

## CSE620: Assignment2

Sima Shafaei

Due: November 6, 2020

1. For the symmetrical TSP problem with the distance matrix given in Table 1 (where the  $i, j$  entry represents the distance from city  $i$  to city  $j$ ) find the optimal tour using exhaustive search. Show all steps and all the suboptimal paths.

|        | City 1   | City 2   | City 3   | City 4   |
|--------|----------|----------|----------|----------|
| City 1 | $\infty$ | 10       | 20       | 5        |
| City 2 | 10       | $\infty$ | 2        | 10       |
| City 3 | 20       | 2        | $\infty$ | 7        |
| City 4 | 5        | 10       | 7        | $\infty$ |

Table 1: Distance matrix for Problem 1.

### Solution:

We wrote a Python program for this question:

```
import math
import itertools as iter

distance=[[math.inf,10,20,5],
          [10,math.inf,2,10],
          [20,2,math.inf,7], |
          [5,10,7,math.inf]]

cities=[1,2,3,4]
n=4

tour=list(iter.permutations(cities))
num_of_sol=len(possible_solutions)
tourList=[""]*num_of_sol
tourLen=[0]*num_of_sol
for i in range(num_of_sol):
    pathLen=0
    path="city" +str(tour[i][0])+"-->"
    for j in range(n):
        pathLen+=distance[tour[i][j]-1][tour[i][(j+1)%n]-1]
        path += "city" +str(tour[i][(j+1)%n])
        if (j+1)!=n:
            path+="-->"

    tourList[i]=path
    tourLen[i]=pathLen
    print("tour: "+path +"      length:"+str(pathLen))

minPath=min(tourLen) |
res = [i for i, j in enumerate(tourLen) if j == minPath]

print("=====")
print("the length of minimum tour is:"+str(minPath))
print("and the list of optimal tours is as follows:")
for i in range(len(res)):
    print(tourList[res[i]])
```

The result is as follows:

```

tour: city1-->city2-->city3-->city4-->city1 length:24
tour: city1-->city2-->city4-->city3-->city1 length:47
tour: city1-->city3-->city2-->city4-->city1 length:37
tour: city1-->city3-->city4-->city2-->city1 length:47
tour: city1-->city4-->city2-->city3-->city1 length:37
tour: city1-->city4-->city3-->city2-->city1 length:24
tour: city2-->city1-->city3-->city4-->city2 length:47
tour: city2-->city1-->city4-->city3-->city2 length:24
tour: city2-->city3-->city1-->city4-->city2 length:37
tour: city2-->city3-->city4-->city1-->city2 length:24
tour: city2-->city4-->city1-->city3-->city2 length:37
tour: city2-->city4-->city3-->city1-->city2 length:47
tour: city3-->city1-->city2-->city4-->city3 length:47
tour: city3-->city1-->city4-->city2-->city3 length:37
tour: city3-->city2-->city1-->city4-->city3 length:24
tour: city3-->city2-->city4-->city1-->city3 length:37
tour: city3-->city4-->city1-->city2-->city3 length:24
tour: city3-->city4-->city2-->city1-->city3 length:47
tour: city4-->city1-->city2-->city3-->city4 length:24
tour: city4-->city1-->city3-->city2-->city4 length:37
tour: city4-->city2-->city1-->city3-->city4 length:47
tour: city4-->city2-->city3-->city1-->city4 length:37
tour: city4-->city3-->city1-->city2-->city4 length:47
tour: city4-->city3-->city2-->city1-->city4 length:24

```

Based on above result the length of minimum tour is **24** and the list of all optimal tours is:

```

city1-->city2-->city3-->city4-->city1
city1-->city4-->city3-->city2-->city1
city2-->city1-->city4-->city3-->city2
city2-->city3-->city4-->city1-->city2
city3-->city2-->city1-->city4-->city3
city3-->city4-->city1-->city2-->city3
city4-->city1-->city2-->city3-->city4
city4-->city3-->city2-->city1-->city4

```

2. For the symmetrical TSP problem with the distance matrix given in Table 2 (where the  $i, j$  entry represents the distance from city  $i$  to city  $j$ ) find the optimum tour using hill climbing, with a 2-change neighborhood (i.e. swap 2 non-adjacent edges), starting at path 1-3-2-4-5-1. Show all steps

|        | City 1   | City 2   | City 3   | City 4   | City 5   |
|--------|----------|----------|----------|----------|----------|
| City 1 | $\infty$ | 10       | 20       | 5        | 10       |
| City 2 | 10       | $\infty$ | 2        | 10       | 6        |
| City 3 | 20       | 2        | $\infty$ | 7        | 1        |
| City 4 | 5        | 10       | 7        | $\infty$ | 20       |
| City 5 | 10       | 6        | 1        | 20       | $\infty$ |

Table 2: Distance matrix for Problem 2.

**Solution:**

To solve this problem again we create a python program:

```

import math
def cost(currentPath,distance,n):
    cost=0
    for i in range(n):
        cost+=distance[currentPath[i]-1][currentPath[(i+1)%n]-1]
    return cost

distance=[[math.inf,10,20,5,10],
          [10,math.inf,2,10,6],
          [20,2,math.inf,7,1],
          [5,10,7,math.inf,20],
          [10,6,1,7,20,math.inf]]

cities=[1,2,3,4,5]
n=5
currentPath=[1,3,2,4,5]

while(True):
    iteration+=1
    print(currentPath,end=" ")
    costCurrent=cost(currentPath,distance,n)
    print(costCurrent)
    k=0
    neighbor=[None]*5
    c=[0]*5
    has_swaped=[0]*(n+1)*(n+1)
    for i in range(n):
        for j in range(n-3):
            t=(j+i+2)%n
            if has_swaped[currentPath[i]][currentPath[t]]==0:
                has_swaped[currentPath[i]][currentPath[t]]=1
                neighbor[k]=currentPath.copy()
                temp=neighbor[k][(i+1)%n]
                neighbor[k][(i+1)%n]=neighbor[k][t]
                neighbor[k][t]=temp
                print("swap:"+str(currentPath[i])+"->" +str(currentPath[(i+1)%n])+"
                    " and "+str(currentPath[t])+"->" +str(currentPath[(t+1)%n]),end=" ")
                print(neighbor[k], end=" ")
                c[k]=cost(neighbor[k],distance,n)
                print("cost="+str(c[k]) )
                k+=1
    minIndex=c.index(min(c))
    if c[minIndex]<costCurrent:
        currentPath=neighbor[minIndex].copy()
    else:
        break

```

The initial path is :[1,3,2,4,5,1], with Cost = 62.

The first group of neighbors in first iteration, and their cost are:

|   |
|---|
| swap:1->3 and 2->4: path= [1, 2, 3, 4, 5,1] cost=49 |
| swap:1->3 and 4->5: path= [1, 4, 2, 3, 5,1] cost=28 |
| swap:3->2 and 5->1: path= [1, 3, 5, 4, 2,1] cost=48 |
| swap:2->4 and 1->3: path= [4, 3, 2, 1, 5,4] cost=36 |
| swap:4->5 and 3->2: path= [1, 5, 2, 4, 3,1] cost=53 |

The path=[1, 4, 2, 3, 5,1] with cost=28 has the minimum weight and will be selected for the next iteration. The neighbors of selected path in second iteration are:

|  |
|--|
| swap:1->4 and 2->3 [1, 2, 4, 3, 5] cost=38 |
| swap:1->4 and 3->5 [1, 3, 2, 4, 5] cost=62 |
| swap:4->2 and 5->1 [1, 4, 5, 3, 2] cost=38 |
| swap:2->3 and 1->4 [3, 4, 2, 1, 5] cost=38 |
| swap:3->5 and 4->2 [1, 5, 2, 3, 4] cost=30 |

As we can see there is no path with cost less than 28, so we can stop the search and the optimum solution would be : *path*=[1, 4, 2, 3, 5,1] and *Cost*=28

Problems 3, 4, and 5 refer to the asymmetrical TSP with the distance matrix given in Table 3.

|        | City 1   | City 2   | City 3   | City 4   |
|--------|----------|----------|----------|----------|
| City 1 | $\infty$ | 20       | 10       | 5        |
| City 2 | 15       | $\infty$ | 2        | 10       |
| City 3 | 5        | 7        | $\infty$ | 7        |
| City 4 | 10       | 1        | 4        | $\infty$ |

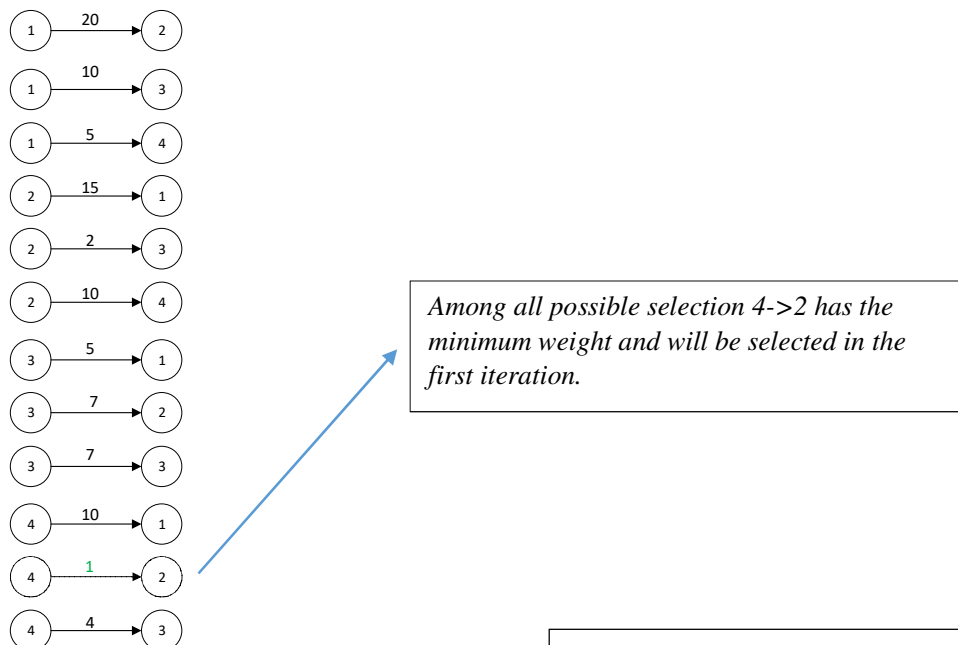
Table 3: Asymmetric Distance matrix for Problems 3, 4, and 5.

Problems 3,4,5: Find the best path using incremental arc addition and the following approaches:

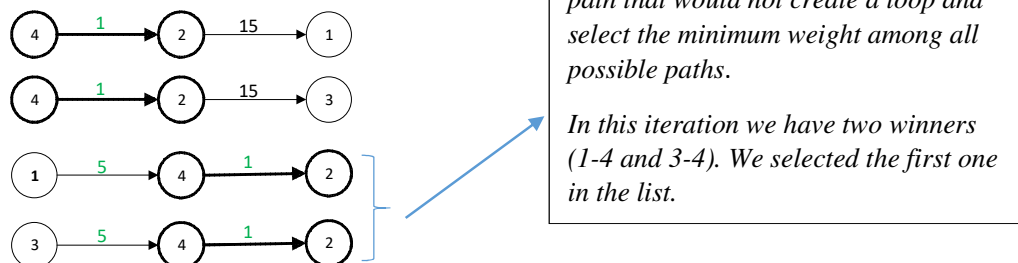
3. Greedy: show cost for all neighbors and all steps.

**Solution:**

in first iteration we have to select the first edge and select the one with minimum weight:

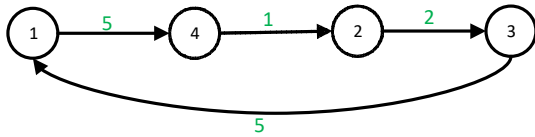


.Iteration 2:



The top graph shows the initial state with edges (1,4) weight 5, (4,2) weight 1, and (2,3) weight 2. The bottom graph shows the state after one iteration, with new edges (3,1) weight 5 and (1,2) weight 5, and updated edge (4,2) weight 1.

*In this iteration winner is 2->3. Finally, when we added all the nodes we have to return to the origin therefore we will add 3->1 to complete the tour:*



**Step 1: Find min for each row**

|        | City 1 | City 2 | City 3 | City 4 |
|--------|--------|--------|--------|--------|
| City 1 | ∞      | 20     | 10     | 5      |
| City 2 | 15     | ∞      | 2      | 10     |
| City 3 | 5      | 7      | ∞      | 7      |
| City 4 | 10     | 1      | 4      | ∞      |

Min values for each row: 5, 2, 5, 1

**Subtract each row from min**

|        | City 1 | City 2 | City 3 | City 4 |
|--------|--------|--------|--------|--------|
| City 1 | ∞      | 15     | 5      | 0      |
| City 2 | 13     | ∞      | 0      | 8      |
| City 3 | 0      | 2      | ∞      | 2      |
| City 4 | 9      | 0      | 3      | ∞      |

$LB = \sum \text{Min of each row} = 13$

**Step 2: Find min for each column**

|        | City 1 | City 2 | City 3 | City 4 |
|--------|--------|--------|--------|--------|
| City 1 | ∞      | 15     | 5      | 0      |
| City 2 | 13     | ∞      | 0      | 8      |
| City 3 | 0      | 2      | ∞      | 2      |
| City 4 | 9      | 0      | 3      | ∞      |

Min values for each column: 0, 0, 0, 0

**Subtract each con from its min**

$LB = \sum \text{Min of each Col} + 13 = 13$

$$LB=13+11=24$$

include 3->1

|        | City 1   | City 2   | City 3   | City 4   |
|--------|----------|----------|----------|----------|
| City 1 | $\infty$ | 15       | $\infty$ | 0        |
| City 2 | $\infty$ | $\infty$ | 0        | 8        |
| City 3 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 4 | $\infty$ | 0        | 3        | $\infty$ |

Find min for each row

| Min |
|-----|
| 0   |
| 0   |
|     |
| 0   |

$\sum$  Min of each row = 0

|        | City 1   | City 2   | City 3   | City 4   |
|--------|----------|----------|----------|----------|
| City 1 | $\infty$ | 15       | $\infty$ | 0        |
| City 2 | $\infty$ | $\infty$ | 0        | 8        |
| City 3 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 4 | $\infty$ | 0        | 3        | $\infty$ |

Find min for each column

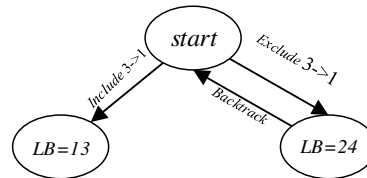
| Min      |   |   |   |   |
|----------|---|---|---|---|
| $\infty$ | 0 | 0 | 0 | 0 |

$\sum$  Min of each col + 0 = 0

|        | City 1   | City 2   | City 3   | City 4   |
|--------|----------|----------|----------|----------|
| City 1 | $\infty$ | 15       | $\infty$ | 0        |
| City 2 | $\infty$ | $\infty$ | 0        | 8        |
| City 3 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 4 | $\infty$ | 0        | 3        | $\infty$ |

Subtract each con from its min

LB=13+0=13



Most influential arc: 1->4 : LB+(15+8) Max

2->3: LB+(8+3)

4->2: LB+(3+15)

1->4 will be selected  $\Rightarrow$  LB=13+23=36

include 1->4

|        | City 1   | City 2   | City 3   | City 4   |
|--------|----------|----------|----------|----------|
| City 1 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 2 | $\infty$ | $\infty$ | 0        | $\infty$ |
| City 3 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 4 | $\infty$ | 0        | 3        | $\infty$ |

Find min for each row

| Min |
|-----|
|     |
| 0   |
|     |
| 0   |

$\sum$  Min of each row = 0

|        | City 1   | City 2   | City 3   | City 4   |
|--------|----------|----------|----------|----------|
| City 1 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 2 | $\infty$ | $\infty$ | 0        | $\infty$ |
| City 3 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 4 | $\infty$ | 0        | 3        | $\infty$ |

Find min for each column

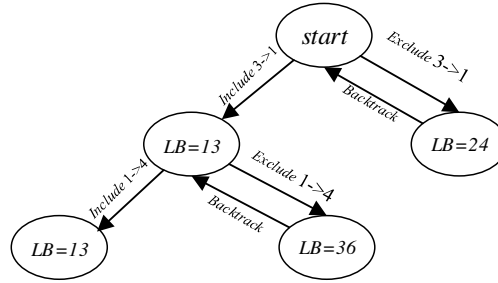
| Min      |   |   |   |   |
|----------|---|---|---|---|
| $\infty$ | 0 | 0 | 0 | 0 |

$\sum$  Min of each col + 0 = 0

|        | City 1   | City 2   | City 3   | City 4   |
|--------|----------|----------|----------|----------|
| City 1 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 2 | $\infty$ | $\infty$ | 0        | $\infty$ |
| City 3 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 4 | $\infty$ | 0        | 3        | $\infty$ |

Subtract each con from its min

LB=13+0=13



Most influential arc:  $2 \rightarrow 3: LB+(3)$   
 $4 \rightarrow 2: LB+(3)$

We can choose either  $4 \rightarrow 2$  or  $2 \rightarrow 3$  for branching. We will select  $4 \rightarrow 2$

$LB=13+3=16$

**include 4->2**

Find min for each row

|        | City 1   | City 2   | City 3   | City 4   |
|--------|----------|----------|----------|----------|
| City 1 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 2 | $\infty$ | $\infty$ | 0        | $\infty$ |
| City 3 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 4 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |

$\sum \text{Min of each row} = 0$

Find min for each column

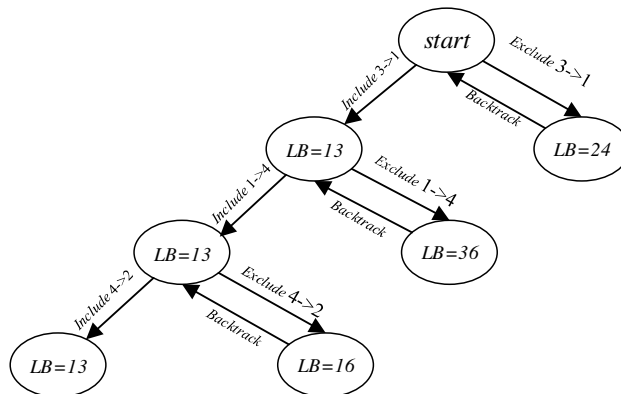
| Min      | City 1   | City 2   | City 3   | City 4   |
|----------|----------|----------|----------|----------|
| 0        | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| $\infty$ | $\infty$ | $\infty$ | 0        | $\infty$ |
| $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| $\infty$ | $\infty$ | $\infty$ | $\infty$ | $\infty$ |

$\sum \text{Min of each col} + 0 = 0$

Subtract each con from its min

|        | City 1   | City 2   | City 3   | City 4   |
|--------|----------|----------|----------|----------|
| City 1 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 2 | $\infty$ | $\infty$ | 0        | $\infty$ |
| City 3 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| City 4 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |

$LB=13+0=13$



We need only one more arc to back to the first city and it would be  $2 \rightarrow 3$ . Therefore, the optimal path is: **3->1->4->2->3**

## 5. Dynamic programming.

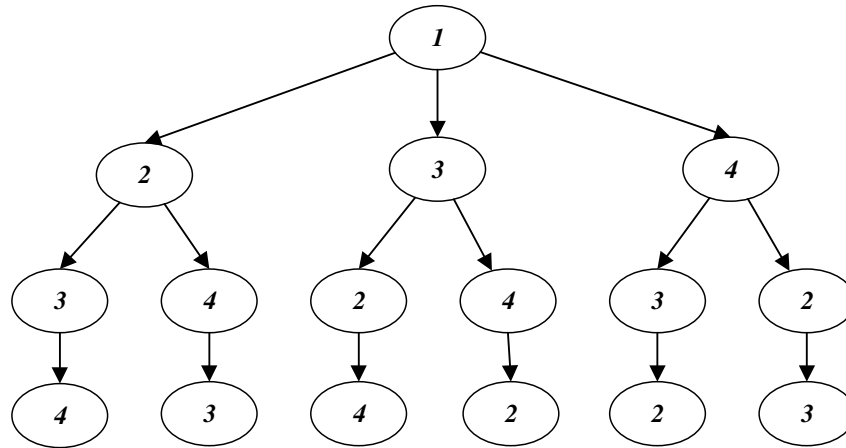
### Solution:

The general formula that followed by dynamic programming for TSP is:

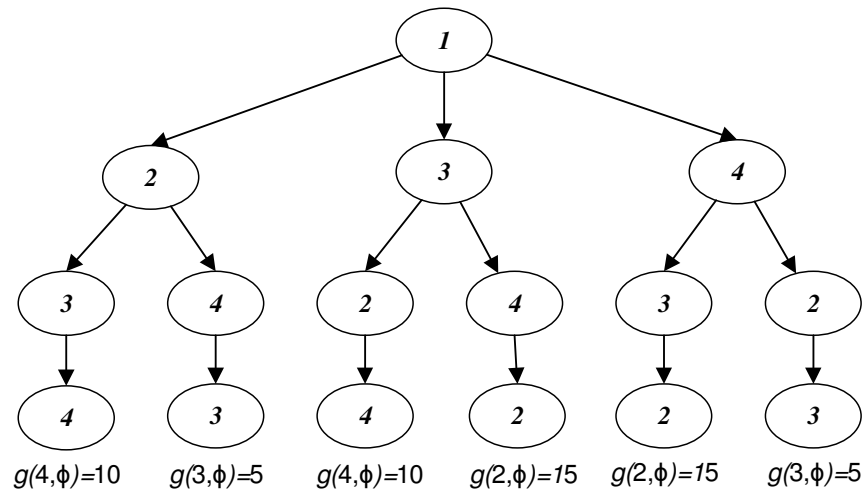
$$g(i, S) = \min_{k \in S} \{d_{ik} + g(k, S - \{k\})\}$$

In this problem we start with city 1 therefore,  $i=1$  and  $S=\{2,3,4\}$  and  $g(j, \phi) = d(j, i)$

We start with creating tree and compute it from bottom to top, following tree shows all possible tour in four cities:



First level in tree:



Second level in the tree:

$$g(3, \{4\}) = \min\{d_{34} + g(4, \phi)\} = 7 + 10 = 17$$

$$g(4, \{3\}) = \min\{d_{43} + g(3, \phi)\} = 4 + 5 = 9$$

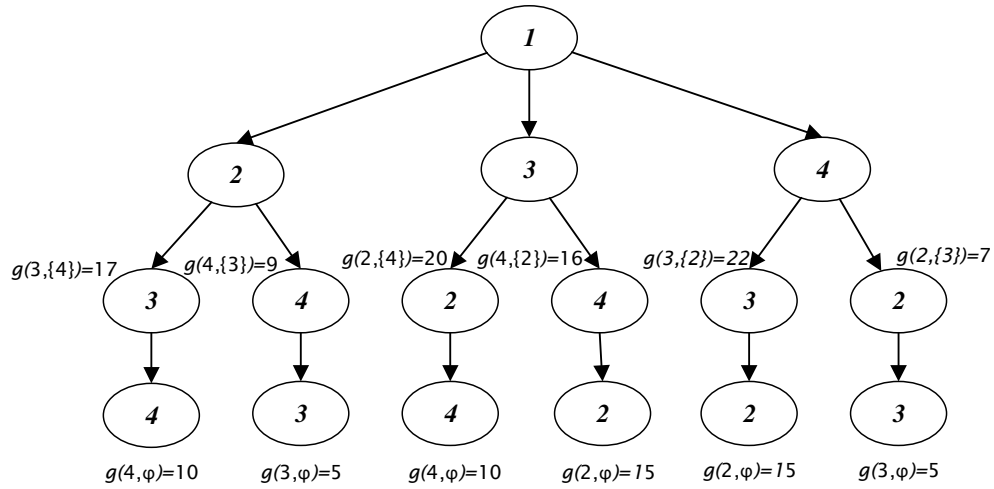
$$g(2, \{4\}) = \min\{d_{24} + g(4, \phi)\} = 10 + 10 = 20$$

$$g(4, \{2\}) = \min\{d_{42} + g(2, \phi)\} = 1 + 15 = 16$$

$$g(3, \{2\}) = \min\{d_{32} + g(2, \phi)\} = 7 + 15 = 22$$



$$g(2, \{3\}) = \min\{d_{23} + g(3, \phi)\} = 2 + 5 = 7$$



*third level in the tree:*

$$g(2, \{3, 4\}) = \min\{d_{23} + g(3, \{4\}), d_{24} + g(4, \{3\})\} = \min\{2 + 17, 10 + 9\} = \min\{19, 19\} = 19$$

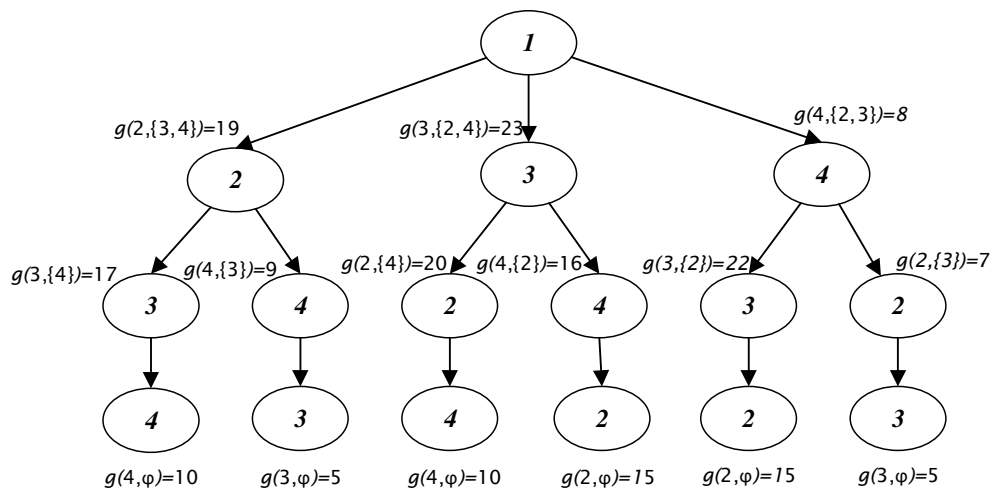
(minimum come from  $k=3$  or 4)

$$g(3, \{2, 4\}) = \min\{d_{32} + g(2, \{4\}), d_{34} + g(4, \{2\})\} = \min\{7 + 20, 7 + 16\} = \min\{27, 23\} = 23$$

(minimum come from  $k=4$ )

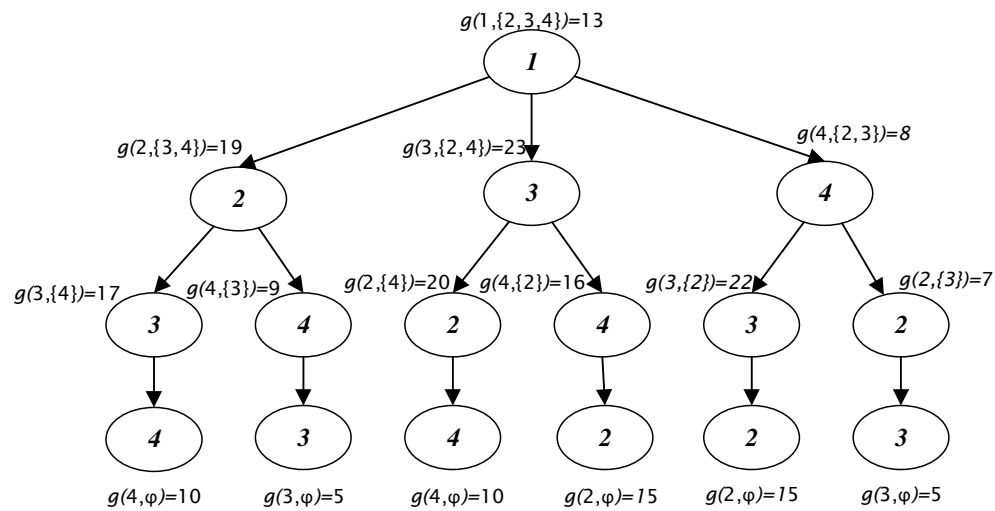
$$g(4, \{3, 2\}) = \min\{d_{43} + g(3, \{2\}), d_{42} + g(2, \{3\})\} = \min\{4 + 22, 1 + 7\} = \min\{26, 8\} = 8$$

(minimum come from  $k=2$ )



*The root of tree:*

$$g(1, \{2,3,4\}) = \min\{d_{12} + g(2, \{3,4\}), d_{13} + g(3, \{2,4\}), d_{14} + g(4, \{2,3\})\} = \min\{20 + 19, 10 + 23, 5 + 8\} = \min\{39, 33, 13\} = 13 \quad (\text{minimum come from } k=4)$$



Based on where minimum came from in each step the shortest tour is: **1->4->2->3->1**