

# FINAL PROJECT

BANA 7020 – Optimization

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# PROBLEM FORMULATION

## Variables-

x – Array of x coordinates

y – Array of y coordinates

Euc – Euclidean Matrix

C<sub>T</sub> – Cost per unit of Truck

C<sub>D</sub> – Cost per unit of Drones

Primary\_nodes: Number of Primary nodes (Integer)

Secondary\_nodes: Number of Secondary nodes (Integer)

Positional – Array of positions (Integer)

Truck\_travel\_bin: Truck binary variable

Drones\_travel\_bin: Drones binary variable

LIMIT – Customers to be served + 2

## Objective function –

### Minimize

$$\sum_i^P \sum_j^P Truck\_travel\_bin(i,j) * Euc(i,j) * C_T + \sum_i^P \sum_j^P Drones\_travel\_bin(i,j) * Euc(i,j) * C_D$$

## Constraints –

### Origin constraints-

$$x(1) := 0$$

$$y(1) := 0$$

$$x(LIMIT) := 0$$

$$y(LIMIT) := 0$$

### K Drones allowed

$$\sum_{j=1}^{LIMIT} Truck\_travel\_bin(i,j) + \sum_{j=1}^{LIMIT} Drones\_travel\_bin(i,j) \leq K+1 \quad \forall i \in (2 \text{ to } (LIMIT - 1))$$

### Positional Constraints

$$Positional(1) = 1$$

$$Positional(2) = \sum_{i=1}^{LIMIT} \sum_{j=1}^{LIMIT} Truck\_travel\_bin(i,j) + 1$$

$$Positional(j) \geq Positional(i) + 1 - 200 * (1 - Truck\_travel\_bin(i,j)) \quad \forall i \in (1 \text{ to } LIMIT), j \in (1 \text{ to } LIMIT)$$

### Balance constraint out - in = 0

$$\sum_{j=1}^{LIMIT} Truck\_travel\_bin(i,j) - \sum_{j=1}^{LIMIT} Truck\_travel\_bin(j,i) = 0 \quad \forall i \in (2 \text{ to } (LIMIT - 1))$$

### Nodes are greater than 0

Primary\_nodes  $\geq 0$

Secondary\_nodes  $\geq 0$

$Euc(p,j) = \text{round}(\sqrt{(y(j)-y(p))^2 + (x(j)-x(p))^2}) \forall p \in (1 \text{ to } LIMIT), j \in (1 \text{ to } LIMIT)$

### Limit constraints

Primary\_nodes + Secondary\_nodes = 22

$\sum_{i=1}^{LIMIT} \sum_{j=1}^{LIMIT} Drones\_travel\_bin(i,j) = 2 * \text{Secondary\_nodes}$

$\sum_{i=1}^{LIMIT} \sum_{j=1}^{LIMIT} Truck\_travel\_bin(i,j) = \text{Primary\_nodes} - 1$

### Constraint for removing subtours of drones

$Drones\_travel\_bin(i,j) = Drones\_travel\_bin(j,i) \forall i \in (2 \text{ to } (LIMIT - 1)), j \in (2 \text{ to } (LIMIT - 1))$

### Constraint for removing subtour of trucks

$Truck\_travel\_bin(i,j) + Truck\_travel\_bin(j,i) \leq 1 \forall i \in (2 \text{ to } (LIMIT - 1)), j \in (2 \text{ to } (LIMIT - 1))$

$Drones\_travel\_bin(i,j) \leq \sum_{a=1}^{LIMIT} Truck\_travel\_bin(a,i) + \sum_{a=1}^{LIMIT} Truck\_travel\_bin(a,j) \forall i \in (2 \text{ to } (LIMIT - 1)), j \in (2 \text{ to } (LIMIT - 1))$

### Origin constraints

$\sum_{i=1}^{LIMIT} Truck\_travel\_bin(1,i) = 1$

$\sum_{i=1}^{LIMIT} Truck\_travel\_bin(i,1) = 0$

$\sum_{i=1}^{LIMIT} Drones\_travel\_bin(1,i) = 0$

$\sum_{i=1}^{LIMIT} Drones\_travel\_bin(i,1) = 0$

### Last node constraints

$\sum_{i=1}^{LIMIT} Truck\_travel\_bin(LIMIT,i) = 0$

$\sum_{i=1}^{LIMIT} Truck\_travel\_bin(i,LIMIT) = 1$

$\sum_{i=1}^{LIMIT} Drones\_travel\_bin(LIMIT,i) = 0$

$\sum_{i=1}^{LIMIT} Drones\_travel\_bin(i,LIMIT) = 0$

$Truck\_travel\_bin(1,LIMIT) = 0$

$Truck\_travel\_bin(LIMIT,1) = 0$

### Removing arcs on itself

$\sum_{i=1}^{LIMIT} Truck\_travel\_bin(i,i) = 0$

$\sum_{i=1}^{LIMIT} Drones\_travel\_bin(i,i) = 0$

### All nodes should be having incoming nodes - except origin

$\sum_{j=1}^{LIMIT} Truck\_travel\_bin(j,i) - \sum_{j=1}^{LIMIT} Drones\_travel\_bin(j,i) \geq 1 \forall i \in (2 \text{ to } LIMIT)$

**All nodes should be having outgoing nodes - except destination**

$$\sum_{i=1}^{LIMIT} Truck\_travel\_bin(j, i) - \sum_{i=1}^{LIMIT} Drones\_travel\_bin(j, i) \geq 1 \quad \forall j \in (1 \text{ to } (LIMIT-1))$$

**Constraint for not being secondary and primary at the same time**

$$Truck\_travel\_bin(i, j) + Drones\_travel\_bin(i, j) \leq 1 \quad \forall i \in (1 \text{ to } LIMIT) \quad j \in (1 \text{ to } LIMIT)$$

**Constraint for traveling back to j if drone travels from j**

$$Drones\_travel\_bin(i, j) = Drones\_travel\_bin(j, i) \quad \forall i \in (2 \text{ to } (LIMIT - 1)) \quad j \in (2 \text{ to } (LIMIT - 1))$$

## XPRESS CODE

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```
model final_project
uses "mmxprs"; !gain access to the Xpress-Optimizer solver
uses "mmive" !gain access to graphical capabilities

parameters
LIMIT=22
end-parameters
setparam("XPRS_MAXTIME", 7200)

declarations
P= 1..22
graph : integer
x: array(P) of real !declaring random X coordinates
y: array(P) of real !declaring random Y coordinates
Euc: array(P,P) of integer !declaring Euclidean matrix
Truck_travel_bin: array(P,P) of mpvar !declaring truck binary variable
Drones_travel_bin: array(P,P) of mpvar !declaring drones binary variable
Primary_nodes: mpvar !primary nodes no
Secondary_nodes: mpvar !secondary nodes no
Positional: array(P) of mpvar
end-declarations

writeln("RANDOM numbers(", LIMIT, " of them) between 1 and 20 :")

setrandseed(4)
cloud:=IVEaddplot("DISTRIBUTION OF GENERATED X and Y", IVE_BLUE)
forall(p in 2..LIMIT) do
    x(p) := 100*random
    y(p) := 100*random
end-do

! origin constraints
x(1):= 0
y(1):= 0
x(22):= 0
y(22):= 0

!type constraints
forall( p in 1..LIMIT) do
    Positional(p) is_integer
end-do

!K drones allowed constraints
forall(i in 2..21) sum(j in 1..LIMIT) Truck_travel_bin(i,j) + sum(j in 1..LIMIT) Drones_travel_bin(i,j) <= 6

!Positional Constraints
Positional(1) = 1
Positional(22) = sum(i in 1..LIMIT, j in 1..LIMIT) Truck_travel_bin(i,j)+1

forall( i in 1..LIMIT, j in 1..LIMIT)
    Positional(j) >= Positional(i) + 1 - 200*(1-Truck_travel_bin(i,j))

!Balance constraint out - in = 0
forall(i in 2..21) sum(j in 1..LIMIT) Truck_travel_bin(i,j)-sum(j in 1..LIMIT) Truck_travel_bin(j,i)=0

forall(p in 1..LIMIT,j in 1..LIMIT) do
    Truck_travel_bin(p,j) is_binary
    Drones_travel_bin(p,j) is_binary
end-do
```

```

Primary_nodes is_integer
Secondary_nodes is_integer
Primary_nodes >=0
Secondary_nodes >=0

forall(p in 1..LIMIT, j in 1..LIMIT) do
    Euc(p,j) := round(sqrt((y(j)-y(p))^2 + (x(j)-x(p))^2))
end-do

!Limit constraints

Primary_nodes + Secondary_nodes =22

!Primary_nodes=(Secondary_nodes/2)+2

!Primary_nodes*2=Secondary_nodes

sum(i in 1..LIMIT, j in 1..LIMIT) Drones_travel_bin(i,j) = 2*Secondary_nodes

sum(i in 1..LIMIT, j in 1..LIMIT) Truck_travel_bin(i,j) = Primary_nodes -1

! constraint for removing subtours of drones
forall(i in 2..21, j in 2..21)
    Drones_travel_bin(i,j) = Drones_travel_bin(j,i)

!Constraint for removing subtour of trucks
forall(i in 2..21, j in 2..21)
    Truck_travel_bin(i,j) + Truck_travel_bin(j,i) <=1

forall(i in 2..21, j in 2..21) Drones_travel_bin(i,j) <= sum(a in 1..22) Truck_travel_bin(a,i) + sum(a in 1..22) Truck_travel_bin(a,j)
if S(i,j) exists no S(j,i) should exist
forall(i in 2..11) sum(j in 2..11) Drones_travel_bin(j,i) + sum(j in 2..11) Drones_travel_bin(i,j) >= 2- sum(j in 2..11) Truck_travel_bin(i,j)

CONSTRAINT FOR Kth

! origin constraints - part 2
sum(i in 1..LIMIT) Truck_travel_bin(1,i) = 1
sum(i in 1..LIMIT) Drones_travel_bin(1,i) = 0

sum(i in 1..LIMIT) Truck_travel_bin(i,1) = 0 |
sum(i in 1..LIMIT) Drones_travel_bin(i,1) = 0

!last node constraints
sum(i in 1..LIMIT) Truck_travel_bin(22,i) = 0
sum(i in 1..LIMIT) Drones_travel_bin(22,i) = 0

sum(i in 1..LIMIT) Truck_travel_bin(i,22) = 1
sum(i in 1..LIMIT) Drones_travel_bin(i,22) = 0

Truck_travel_bin(1,22) =0
Truck_travel_bin(22,1) =0

!removing arcs on itself
sum(i in 1..LIMIT) Truck_travel_bin(i,i) = 0
sum(i in 1..LIMIT) Drones_travel_bin(i,i) = 0

!all nodes should be have incoming nodes - except origin
forall(i in 2..LIMIT) sum(j in 1..LIMIT) Truck_travel_bin(j,i) + sum(j in 1..LIMIT) Drones_travel_bin(j,i) >=1

!all nodes should have outgoing nodes - except destination
forall(j in 1..21) sum(i in 1..LIMIT) Truck_travel_bin(j,i) + sum(i in 1..LIMIT) Drones_travel_bin(j,i) >=1

! constraint for not being secondary and primary at the same time
forall(i in 1..LIMIT, j in 1..LIMIT)
    Truck_travel_bin(i,j) + Drones_travel_bin(i,j) <=1

! constraint for traveling back to j if drone travels from j
forall(i in 2..21, j in 2..21)
    Drones_travel_bin(i,j) = Drones_travel_bin(j,i)

obj:=sum(i in P)sum(j in P)(Truck_travel_bin(i,j))*Euc(i,j)*20+sum(i in P)sum(j in P)(Drones_travel_bin(i,j))*Euc(i,j)*1
minimize(obj)

writeln("Printing random numbers generated below:")
forall(p in 1..LIMIT) do
    writeln("Number ",p," in Array X is :",x(p)," and the Number ",p," in Array Y is:", y(p))
end-do

IVEzoom(0, -0, 10, 10)
writeln(" Generating the Plot for co-ordinates below")
graph:=IVEaddplot("Y(X)",IVE_RED) !Create a graph
graph2:=IVEaddplot("Y(X)",IVE_GREEN)

forall(p in 1..LIMIT) do
    IVEdrawpoint(graph, x(p), y(p))
    IVEdrawlabel(graph, x(p), y(p), ""+p)
end-do

```

```
forall(i in 1..LIMIT,j in 1..LIMIT | getsol(Drones_travel_bin(i,j)) > 0 ) do
  IVEdrawline(graph2, x(i), y(i),x(j), y(j))
end-do

forall(i in 1..LIMIT,j in 1..LIMIT | getsol(Truck_travel_bin(i,j)) > 0 ) do
  IVEdrawline(graph, x(i), y(i),x(j), y(j))
end-do

forall(i in 1..LIMIT,j in 1..LIMIT | getsol(Truck_travel_bin(i,j)) > 0 ) do
  writeln("Send Truck from ",i," to ", j," : ",getsol(Truck_travel_bin(i,j)))
end-do

forall(i in 1..LIMIT,j in 1..LIMIT | getsol(Drones_travel_bin(i,j)) > 0 ) do
  writeln("Send Drones from ",i," to ", j," : ",getsol(Drones_travel_bin(i,j)))
end-do

end-model
```

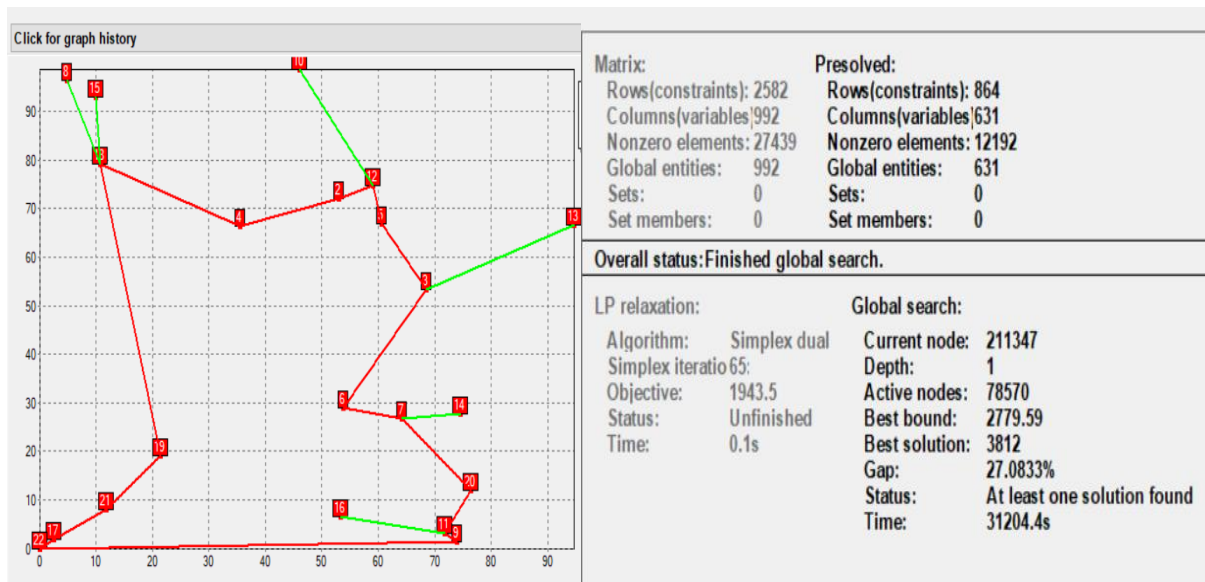
NOTE: We have also used a code with manually generated random points

## SOLUTION

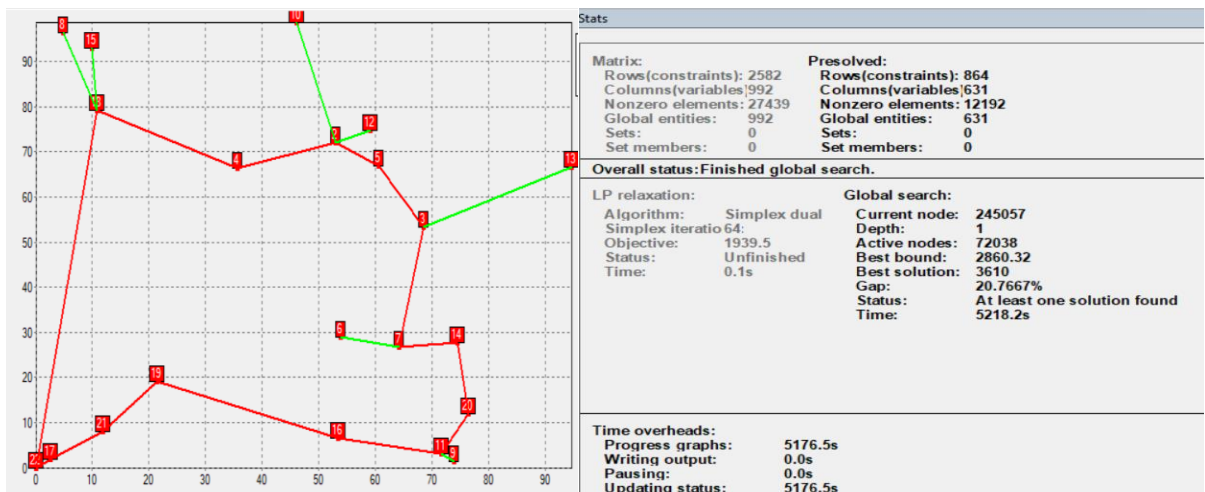
SEED = 4

COST PER UNIT DISTANCE OF TRUCK – 10 COST PER UNIT DISTANCE OF DRONES - 3

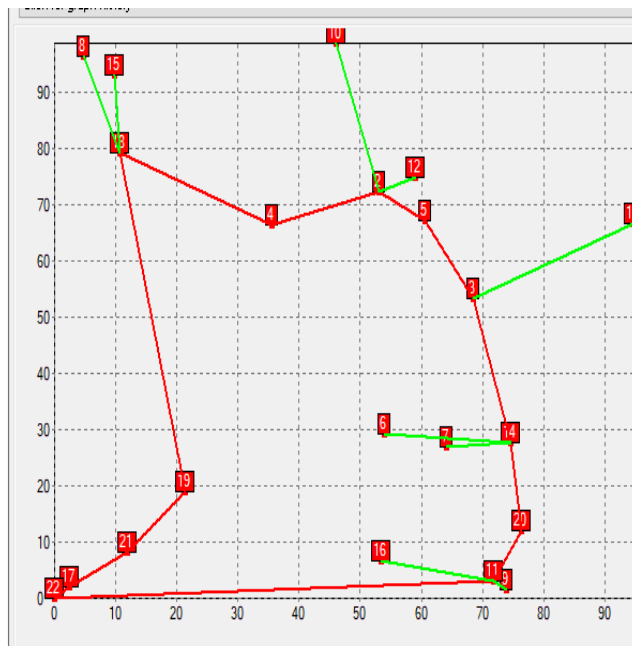
K=2 OBJECTIVE FUNCTION = 3812



K=3 OBJECTIVE FUNCTION = 3610

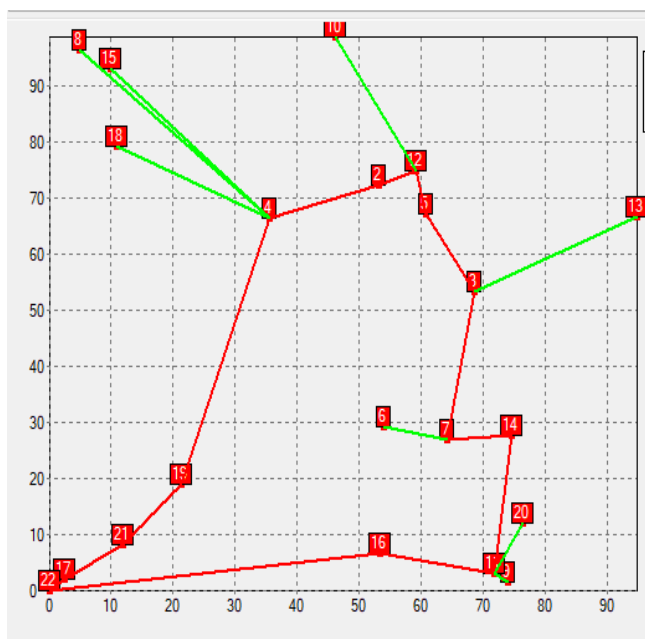


## K=4 OBJECTIVE FUNCTION = 3734



Stats			
<b>Matrix:</b>		<b>Presolved:</b>	
Rows(constraints):	2582	Rows(constraints):	864
Columns(variables):	992	Columns(variables):	631
Nonzero elements:	27439	Nonzero elements:	12192
Global entities:	992	Global entities:	631
Sets:	0	Sets:	0
Set members:	0	Set members:	0
<b>Overall status: Finished global search.</b>			
<b>LP relaxation:</b>		<b>Global search:</b>	
Algorithm:	Simplex dual	Current node:	465819
Simplex iterations:	63	Depth:	1
Objective:	1939.5	Active nodes:	162356
Status:	Unfinished	Best bound:	2905.67
Time:	0.1 s	Best solution:	3734
		Gap:	22.1835%
		Status:	At least one solution found
		Time:	7199.5s

## K=5 OBJECTIVE FUNCTION = 3738

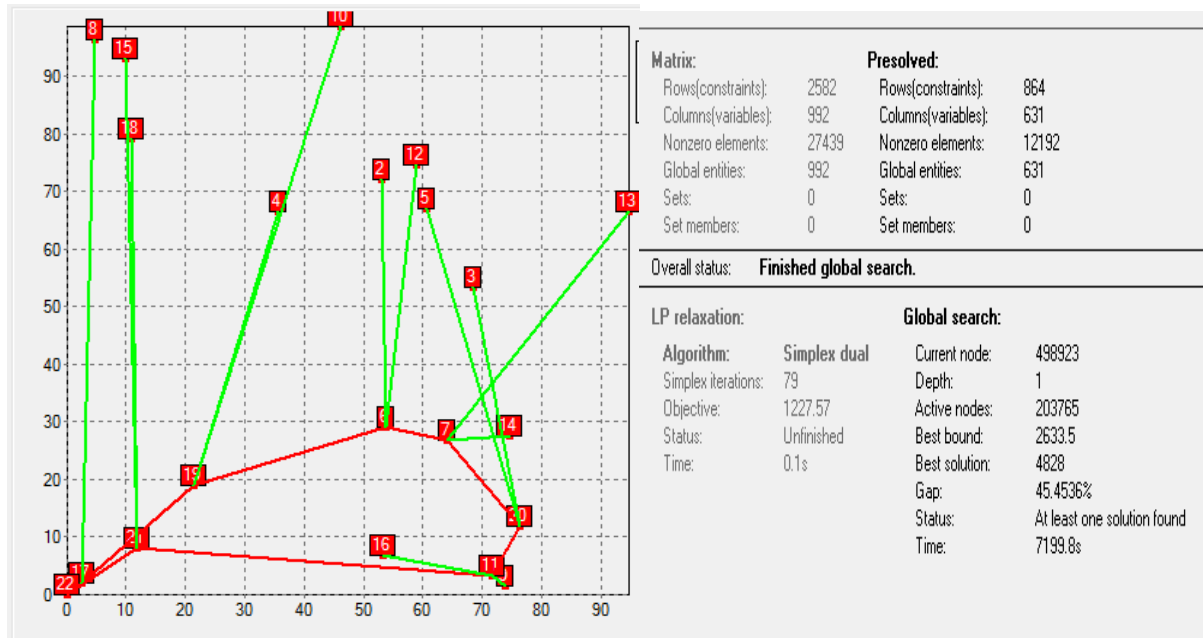


Stats			
<b>Matrix:</b>		<b>Presolved:</b>	
Rows(constraints):	2582	Rows(constraints):	864
Columns(variables):	992	Columns(variables):	631
Nonzero elements:	27439	Nonzero elements:	12192
Global entities:	992	Global entities:	631
Sets:	0	Sets:	0
Set members:	0	Set members:	0
<b>Overall status: Finished global search.</b>			
<b>LP relaxation:</b>		<b>Global search:</b>	
Algorithm:	Simplex dual	Current node:	242426
Simplex iterations:	61	Depth:	1
Objective:	1939.5	Active nodes:	80457
Status:	Unfinished	Best bound:	2846.32
Time:	0.1 s	Best solution:	3738
		Gap:	23.8546%
		Status:	At least one solution found
		Time:	28475.4s

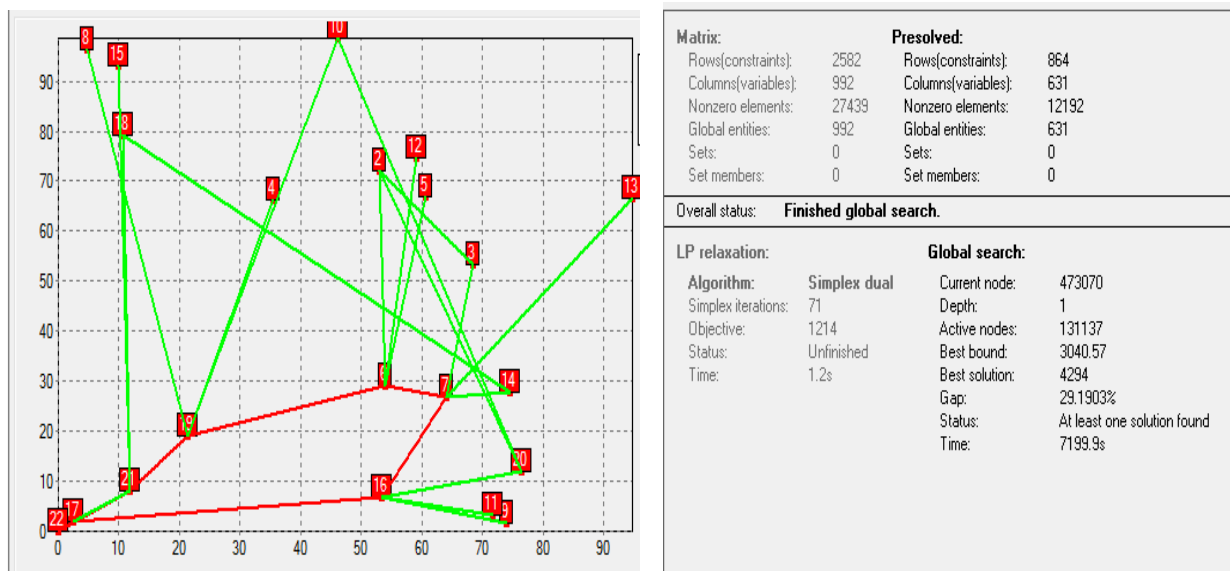
## SENSITIVITY ANALYSIS

COST PER UNIT DISTANCE OF TRUCK – 20 COST PER UNIT DISTANCE OF DRONES – 1

K =2 OBJECTIVE FUNCTION = 4828

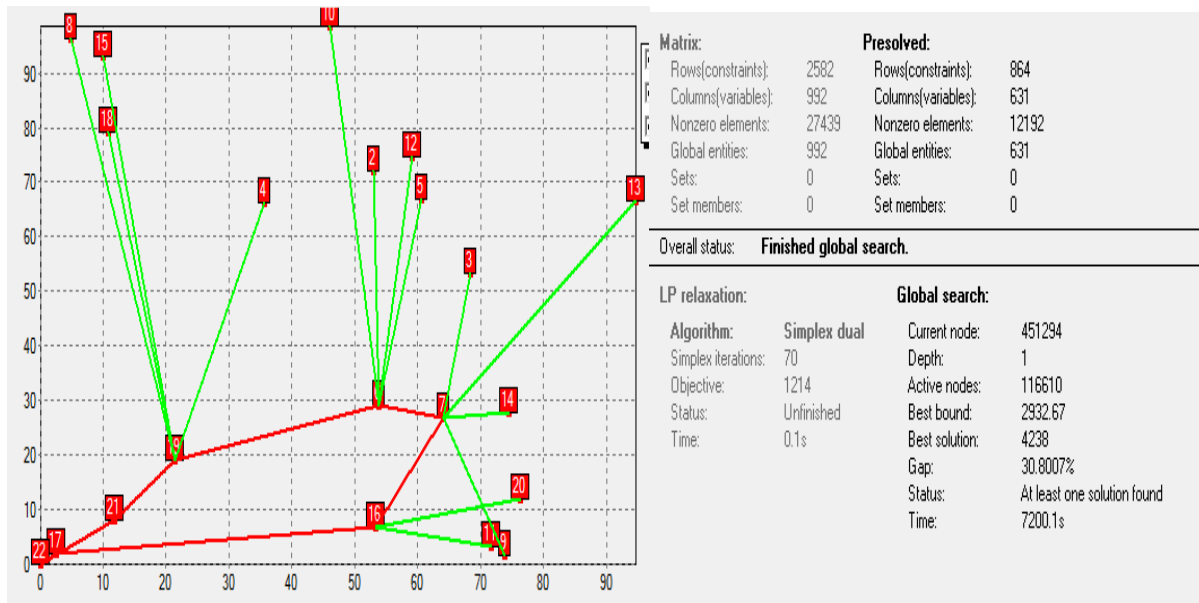


K =3 OBJECTIVE FUNCTION = 4294

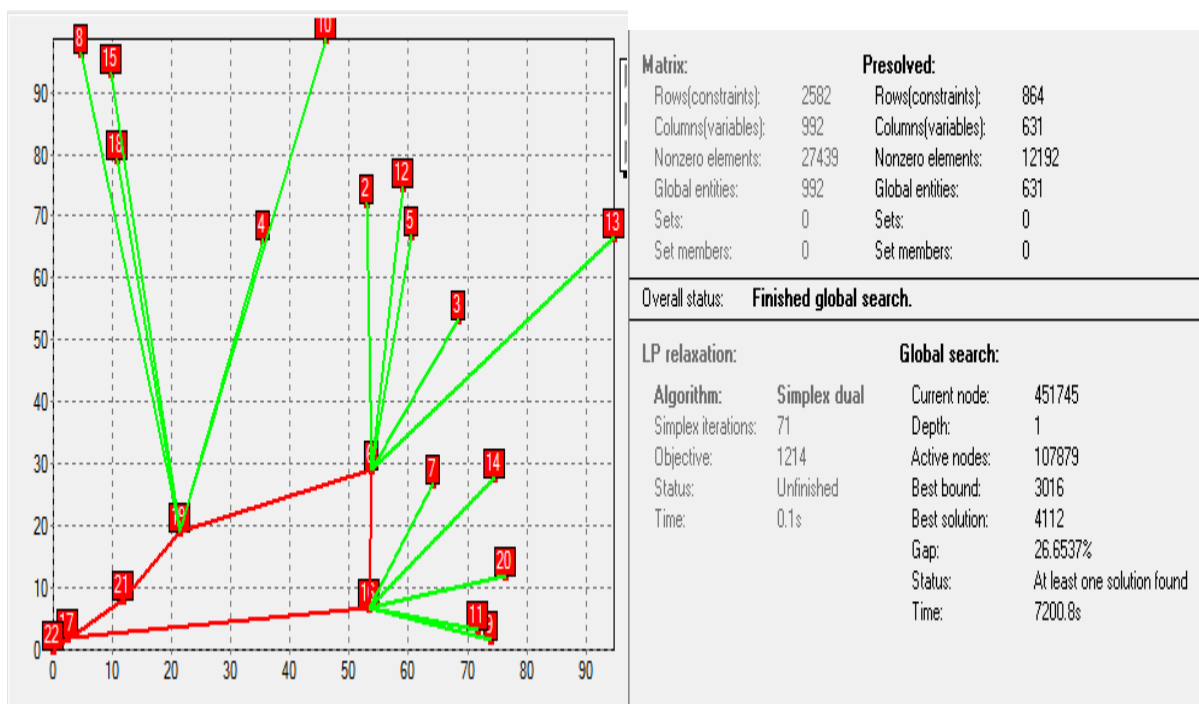




## K =4 OBJECTIVE FUNCTION = 4238



## K =5 OBJECTIVE FUNCTION = 4112

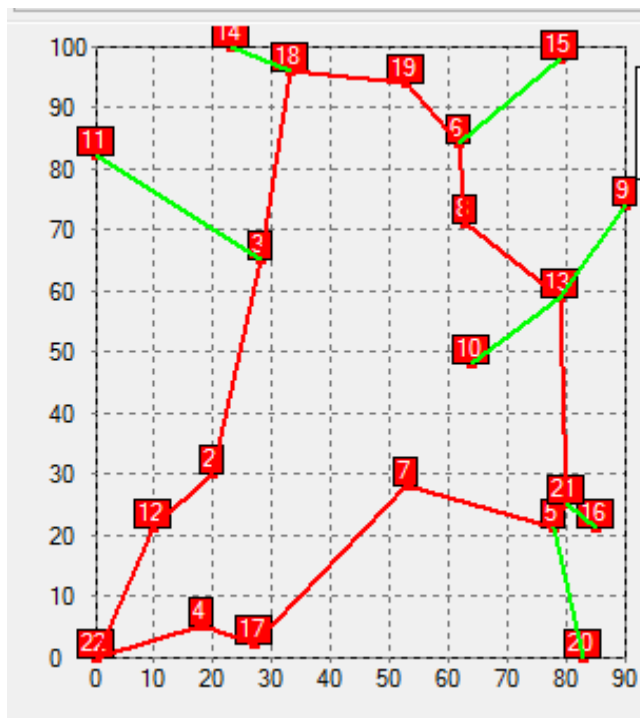


**CONCLUSION:** We observe by increasing the ratio of Unit cost per distance of Truck to that of Drones, the solution optimizes the route by using more Drones for every value of K

To better visualize the working of the model we have manually generated customer coordinates which are clustered near a single node (Customer location). Our result for these set of customer location is as follows-

**COST PER UNIT DISTANCE OF TRUCK – 10 COST PER UNIT DISTANCE OF DRONES - 3**

**K =2 OBJECTIVE FUNCTION = 3772**



Matrix:		Presolved:	
Rows(constraints):	2582	Rows(constraints):	864
Columns(variables):	992	Columns(variables):	631
Nonzero elements:	27439	Nonzero elements:	12192
Global entities:	992	Global entities:	631
Sets:	0	Sets:	0
Set members:	0	Set members:	0

Overall status: **Finished global search.**

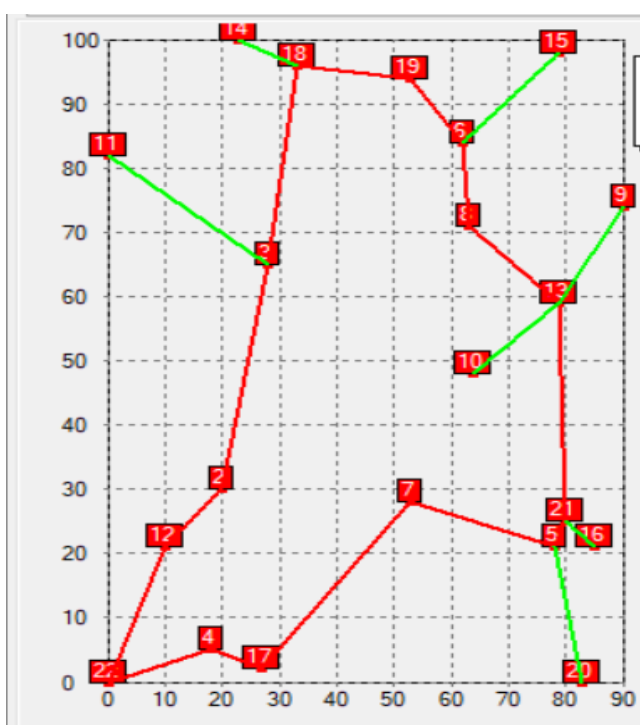
LP relaxation:

Algorithm:	Simplex dual
Simplex iterations:	72
Objective:	2673.67
Status:	Unfinished
Time:	0.1s

Global search:

Current node:	342371
Depth:	1
Active nodes:	38240
Best bound:	3564.67
Best solution:	3772
Gap:	5.49664%
Status:	At least one solution found
Time:	4799.2s

**K =3 OBJECTIVE FUNCTION = 3772**



Stats

Matrix:		Presolved:	
Rows(constraints):	2582	Rows(constraints):	864
Columns(variables):	992	Columns(variables):	631
Nonzero elements:	27439	Nonzero elements:	12192
Global entities:	992	Global entities:	631
Sets:	0	Sets:	0
Set members:	0	Set members:	0

Overall status: **Finished global search.**

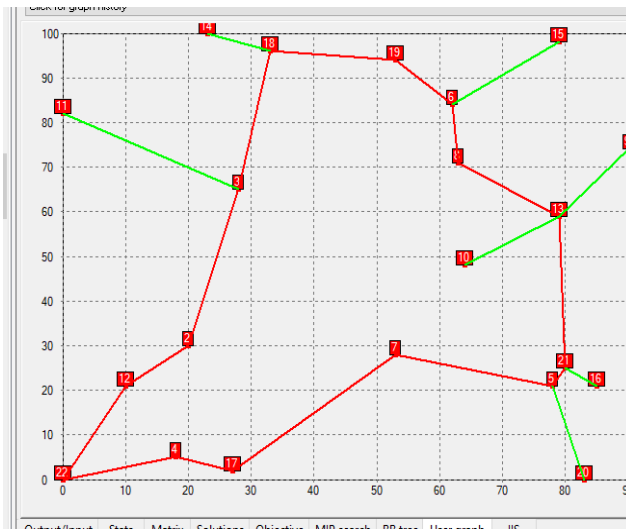
LP relaxation:

Algorithm:	Simplex dual
Simplex iterations:	66
Objective:	2670.67
Status:	Unfinished
Time:	0.1s

Global search:

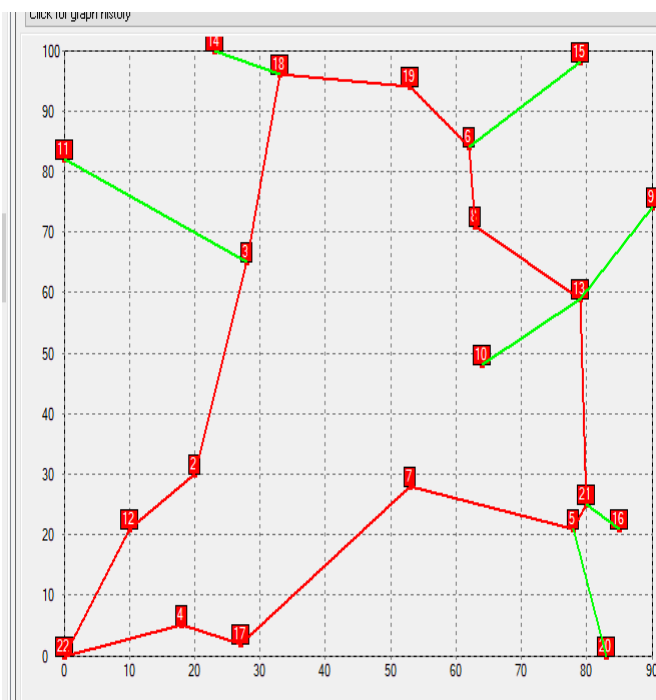
Current node:	63686
Depth:	1
Active nodes:	0
Best bound:	3772
Best solution:	3772
Gap:	0%
Status:	Solution is optimal.
Time:	2431.9s

## K=4 OBJECTIVE FUNCTION = 3772



Stats			
<b>Matrix:</b>		<b>Presolved:</b>	
Rows(constraints):	2582	Rows(constraints):	864
Columns(variables):	992	Columns(variables):	631
Nonzero elements:	27439	Nonzero elements:	12192
Global entities:	992	Global entities:	631
Sets:	0	Sets:	0
Set members:	0	Set members:	0
<b>Overall status: Finished global search.</b>			
<b>LP relaxation:</b>		<b>Global search:</b>	
Algorithm:	Simplex dual	Current node:	40286
Simplex iterations:	67	Depth:	1
Objective:	2670.67	Active nodes:	0
Status:	Unfinished	Best bound:	3772
Time:	0.1s	Best solution:	3772
		Gap:	0%
		Status:	Solution is optimal.
		Time:	1106.7s

## K=5 OBJECTIVE FUNCTION = 3772



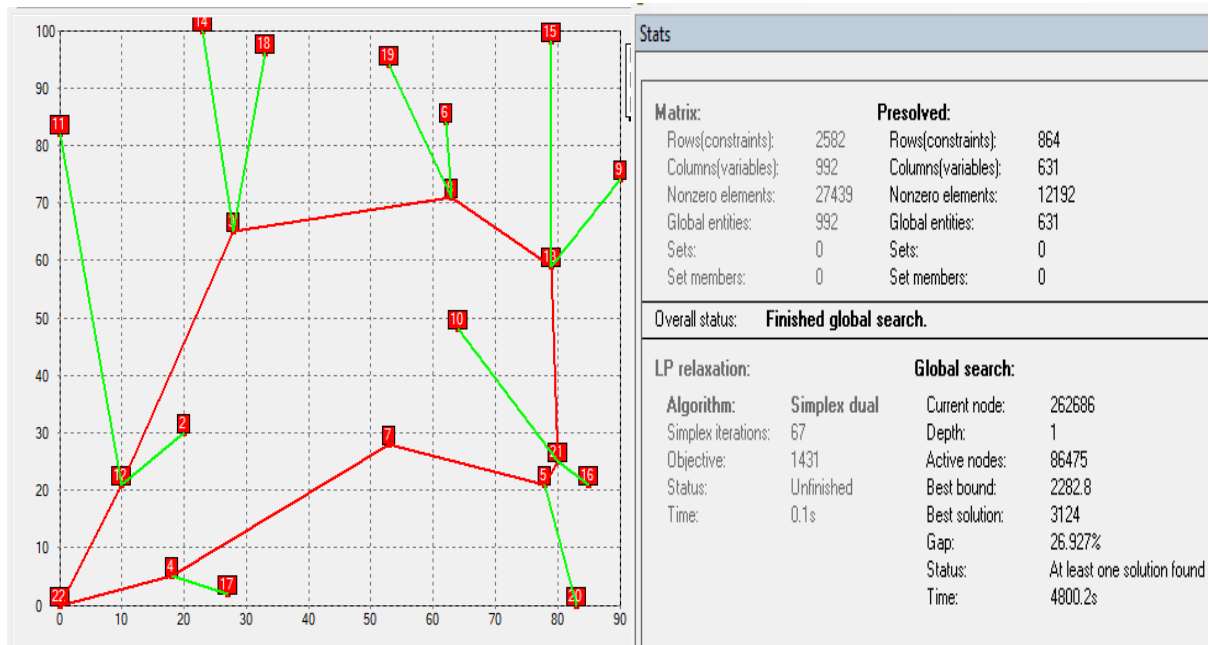
Stats			
<b>Matrix:</b>		<b>Presolved:</b>	
Rows(constraints):	2582	Rows(constraints):	864
Columns(variables):	992	Columns(variables):	631
Nonzero elements:	27439	Nonzero elements:	12192
Global entities:	992	Global entities:	631
Sets:	0	Sets:	0
Set members:	0	Set members:	0
<b>Overall status: Finished global search.</b>			
<b>LP relaxation:</b>		<b>Global search:</b>	
Algorithm:	Simplex dual	Current node:	95756
Simplex iterations:	67	Depth:	1
Objective:	2670.67	Active nodes:	0
Status:	Unfinished	Best bound:	3772
Time:	0.1s	Best solution:	3772
		Gap:	0%
		Status:	Solution is optimal.
		Time:	1499.8s

**CONCLUSION:** Here we observe increasing K does not decrease the objective function.

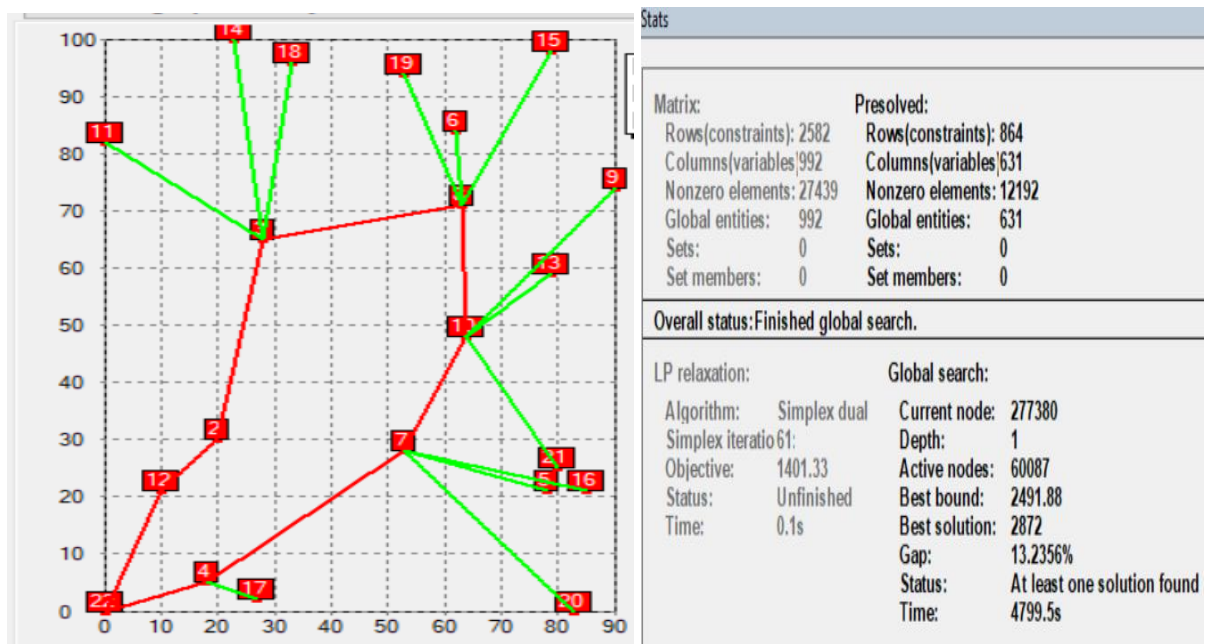
## SENSITIVITY ANALYSIS

COST PER UNIT DISTANCE OF TRUCK – 10 COST PER UNIT DISTANCE OF DRONES – 1

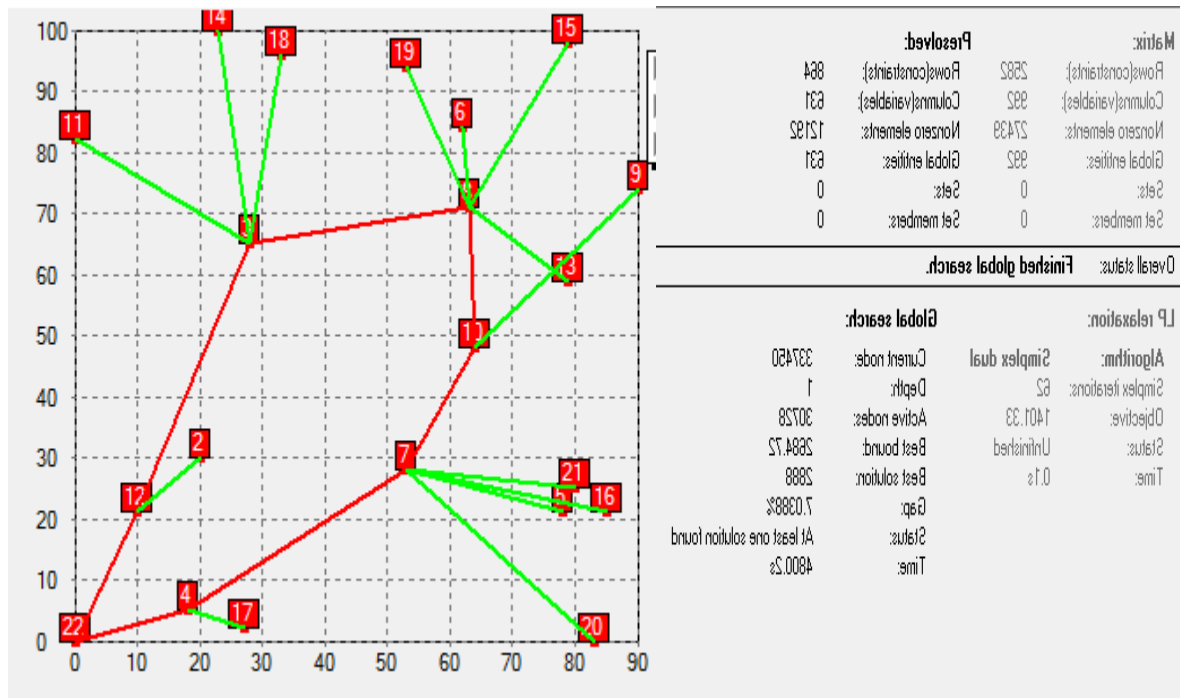
K=2 OBJECTIVE FUNCTION = 3124



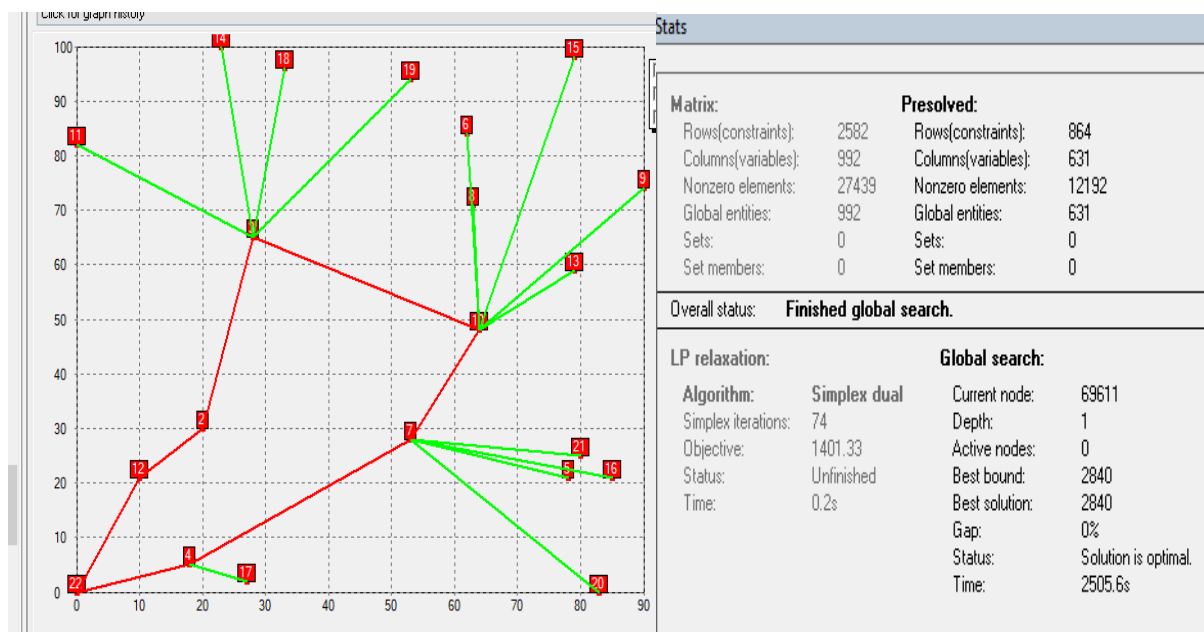
K=3 OBJECTIVE FUNCTION = 2872



**K=4 OBJECTIVE FUNCTION = 2888**



**K=5 OBJECTIVE FUNCTION = 2840**



**CONCLUSION:** Here we observe increasing K decreases the objective function, but not by a huge margin.