

Graph Structure

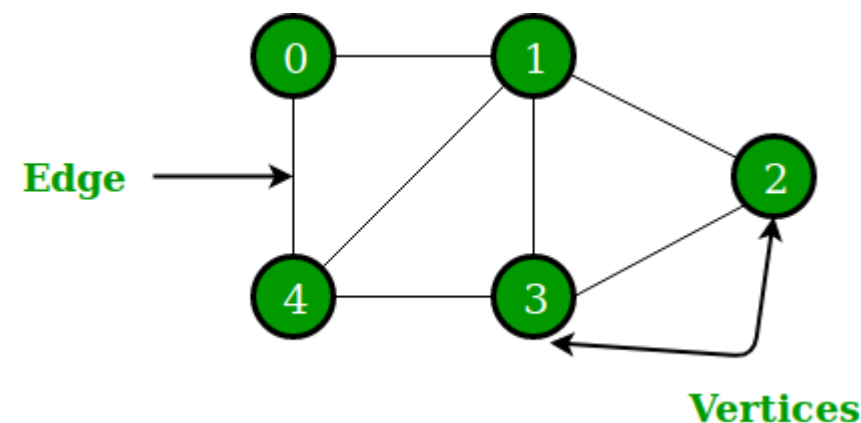


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- Terminologies
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- Graph traversal
- Spanning tree
- Shortest path

Graph

- A graph consists of a **finite set of vertices** (or nodes) and **set of edges** which connect a pair of nodes.
- $G = \{V, E\}$
 - V: set of vertices. $V = \{v_1, v_2, \dots, v_n\}$
 - E: set of edges. $E = \{e_1, e_2, \dots, e_m\}$
- Example:
 - $V = \{0, 1, 2, 3, 4\}$
 - $E = \{01, 04, 12, 13, 14, 23, 34\}$

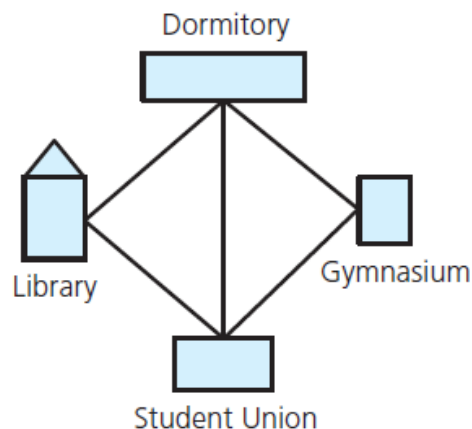


Terminologies

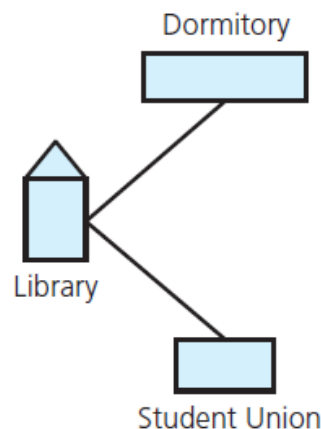
Terminologies

- A **subgraph** consists of a subset of a graph's vertices and a subset of its edges.
 - $G' = \{V', E'\}$ is a subgraph of $G = \{V, E\}$ if $V' \subseteq V, E' \subseteq E$

(a)



(b)



(a) A campus map as a graph;
(b) a subgraph

Terminologies

- **Vertex**: also called a **node**.
- **Edge**: connects two vertices.
- **Loop** (*self-edge*): An edge of the form (v, v) .
- **Adjacent**: two vertices are **adjacent** if they are joined by an edge.

Terminologies

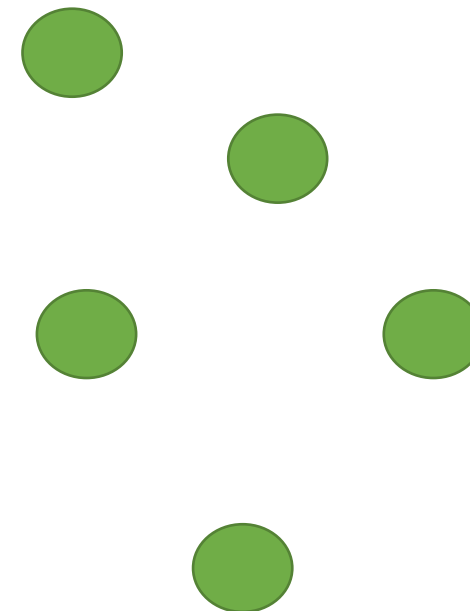
- **Path:** A sequence of edges that begins at one vertex and ends at another vertex.
 - If all vertices of a path is distinct, the path is **simple**.
- **Cycle:** A path that starts and ends at the same vertex and does not traverse the same edge more than once.
- **Acyclic graph:** A graph with no cycle.

Terminologies

- **Null graph:** A graph having no edges
- **Trivial graph:** A graph with only one vertex.



trivial graph

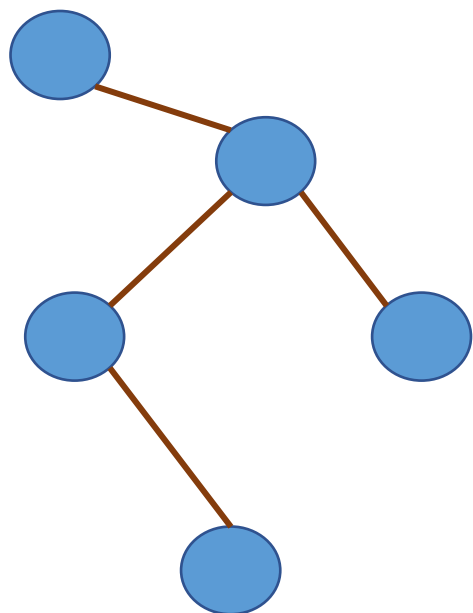


null graph

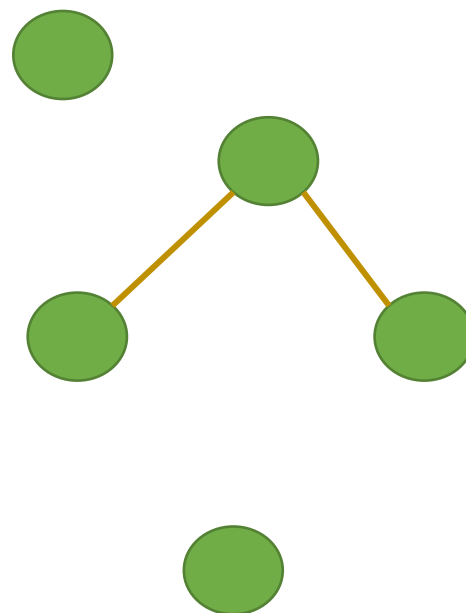
Terminologies

- **Connected graph:** A graph in which each pair of **distinct vertices** has a **path** between them.
- **Disconnected graph:** A graph that contains two vertices not connected.
- **Complete graph:** A graph in which each pairs of **distinct vertices** has an **edge** between them
- Graph cannot have duplicate edges between vertices.
 - **Multigraph:** does allow multiple edges

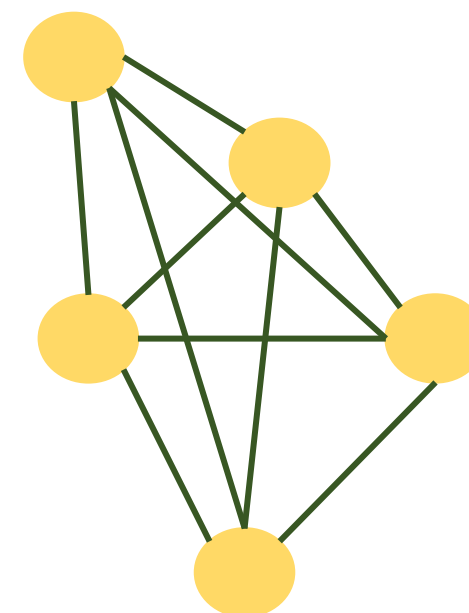
Terminologies



connected graph



disconnected graph



complete graph

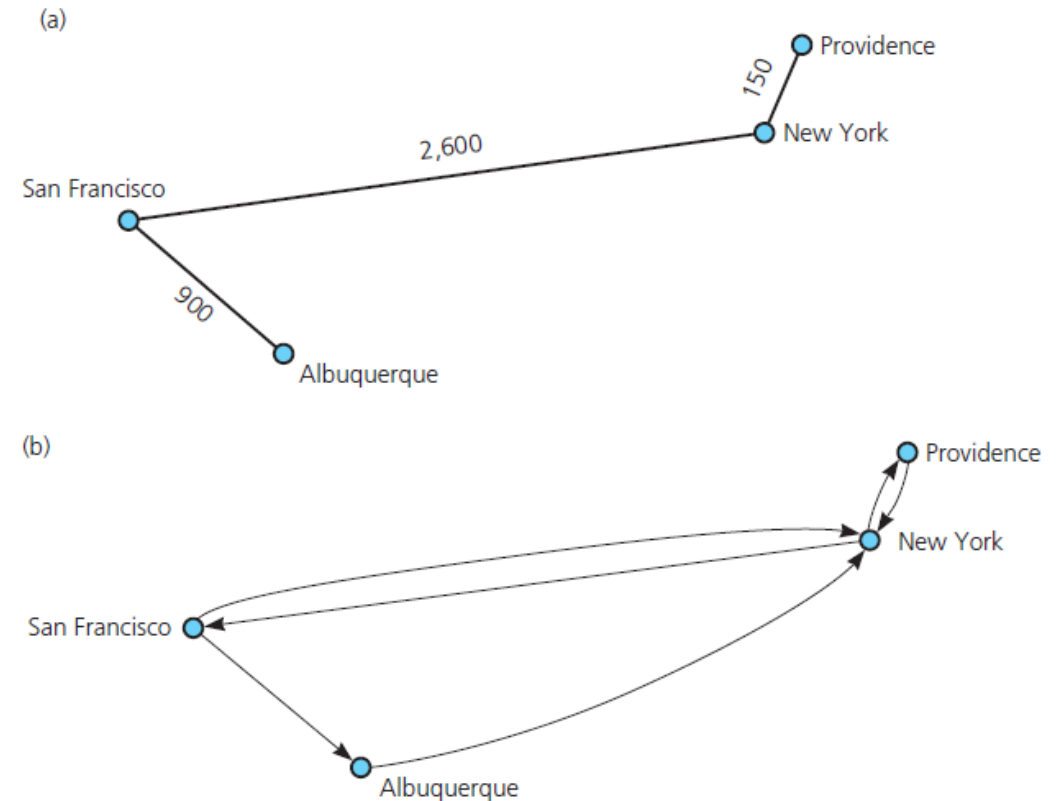
Terminologies

- **Undirected graph:** the graph in which edges do not indicate a direction.
- **Directed graph, or digraph:** a graph in which each edge has a direction.
- **Weighted graph:** a graph with numbers (weights, costs) assigned to its edges.

Terminologies

(a): undirected graph

(b): directed graph



Graph Representation

Graph Representation

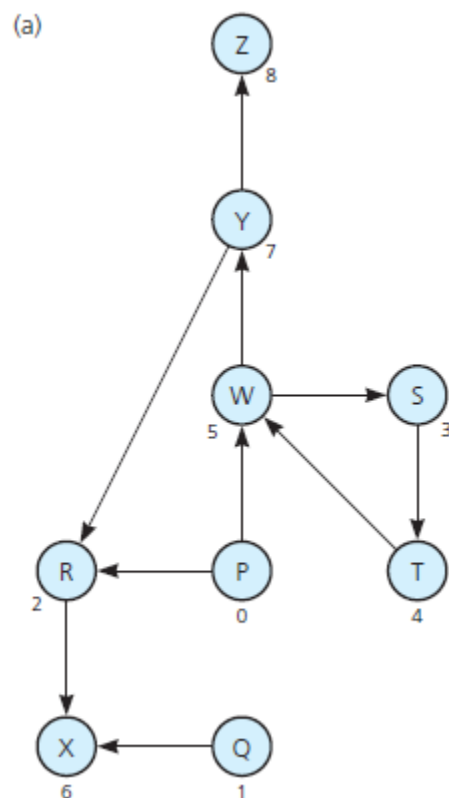
- Adjacency Matrix
- Adjacency List

Adjacency Matrix

$A[n][n]$ with n is the number of vertices.

- $A[i][j] = \begin{cases} 1 & \text{if there is an edge}(i, j) \\ 0 & \text{if there is no edge}(i, j) \end{cases}$
- $A[i][j] = \begin{cases} w & \text{with } w \text{ is the weight of edge}(i, j) \\ \infty & \text{if there is no edge}(i, j) \end{cases}$

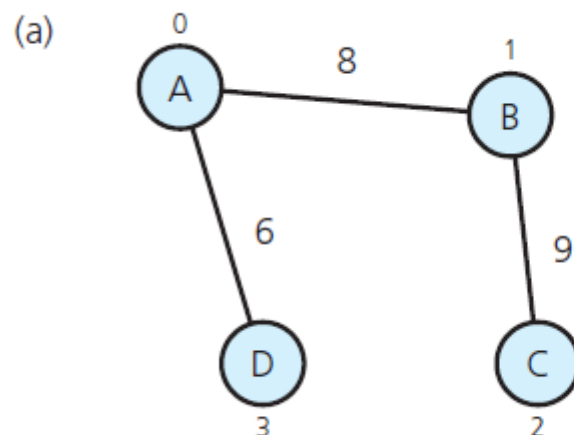
Adjacency Matrix



(b)

		0	1	2	3	4	5	6	7	8
		P	Q	R	S	T	W	X	Y	Z
0	P	0	0	1	0	0	1	0	0	0
1	Q	0	0	0	0	0	0	1	0	0
2	R	0	0	0	0	0	0	1	0	0
3	S	0	0	0	0	1	0	0	0	0
4	T	0	0	0	0	0	1	0	0	0
5	W	0	0	0	1	0	0	0	1	0
6	X	0	0	0	0	0	0	0	0	0
7	Y	0	0	1	0	0	0	0	0	1
8	Z	0	0	0	0	0	0	0	0	0

Adjacency Matrix



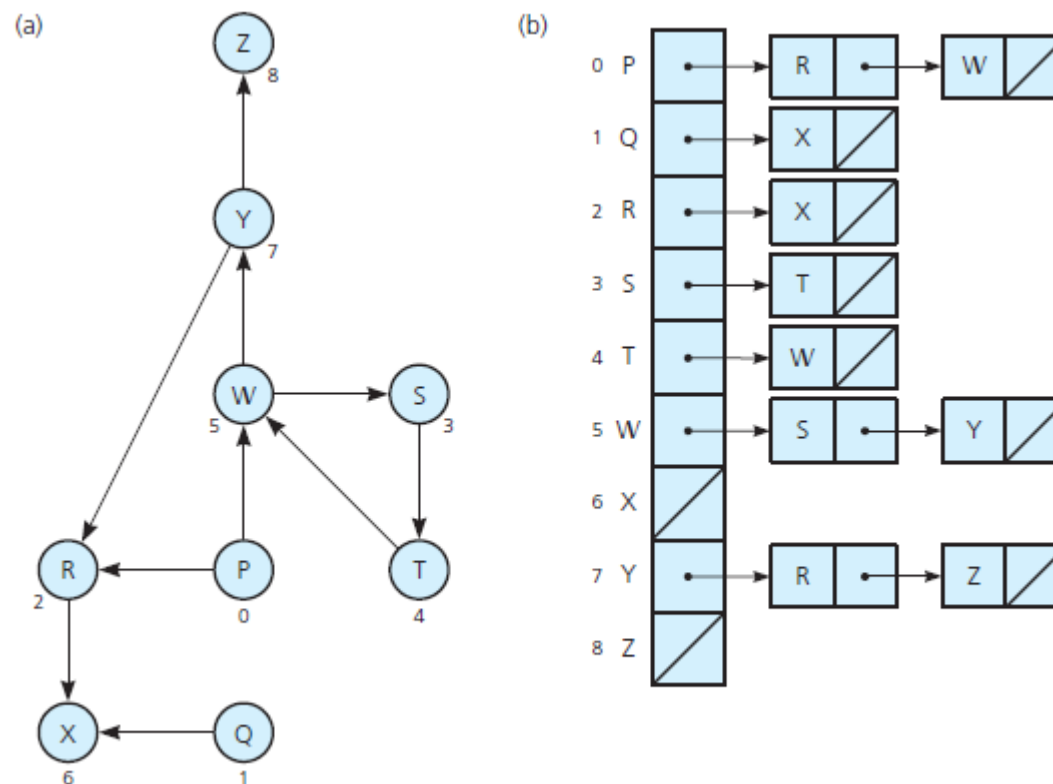
(b)

		0	1	2	3
		A	B	C	D
0	A	∞	8	∞	6
1	B	8	∞	9	∞
2	C	∞	9	∞	∞
3	D	6	∞	∞	∞

Adjacency List

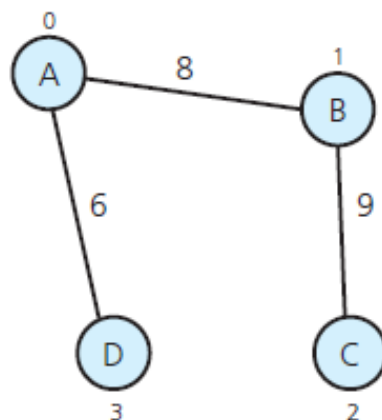
- A graph with n vertices has n linked chains.
- The i^{th} linked chain has a node for vertex j if and only if having edge (i,j) .

Adjacency List

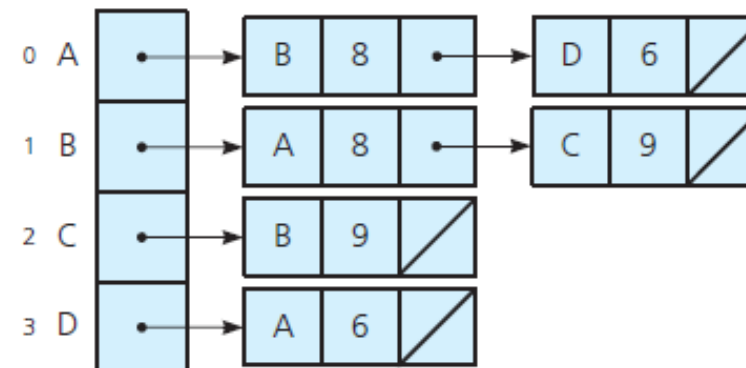


Adjacency List

(a)



(b)



Graph Traversal

Graph Traversal

- Visits (all) the vertices that it can reach.
- **Connected component** is subset of vertices visited during traversal that begins at given vertex.

Depth-First Search

- Goes as far as possible from a vertex before backing up.

DFS (*v*: vertex)

```
{  
    Mark v as visited  
    for (each unvisited vertex u adjacent to v)  
        DFS (u)  
}
```

Depth-First Search

DFS (*v*: vertex)

```
s = new empty stack
```

```
s.push(v)
```

```
Mark v as visited
```

```
while (s is not empty) {
```

```
    if (no unvisited vertices are adjacent to the vertex on  
the top of the stack)
```

```
        s.pop()
```

```
    else {
```

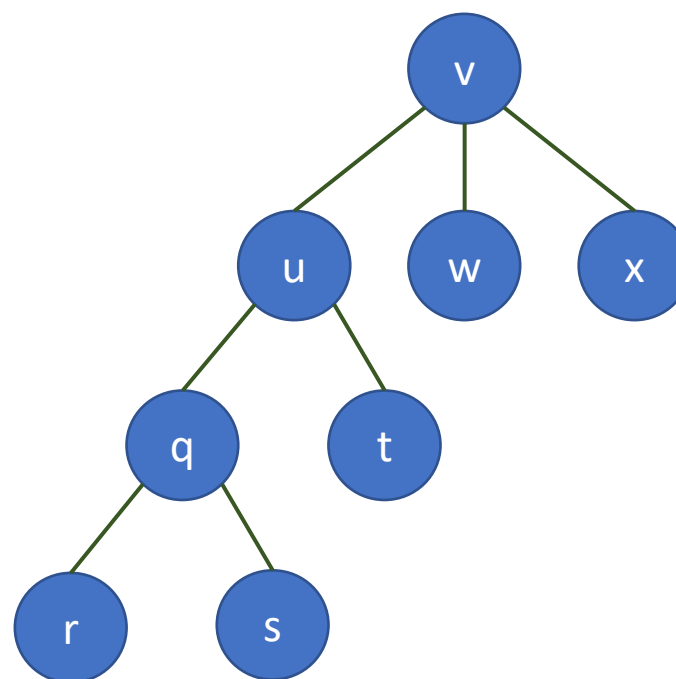
```
        s.push(u)
```

```
        Marked u as visited
```

```
    }
```

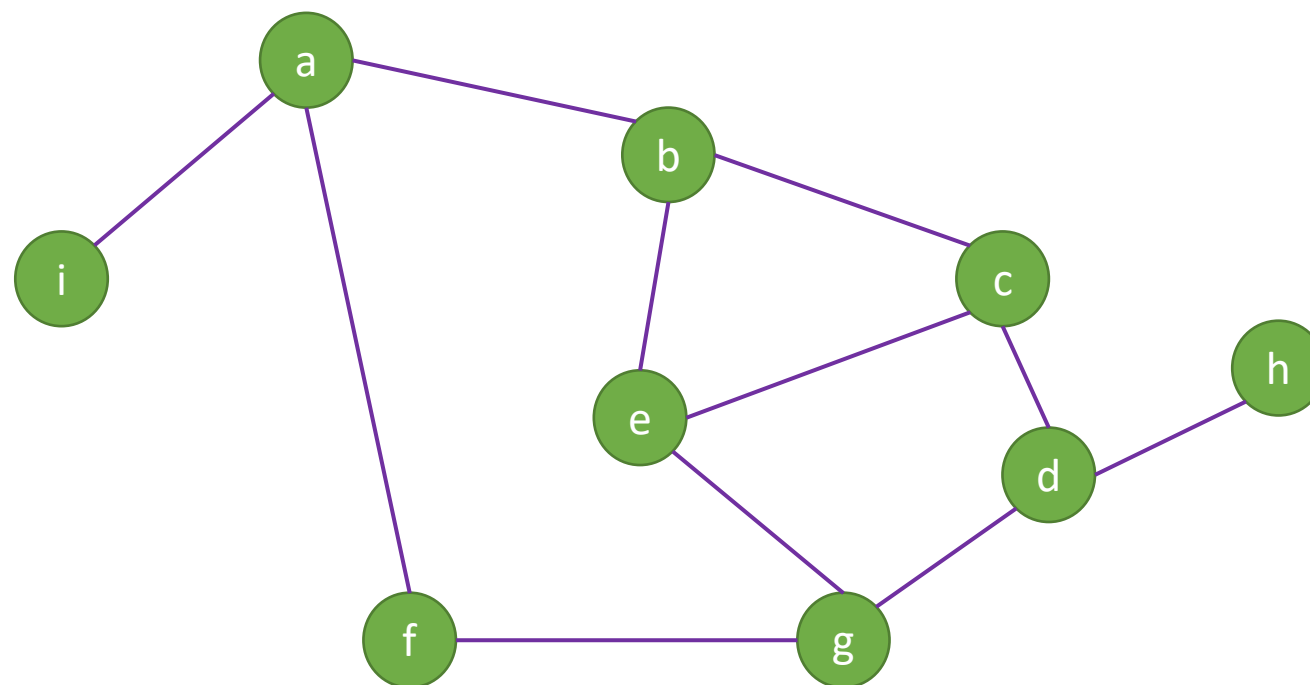
```
}
```


Depth-First Search



v - u - q - r - s - t - w - x

Depth-First Search



DFS starts at **a**:

DFS starts at **e**:

Breadth-First Search

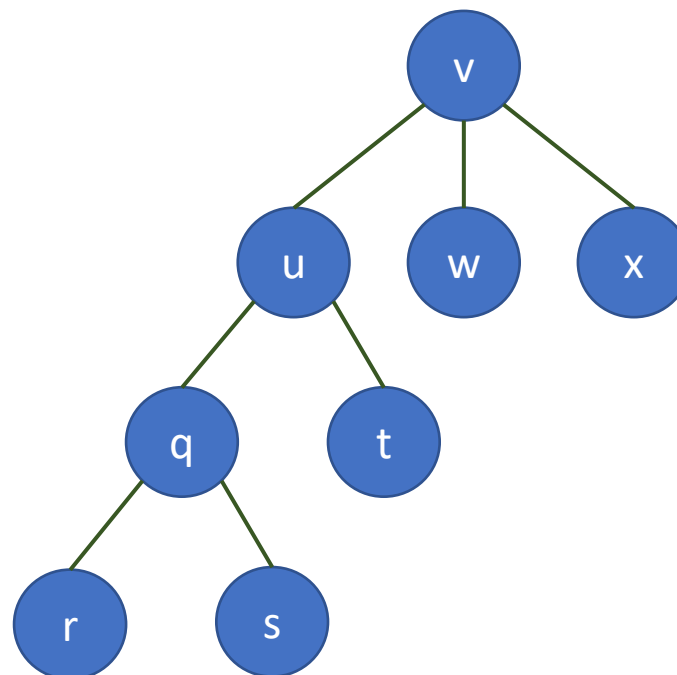
- Visits all vertices adjacent to vertex before going forward.
- Breadth-first search uses a **queue**.

Breadth-First Search

BFS (v: Vertex)

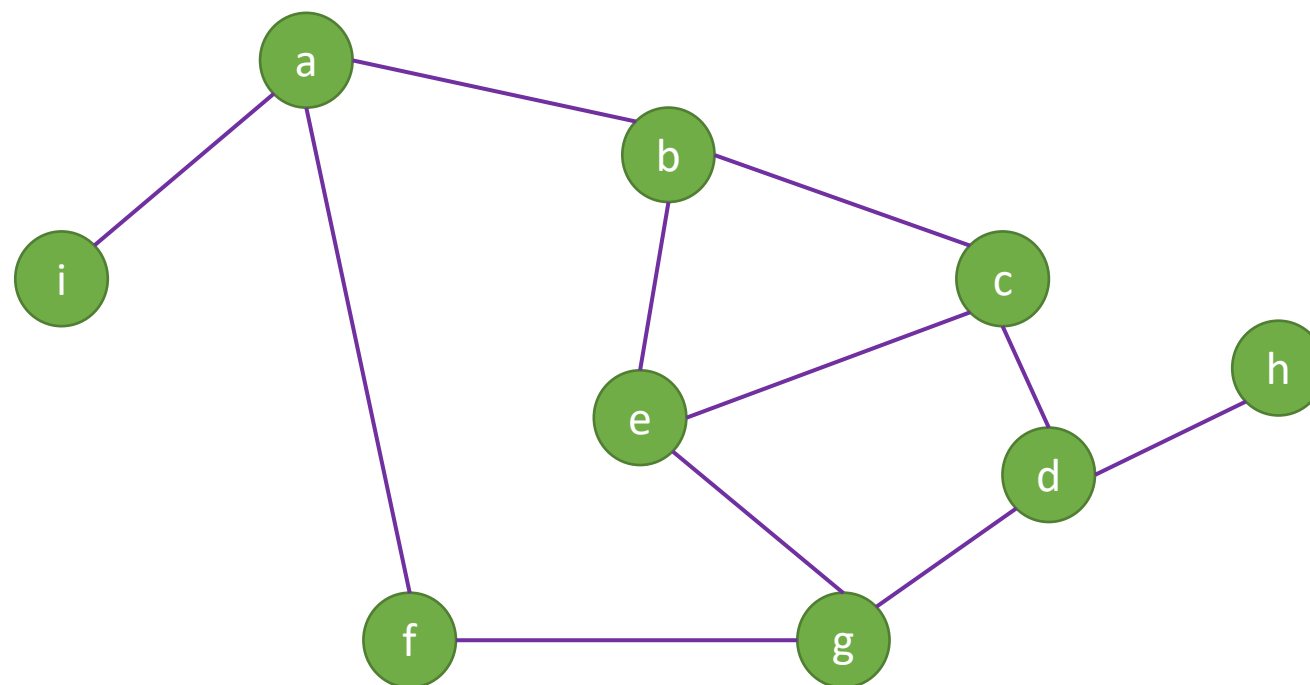
```
q = a new empty queue
q.enqueue(v)
Mark v as visited
while (q is not empty) {
    w = q.dequeue()
    for (each unvisited vertex u adjacent to w) {
        Mark u as visited
        q.enqueue(u)
    }
}
```

Breadth-First Search



v - u - w - x - q - t - r - s

Breadth-First Search



BFS starts at **a**:

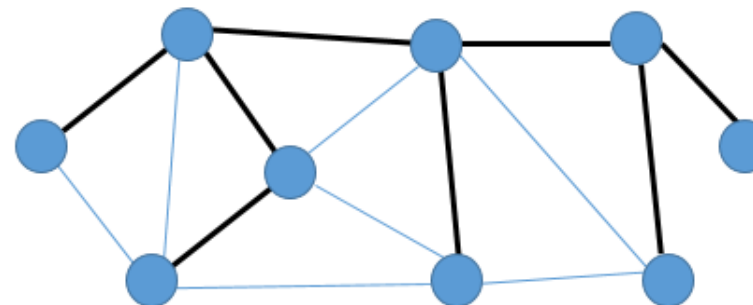
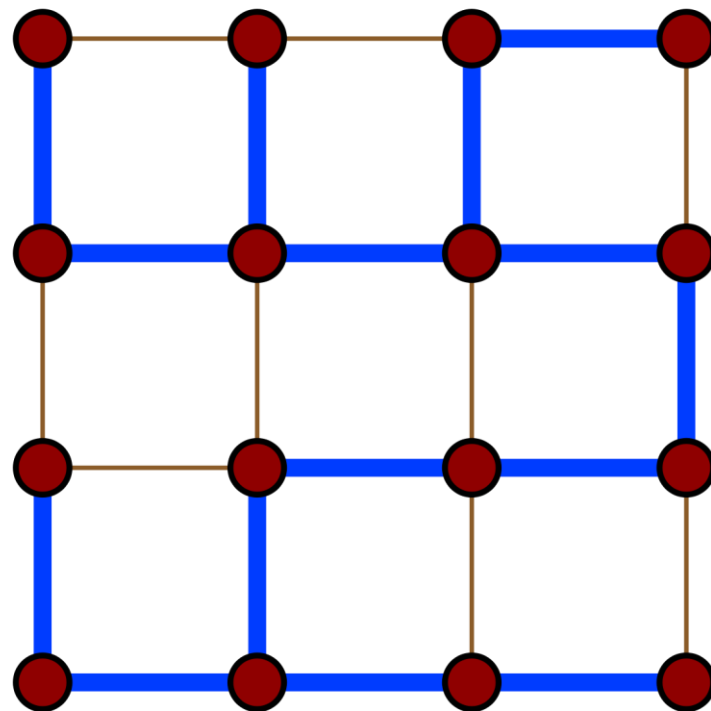
BFS starts at **e**:

Minimum Spanning Tree

Spanning Tree

- A spanning tree
 - is a **subgraph** of undirected graph G
 - has **all** the vertices covered with **minimum** possible number of edges.
- does not have cycles
- cannot be disconnected.

Spanning Tree

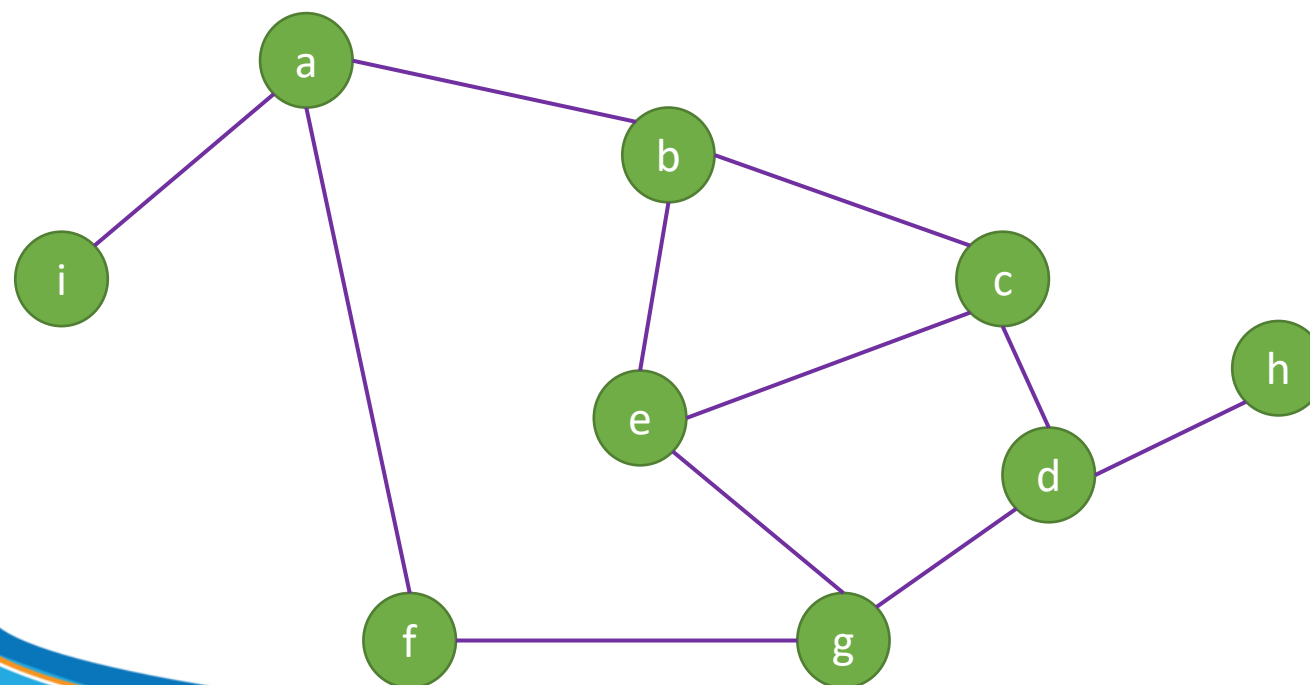


Spanning Tree

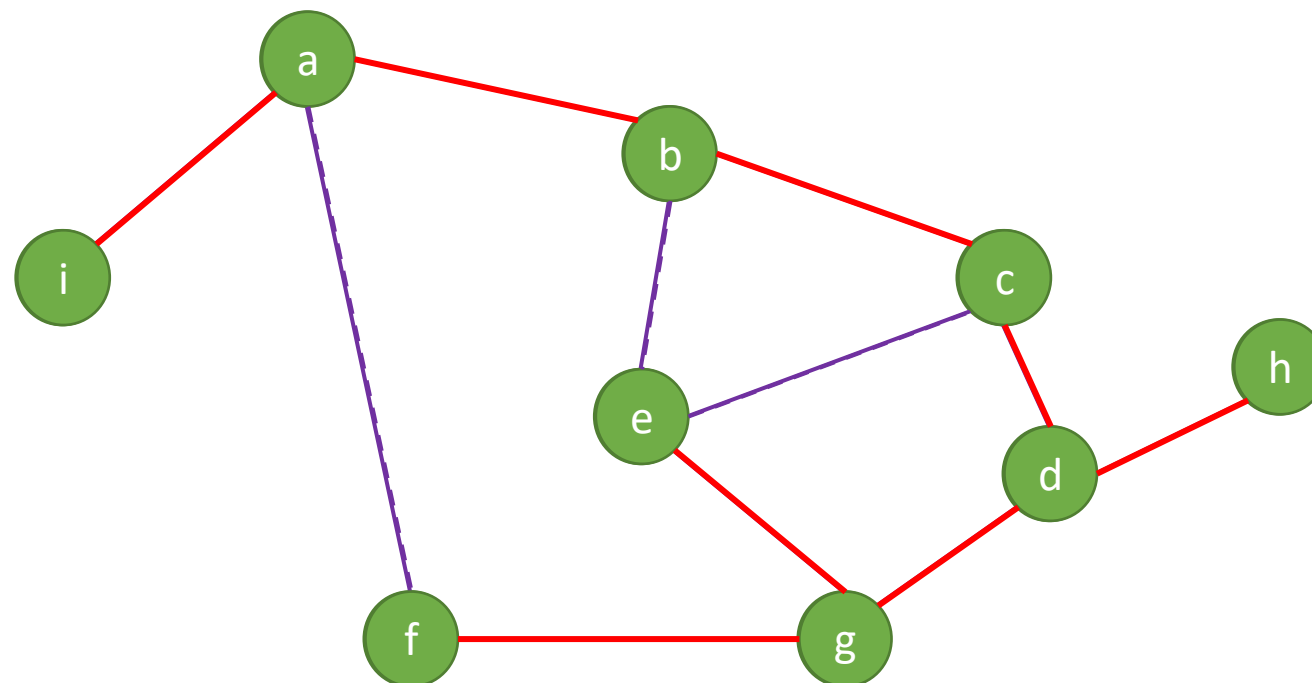
- A connected graph G can have **more than one** spanning tree.
- All possible spanning trees of graph G , **have the same** number of **edges** and **vertices**.
- The spanning tree **does not have any cycle** (loops).
- The spanning tree is **minimally connected**.
- The spanning tree is **maximally acyclic**.

Spanning Tree

- Depth-first-search spanning tree
- Breadth-first-search spanning tree

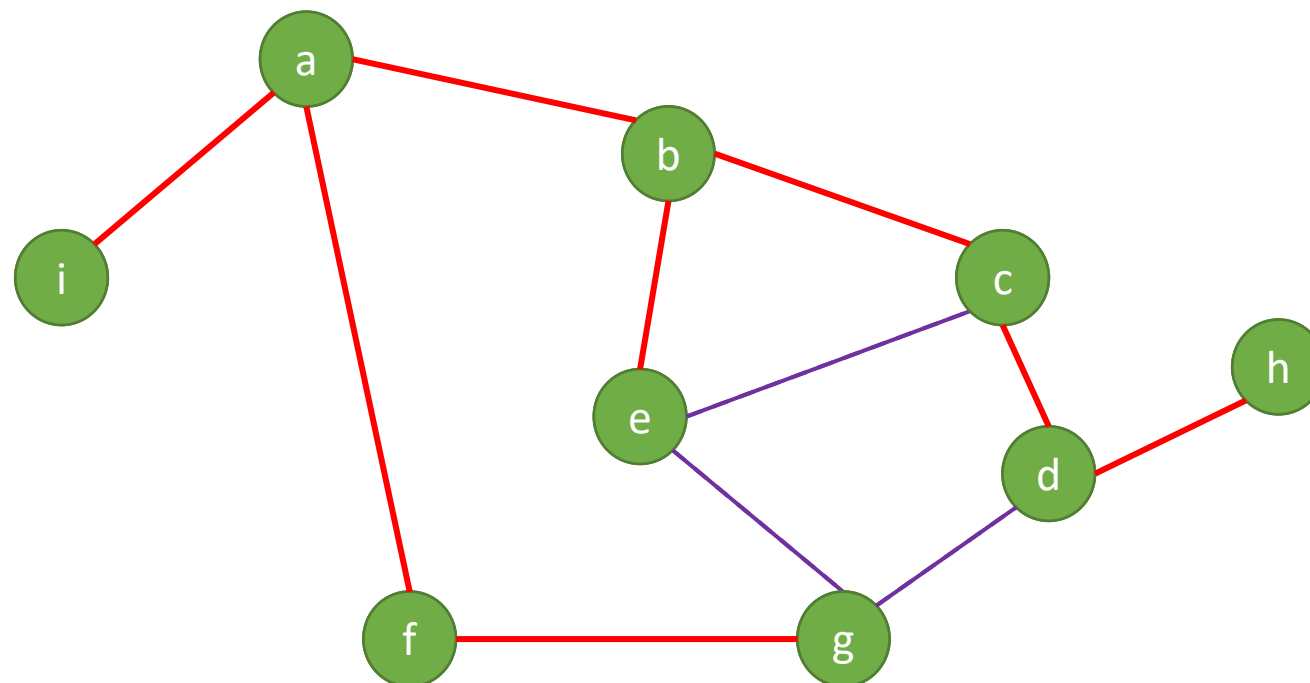


Spanning Tree



DFS spanning tree

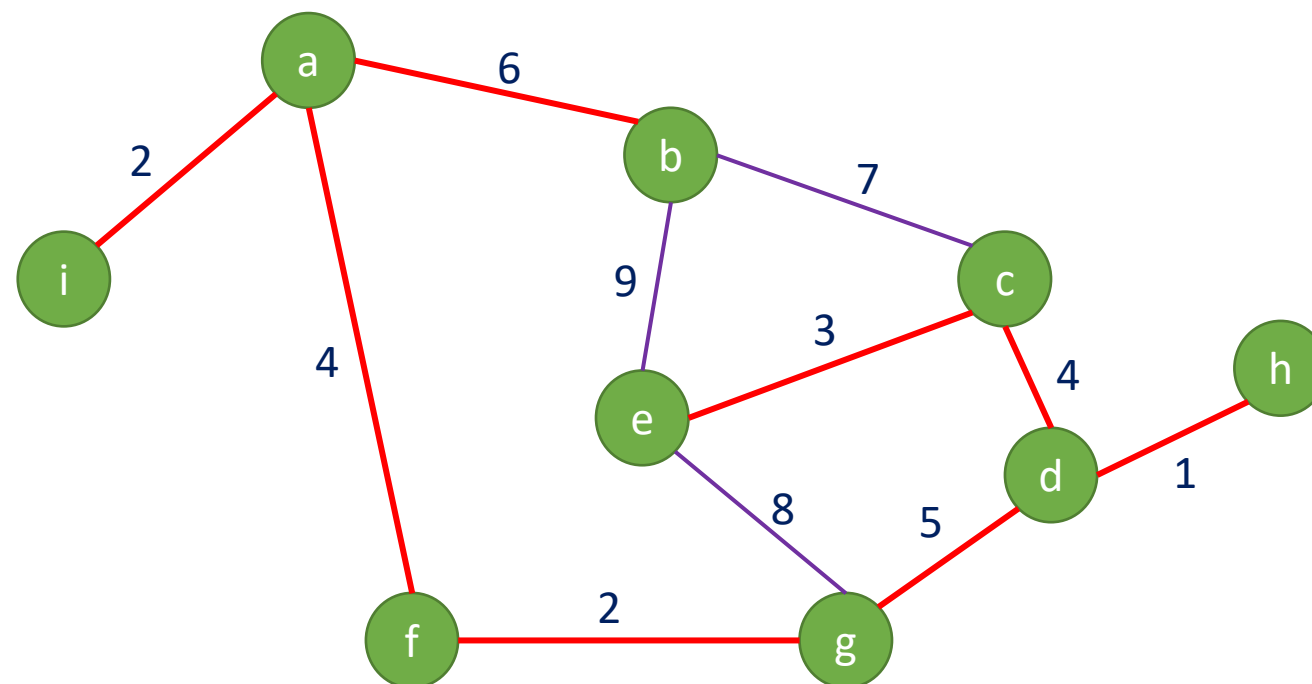
Spanning Tree



BFS spanning tree

Minimum Spanning Tree

- A minimum spanning tree is a spanning tree that has **minimum weight** than all other spanning trees of the same graph.



Prim's Minimum Spanning Tree

- Begins with any vertex.
- Initially, the tree T contains only the starting vertex.
- At each stage,
 - Select the least cost edge $e(v, u)$ with v in T and u not in T .
 - Add u and e to T

Prim's Minimum Spanning Tree

primAlgorithm(v: Vertex)

Mark **v** as visited and include it in the minimum spanning tree

while (there are unvisited vertices)

{

Find the least-cost edge **e(v, u)** from a visited vertex **v** to some unvisited vertex **u**

Mark **u** as visited

Add the vertex **u** and the edge **e(v, u)** to the minimum spanning tree

}

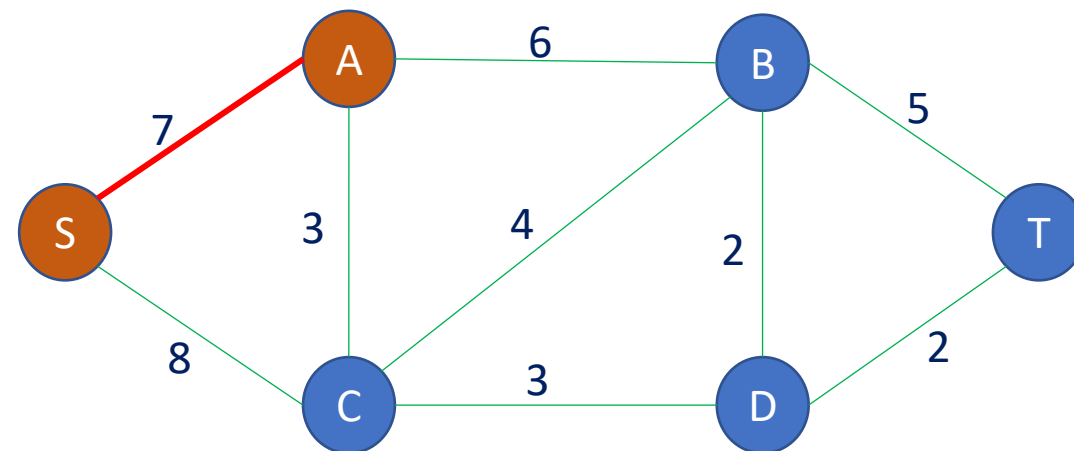
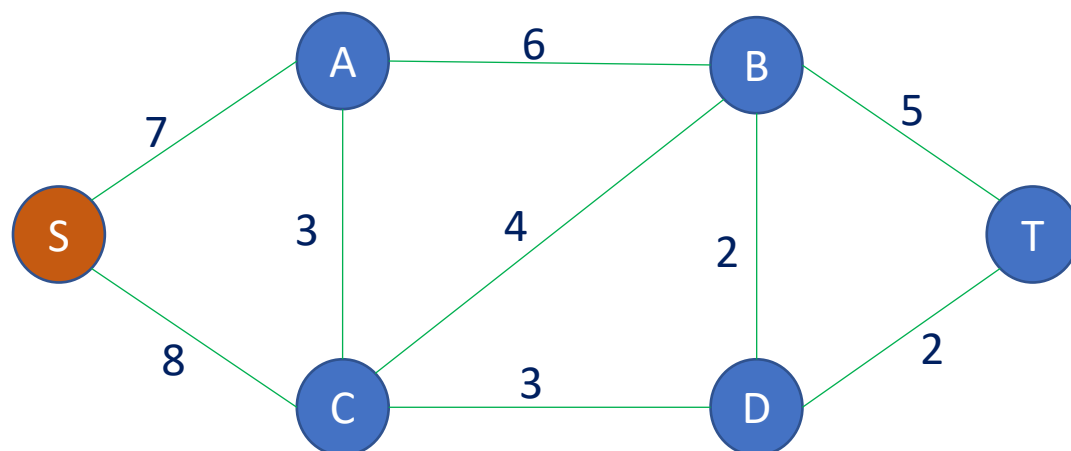
Prim's Minimum Spanning Tree

```

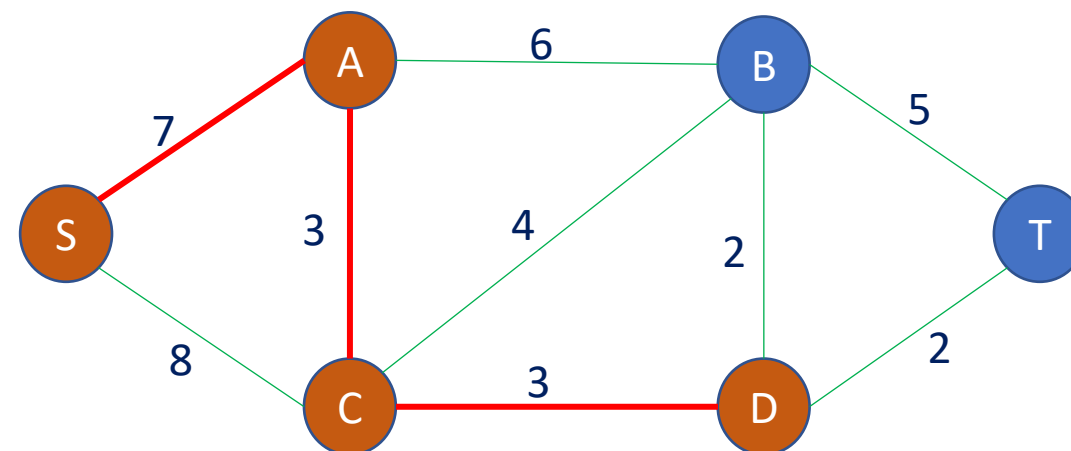
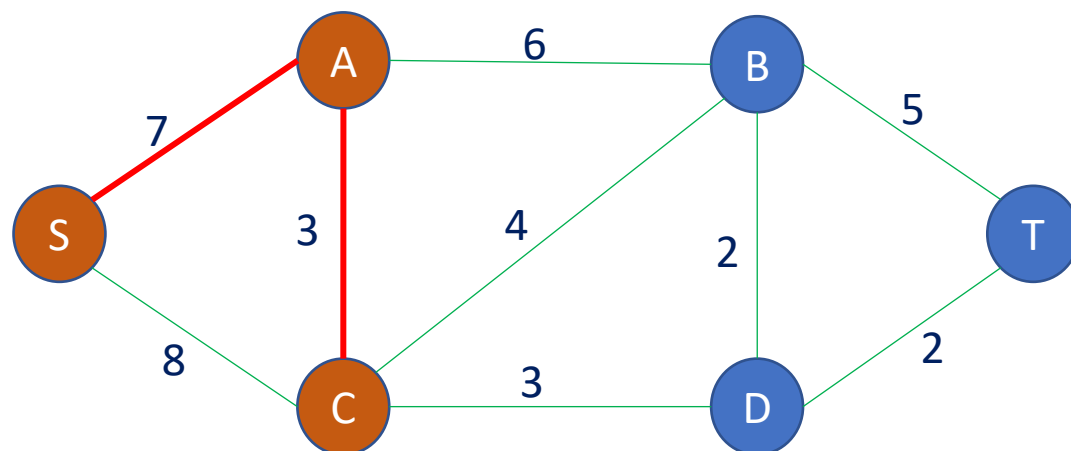
PrimSpanningTree (matrix[N][N], source)
{
    for v = 0 to N-1 {
        length[v] = matrix[source][v]
        parent[v] = source }
    Mark source //Add source to the spanning tree
    for step = 1 to N-1 {
        Find the vertex v such that length[v] is smallest
        and v is not in spanning tree
        Mark v
        for all vertices u not in vertexSet
            if (length[u] > matrix[v][u]) {
                length[u] = matrix[v][u]
                parent[u] = v }
    }
}

```

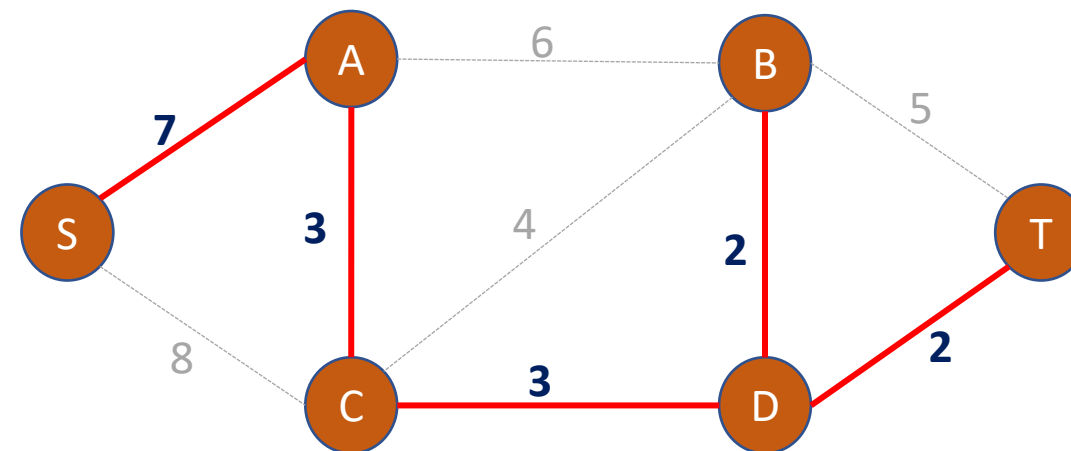
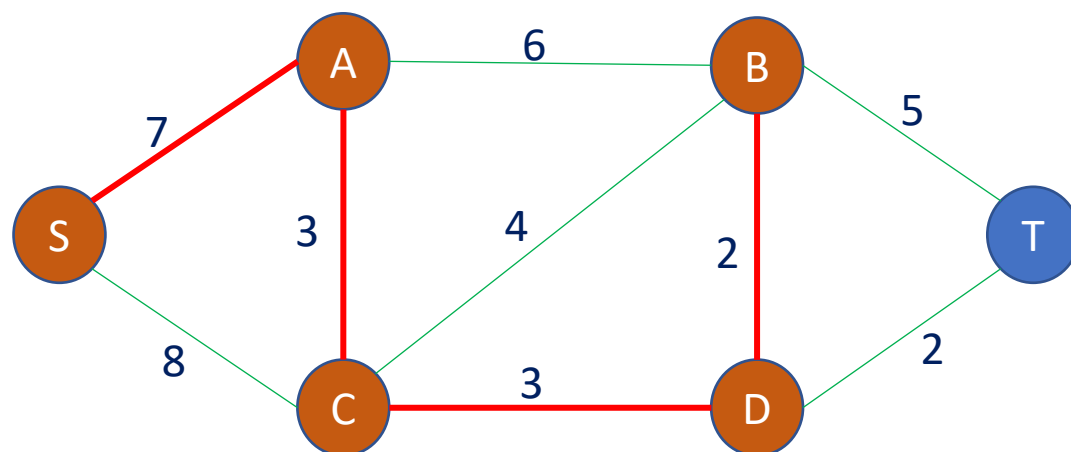
Prim's Minimum Spanning Tree



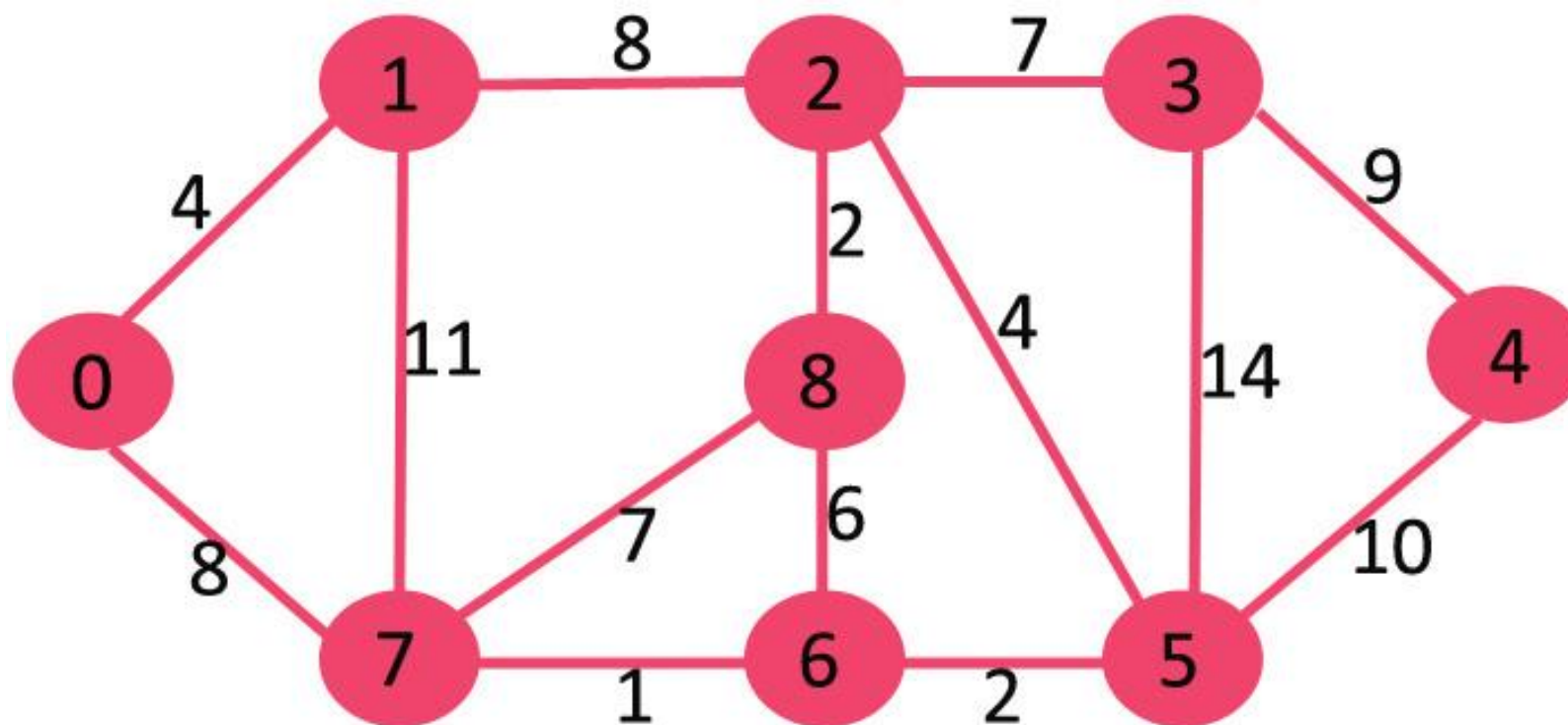
Prim's Minimum Spanning Tree



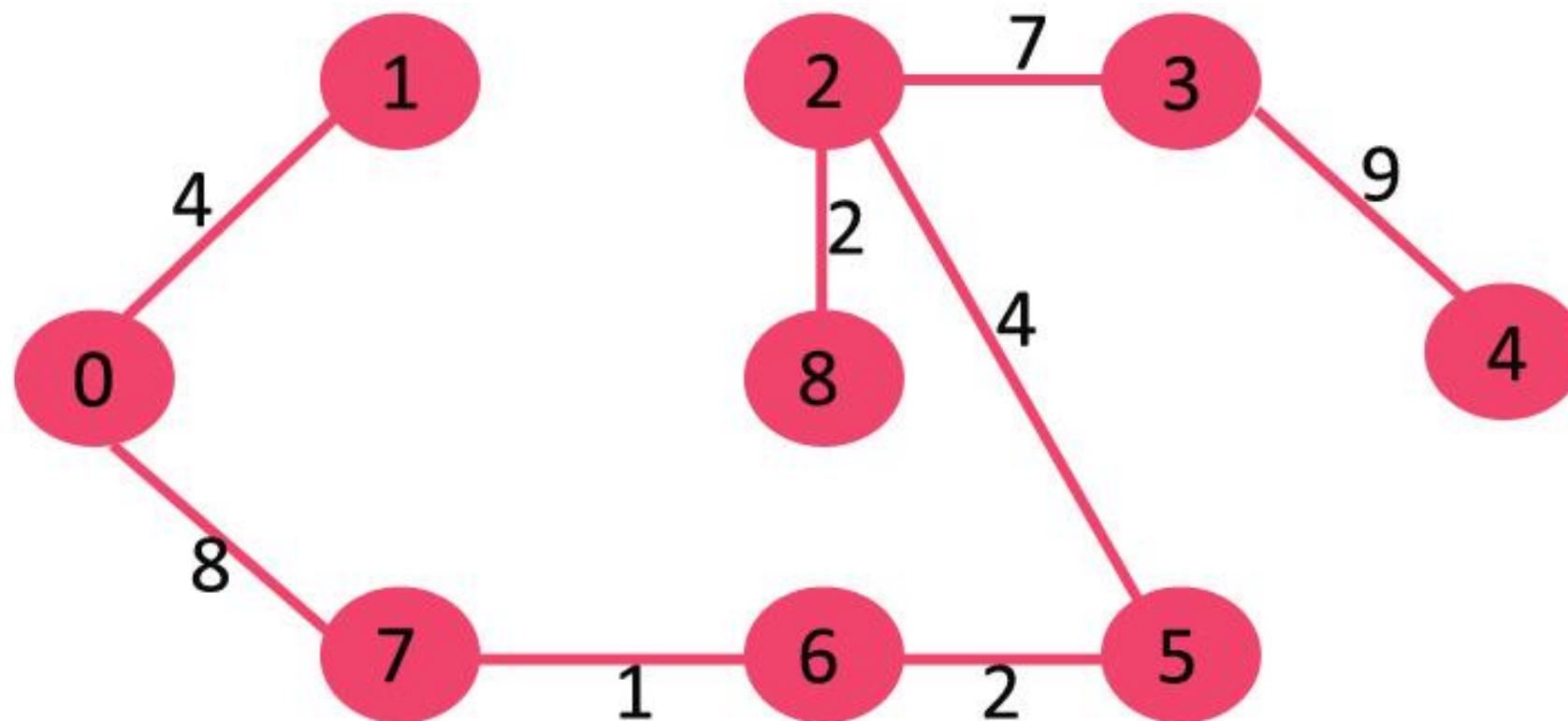
Prim's Minimum Spanning Tree



Example



Example



Shortest Path

Dijkstra's Shortest Path Algorithm

- Given a graph and a **source vertex** in the graph, find shortest paths from source to **all vertices** in the given graph.
- **Dijkstra's** algorithm is very **similar** to **Prim's** algorithm for minimum spanning tree.
- This algorithm is applicable to graphs with **non-negative weights** only.

Dijkstra's Shortest Path Algorithm

shortestPath (`matrix[N][N]`, `source`, `length[]`)

Input:

matrix[N][N]: adjacency matrix of Graph G with N vertices

source: the *source* vertex

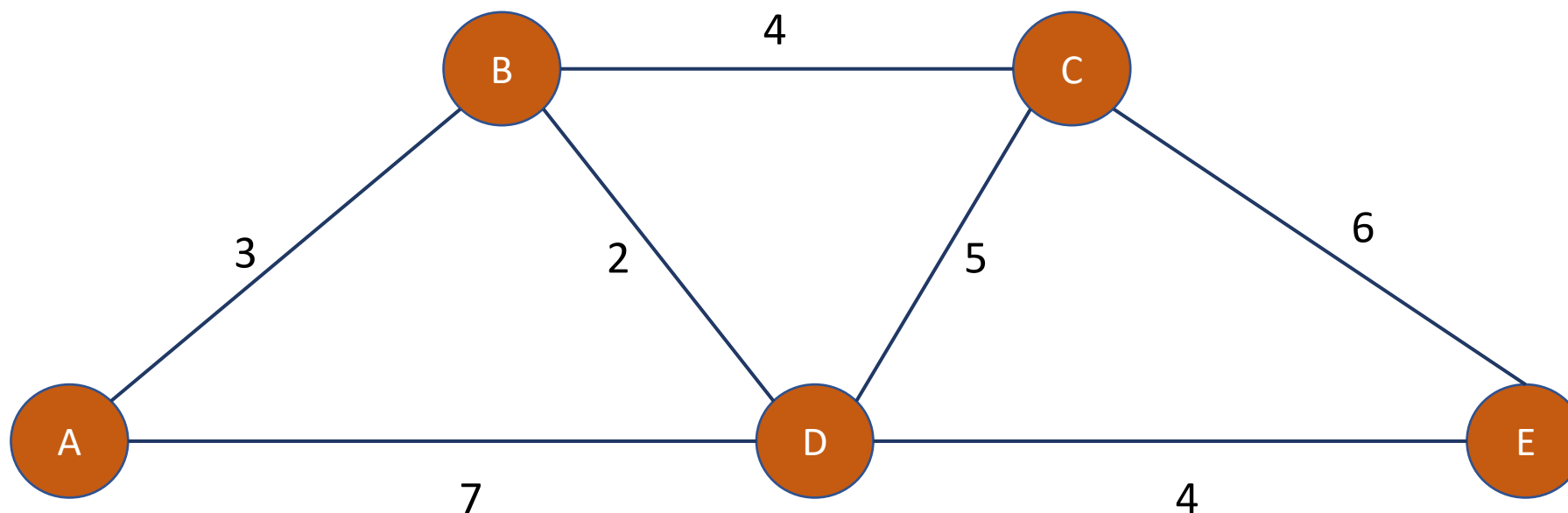
Output:

length[]): the length of the shortest path from *source* to all *vertices* in G .

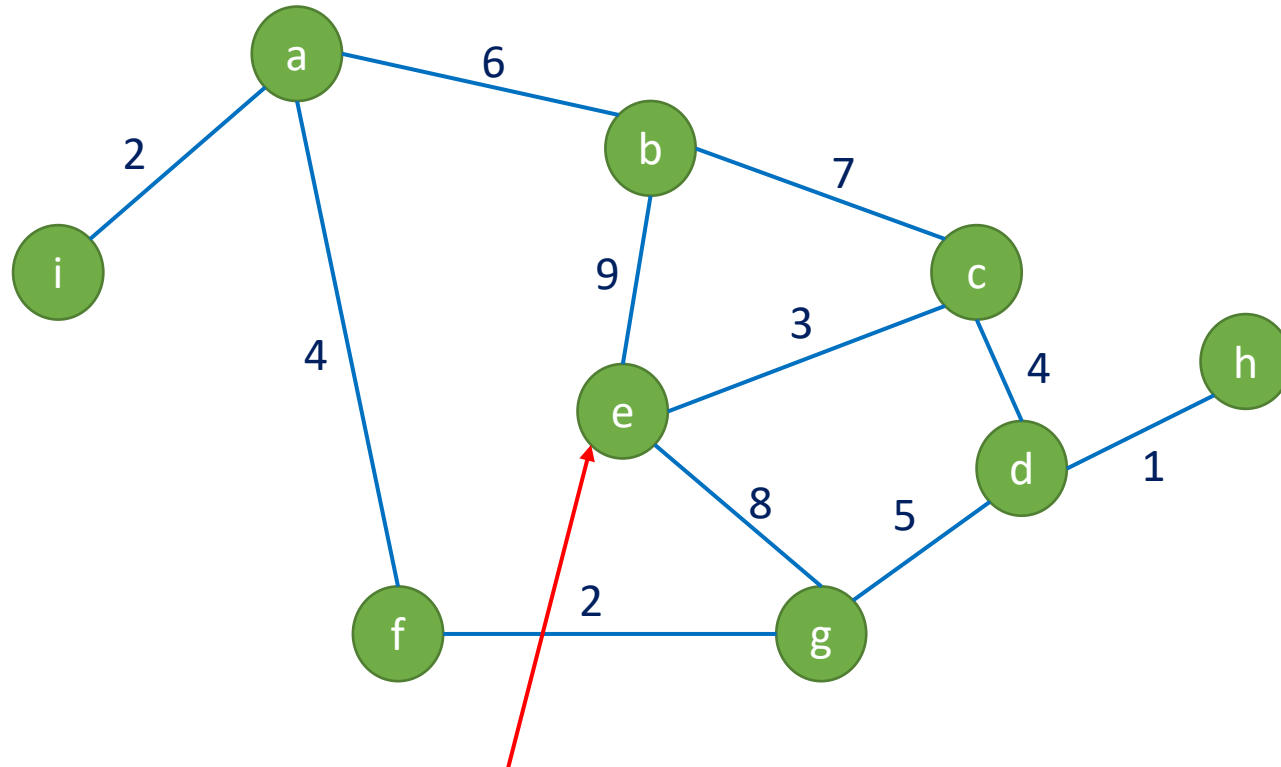
Dijkstra's Shortest Path Algorithm

```
shortestPath (matrix[N][N], source, length[])  
{  
    for v = 0 to N-1  
        length[v] = matrix[source][v]  
    length[source] = 0 //why?  
    for step = 1 to N {  
        Find the vertex v such that length[v] is smallest  
        and v is not in vertexSet  
        Add v to vertexSet  
        for all vertices u not in vertexSet  
            if (length[u] > length[v] + matrix[v][u]) {  
                length[u] = length[v] + matrix[v][u]  
                parent[u] = v }  
    }  
}
```

Example



Example



source = e
step = 0

Initialize:

```
for v = 0 to N-1  
    length[v] = matrix[source][v]  
length[source] = 0 //why?
```

$V = \{\}$

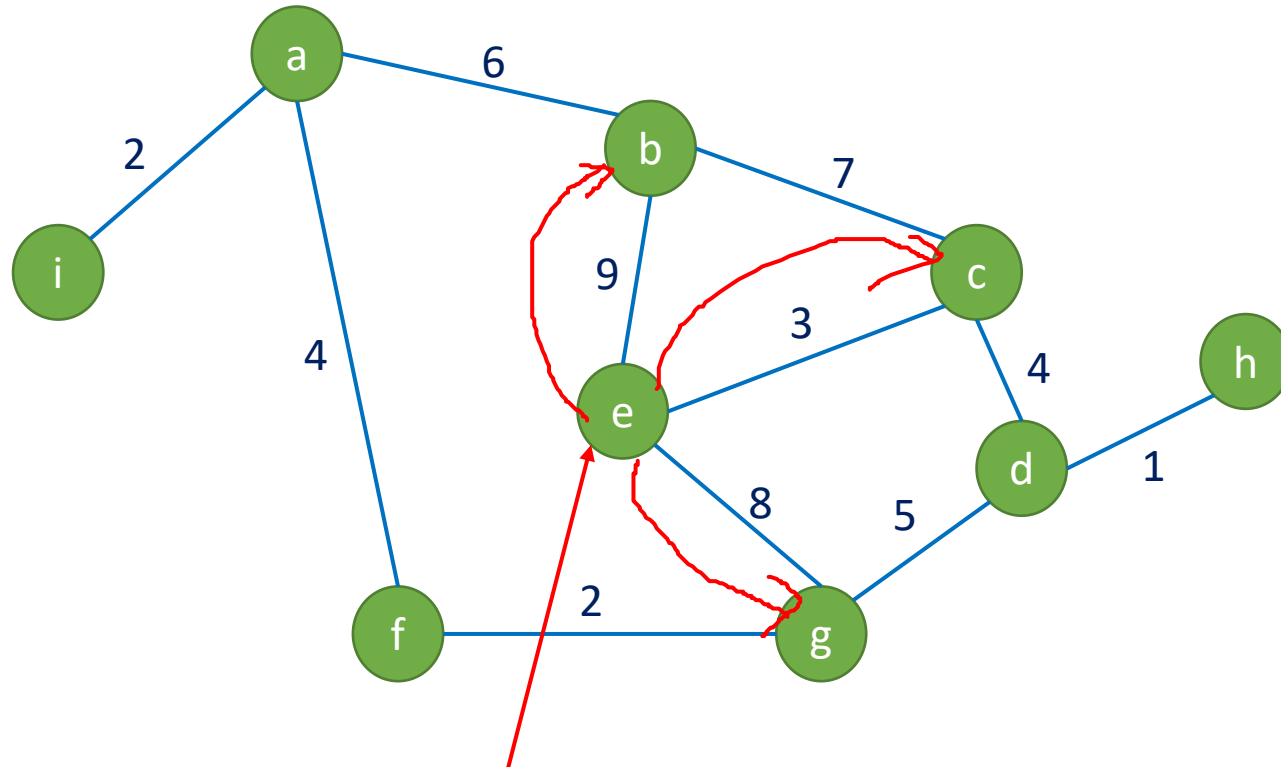
$\text{non-}V = \{a, b, c, d, e, f, g, h, i\}$

	a	b	c	d	e	f	g	h	i
Index	0	1	2	3	4	5	6	7	8
Length[i]	∞	9	3	∞	0	∞	8	∞	∞
Parent[i]		e	e		e		e		

Example



fit@hcmus



source = e
step = 1

Loop:

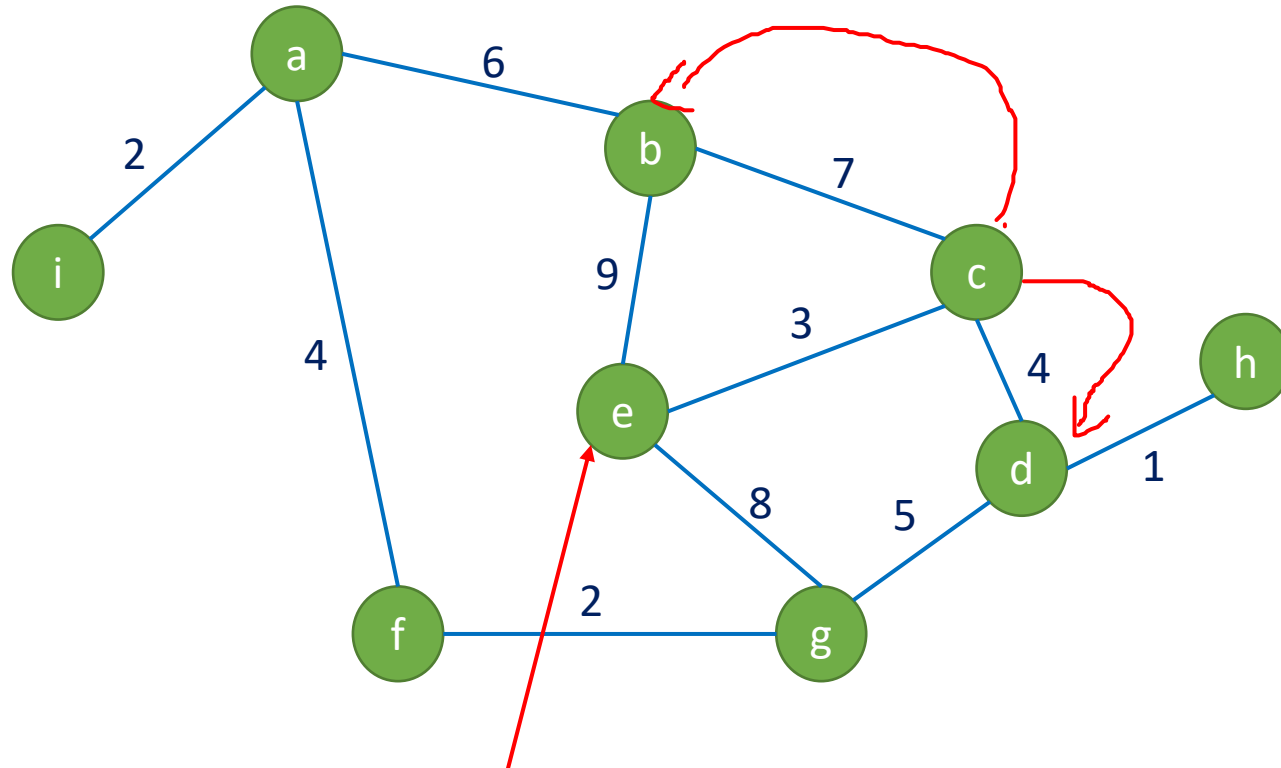
```
for step = 1 to N {
    Find vertex v: length[v] smallest, v not in V
    Add v to V
    for all vertices u not in V
        if (length[u] > length[v] + matrix[v][u]) {
            length[u] = length[v] + matrix[v][u]
            parent[u] = v }
}
```

$V = \{e\}$

$\text{non-}V = \{a, b, c, d, f, g, h, i\}$

	a	b	c	d	e	f	g	h	i
Index	0	1	2	3	4	5	6	7	8
Length[i]	∞	9	3	∞	0	∞	8	∞	∞
Parent[i]		e	e		e		e		

Example



source = e
step = 2

Loop:

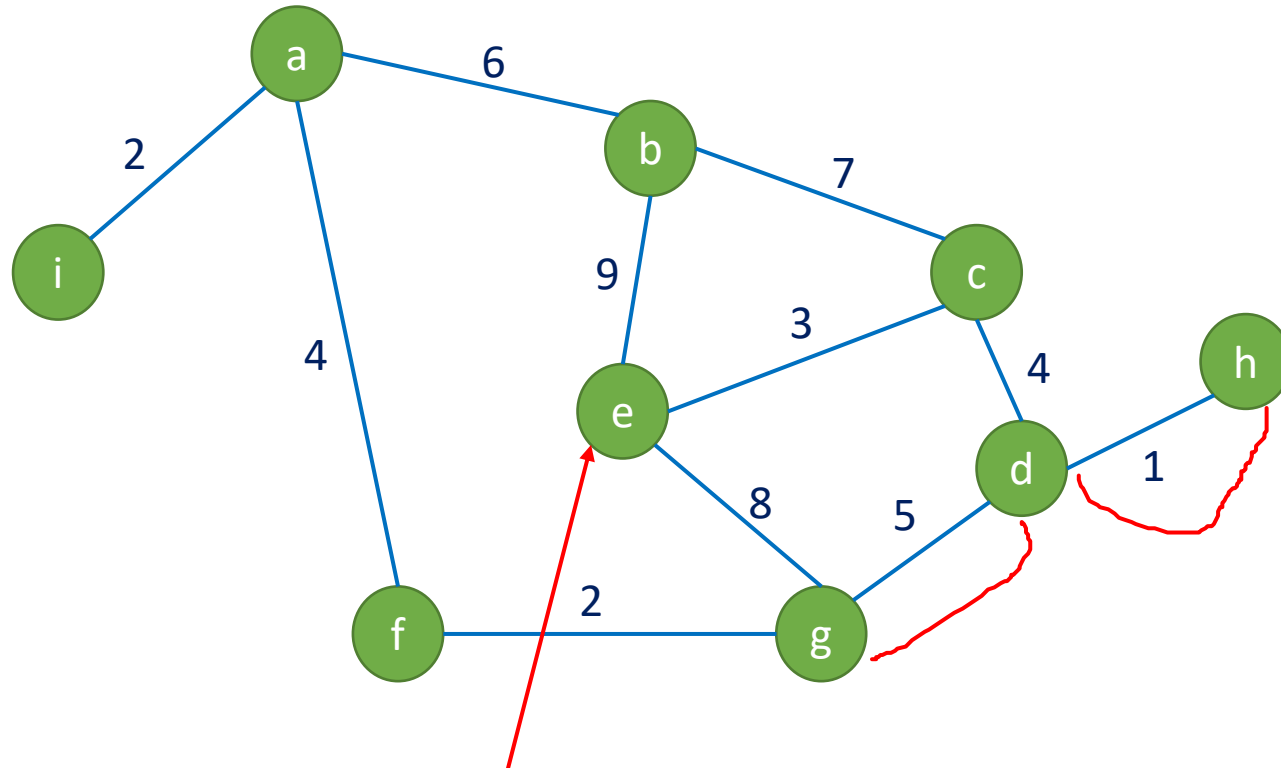
```
for step = 1 to N {
    Find vertex v: length[v] smallest, v not in V
    Add v to V
    for all vertices u not in V
        if (length[u] > length[v] + matrix[v][u]) {
            length[u] = length[v] + matrix[v][u]
            parent[u] = v }
}
```

V = {e, c}

non-V = {a, b, d, f, g, h, i}

	a	b	c	d	e	f	g	h	i
Index	0	1	2	3	4	5	6	7	8
Length[i]	∞	9	3	7	0	∞	8	∞	∞
Parent[i]		e	e	c	e		e		

Example



source = e
step = 3

Loop:

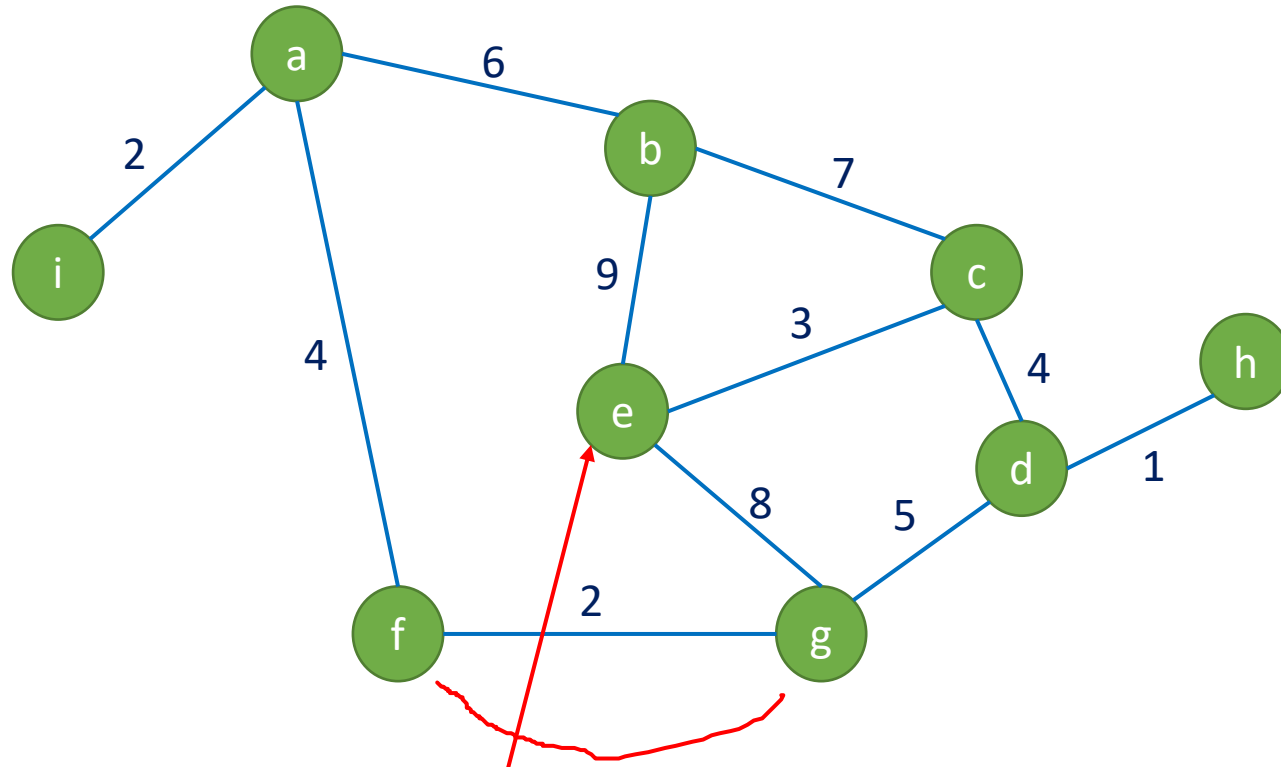
```
for step = 1 to N {
    Find vertex v: length[v] smallest, v not in V
    Add v to V
    for all vertices u not in V
        if (length[u] > length[v] + matrix[v][u]) {
            length[u] = length[v] + matrix[v][u]
            parent[u] = v }
}
```

$V = \{e, c, d\}$

$\text{non-}V = \{a, b, f, g, h, i\}$

	a	b	c	d	e	f	g	h	i
Index	0	1	2	3	4	5	6	7	8
Length[i]	∞	9	3	7	0	∞	8	8	∞
Parent[i]		e	e	c	e		e	d	

Example



source = e
step = 4

Loop:

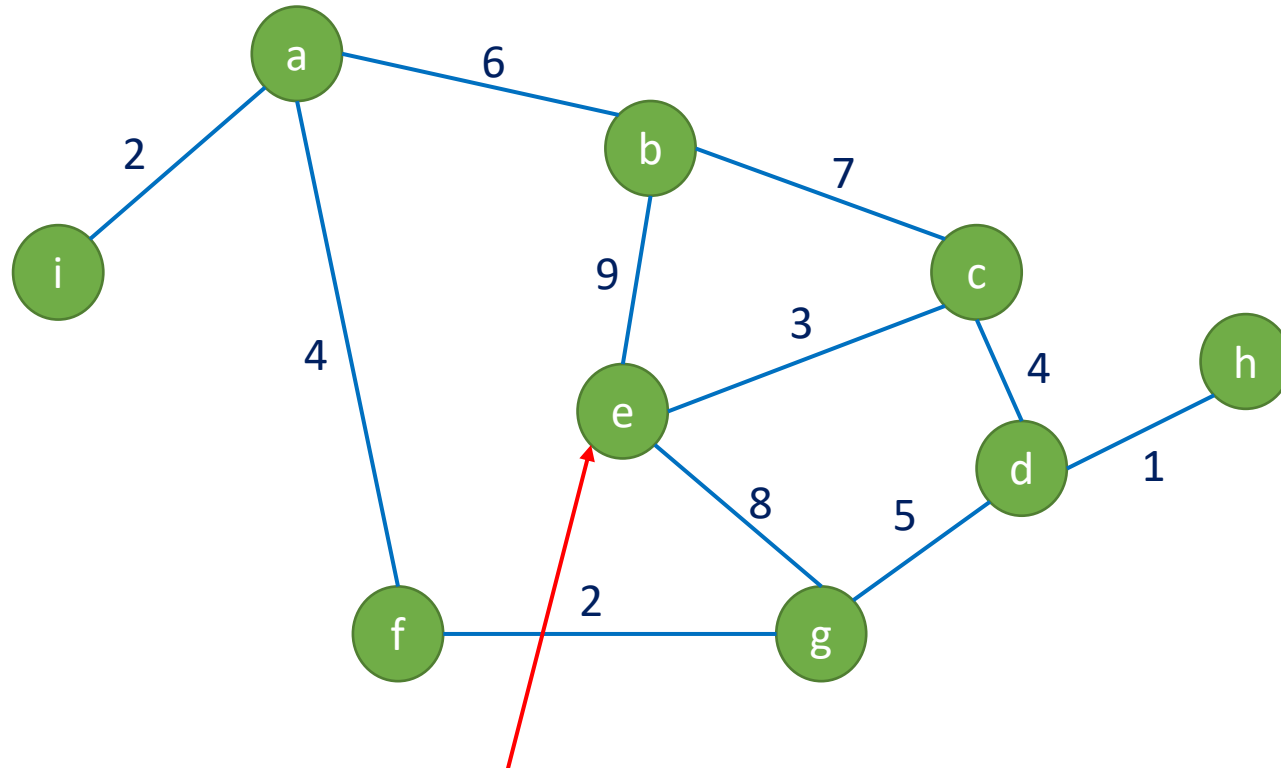
```
for step = 1 to N {
    Find vertex v: length[v] smallest, v not in V
    Add v to V
    for all vertices u not in V
        if (length[u] > length[v] + matrix[v][u]) {
            length[u] = length[v] + matrix[v][u]
            parent[u] = v }
}
```

$V = \{e, c, d, g\}$

$\text{non-}V = \{a, b, f, h, i\}$

	a	b	c	d	e	f	g	h	i
Index	0	1	2	3	4	5	6	7	8
Length[i]	∞	9	3	7	0	10	8	8	∞
Parent[i]		e	e	c	e	g	e	d	

Example



source = e
step = 5

Loop:

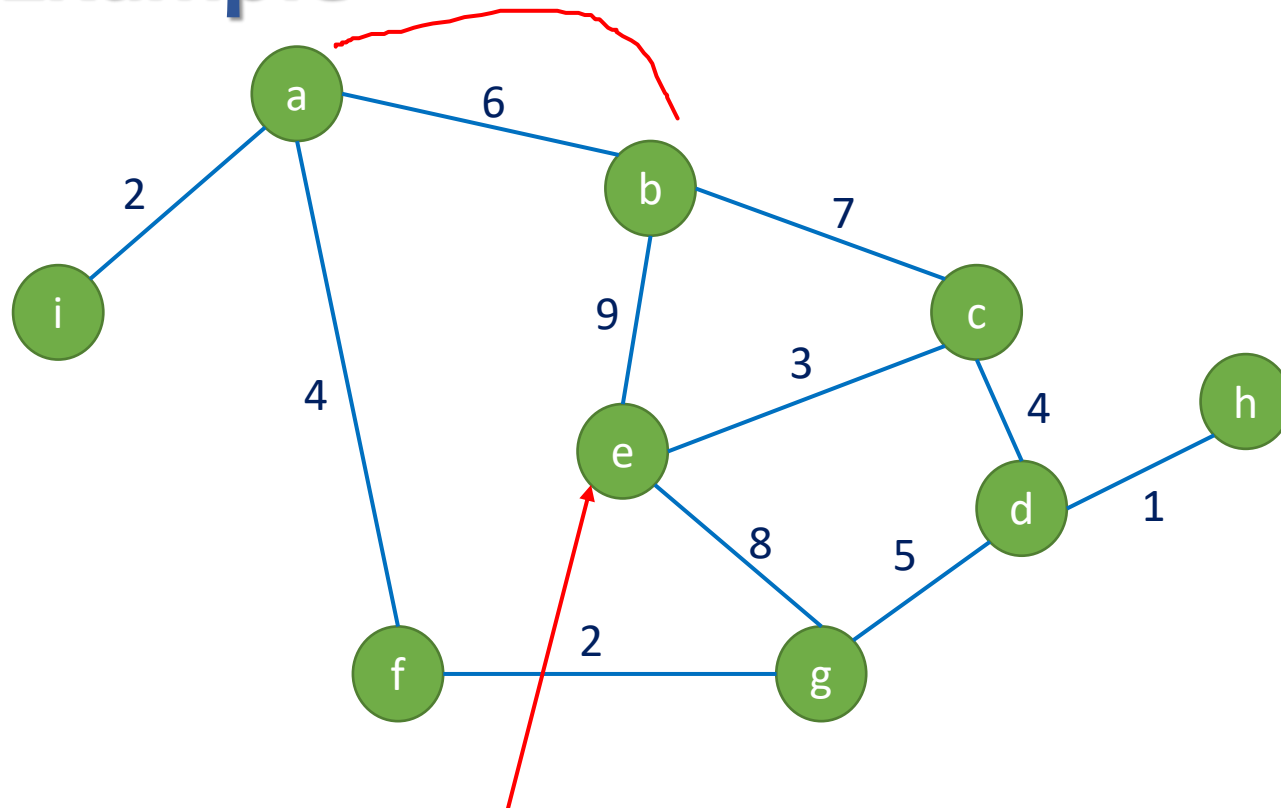
```
for step = 1 to N {
    Find vertex v: length[v] smallest, v not in V
    Add v to V
    for all vertices u not in V
        if (length[u] > length[v] + matrix[v][u]) {
            length[u] = length[v] + matrix[v][u]
            parent[u] = v }
}
```

$V = \{e, c, d, g, h\}$

$\text{non-}V = \{a, b, f, i\}$

	a	b	c	d	e	f	g	h	i
Index	0	1	2	3	4	5	6	7	8
Length[i]	∞	9	3	7	0	10	8	8	∞
Parent[i]		e	e	c	e	g	e	d	

Example



source = e
step = 6

Loop:

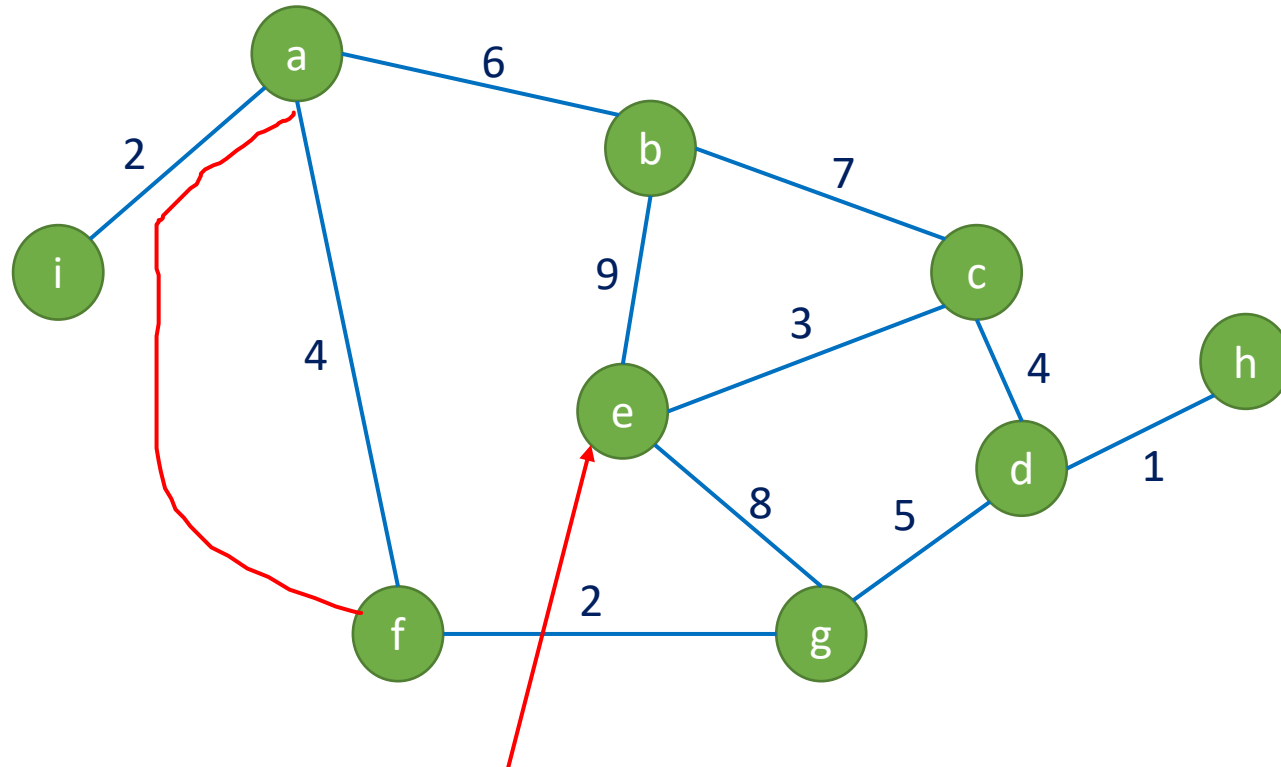
```
for step = 1 to N {
    Find vertex v: length[v] smallest, v not in V
    Add v to V
    for all vertices u not in V
        if (length[u] > length[v] + matrix[v][u]) {
            length[u] = length[v] + matrix[v][u]
            parent[u] = v }
}
```

$V = \{e, c, d, g, h, b\}$

$\text{non-}V = \{a, f, i\}$

	a	b	c	d	e	f	g	h	i
Index	0	1	2	3	4	5	6	7	8
Length[i]	15	9	3	7	0	10	8	8	∞
Parent[i]	b	e	e	c	e	g	e	d	

Example



source = e
step = 7

Loop:

```
for step = 1 to N {
    Find vertex v: length[v] smallest, v not in V
    Add v to V
    for all vertices u not in V
        if (length[u] > length[v] + matrix[v][u]) {
            length[u] = length[v] + matrix[v][u]
            parent[u] = v }
}
```

$V = \{e, c, d, g, h, b, f\}$

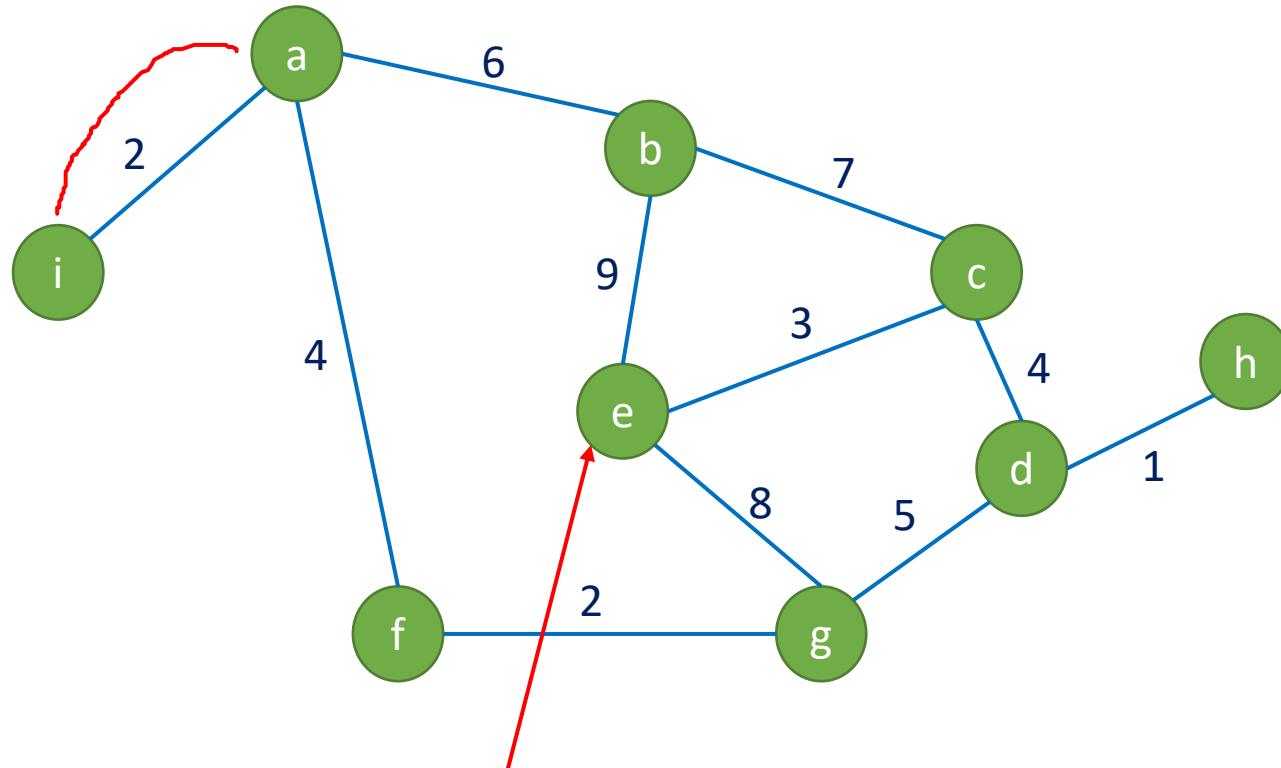
$\text{non-}V = \{a, i\}$

	a	b	c	d	e	f	g	h	i
Index	0	1	2	3	4	5	6	7	8
Length[i]	14	9	3	7	0	10	8	8	∞
Parent[i]	f	e	e	c	e	g	e	d	

Example



fit@hcmus



source = e
step = 8

Loop:

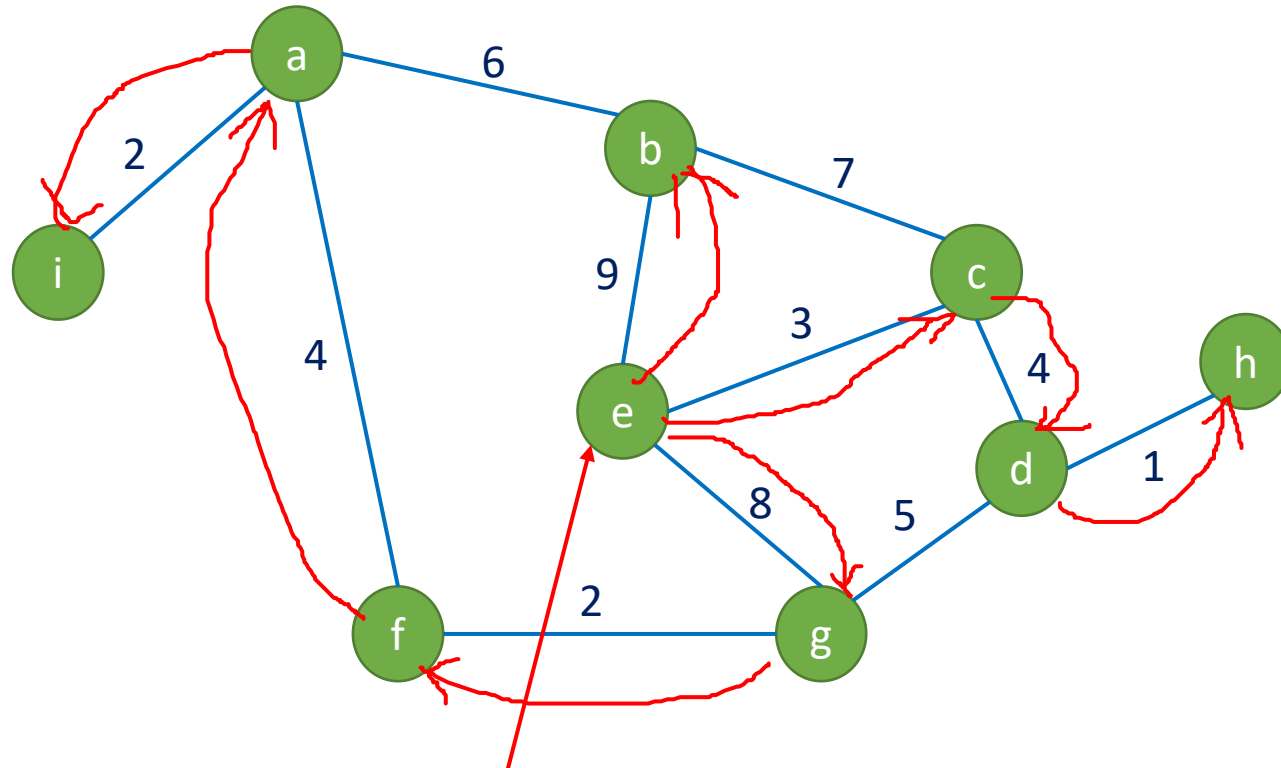
```
for step = 1 to N {
    Find vertex v: length[v] smallest, v not in V
    Add v to V
    for all vertices u not in V
        if (length[u] > length[v] + matrix[v][u]) {
            length[u] = length[v] + matrix[v][u]
            parent[u] = v }
}
```

$V = \{e, c, d, g, h, b, f, a\}$

$\text{non-}V = \{i\}$

	a	b	c	d	e	f	g	h	i
Index	0	1	2	3	4	5	6	7	8
Length[i]	14	9	3	7	0	10	8	8	16
Parent[i]	f	e	e	c	e	g	e	d	a

Example



source = e
step = 9

Loop:

```
for step = 1 to N {
    Find vertex v: length[v] smallest, v not in V
    Add v to V
    for all vertices u not in V
        if (length[u] > length[v] + matrix[v][u]) {
            length[u] = length[v] + matrix[v][u]
            parent[u] = v }
}
```

$V = \{e, c, d, g, h, b, f, a, i\}$

$\text{non-}V = \{\}$

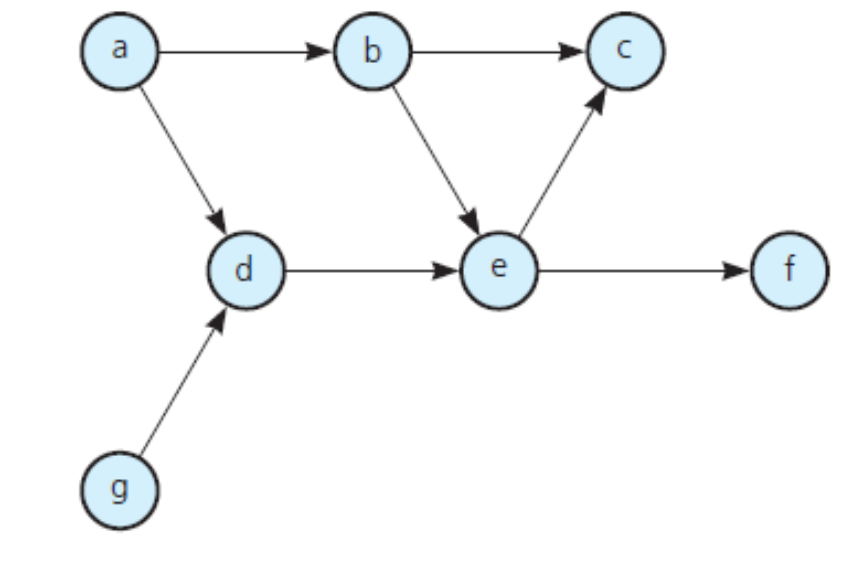
	a	b	c	d	e	f	g	h	i
Index	0	1	2	3	4	5	6	7	8
Length[i]	14	9	3	7	0	10	8	8	16
Parent[i]	f	e	e	c	e	g	e	d	a

Questions and Answers

Topological sorting

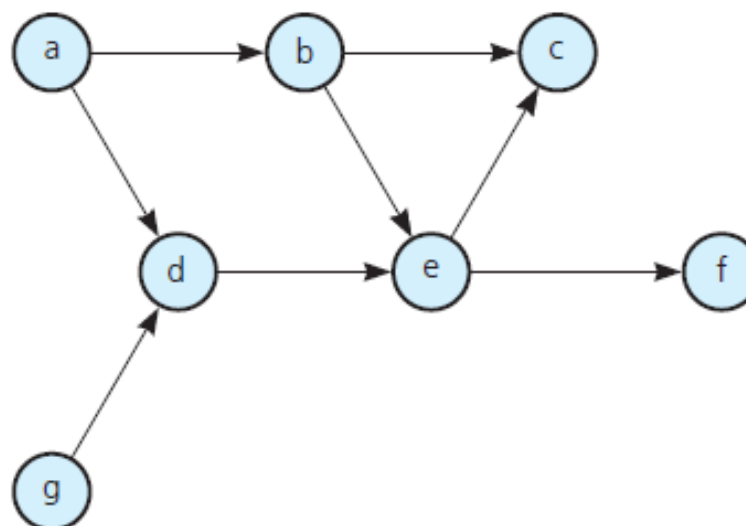
Directed acyclic graph

- dag: directed acyclic graph



Topological sorting

- Topological order: order to take to satisfy all the prerequisites.
- Topological sorting: arranging the vertices in topological order.
- Prerequisite structure of the courses.



Topological sorting

```
topSort1 (theGraph: Graph, aList: List)
```

```
    n = number of vertices in theGraph
```

```
    for (step = 1 to n)
```

```
    {
```

```
        Select a vertex v that has no successors
```

```
        aList.addHead(v)
```

```
        Remove from the Graph vertex v and its edges
```

```
    }
```

Topological sorting

L: Empty list that will contain the sorted elements

S: Stack of all nodes with no incoming edge

while S is not empty

 remove a node n from S // $n = S.pop()$

 add n to tail of L

for each node m with an edge e from n to m do

 remove edge e from the graph

 if m has no other incoming edges then

 insert m into S // $S.push(m)$

if graph has edges then

 return error //(graph has at least one cycle)

else

 return L //(a topologically sorted order)

Topological sorting

- Try this one

