

# **GIT RECAP**

- Check status since last commit:

```
$ git status
```

- Stage changes/add new files:

```
$ git add file_name
```

- Record changes (advisable for new units of code):

```
$ git commit -m "Relevant message here"
```

- Push to remote repository (so we can see your code):

```
$ git push origin master
```

- Lists all your commits:

```
$ git log
```

# **SIMULATION COMPONENTS**

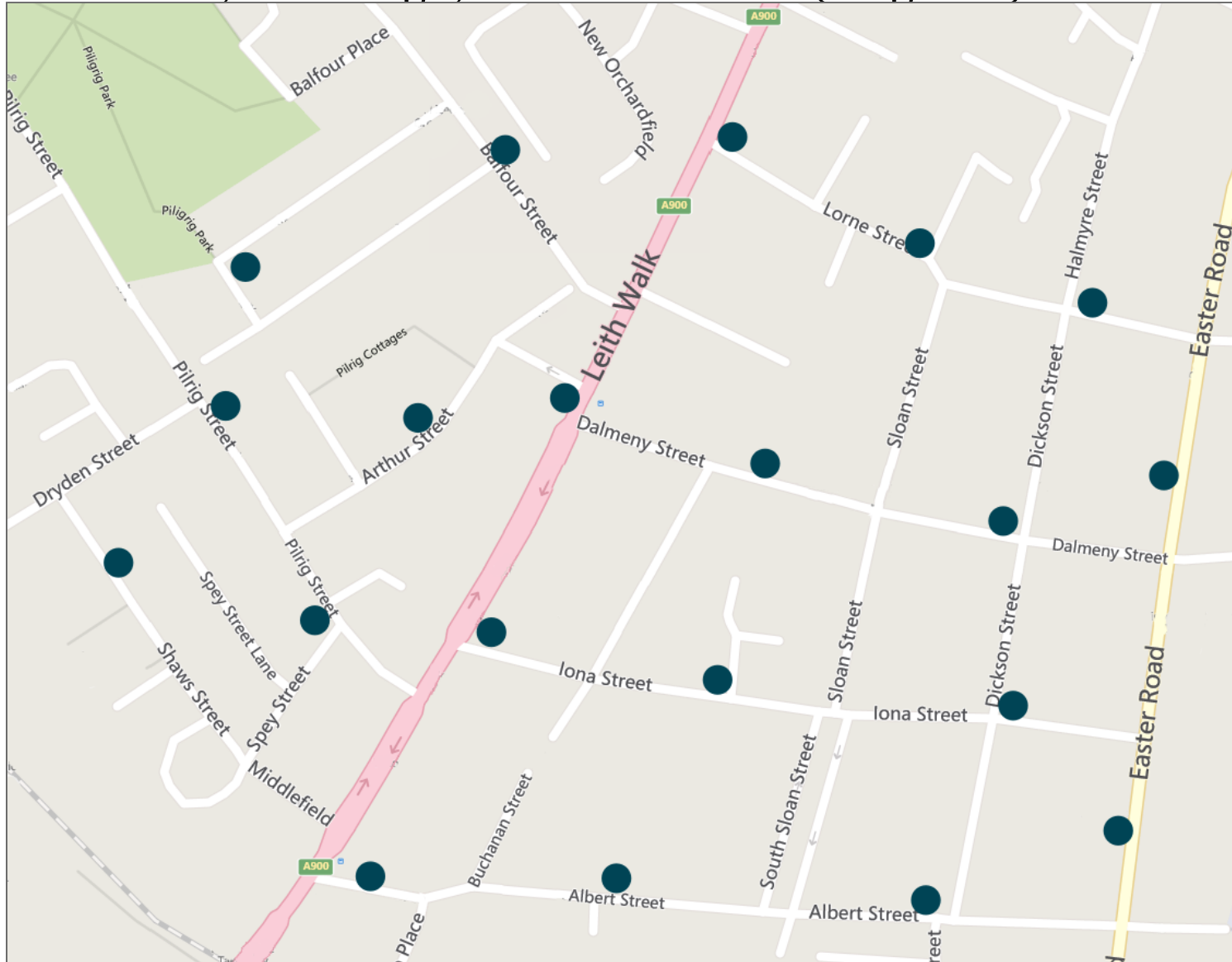
## **SERVICE AREAS & ROUTE PLANNING**

## **SERVICE AREAS**

- We need an abstract representation of roads layout and bin locations for the different areas.
- We need to model the roads between different locations and the time required to travel these.
- We need to account for the fact that some streets only allow one way traffic.

# EXAMPLE

Leith Walk, Edinburgh; 20 bin locations. (bing.com)

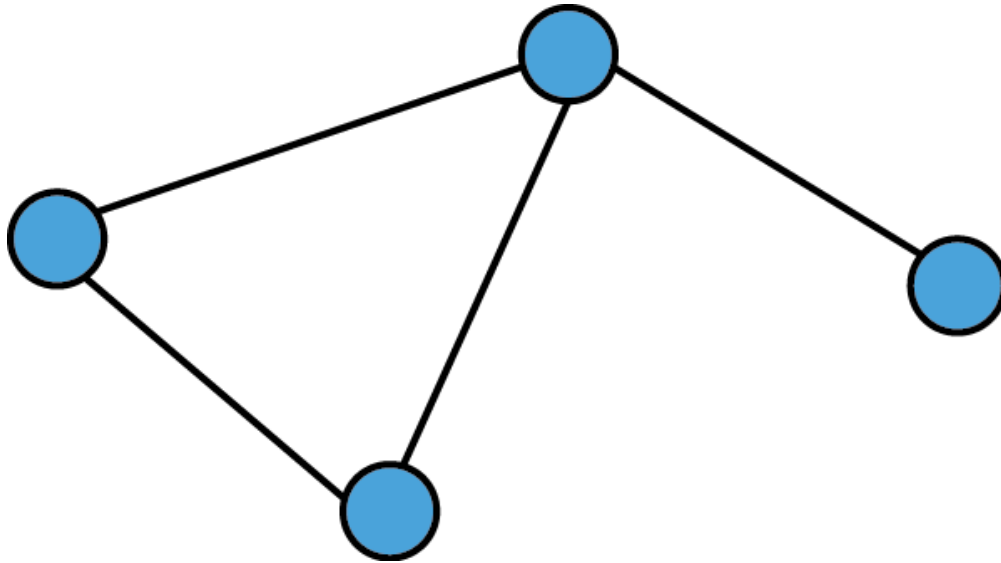




## GRAPH REPRESENTATION

- In mathematical terms such a collection of bin locations interconnected with street segments can be represented through a graph.
- A graph  $G = (V, E)$  comprises a set of vertices  $V$  that represent objects (bin locations/depot) and  $E$  edges that connect different pairs of vertices (links/street segments).
- Graphs can be *directed* or *undirected*.

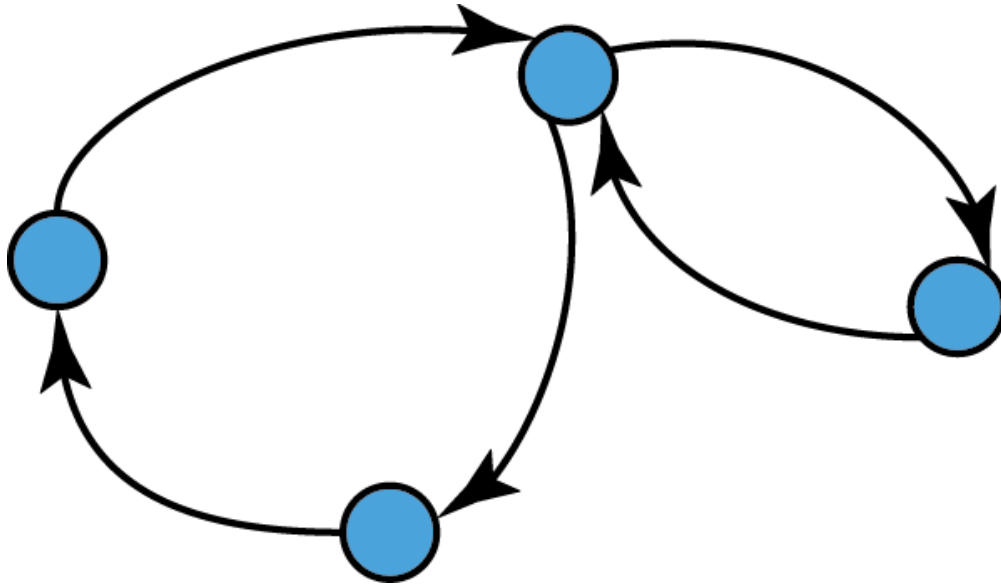
## UNDIRECTED GRAPHS



- Edges have no orientation, i.e. they are unordered pairs of vertices. That is there is a symmetry relation between nodes and thus  $(a,b) = (b,a)$ .



## DIRECTED GRAPHS



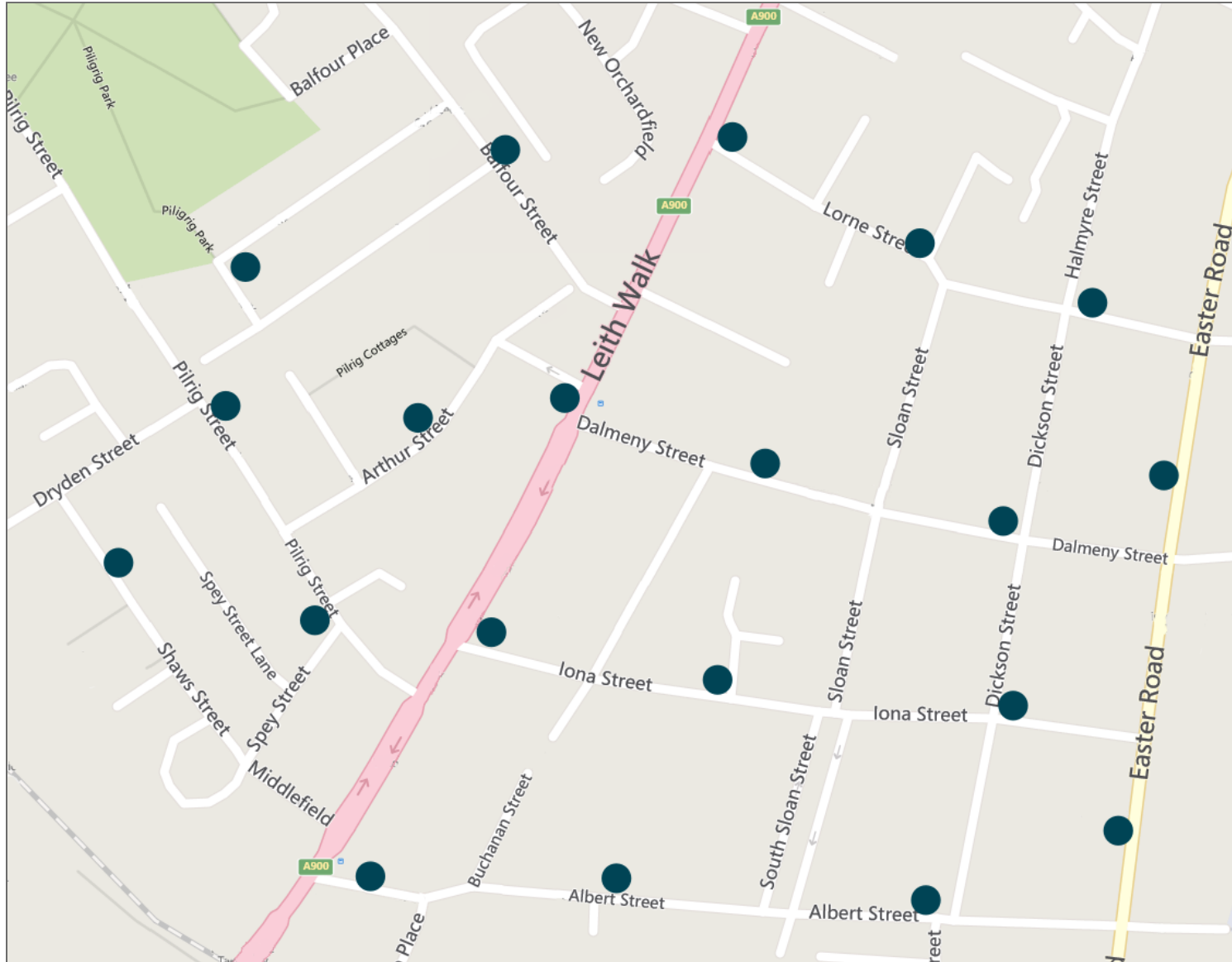
- Edges have a direction associated with them and they are called *arcs* or directed edges.
- Formally, they are *ordered* pairs of vertices, i.e.  $(a,b) \neq (b,a)$  if  $a \neq b$ .

## **GRAPH REPRESENTATION IN YOUR SIMULATORS**

- For our simulations we will consider *directed* graph representations of the service network.
- This will increase complexity, but is more realistic.

# BACK TO THE EXAMPLE

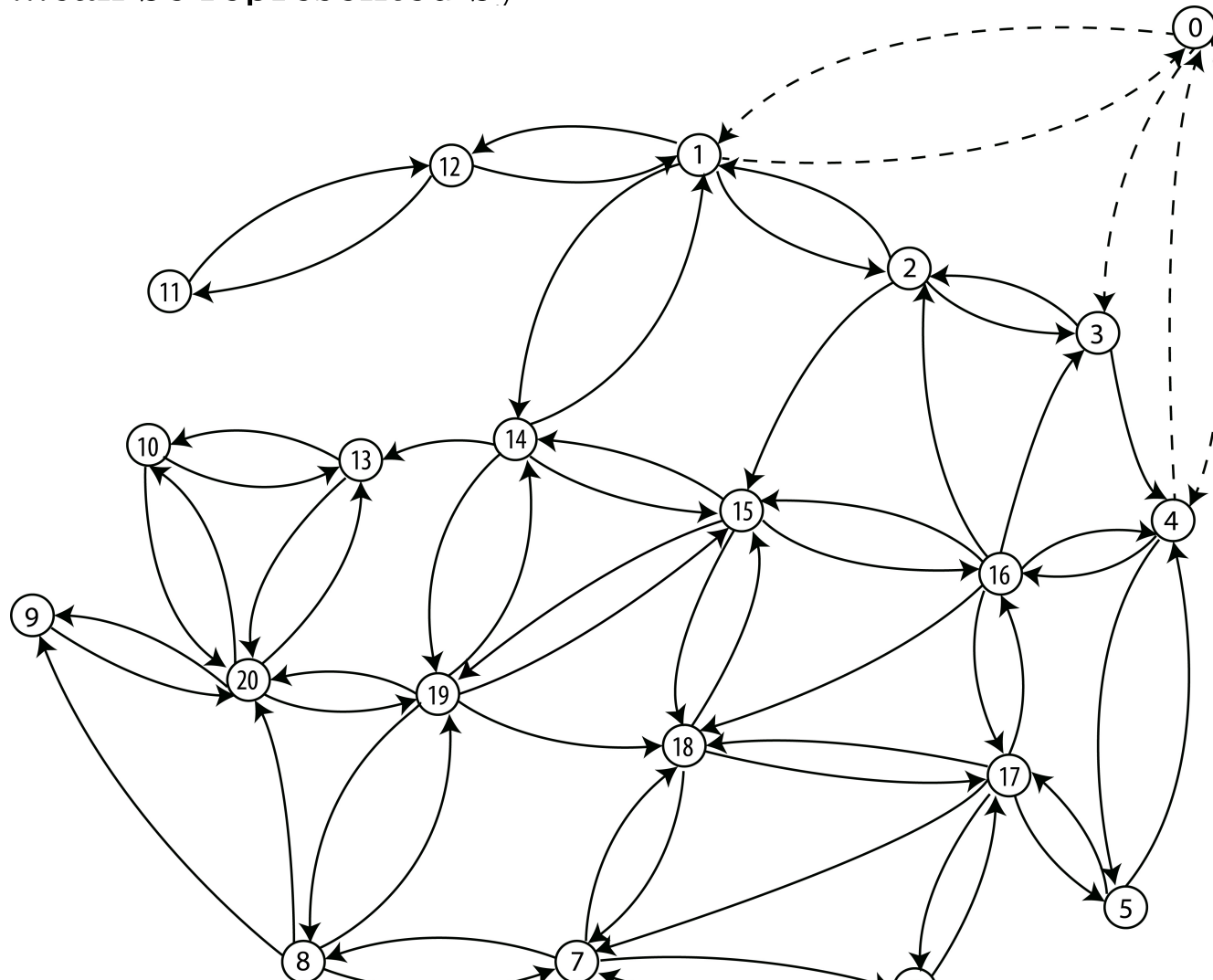
This area...





# CORRESPONDING GRAPH

...can be represented by



We numbered vertices & added node 'o' for the depot.

## WEIGHTED GRAPH

- We also need to model the distances between bin locations.
- We will use a *weighted graph* representation, where a number (weight) is associated to each arc.
- In our case weights will represent the average travel duration between two locations (vertices) in one direction, expressed in minutes.







## INPUT

- For each area, graph representation of bin locations and distances between them will be given in the input script (file) in *matrix* form.
- We will consider the lorry depot as location 0. For a service area with  $N$  locations, an  $N \times N$  matrix will be specified.
- The **roadsLayout** keyword will precede the matrix.
- Where there is no arc in the graph between two vertices we will use a -1 value in the matrix.

## FOR THE PREVIOUS EXAMPLE

	0	1	2	3	4	5	...	19	20
0	0	9	-1	8	10	-1	...	-1	-1
1	9	0	2	-1	-1	-1	...	-1	-1
2	-1	2	0	1	-1	-1	...	-1	-1
3	-1	-1	1	0	1	-1	...	-1	-1
4	10	-1	-1	1	0	4	...	-1	-1
5	-1	-1	-1	-1	4	0	...	-1	-1
.	.	.	.	.	.	.		.	.
.	.	.	.	.	.	.		.	.
.	.	.	.	.	.	.		.	.
19	-1	-1	-1	-1	-1	-1	...	0	1
20	-1	-1	-1	-1	-1	-1	...	1	0

\*Note that the matrix is not symmetric.

## ROUTE PLANNING

- In each area the lorry is schedule at fixed intervals.
- The occupancy thresholds are used to decide which bins need to be visited.
- There are lorry weight and volume constraints that you may account for at the start when planning.
- Equally, you may decide on the fly, i.e. when lorry capacity exceeded.
- Naturally there are efficiency implications here. You need to chose the approach and explain why you did that.
- This is not something to argue for/against. The purpose is for you to think critically about different approaches.

## ROUTE PLANNING

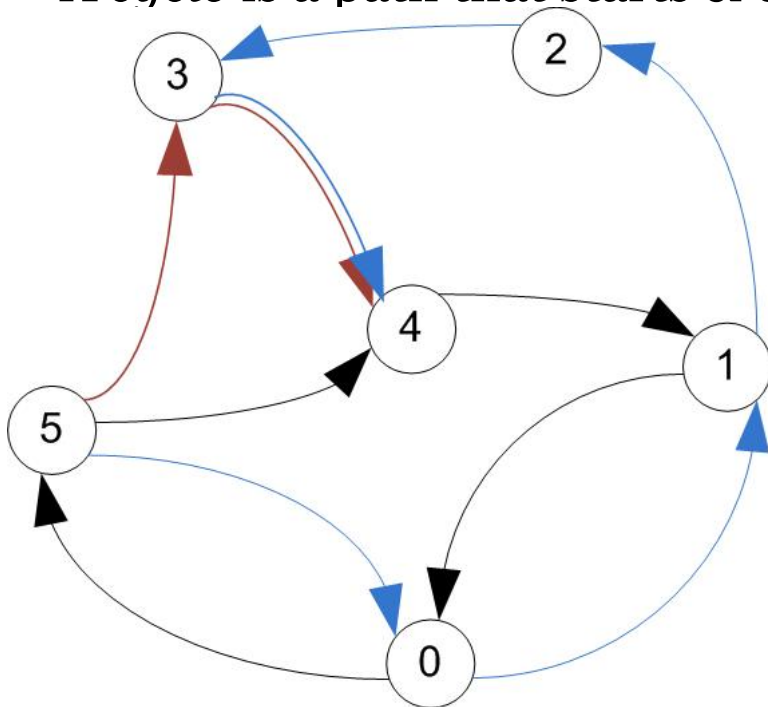
- Your goal is to compute shortest routes that service all bins exceeding occupancy thresholds at the minimum cost in terms of time.
- Remember all routes are circular, i.e. they begin and end at the depot.
- Some bins along a route may not need service.
- Thus it may be appropriate to work with an equivalent graph where vertices that do not require to be visited are isolated and equivalent arc weights are introduced.
- Sometimes it may be more efficient to travel multiple times through the same location, even if the route previously serviced bins that required that.

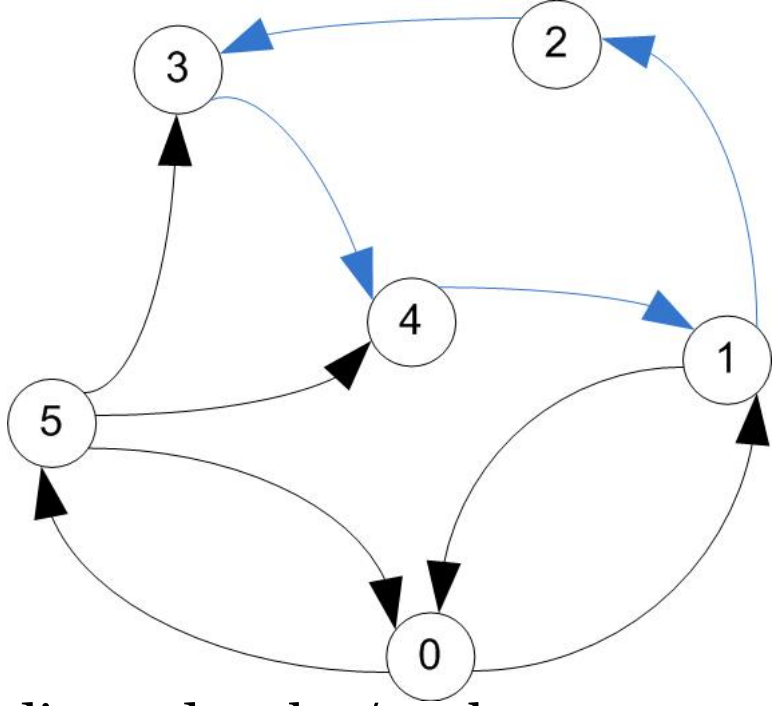
## **THE (MORE) CHALLENGING PART**

- How to partition the service areas and find (almost) optimal routes that visit all vertices that require so with minimum cost?
- This is entirely up to you, but I will discuss some useful aspects next.
- You must justify your choice in the final report and comment appropriately the simulator code.
- You may wish to implement more than one algorithm.

## USEFUL TERMINOLOGY

- A *walk* is a sequence of arcs connecting a sequence of vertices in a graph.
- A *directed path* is a walk that does not include any vertex twice, with all arcs in the same direction.
- A *cycle* is a path that starts & ends at the same vertex.

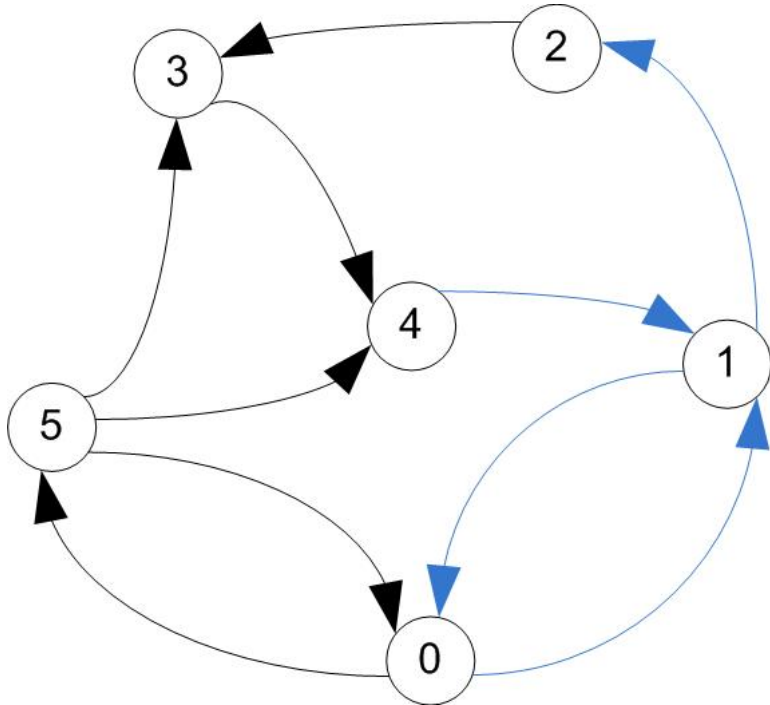




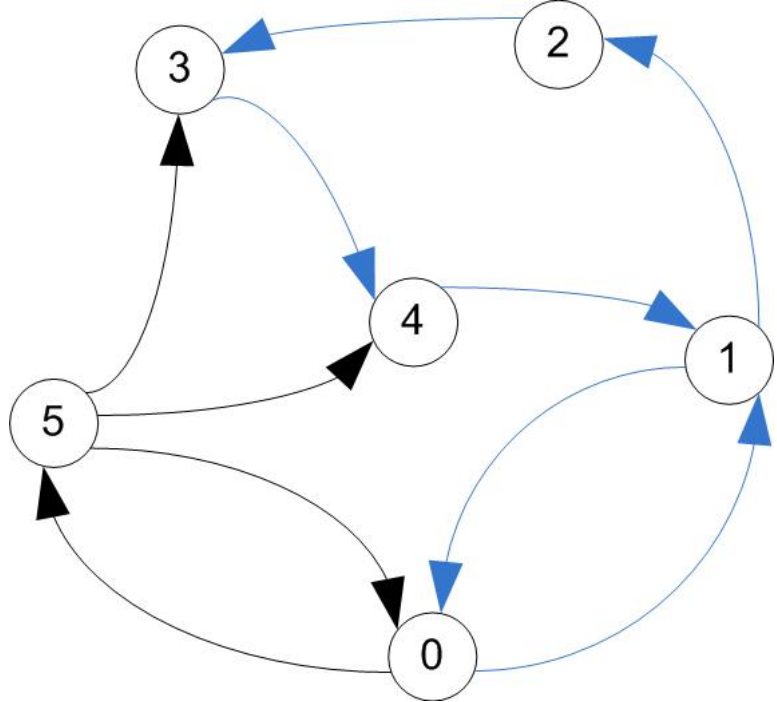
directed paths / cycle

## USEFUL TERMINOLOGY

- A *trail* is a walk that does not include any arc twice.
- A trail may include a vertex twice, as long as it comes and leaves on different arcs.
- A *circuit* is a trail that starts & ends at the same vertex



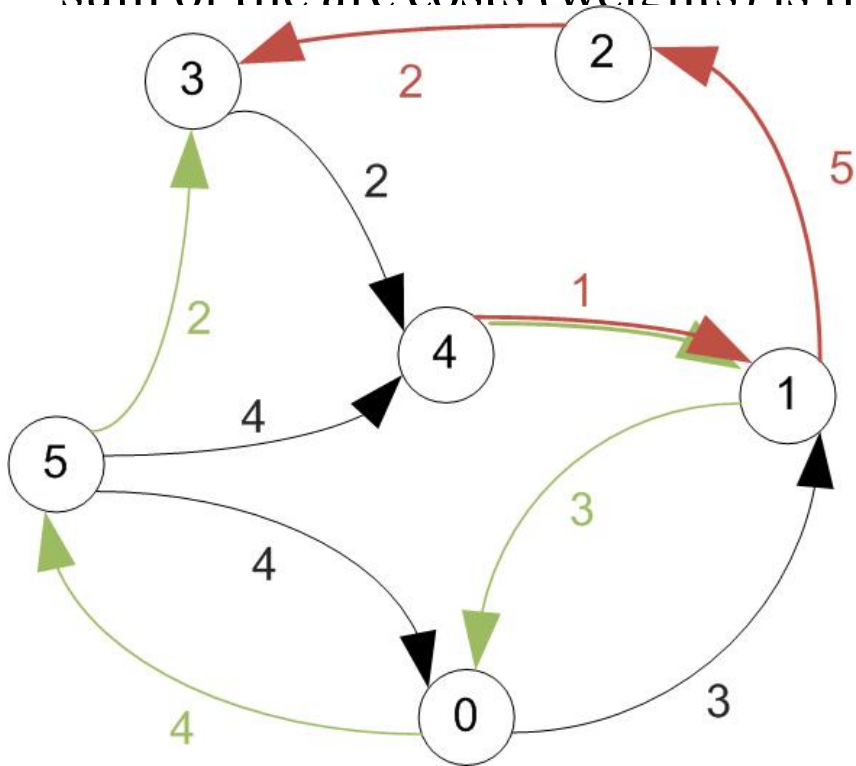




trail / circuit (tour)

# SHORTEST PATHS

- There may be multiple paths that connect two vertices in a directed graph.
- In a *weighted* graph the shortest path between two vertices is that for which the sum of the arc costs (weights) is the smallest.



# SHORTEST PATHS

- There are several algorithms you can use to find the shortest paths on a given service network.
- A non-exhaustive list includes
  - Dijkstra's algorithm (single source),
  - Floyd-Warshall algorithm (all pairs),
  - Bellman-Ford algorithm (single source).
- Each of these have different complexities, which depend on the number of vertices and/or arcs.
- The size and structure of the graph will impact on the execution time.

## FLOYD–WARSHALL ALGORITHM

- A single execution finds the lengths of the shortest paths between **all** pairs of vertices.
- The standard version does not record the sequence of vertices on each shortest path.
- The reason for this is the memory cost associated with large graphs.
- We will see however that paths can be reconstructed with simple modifications, without storing the end-to-end vertex sequences.

## FLOYD–WARSHALL ALGORITHM

- Complexity is  $O(N^3)$ , where  $N$  is the number of vertices in the graph.

The core idea:

- Consider  $d_{i,j,k}$  to be the shortest path from  $i$  to  $j$  obtained using intermediary vertices only from a set  $\{1,2,\dots,k\}$ .
- Next, find  $d_{i,j,k+1}$  (i.e. with nodes in  $\{1,2,\dots,k+1\}$ ).
  - This could be  $d_{i,j,k+1} = d_{i,j,k}$  or
  - A path from vertex  $i$  to  $k+1$  concatenated with a path from vertex  $k+1$  to  $j$ .

## FLOYD–WARSHALL ALGORITHM

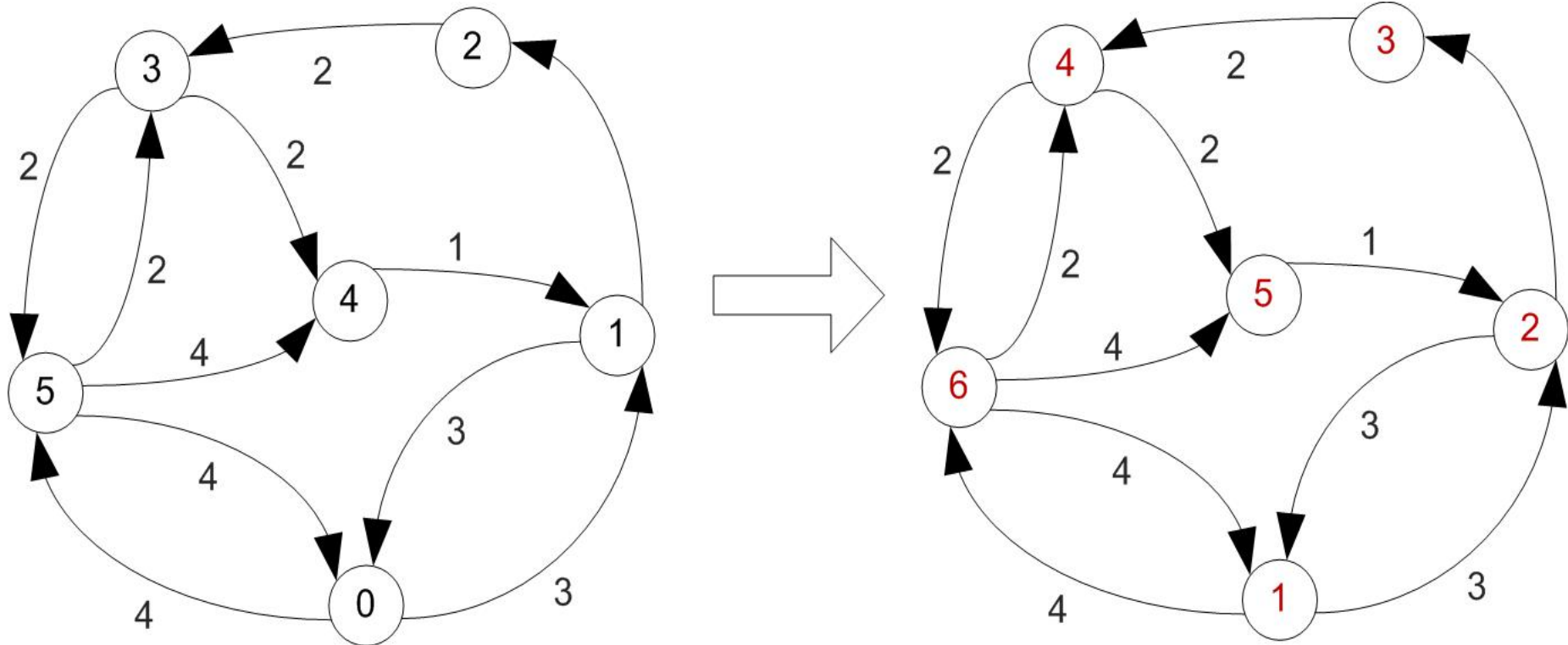
- Then we can compute all the shortest paths recursively as

$$d_{i,j,k+1} = \min(d_{i,j,k}, d_{i,k+1,k} + d_{k+1,j,k}).$$

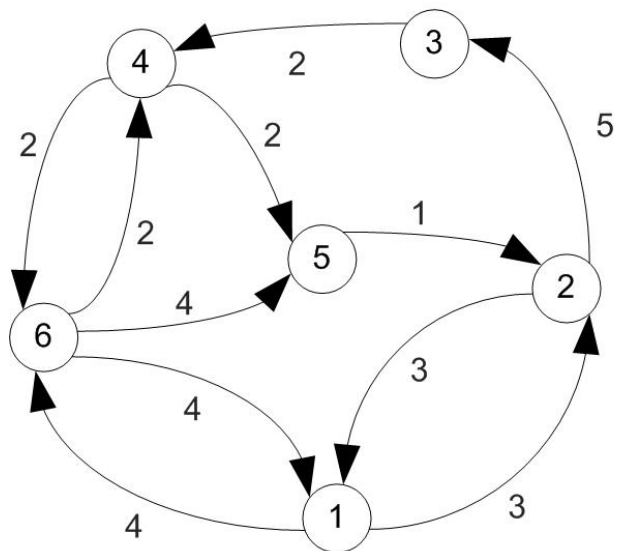
- Initialise  $d_{i,j,0} = w_{i,j}$  (i.e. start from arc costs).
- Remember that in your case the absence of an arc between vertices is represented as a -1 value, so you will need to pay attention when you compute the minimum.

## EXAMPLE

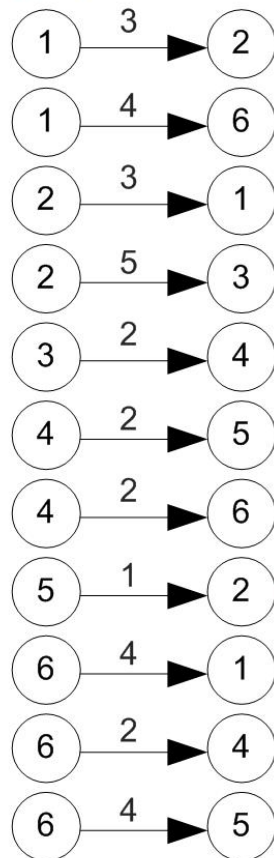
First let's increase vertex indexes by one, since we were starting at 0.



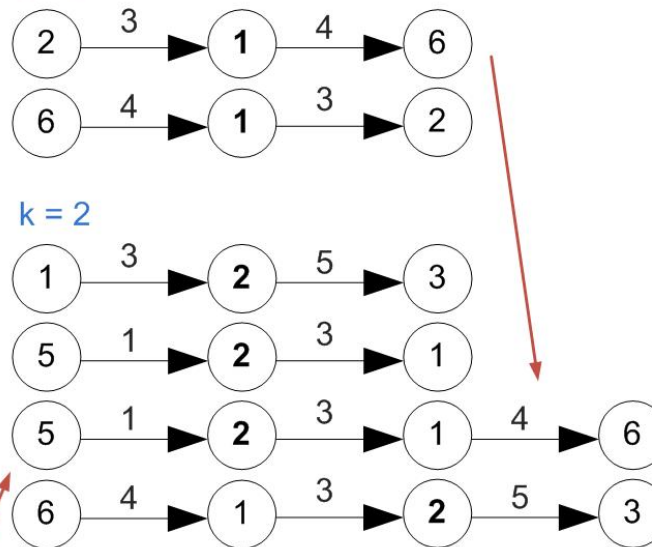
# EXAMPLE



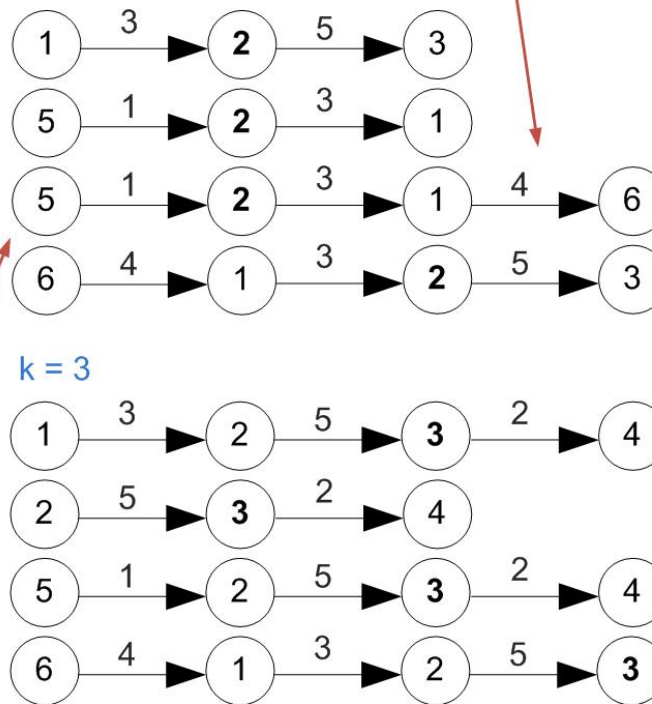
$k = 0$



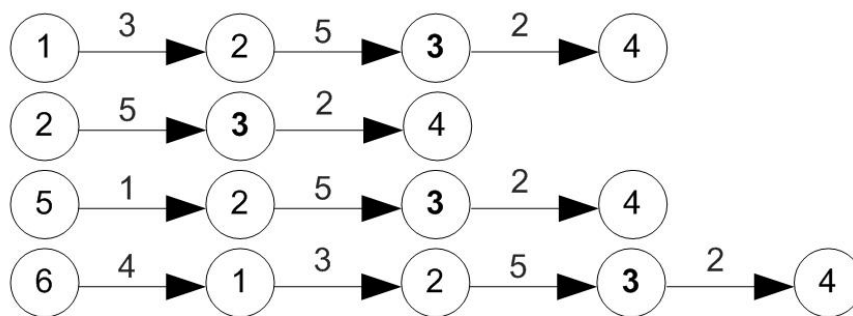
$k = 1$



$k = 2$



$k = 3$

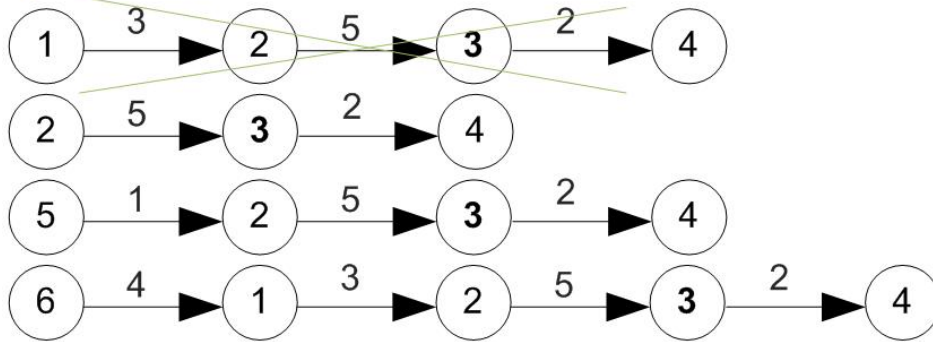




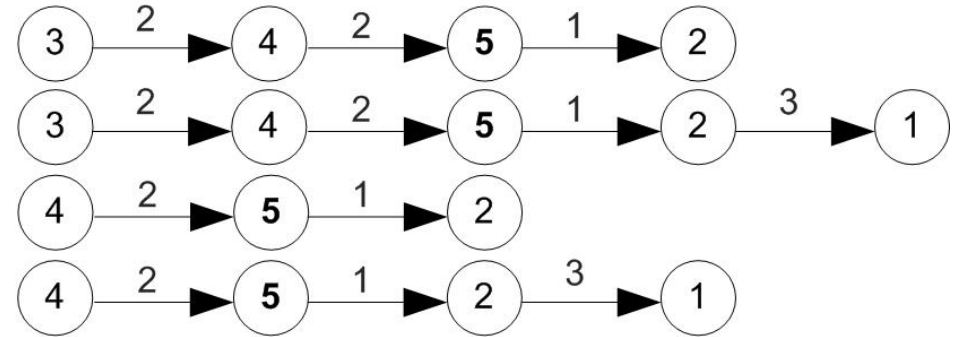


# EXAMPLE (CONT'D)

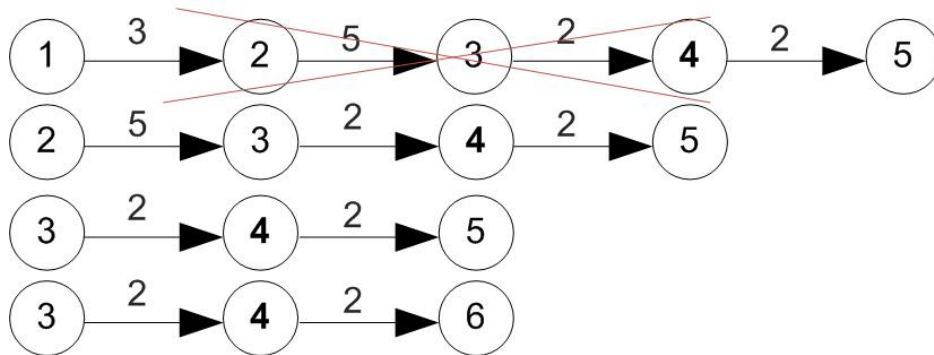
k = 3



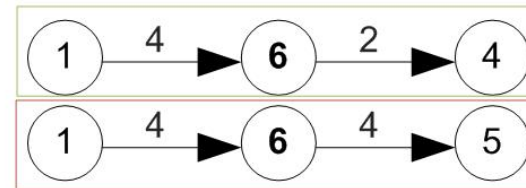
k = 5



k = 4



k = 6



All shortest paths found at this step.

# PSEUDOCODE

Denote  $\mathbf{d}$  the  $\mathbf{N} \times \mathbf{N}$  array of shortest path lengths.  
Initialise all elements in  $\mathbf{d}$  with  $\text{inf}$ .

```
For i = 1 to N
  For j = 1 to N
     $d[i][j] \leftarrow w[i][j]$  // assign weights of existing arcs;

For k = 1 to N
  For i = 1 to N
    For j = 1 to N
      If  $d[i][j] > d[i][k] + d[k][j]$ 
         $d[i][j] \leftarrow d[i][k] + d[k][j]$ 
      End If
```

## **FLOYD–WARSHALL ALGORITHM**

- This will give you the lengths of the shortest paths between each pair of vertices, but not the entire path.
- You do not actually need to store all the paths, but you would want to be able to reconstruct them easily.
- The standard approach is to compute the shortest path tree for each node, i.e. the spanning trees rooted at each vertex and having the minimal distance to each other node.

# PSEUDOCODE

Denote  $\mathbf{d}$ ,  $\mathbf{nh}$  the  $N \times N$  arrays of shortest path lengths and respectively the next hop of each vertex.

```
For i = 1 to N
  For j = 1 to N
    d[i][j] ← w[i][j] // assign weights of existing arcs;
    nh[i][j] ← j

For k = 1 to N
  For i = 1 to N
    For j = 1 to N
      If d[i][j] > d[i][k] + d[k][j]
        d[i][j] ← d[i][k] + d[k][j]
        nh[i][j] ← nh[j][k]
      End If
```

## RECONSTRUCTING THE PATHS

To retrieve the sequence of vertices on the shortest path between nodes  $i$  and  $j$ , simply run a routine like the following.

```
path ← i
While i ≠ j
  i ← nh[i][j]
  append i to path
EndWhile
```

## **FINDING OPTIMAL ROUTES GIVEN A SET OF USER REQUIREMENTS**

- Finding shortest paths between different bin locations is only one component of route planning.
- The problem you are trying to solve is a flavour of the Vehicle Routing Problem (VRP). This is a known *hard* problem.
- Simply put, an optimal solution may not be found in polynomial time and the complexity increases significantly with the number of vertices.

# HEURISTIC ALGORITHMS

- Heuristics work well for finding solutions to hard problems in many cases.
- Solutions may not be always optimal, but good enough.
- Work relatively fast.
- When the number of vertices is small, a 'brute force' approach could be feasible.
- Guaranteed to find a solution (if there exists one), and this will be optimal.



## CLARIFICATIONS

1. If returning to depot and having to immediately service other bins in the same schedule, should I check the occupancy status of all bins again?
  - No. This was not explicitly discussed in the handout, and can be debatable. For this exercise, check all bins at the beginning of a schedule, and plan according to their status even if performing multiple trips.
2. If visiting some bin locations on a path between two bins requiring service, should I output all that information?
  - No. This is useful to check your implementation is correct, but takes up memory.

## CHOOSING ROUTE PLANNING ALGORITHMS

- You have complete freedom to choose what heuristic you implement, but
- make sure you document your choice and discuss its implication on system's performance in your report.
- It is likely that you will need to compute shortest paths.
- Again, you can choose any algorithm for this task, e.g. Floyd-Warshall, Dijkstra, etc., but explain your choice.
- You can implement multiple solutions, as some may not work for any graph or will perform poorly.
- More about route planning next time.

## **ASSIGNMENT, PART 1**

- Not mandatory, zero weighted (just for feedback)
- Short proposal document outlining planned simulator.
- You should be able to explain plans for:
  1. Handling command line arguments;
  2. Parsing and validation of input scripts;
  3. Generation, scheduling, and execution of events;
  4. Graph manipulation/route planning algorithms;
  5. Statistics collection;
  6. Experimentation support and results visualisation;
  7. Code testing.

## ASSIGNMENT, PART 1

- No code will be checked.
- Have created 'doc' folder inside repository, copy 'proposal.pdf' inside, git push.

```
$ cd doc  
$ git add proposal.pdf  
$ git commit -m 'Added proposal document'  
$ git push
```

- Deadline today, 7 Oct at 16:00.

**QUESTIONS?**