



# Graphs

CE-1103 Algorithms and Data Structures

# Disclaimer / Descargo de Responsabilidad

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Esta presentación corresponde a una guía usada por el profesor durante las clases. La misma ha sido modificada para ser utilizado en el modelo de cursos asistidos por tecnología. No es una versión final, por lo que la misma podría requerir todavía hacer algunos ajustes. Para aspectos de evaluación esta presentación es solo una guía, por lo que el estudiante debe profundizar con el material de lectura asignado y lo discutido en clases para aspectos de evaluación.

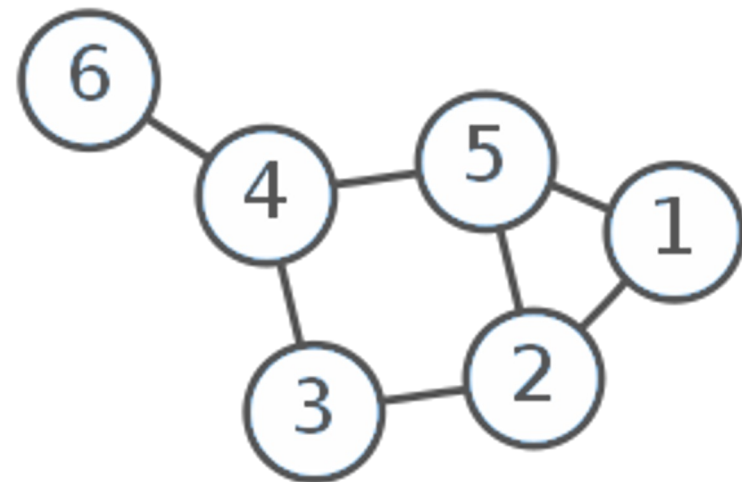
This presentation corresponds to a guide material used by the professor during classes. It has been modified to be used in the model of technology-assisted courses. It is not a final version, so it may still require some adjustments. For evaluation aspects, this presentation is only a guide, so the student should delve with the assigned reading material and what has been discussed in class.

# Introduction

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→ Graphs are general data structures that have a wide range of applications:

- ◆ Sociology
- ◆ Chemistry
- ◆ Geography
- ◆ Electrical engineering
- ◆ Industrial engineering



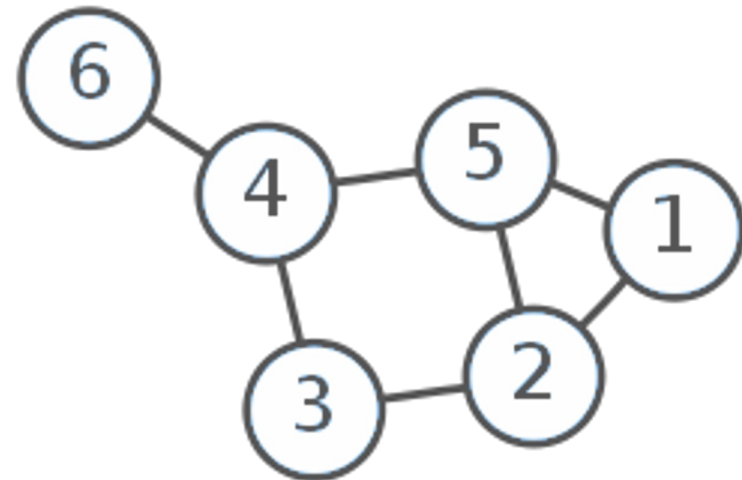
# Introduction

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→ Graphs are general data structures that have a wide range of

- ◆ Sociology
- ◆ Chemistry
- ◆ Geography
- ◆ Electrical engineering
- ◆ Industrial engineering

i.e Identify criminal networks

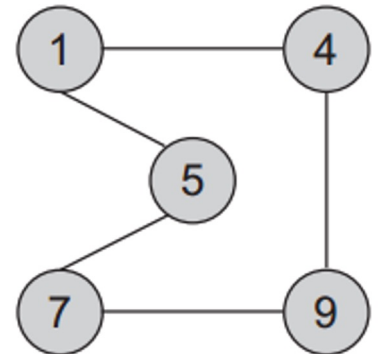


# Concepts & definitions

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- A graph  $G$  groups together physical or conceptual entities. A graph is composed of:
- ◆ Vertices, nodes or points that represents each of the entities
  - ◆ Edges, arcs or lines that represents relationships between nodes.

→ A graph is denoted as  $G = \{V, A\}$

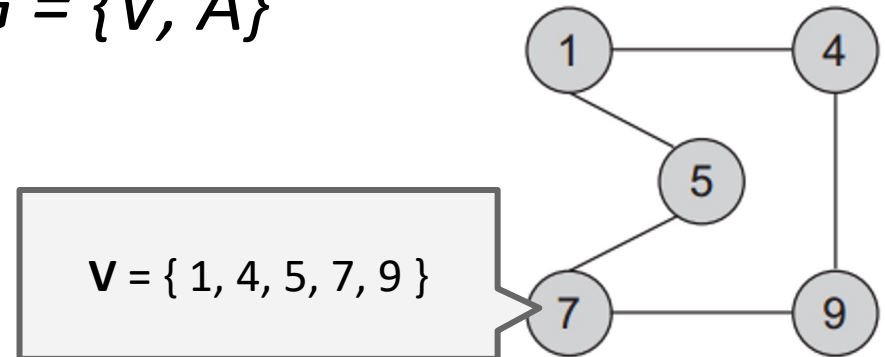


# Concepts & definitions

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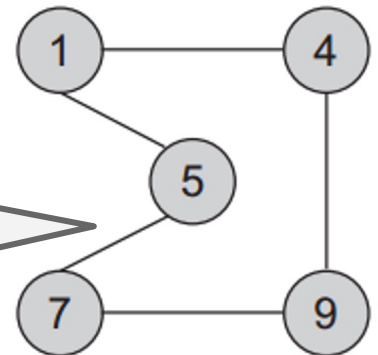
# Concepts & definitions

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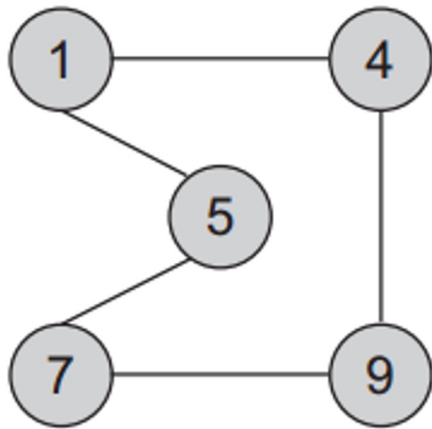
$A = \{ (1,4), (4,1), (1,5), (5,1), (4,9), (9,4), (5,7), (7,5), (7,9), (9,7) \}$



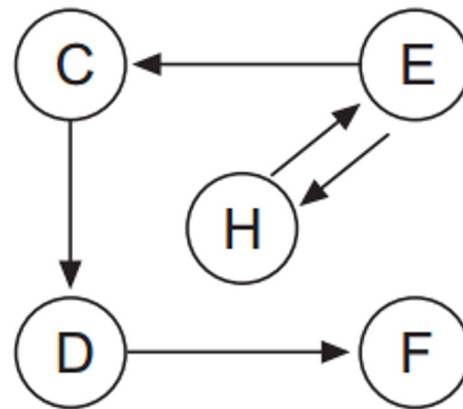
# Concepts & definitions

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→ A graph can be directed or undirected:



Undirected graph



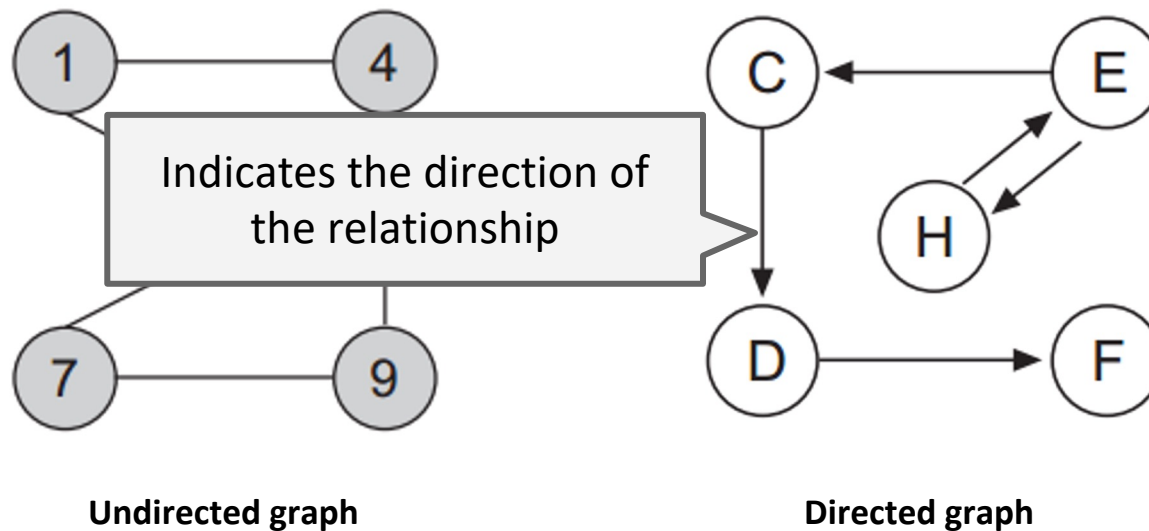
Directed graph



# Concepts & definitions

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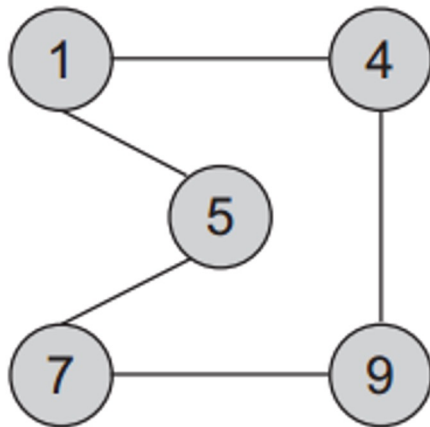
→ A graph can be directed or undirected:



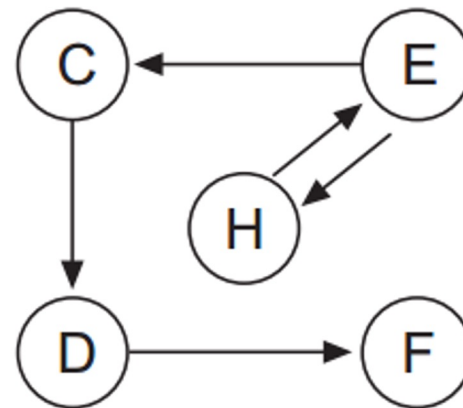
# Concepts & definitions

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→ A graph can be directed or undirected:



Vertices 7 and 9 are adjacent vertices

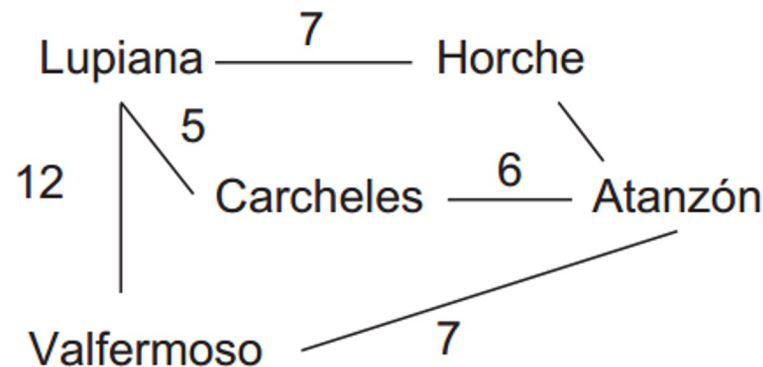


Directed graph

# Concepts & definitions

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- An edge can have a weight associated denoting a magnitude associated with the relationship
- Graphs with weight set on the edges are called **weighted graphs**



Weighted graph

# Concepts & definitions

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- The degree of  $v$  is a quality of a node of a graph. In an **undirected graph** it is the number of edges that contains  $v$
- In a directed graph the **indegree** is the number of tail ends adjacent to  $v$ . **Outdegree** is the number of head ends adjacent to  $v$

# Concepts & definitions

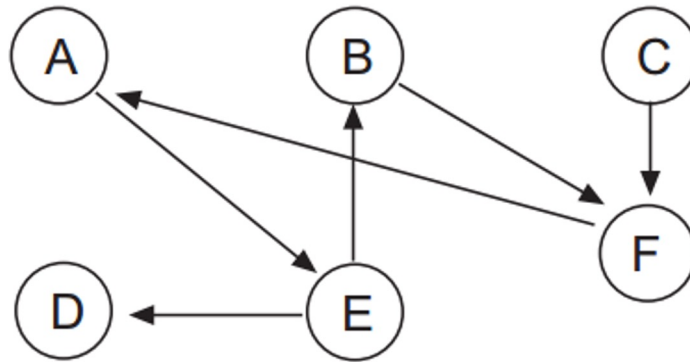
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- A path  $P = (v_0, v_1, v_2, \dots, v_n)$  is a set of vertices that form the path from  $v_0$  to  $v_n$ .  $v_0$  and  $v_n$  can be the same.
- If the vertices between  $v_0$  to  $v_n$  are different, the path is called **simple path**

# Concepts & definitions

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→ A **cycle** is a simple path that begins and ends in the same node.

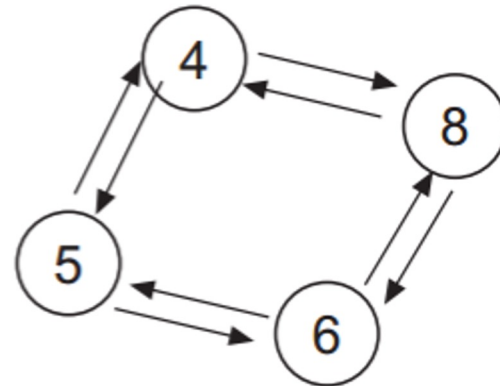
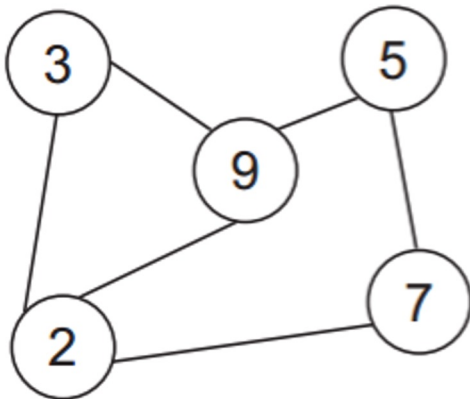


→ A **DAG** is a directed acyclic graph, a graph where there are no cycles

# Concepts & definitions

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- A graph is **connected** if there is a path between any pair of nodes that compose it
- A graph is **strongly connected** if the graph is connected and is a digraph



# Graph representation

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- Graphs can be represented using two different approaches:
  - ◆ Using a bidimensional array known as **adjacency matrix**
  - ◆ Using a dynamic representation known as **adjacency list**
- Choosing between one representation or the other depends of the type of the array and the operations that will be done



# Graph representation

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- Graphs can be represented using two different approaches:
- ◆ Using a bidimensional array known as **adjacency matrix**
  - ◆ Using a dynamic representation known as **adjacency list**

→ Choosing a representation other depends of the type of the operations that will be done

If the graph is dense (lots of arcs), is better to choose a matrix

If the graph is sparse, choose the linked list

## Graph representation

# Adjacency Matrix

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→ Let  $G = \{V, A\}$  where  $V = \{v_0, v_1, v_2, \dots, v_{n-1}\}$  and  $A = \{(v_i, v_j)\}$ . Nodes can be represented by matrix  $A$  of  $n \times n$  known as adjacency matrix. Each element of  $a_{ij}$  can take one of the following values:

$$a_{ij} \left\{ \begin{array}{l} \mathbf{0} \text{ if there is not an arc between } (v_i, v_j) \\ \mathbf{1} \text{ if there is an arc between } (v_i, v_j) \end{array} \right\}$$

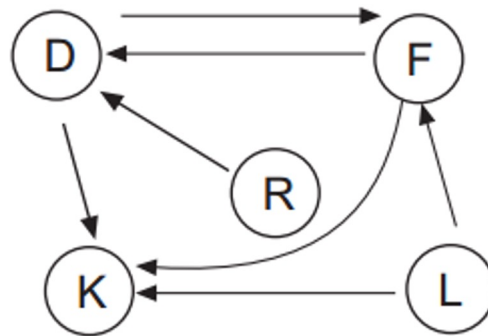
## Graph representation

# Adjacency Matrix

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→ For example, let's say the nodes are {D, F, K, L, R}  
the matrix will be:

$$A = \begin{vmatrix} 0 & 1 & 1 & 0 & 0 \\ 1 & 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 & 0 \end{vmatrix}$$



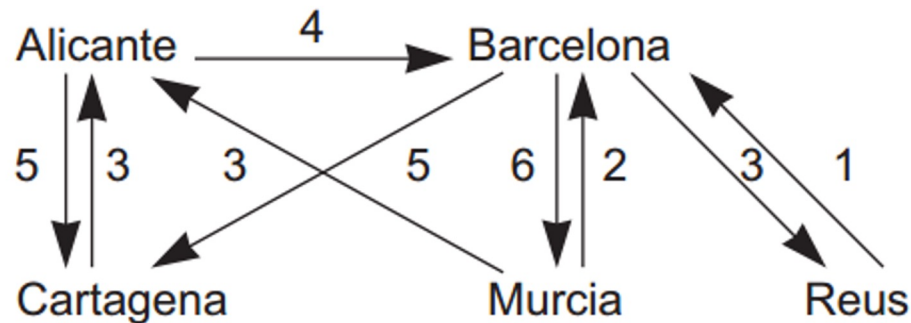
## Graph representation

# Adjacency Matrix

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→ If the graph is weighted:

$$P = \begin{vmatrix} 0 & 4 & 5 & 0 & 0 \\ 0 & 0 & 3 & 6 & 3 \\ 3 & 0 & 0 & 0 & 0 \\ 5 & 2 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \end{vmatrix}$$



# Adjacency List

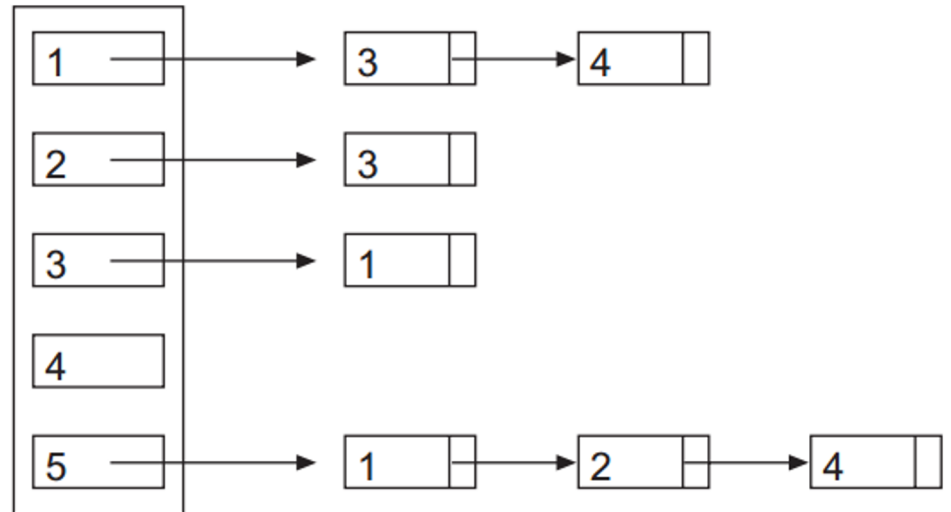
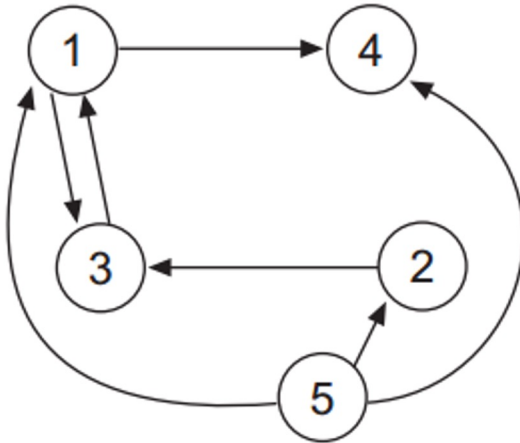
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→ An adjacency list is a linked list where each element represents a node of the graph. Each element contains a list of relationships with other nodes, being the element node, the origin

# Graph representation

## Adjacency List

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# Graph traversals

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- Traversing a graph involves **visiting** all reachable nodes starting from an specific node
- Basic traversing algorithm:
  - ◆ Let  $V$  be the set of vertices of the graph
  - ◆ Let  $W$  be the set of not visited nodes. Initially it only contains the initial node  $v$
  - ◆ Let  $Y$  be the set of visited nodes.
  - ◆ On each pass of the algorithm, removes a node  $w$ , get processed and for each edge of  $w$ , if not visited, will be added to  $w$
  - ◆ Algorithm ends when  $W$  is empty

# Breadth-First

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- Uses a queue that keeps marked vertices
- FIFO achieves that from  $v$ , all adjacent vertices are processed first, then all the adjacents of the adjacents of  $v$ ...and so on



# Breadth-First

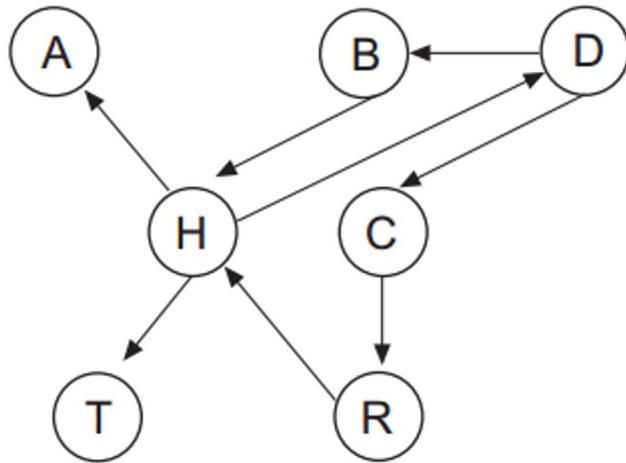
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### → Algorithm:

1. Mark the start node  $v$
2. Enqueue the start node  $v$
3. Repeat step 4 and 5 until queue is empty
4. Dequeue node  $w$  from the queue, process  $w$
5. Enqueue all adjacent nodes to  $w$  that are not marked, marked queued nodes
6. End

# Graph traversals

## Breadth-First



Queue	Visited
<i>D</i>	
<i>B C</i>	<b>D</b>
<i>C H</i>	<b>B</b>
<i>H R</i>	<b>C</b>
<i>R A T</i>	<b>H</b>
<i>A T</i>	<b>R</b>
<i>T</i>	<b>A</b>
Empty Queue	<b>T</b>

## Graph traversals

### Depth-First

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- We saw that in the Breadth-First traversal, adjacent nodes **are processed in a FIFO** approach
- In Depth-First, the processing order is given by a **LIFO approach**

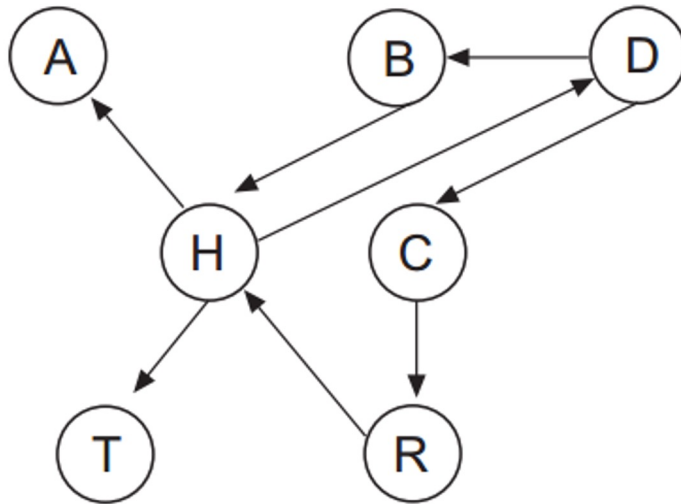
# Depth-First

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- Traverse begins with a node  $v$ .  $v$  is marked as visited and pushed to the stack. Top of the stack is popped. Each unvisited adjacent node of  $v$  is pushed to the stack.
- Continue until there are not more elements in the stack

# Graph traversals

## Depth-First



Stack	Visited nodes
<i>D</i>	
<i>B C</i>	<b>D</b>
<i>B R</i>	<b>C</b>
<i>B H</i>	<b>R</b>
<i>B A T</i>	<b>H</b>
<i>B A</i>	<b>T</b>
<i>B</i>	<b>A</b>
Empty Stack	<b>B</b>

# Shortest-path: Dijkstra

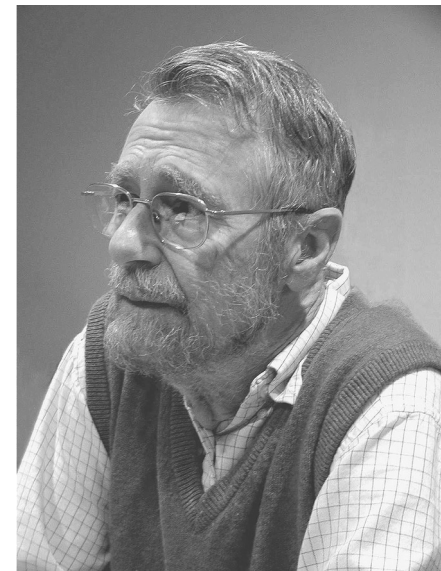
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- One of the most common problems is to determine the shortest path between a pair of nodes
- For this kind of problem we consider a directed and weighted graph
- The length of the shortest path is the sum of the weight of each edge

# Shortest-path: Dijkstra

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- **Dijkstra algorithm** finds the shortest path from an origin node to all other nodes in a graph with positive weights
- Edsger Dijkstra (1930 - 2002) was a Dutch computer scientist that shaped computer programming as a recognized science



# Shortest-path: Dijkstra

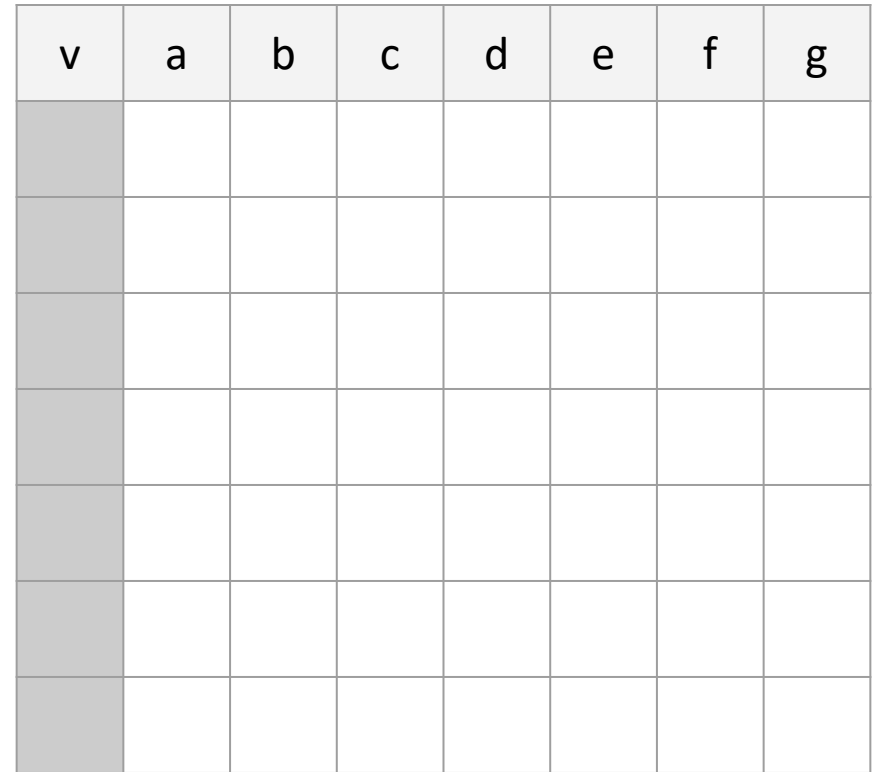
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→ **Dijkstra algorithm** is an avid algorithm that selects the best solution on each step

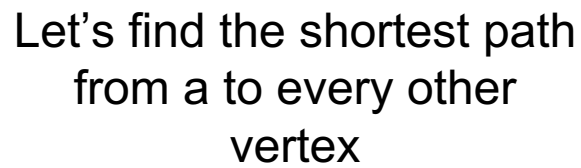
→ Let's see how it works



## Shortest-path: Dijkstra

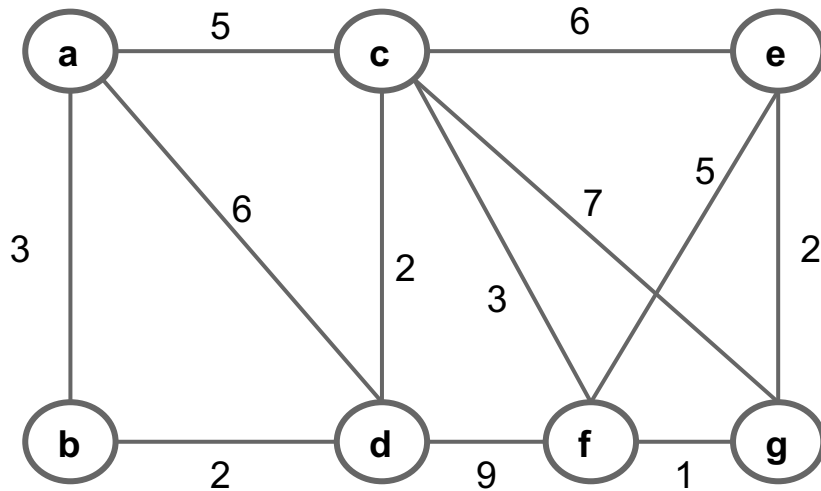


## Shortest-path: Dijkstra

[illegible]

## Graph algorithms

# Shortest-path: Dijkstra

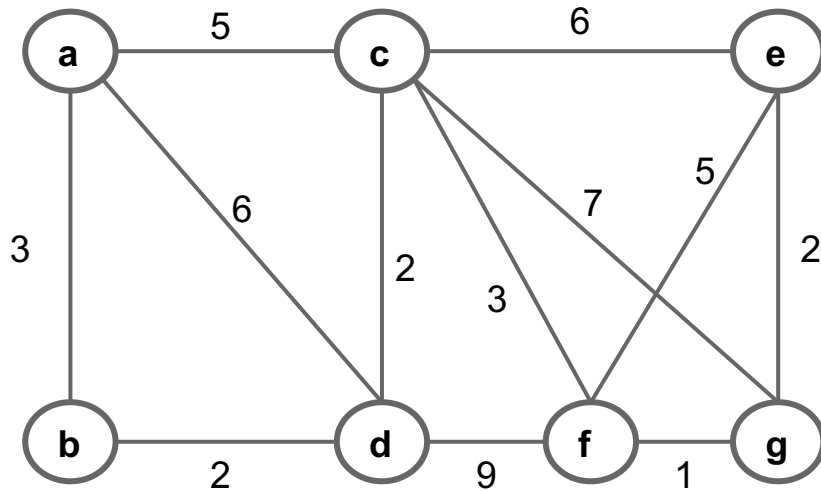


v	a	b	c	d	e	f	g
a	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	6 <sub>a</sub>	-	-	-
b							
c							
d							
e							
f							
g							

Sub index indicates the **from** node

# Graph algorithms

## Shortest-path: Dijkstra

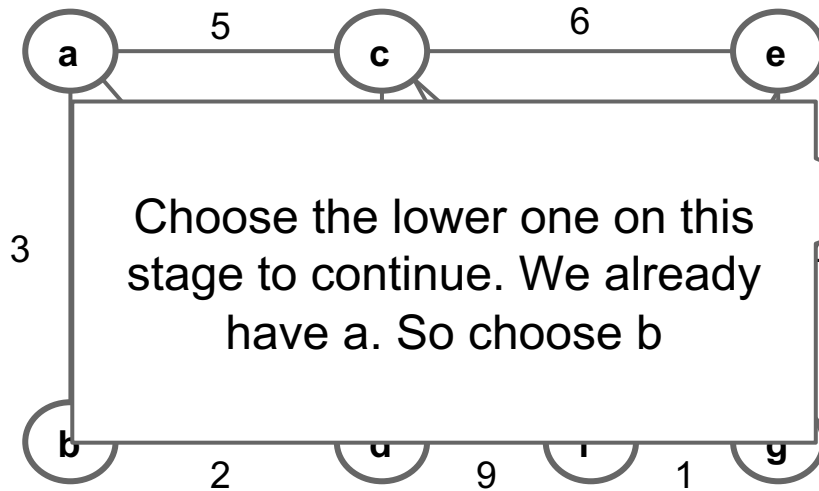


v	a	b	c	d	e	f	g
a	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	6 <sub>a</sub>	-	-	-
b							
c							
d							
e							
f							
g							

Blue means: this is the shortest path. For example, from a to a, there won't be other path shorter

# Graph algorithms

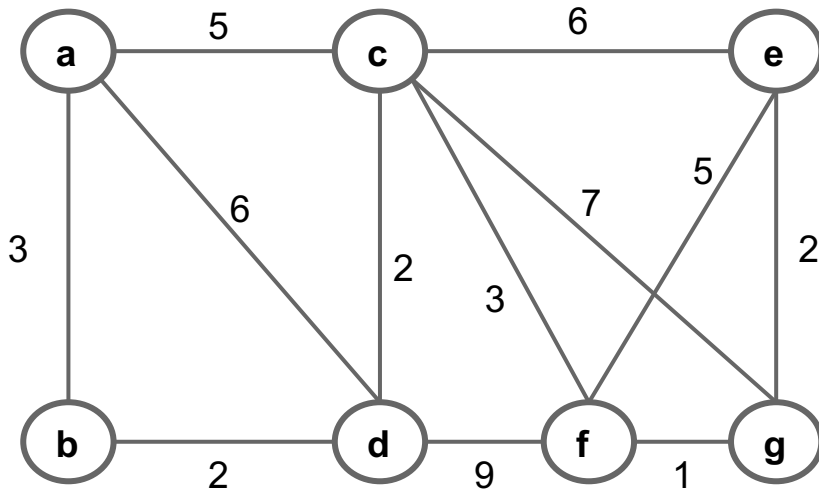
## Shortest-path: Dijkstra



v	a	b	c	d	e	f	g
a	$0_a$	$3_a$	$5_a$	$6_a$	-	-	-
b							
c							
d							
e							
f							
g							

# Graph algorithms

## Shortest-path: Dijkstra

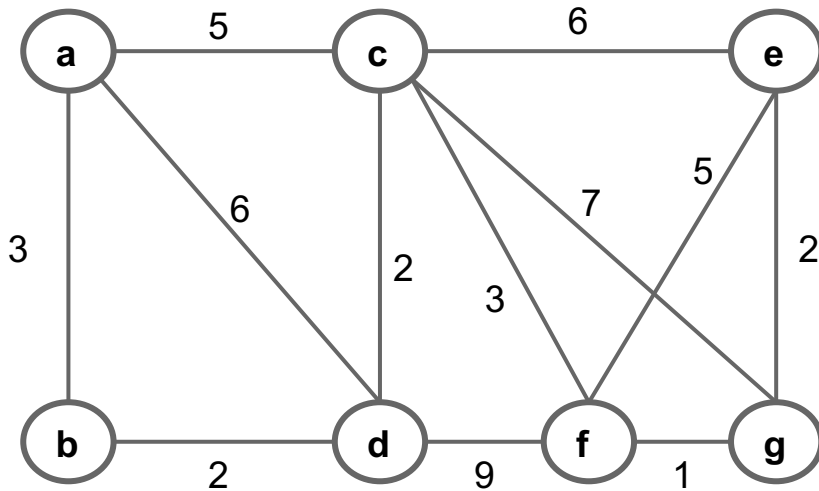


v	a	b	c	d	e	f	g
a	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	6 <sub>a</sub>	-	-	-
b	0 <sub>a</sub>				-	-	-
c							
d							
e							
f							
g							

We already knew that the shortest path to a was from a itself

## Graph algorithms

# Shortest-path: Dijkstra

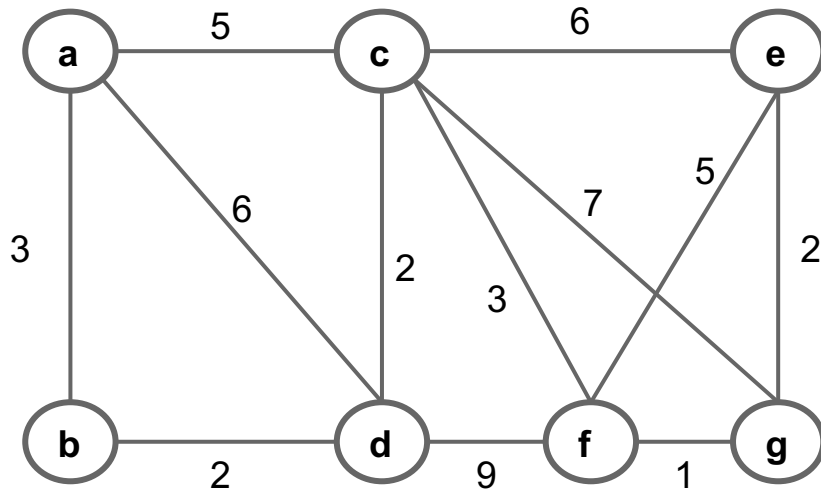


v	a	b	c	d	e	f	g
a	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	6 <sub>a</sub>	-	-	-
b	0 <sub>a</sub>				-	-	-

The shortest path to b from node a is?

# Graph algorithms

## Shortest-path: Dijkstra

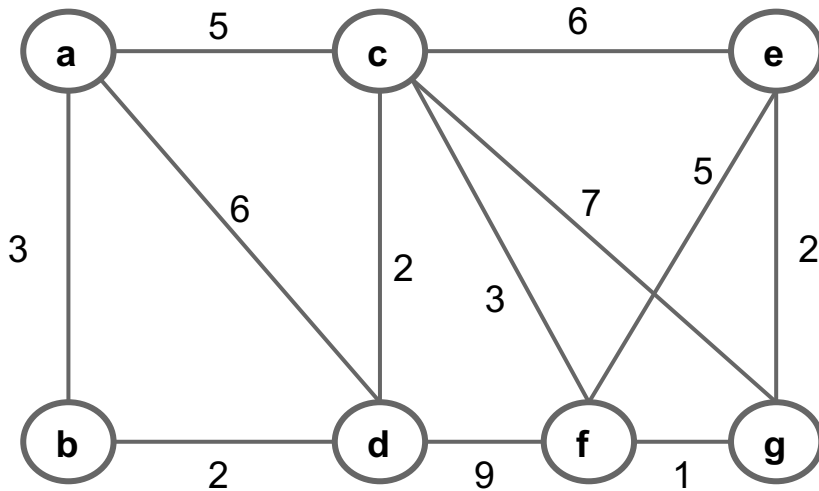


v	a	b	c	d	e	f	g
a	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	6 <sub>a</sub>	-	-	-
b	0 <sub>a</sub>	3 <sub>a</sub>			-	-	-



# Graph algorithms

## Shortest-path: Dijkstra

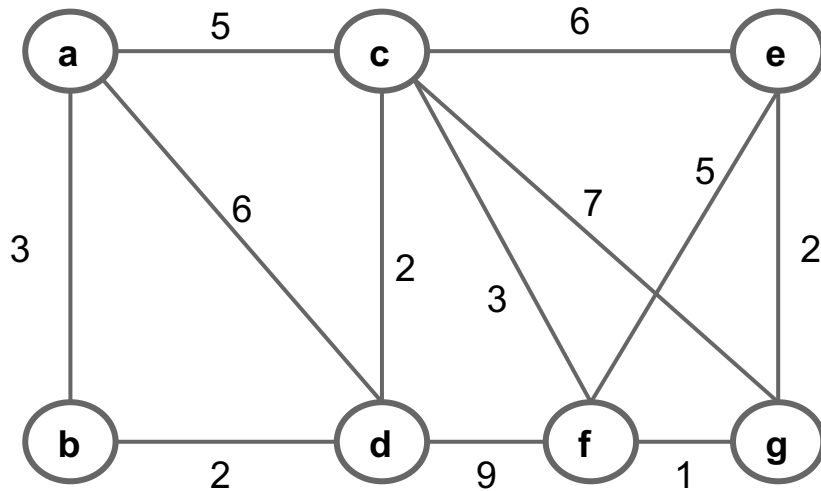


v	a	b	c	d	e	f	g
a	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	6 <sub>a</sub>	-	-	-
b	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	-	-	-

To get to d from a we have two paths. Choose the lower one indicating the source node

# Graph algorithms

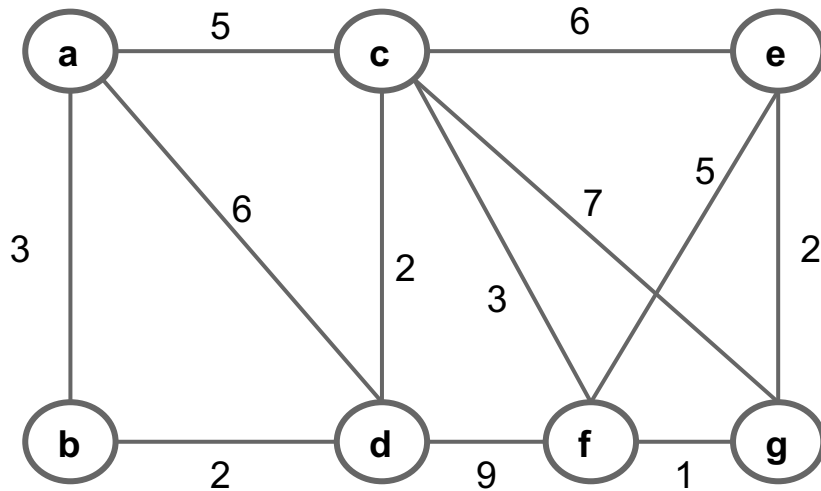
## Shortest-path: Dijkstra



v	a	b	c	d	e	f	g
a	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	6 <sub>a</sub>	-	-	-
b	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	-	-	-
c	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>				

# Graph algorithms

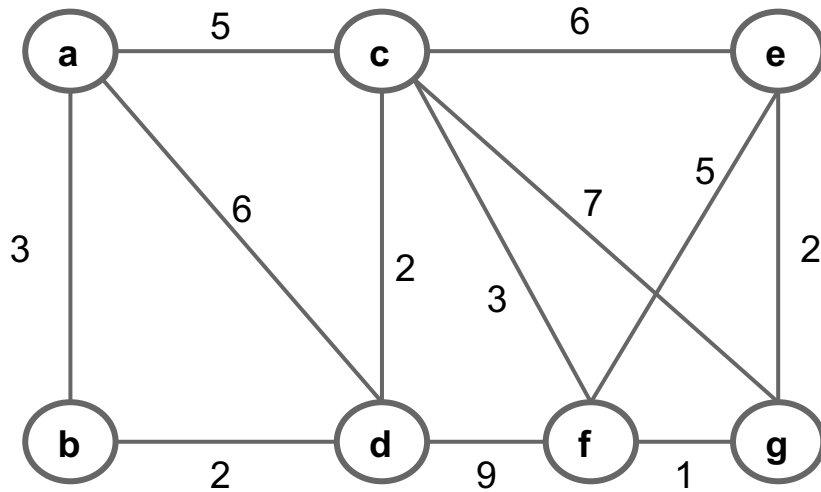
## Shortest-path: Dijkstra



v	a	b	c	d	e	f	g
a	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	6 <sub>a</sub>	-	-	-
b	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	-	-	-
c	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	11 <sub>c</sub>	8 <sub>c</sub>	12 <sub>c</sub>

## Graph algorithms

# Shortest-path: Dijkstra

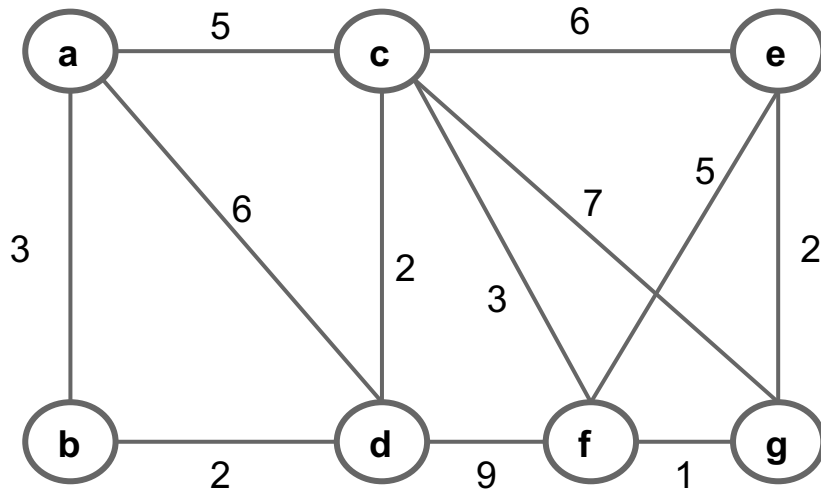


No further improvements...so we are done!

v	a	b	c	d	e	f	g
a	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	6 <sub>a</sub>	-	-	-
b	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	-	-	-
c	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	11 <sub>c</sub>	8 <sub>c</sub>	12 <sub>c</sub>
d	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	11 <sub>c</sub>	8 <sub>c</sub>	12 <sub>c</sub>
f	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	11 <sub>c</sub>	8 <sub>c</sub>	9 <sub>f</sub>
g							

## Graph algorithms

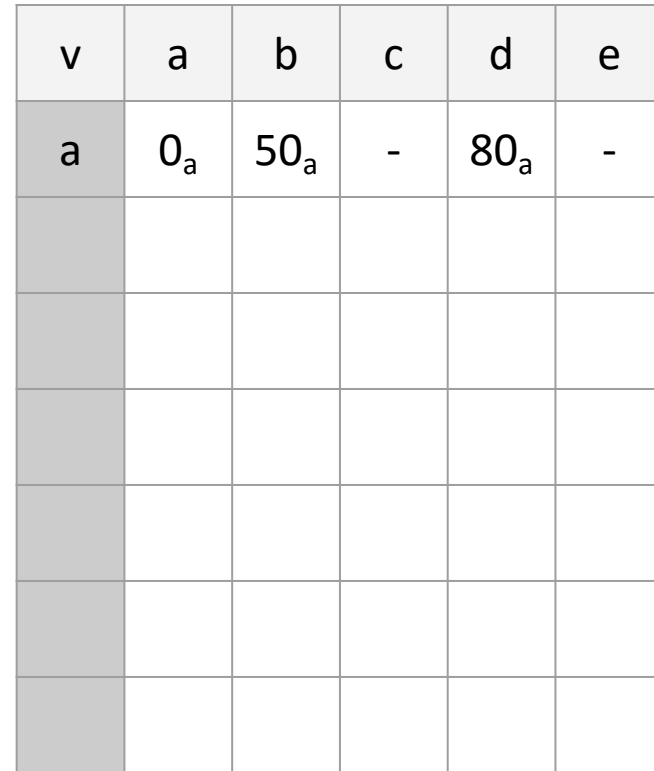
# Shortest-path: Dijkstra



What is the shortest path from a to g? **a > c > f > g**

v	a	b	c	d	e	f	g
a	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	6 <sub>a</sub>	-	-	-
b	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	-	-	-
c	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	11 <sub>c</sub>	8 <sub>c</sub>	12 <sub>c</sub>
d	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	11 <sub>c</sub>	8 <sub>c</sub>	12 <sub>c</sub>
f	0 <sub>a</sub>	3 <sub>a</sub>	5 <sub>a</sub>	5 <sub>b</sub>	11 <sub>c</sub>	8 <sub>c</sub>	9 <sub>f</sub>

## Shortest-path: Dijkstra





# Graphs

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