0,0,1,0], \#v0->v1,v2
[0,0,0,1,1,1,0,0,0,0], #v1->v3,v4,v5
[0,0,0,0,0,0,1,1,0,0], #v2->v6,v7
[0,0,0,0,0,0,0,0,0], #v3->
[0,0,0,0,0,0,0,0,0], #v4->
[0,0,0,0,0,0,0,0,0], \# v5->
[0,0,0,0,0,0,0,0,1,0], \#v6->v8
[0,0,0,0,0,0,0,0,0,1], \#v7->v9
[0,0,0,0,0,0,0,0,0], #v8->
[0,0,0,0,0,0,0,0,0] #v9->
# cost info
cost = [1, 2, 3, 4]
```

```
m = gp.Model("mapping")
m var = [] # m variables
for i in range(num tasks):
   mylhs = gp.LinExpr(0.0)
    for j in range(num procs):
        temp m var.append(m.addVar(vtype=GRB.BINARY, name="m " +str(i) +
 " + str(j))) # binary variable m i j
        mylhs.add(temp m var[j])
   m.addConstr(lhs=mylhs, sense=GRB.EQUAL, rhs=1,
name="mapping const "+str(i))
   m var.append(temp m var)
# starting time variables s
s var = [] # s variables
for i in range(num tasks):
    s var.append(m.addVar(vtype=GRB.INTEGER, name="s " + str(i))) #
integer variable s i
t var = [] # t variables
for i in range(num tasks):
    t var.append(m.addVar(vtype=GRB.INTEGER, name="t " + str(i))) #
integer variable t i
   myrhs = gp.LinExpr(0.0)
    for j in range(num procs):
        myrhs.add(exec time[i][j]* m var[i][j])
   m.addConstr(lhs=t var[i], sense=GRB.EQUAL, rhs=myrhs,
name="exec time const "+str(i))
for i in range(num tasks):
   mylhs = gp.LinExpr(0.0)
   mylhs.add(s var[i])
   mylhs.add(t var[i])
   m.addConstr(lhs=mylhs, sense=GRB.LESS EQUAL, rhs=latency const,
name="latency const "+str(i))
```

```
for i in range(num tasks):
   for j in range(num tasks):
       if edge[i][j] == 1:
          m.addConstr(s_var[i] + t_var[i] <= s_var[j],</pre>
name="edge const "+str(i)+" "+str(j))
sh var = []
ah var = []
for i in range(num tasks):
   temp sh var = []
   temp ah var = []
   for j in range(num tasks):
       temp sh var.append(m.addVar(vtype=GRB.BINARY, name="sh " + str(i)
temp ah var.append(m.addVar(vtype=GRB.BINARY, name="ah " + str(i)
+ " " + str(j)))  # binary variable ah i j
   sh var.append(temp sh var)
   ah var.append(temp ah var)
for i in range(num tasks):
      if i!=j:
          m.addConstr(s var[i] + t var[i] <= s var[j] + (1 -</pre>
name="schedulingConstraint1"+str(i)+" "+str(j))
for i in range(num tasks):
       if i!=j:
          m.addConstr(s_var[j] + t_var[j] <= s_var[i] + (1 -</pre>
name="schedulingConstraint2"+str(i)+" "+str(j))
```

```
used vars = []
for i in range(num procs):
    used vars.append(m.addVar(vtype=GRB.BINARY, name="used "+str(i)))
    myrhs = gp.LinExpr(0.0)
    for j in range(num tasks):
        m.addConstr(lhs=used vars[i], sense=GRB.GREATER EQUAL,
rhs=m var[j][i], name="used const "+str(i)+" "+str(j))
for k in range(num procs):
        for i in range(num tasks):
                for j in range(num tasks):
                        if i!=j:
                                mylhs = gp.LinExpr(0.0)
                                myrhs = gp.LinExpr(0.0)
                                m.addConstr(sh var[i][j] >= m var[i][k] +
m var[j][k] -1, name="sh const "+str(k)+" "+str(i)+" "+str(j))
for k in range(num procs):
        for 1 in range(num procs):
                for i in range(num tasks):
                                if i!=j and k!=l:
                                         mylhs = gp.LinExpr(0.0)
                                         myrhs = qp.LinExpr(0.0)
                                         m.addConstr(sh var[i][j] <=</pre>
(1-m var[i][k]) *my infty + (1-m var[j][l]) *my infty ,
name="sh_const_sec_"+str(k)+" "+str(l)+" "+str(i)+" "+str(j))
lat = m.addVar(vtype=GRB.INTEGER, name="lat")
```

## P3.py

```
[2,1,3,4],
[2,3,1,4],
[2,3,3,1],
# edge info
edge = [
[0,1,1,0],
[0,0,0,1],
[0,0,0,1],
[0,0,0,0],
# cost info
cost = [1, 2, 3, 4]
# model generation
m = gp.Model("mapping")
# mapping variables m
m var = [] \# m variables
for i in range(num tasks):
   temp m var = []
   mylhs = gp.LinExpr(0.0)
    for j in range(num procs):
        temp m var.append(m.addVar(vtype=GRB.BINARY, name="m " +str(i) +
' " + str(j)))  # binary variable m i j
       mylhs.add(temp m var[j])
   m.addConstr(lhs=mylhs, sense=GRB.EQUAL, rhs=1,
name="mapping const "+str(i))
   m var.append(temp m var)
# starting time variables s
s var = [] # s variables
for i in range(num tasks):
    s var.append(m.addVar(vtype=GRB.INTEGER, name="s " + str(i))) #
integer variable s i
```

```
for i in range(num tasks):
    t var.append(m.addVar(vtype=GRB.INTEGER, name="t " + str(i))) #
   myrhs = gp.LinExpr(0.0)
    for j in range(num procs):
        myrhs.add(exec_time[i][j]* m_var[i][j])
    m.addConstr(lhs=t var[i], sense=GRB.EQUAL, rhs=myrhs,
name="exec time const "+str(i))
for i in range(num tasks):
   mylhs = qp.LinExpr(0.0)
   mylhs.add(s var[i])
   mylhs.add(t var[i])
   m.addConstr(lhs=mylhs, sense=GRB.LESS EQUAL, rhs=latency const,
name="latency const "+str(i))
# # edge constraints
sh var = []
ah var = []
for i in range(num tasks):
    temp sh var = []
    temp ah var = []
    for j in range(num tasks):
        temp sh var.append(m.addVar(vtype=GRB.BINARY, name="sh " + str(i)
+ " " + str(j)))  # binary variable sh i j
        temp ah var.append(m.addVar(vtype=GRB.BINARY, name="ah " + str(i)
 " " + str(j))) # binary variable ah i j
    sh var.append(temp sh var)
   ah var.append(temp ah var)
```

```
for i in range(num tasks):
   for j in range(num tasks):
       if edge[i][j] == 1:
           m.addConstr(s var[i] + t var[i] + 1 <= s var[j] + my infty *</pre>
(1 - sh_var[i][j]), name="edge const extended "+str(i)+" "+str(j))
for i in range(num tasks):
   for j in range(num tasks):
       if i!=j:
           m.addConstr(s var[i] + t var[i] <= s var[j] + (1 -</pre>
sh var[i][j])*my infty + (1 - ah var[i][j])*my infty,
name="schedulingConstraint1"+str(i)+" "+str(j))
for i in range(num tasks):
           m.addConstr(s var[j] + t var[j] \le s var[i] + (1 - var[j])
name="schedulingConstraint2"+str(i)+" "+str(j))
used vars = []
for i in range(num procs):
   used vars.append(m.addVar(vtype=GRB.BINARY, name="used "+str(i)))
   myrhs = gp.LinExpr(0.0)
   for j in range(num tasks):
       m.addConstr(lhs=used vars[i], sense=GRB.GREATER EQUAL,
rhs=m var[j][i], name="used const "+str(i)+" "+str(j))
for k in range(num procs):
       for i in range(num tasks):
                       if i!=j:
```

```
mylhs = gp.LinExpr(0.0)
                              myrhs = gp.LinExpr(0.0)
                              m.addConstr(sh var[i][j] >= m var[i][k] +
m_{var[j][k]} -1, name="sh_{const_"+str(k)+"_"+str(i)+"_"+str(j))}
for k in range(num_procs):
       for l in range(num procs):
                                     mylhs = qp.LinExpr(0.0)
                                     myrhs = gp.LinExpr(0.0)
                                     m.addConstr(sh var[i][j] <=</pre>
(1-m var[i][k])*my infty + (1-m var[j][l])*my_infty ,
name="sh const sec "+str(k)+" "+str(l)+" "+str(i)+" "+str(j))
# objective
myobj = gp.LinExpr(0.0)
for i in range(num procs):
   myobj.add(used vars[i] * cost[i])
m.setObjective(myobj, GRB.MINIMIZE)
m.write("formulation.lp")
m.optimize()
print("============"")
print("Optimization Results:")
m.printAttr('X')
print("=============")
```