

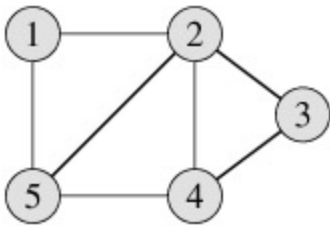
# **Graph Search:**

**Breadth-First Search (BFS)**  
**Depth-First Search (DFS)**

# Breadth-First and Depth-First Search

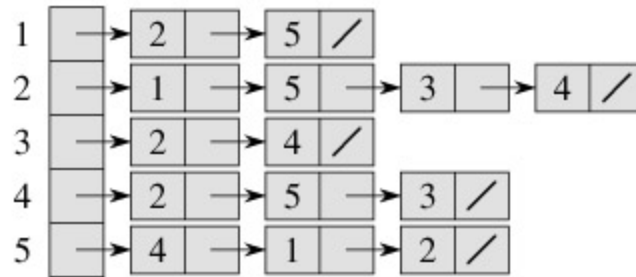
- ◆ **BFS Basic Algorithm**
- ◆ **BFS Complexity**
- ◆ **DFS Algorithm**
- ◆ **DFS Implementation**
- ◆ **Relation between BFS and DFS**

# Graph representation



(a)

graph



(b)

Adjacency list

	1	2	3	4	5
1	0	1	0	0	1
2	1	0	1	1	1
3	0	1	0	1	0
4	0	1	1	0	1
5	1	1	0	1	0

(c)

Adjacency matrix

# Graph Traversal

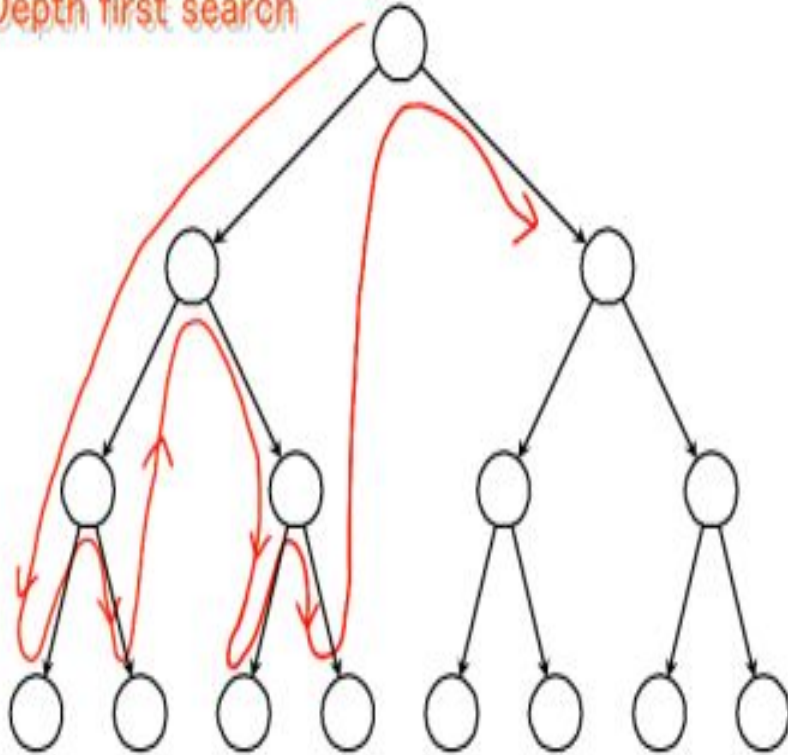
- **Problem:** Search for a certain node or traverse all nodes in the graph
- **Depth First Search**
  - Once a possible path is found, continue the search until the end of the path
- **Breadth First Search**
  - Start several paths at a time, and advance in each one step at a time

# Graph Traversal (Contd.)

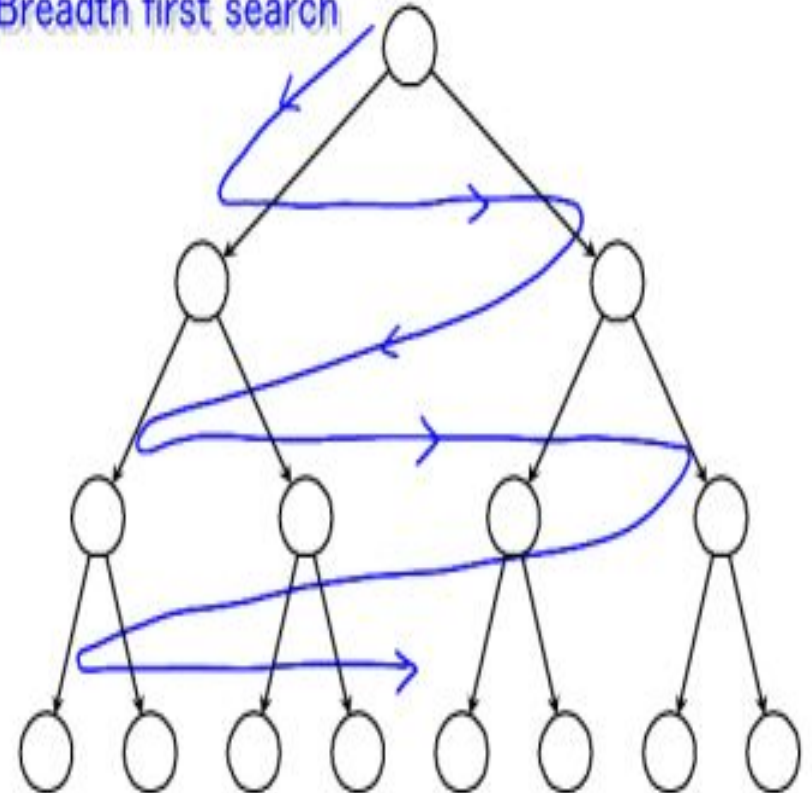
- In both DFS and BFS, the nodes of the undirected graph are visited in a systematic manner so that every node is visited exactly once.
- Both BFS and DFS give rise to a tree:
  - When a node  $x$  is visited, it is labeled as visited, and it is added to the tree.
  - If the traversal got to node  $x$  from node  $y$ ,  $y$  is viewed as the parent of  $x$ , and  $x$  is the child of  $y$ .

# Graph Traversals

Depth first search



Breadth first search



# Breadth-First Search

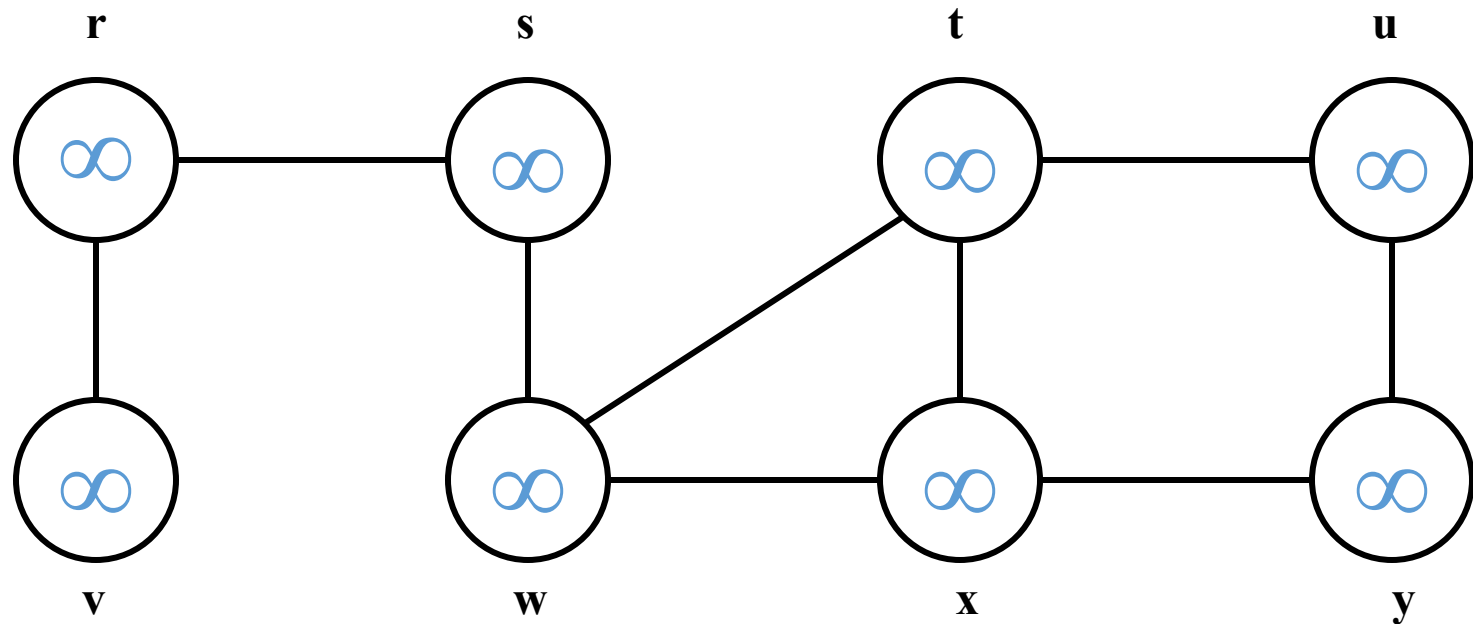
- **BFS follows the following rules:**
  - Select an unvisited node  $x$ , visit it, have it be the root in a BFS tree being formed. Its level is called the current level.
  - For each node  $z$  in the current level, in the order in which the level nodes were visited, visit all the unvisited neighbors of  $z$ . The newly visited nodes from this level form a new level that becomes the next current level.
  - Repeat step 2 until no more nodes can be visited.
  - If there are still unvisited nodes, repeat from Step 1.

# Implementation of BFS

- Observations:
  - the first node visited in each level is the first node from which to proceed to visit new nodes.
- This suggests that a *queue* is the proper data structure to remember the order of the steps.

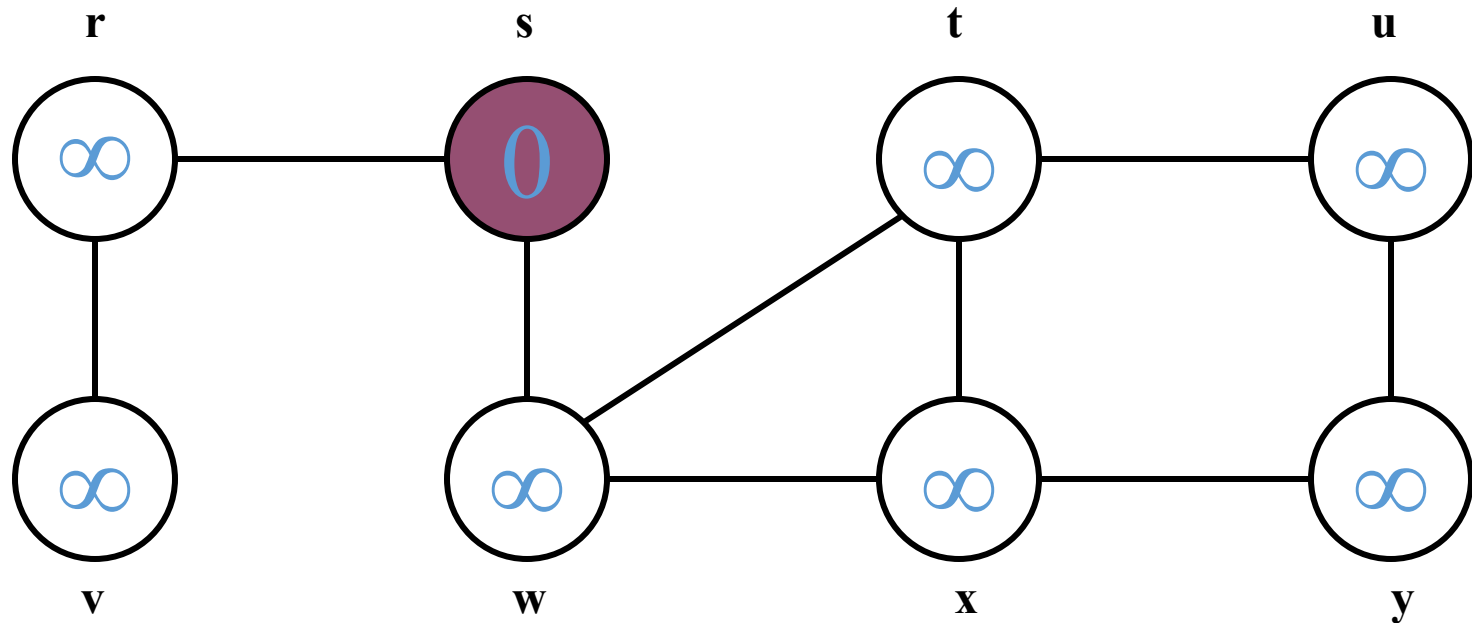


# Breadth-First Search: Example



Symbol  $\infty$  signifies the distance of the node from the root of the BFS tree. Since we do not have any visited node, all the nodes are marked as  $\infty$ . White color signifies the node as unvisited.

# Breadth-First Search: Example

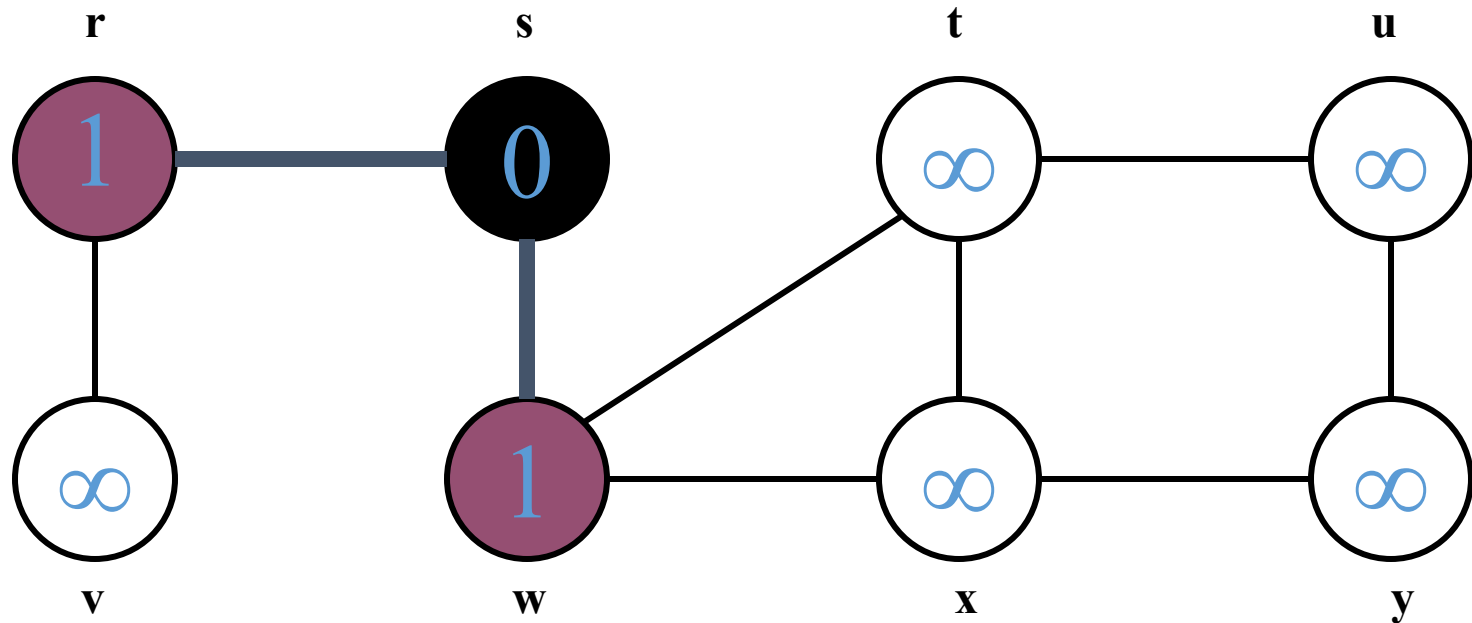


Q:

s

Here we start with the unvisited node **s**. This node is marked as violet color which means it is reached and the node is already in the queue.

# Breadth-First Search: Example

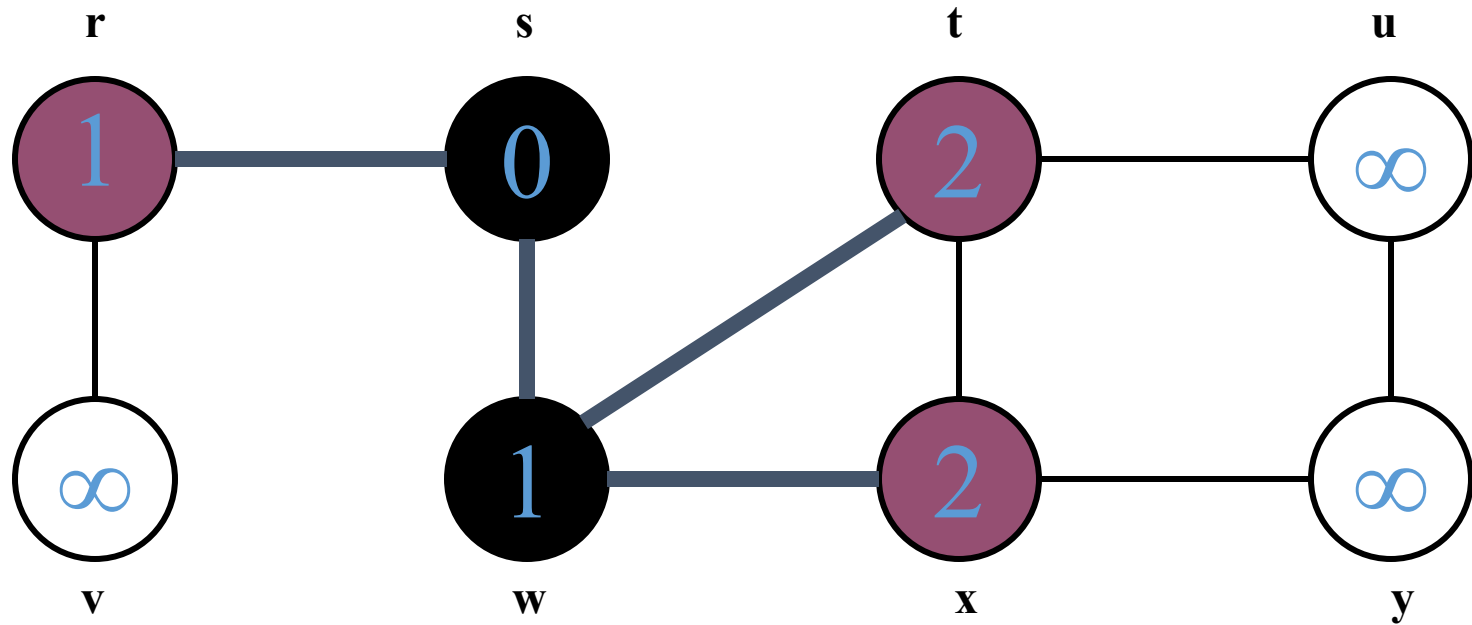


Q: 

w	r
---	---

Here node **s** is deleted from the queue and mark as visited. This is shown as black color in the picture. The unvisited neighbours of **s** are **r** and **w**. Both are inserted into the queue. Since node **r** is at the rear of the queue, it will be visited first.

# Breadth-First Search: Example

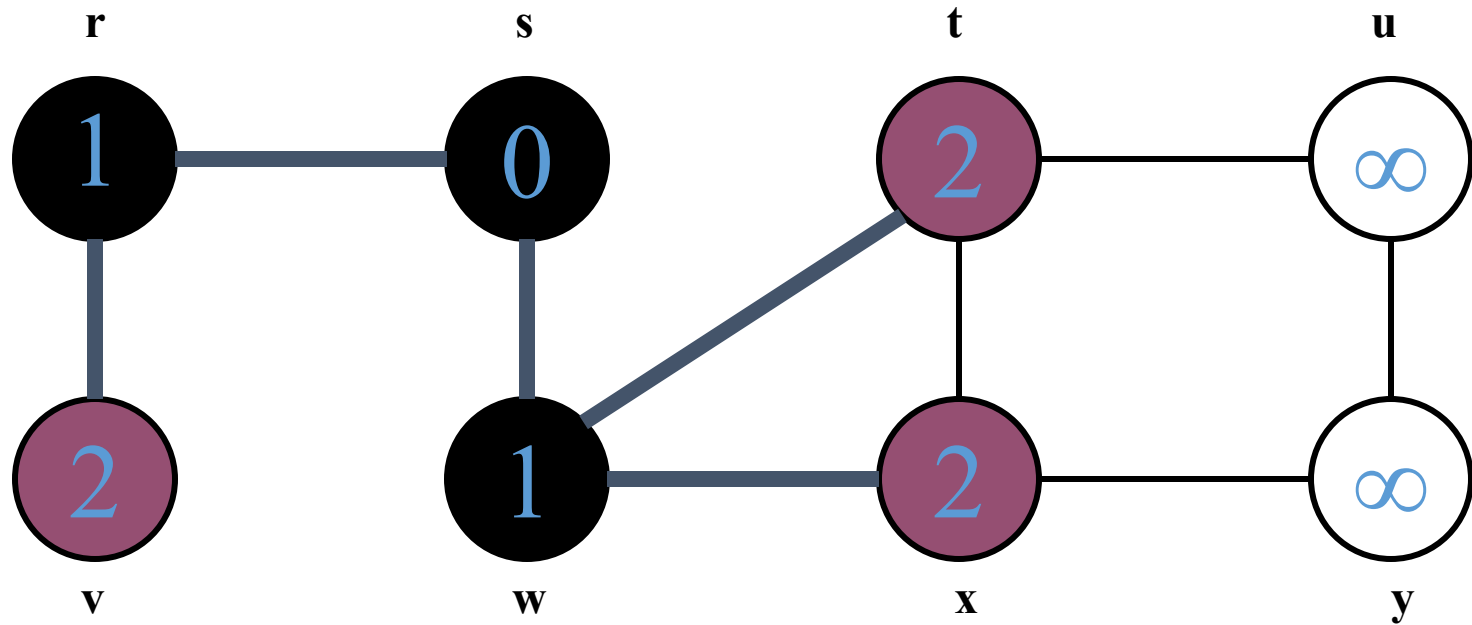


**Q:**

r	t	x
---	---	---

 The unvisited neighbours of **w** are **t** and **x**.

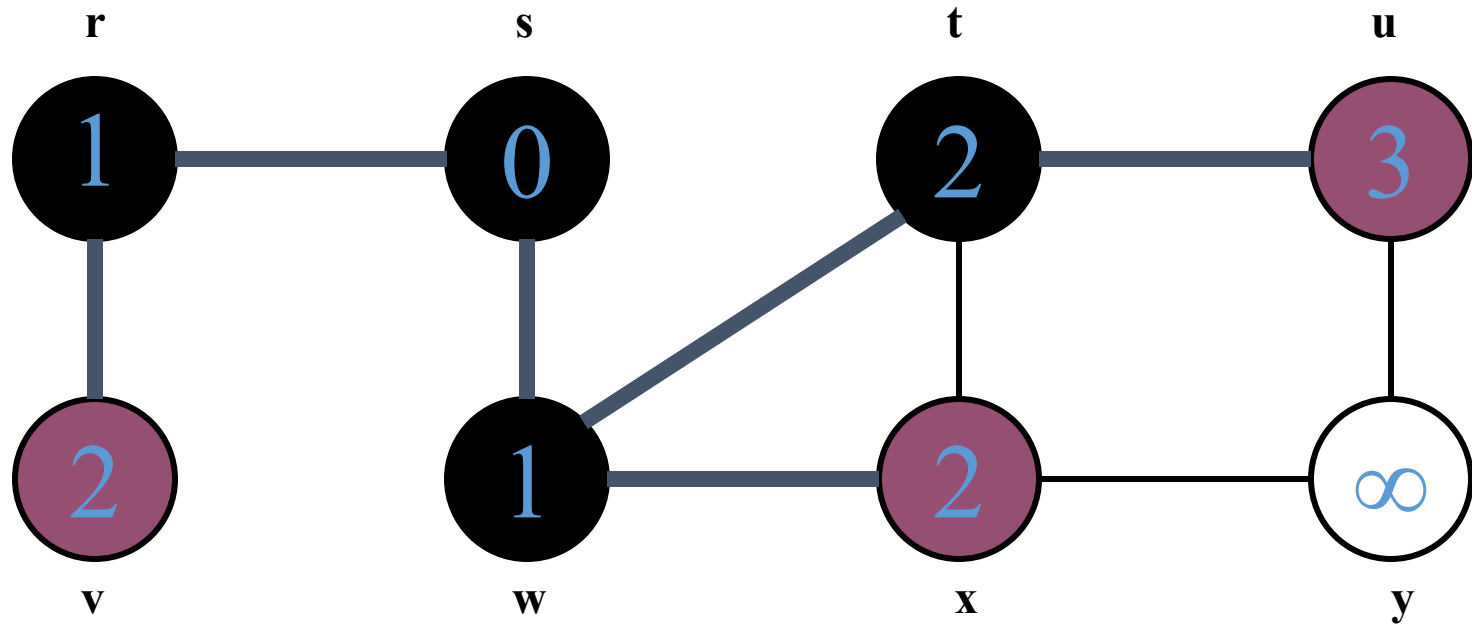
# Breadth-First Search: Example



**Q:**

<b>t</b>	<b>x</b>	<b>v</b>
----------	----------	----------

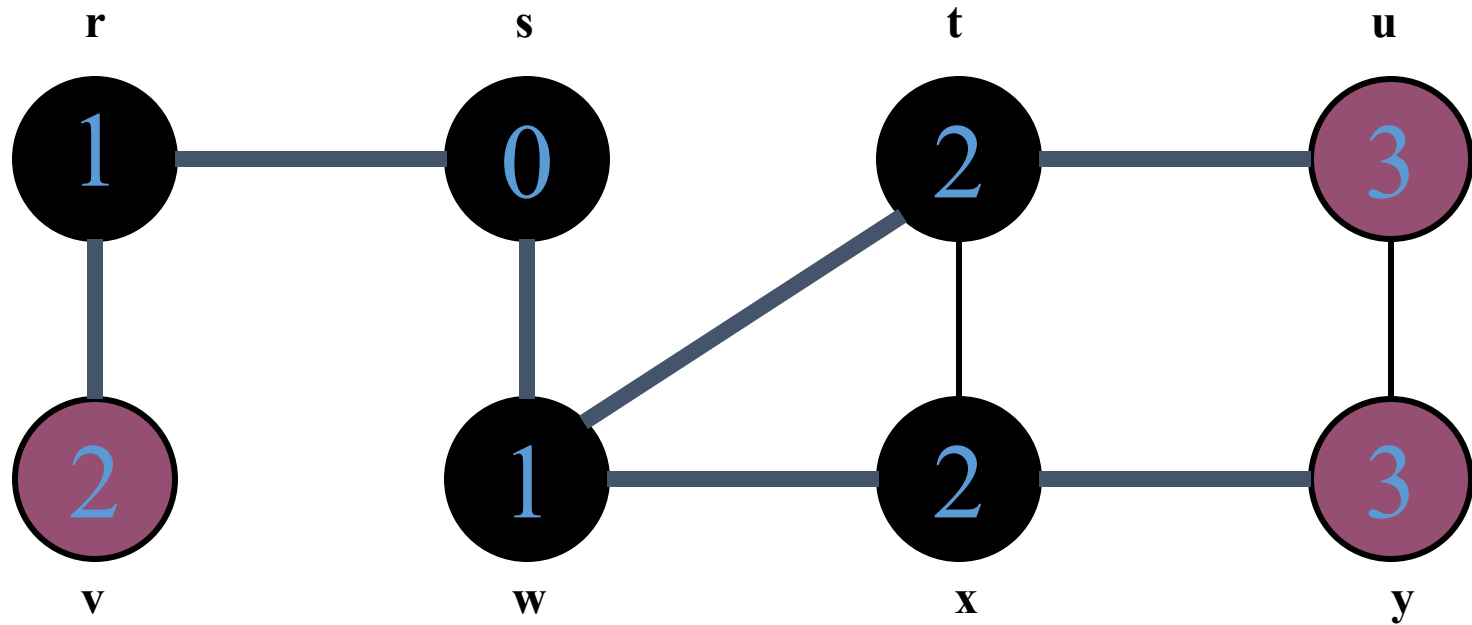
# Breadth-First Search: Example



Q: 

x	v	u
---	---	---

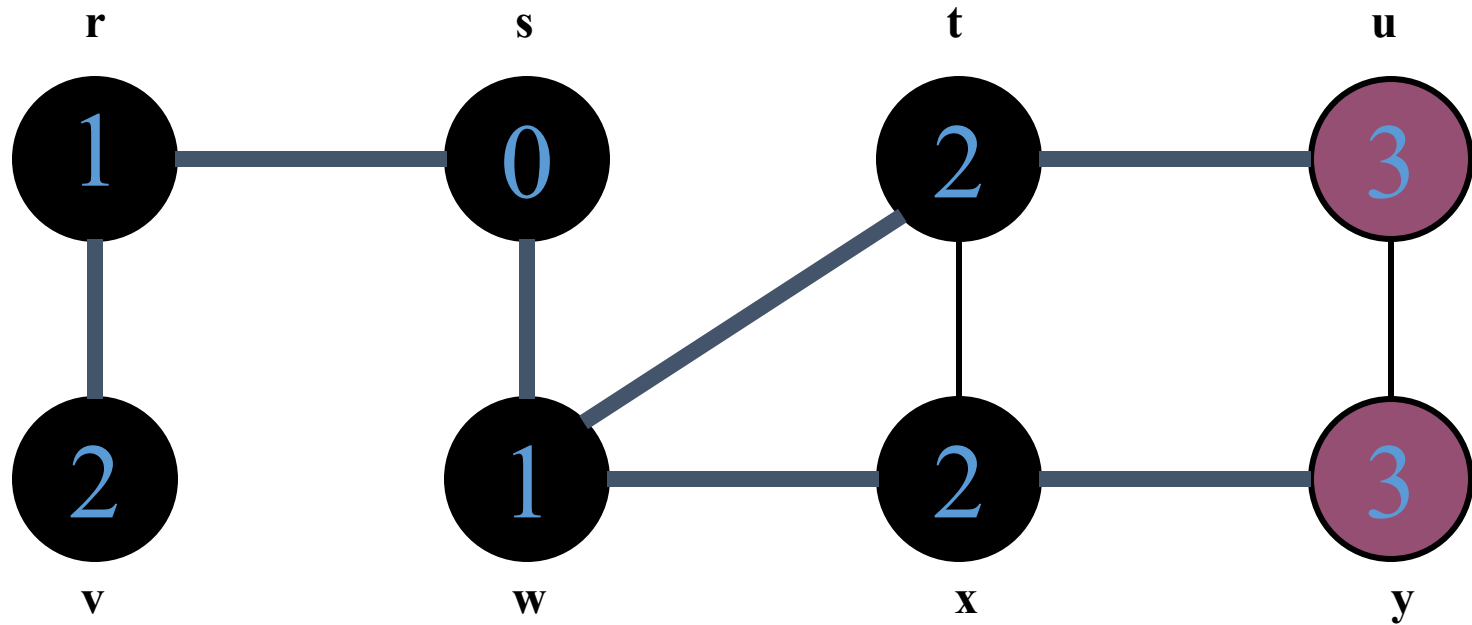
# Breadth-First Search: Example



**Q:**

<b>v</b>	<b>u</b>	<b>y</b>
----------	----------	----------

# Breadth-First Search: Example

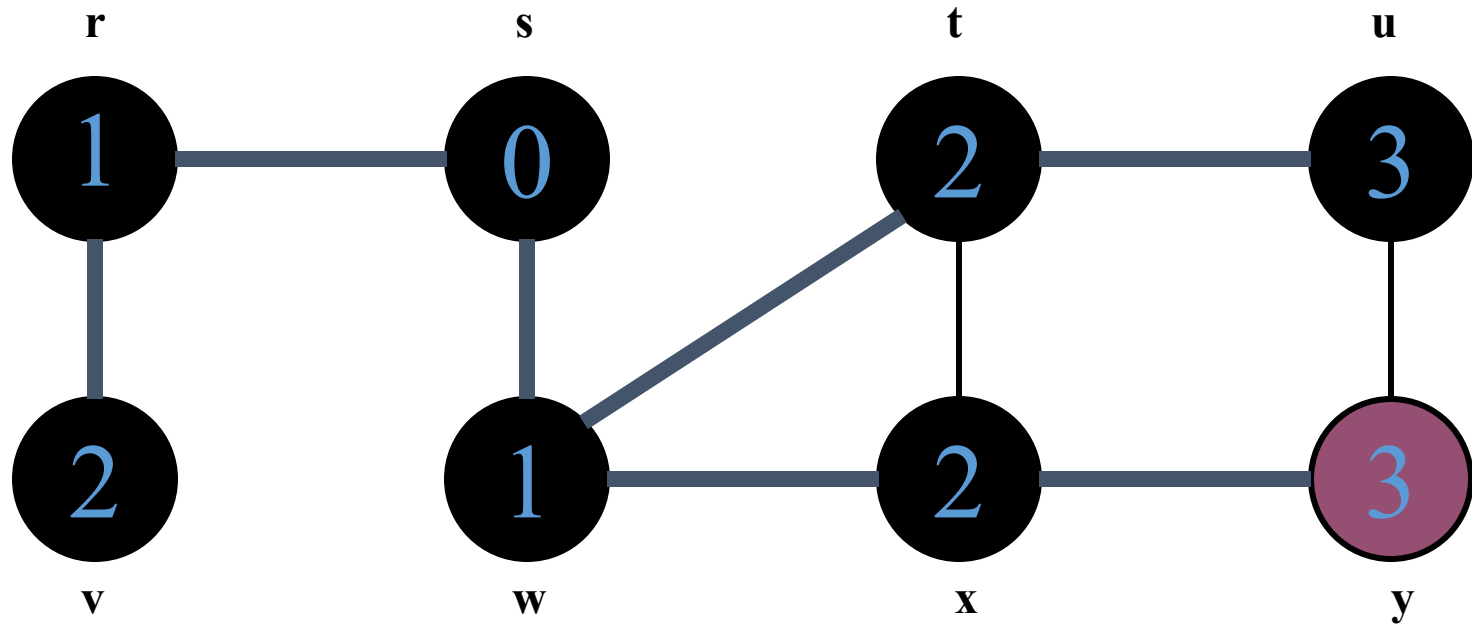


Q: 

u	y
---	---

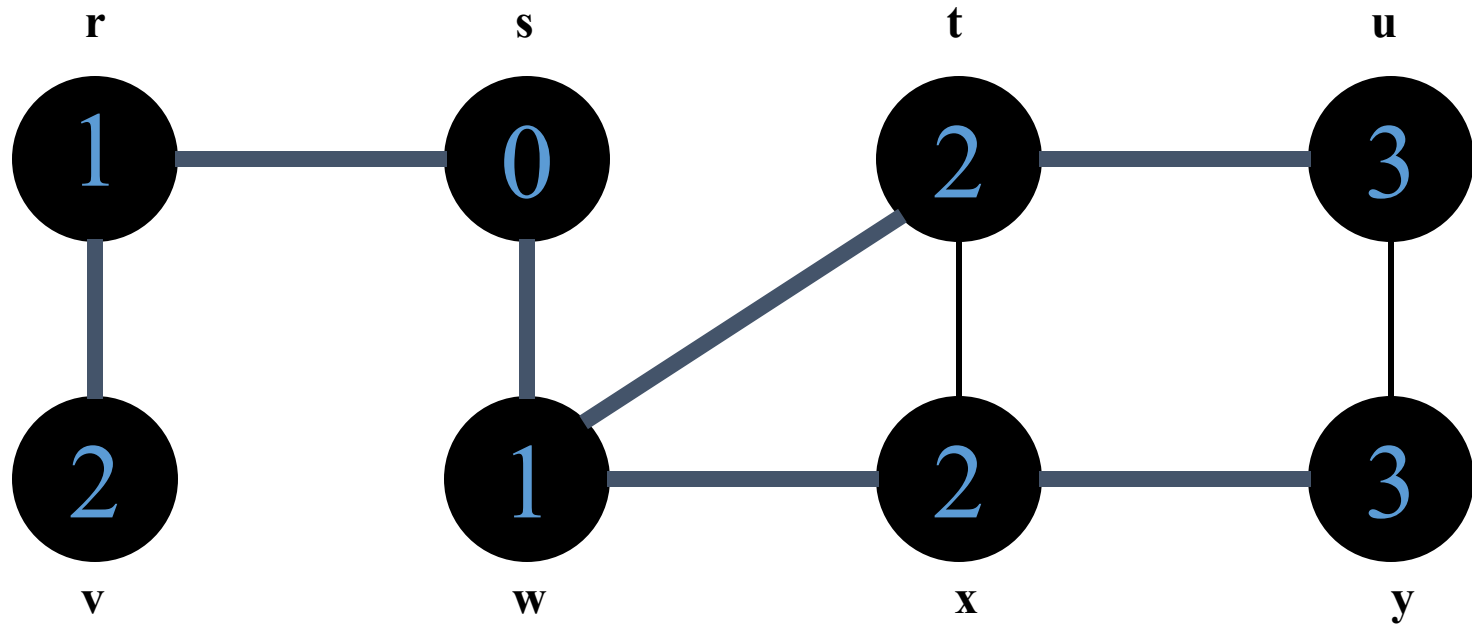


# Breadth-First Search: Example



Q: y

# Breadth-First Search: Example



Q:  $\emptyset$

# BFS (Non Recursive algorithm)

**BFS(V,E,s)**

For all nodes except  $s$

$d[v] = \infty$

$d[s] = 0$

$Q = s$

While  $Q \neq \emptyset$

$u = \text{Dequeue}(Q)$

for all adjacent nodes  $v$  of  $u$

if  $d[v] = \infty$

then  $d[v] = d[u] + 1$

$\text{Enqueue}(Q, v)$

# BFS (time complexity)

**BFS(V,E,s)**

**For all nodes except  $s$**

$d[v] = \infty$

$d[s] = 0$

$Q = \emptyset$

**While  $Q \neq \emptyset$**


$u = \text{Dequeue}(Q)$


**for all adjacent nodes  $v$  of  $u$**

if  $d[v] = \infty$

then  $d[v] = d[u] + 1$

$\text{Enqueue}(Q, v)$

  $O(|V|)$

  $O(V^2) = |E|$ .

Overall complexity =  $O(|V|) + |E|$

# Depth-First Search

• *Depth-first search* is another strategy for exploring a graph

- Explore “deeper” in the graph whenever possible.
- Edges are explored out of the most recently discovered vertex  $v$  that still has unexplored edges.
- When all of  $v$ 's edges have been explored, backtrack to the vertex from which  $v$  was discovered.

# Depth-First Search

- Vertices initially colored white
- Then colored gray when discovered
- Then black when finished

# DFS Algorithm

## DFS(V,E)

```
for each vertex u in V[G]
    color[v] ← WHITE
     $\pi[v] \leftarrow \text{NIL}$ 
    time ← 0
for each vertex v in V[G]
    if color[v] ← WHITE
    then
        Depth_First_Search(v)
```

## **Depth First Search(v)**

```
color[v] ← GRAY
time ← time + 1
d[v] ← time
for each vertex u adjacent to v
    if color[u] ← WHITE
         $\pi[u] \leftarrow v$ 
        Depth_First_Search(u)
color[v] ← BLACK
time ← time + 1
f[v] ← time
```

# Explanation of the algorithm

- Create and maintain 4 variables for each vertex of the graph, *such as*,  $\text{color}[v]$ ,  $d[v]$ ,  $f[v]$ ,  $\pi[v]$ .
- **color[v]** :
  - This variable represents the color of the vertex 'v' at the given point of time.
  - The possible values of this variable are- WHITE, GREY and BLACK.
  - WHITE color of the vertex signifies that it has not been discovered yet.
  - GREY color of the vertex signifies that it has been discovered and it is being processed.
  - BLACK color of the vertex signifies that it has been completely processed.
- **$\pi[v]$**  : This variable represents the predecessor of vertex 'v'.
- **d[v]** : This variable represents a timestamp when a vertex 'v' is discovered.
- **f[v]** : This variable represents a timestamp when the processing of vertex 'v' is completed.



# Explanation of the algorithm

- For each vertex of the graph, initialize the variables as-
  - $\text{color}[v] = \text{WHITE}$
  - $\pi[v] = \text{NIL}$
  - $\text{time} = 0$  (Global Variable acting as a timer)
- Repeat the Depth\_First\_Search procedure until all the vertices of the graph become BLACK. Consider any white vertex 'v' and call the Depth\_First\_Search function on it.
- **DFS Time Complexity-** The total running time for Depth First Search is  $\theta(V+E)$ .

# Types of Edges in DFS

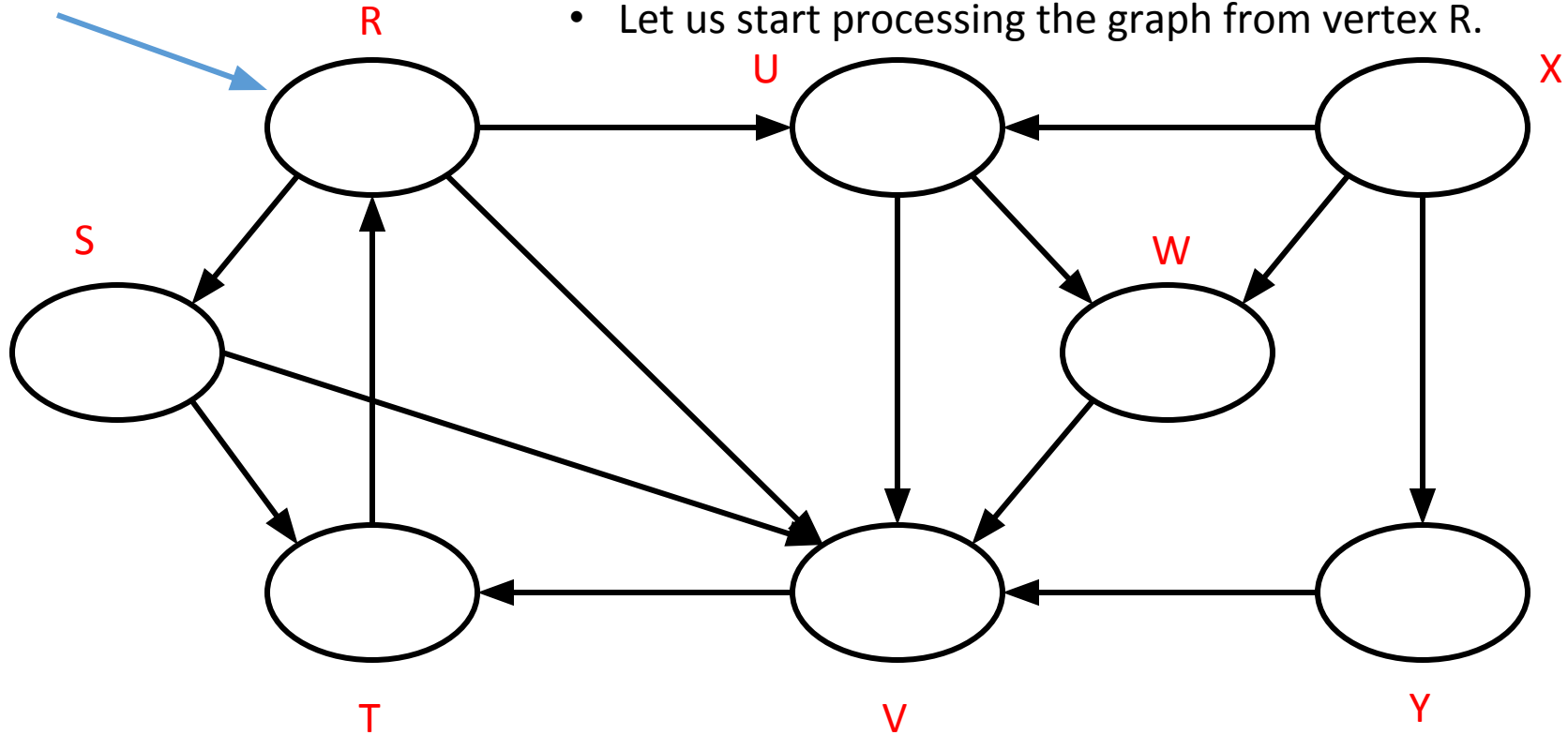
- After a DFS traversal of any graph  $G$ , all its edges can be put in one of the following 4 classes:
  - ✓ Tree Edge, Back Edge, Forward Edge, Cross Edge
- **Tree edge:** A tree edge is an edge that is included in the DFS tree.
- **Back edge:** An edge from a vertex ' $u$ ' to one of its ancestors ' $v$ ' is called as a back edge. A self-loop is considered as a back edge. A back edge is discovered when
  - DFS tries to extend the visit from a vertex ' $u$ ' to vertex ' $v$ ' and
  - vertex ' $v$ ' is found to be an ancestor of vertex ' $u$ ' and grey at that time.
- **Forward edge:** An edge from a vertex ' $u$ ' to one of its descendants ' $v$ ' is called as a forward edge. A forward edge is discovered when
  - DFS tries to extend the visit from a vertex ' $u$ ' to a vertex ' $v$ '
  - And finds that  $\text{color}(v) = \text{BLACK}$  and  $d(v) > d(u)$ .
- **Cross edge:** An edge from a vertex ' $u$ ' to a vertex ' $v$ ' that is neither its ancestor nor its descendant is called as a cross edge. A cross edge is discovered when
  - DFS tries to extend the visit from a vertex ' $u$ ' to a vertex ' $v$ '
  - And finds that  $\text{color}(v) = \text{BLACK}$  and  $d(v) < d(u)$ .

We will traverse the given graph using DFS.

## DFS Example

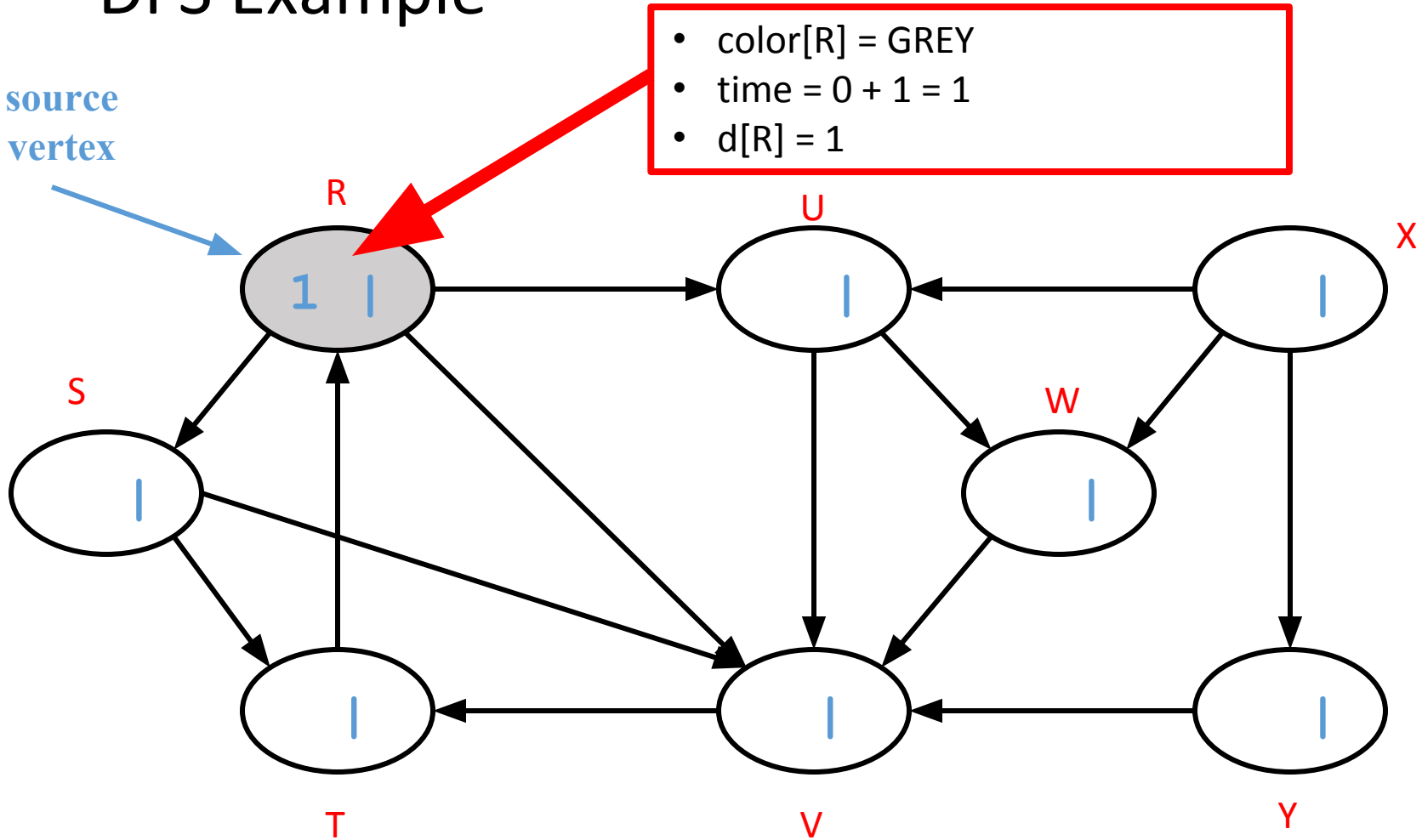
source  
vertex

- Initially for all the vertices of the graph, we set the variables as-
  - color[v] = WHITE
  - $\pi[v] = \text{NIL}$
  - time = 0 (Global)
- Let us start processing the graph from vertex R.



# DFS Example

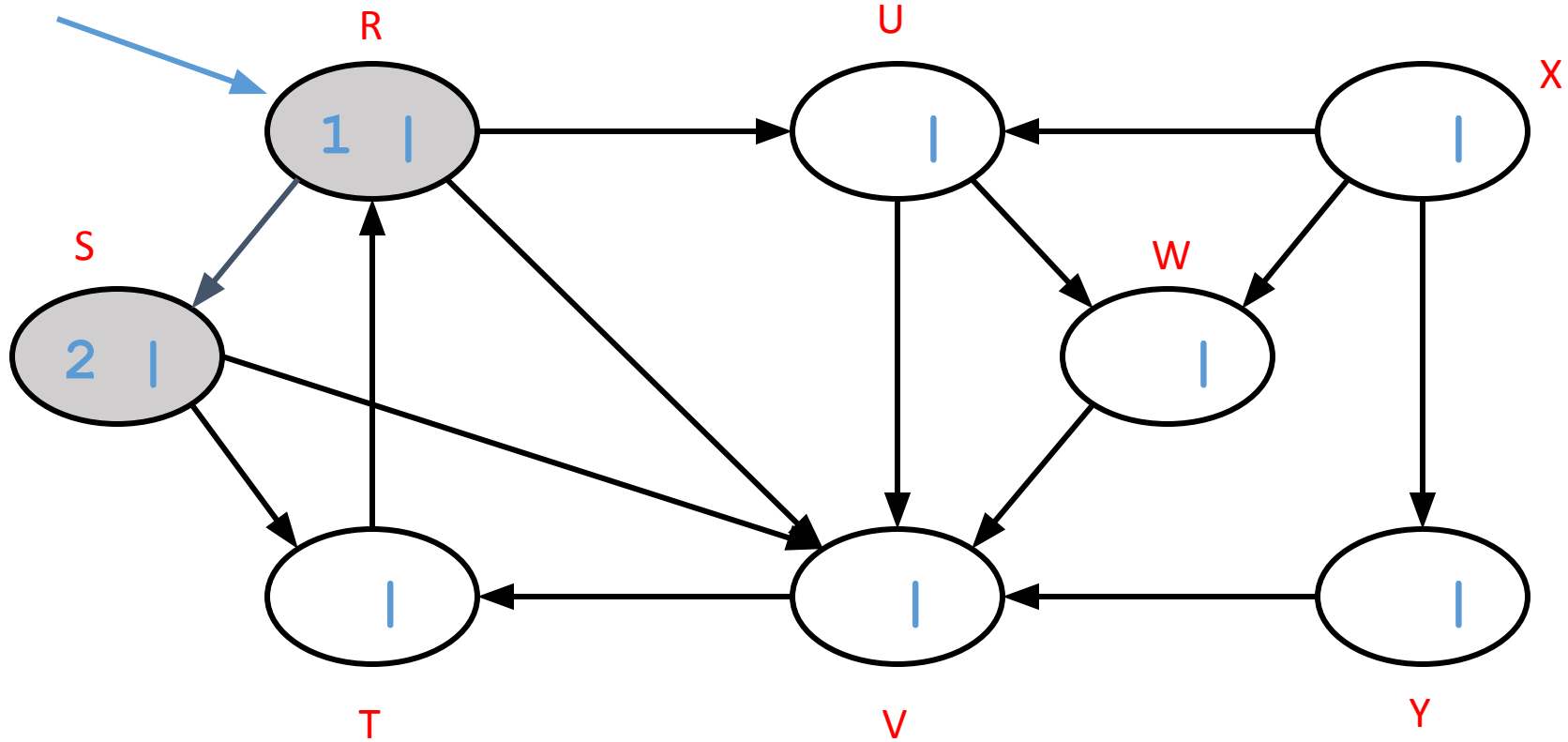
source  
vertex



# DFS Example

source  
vertex

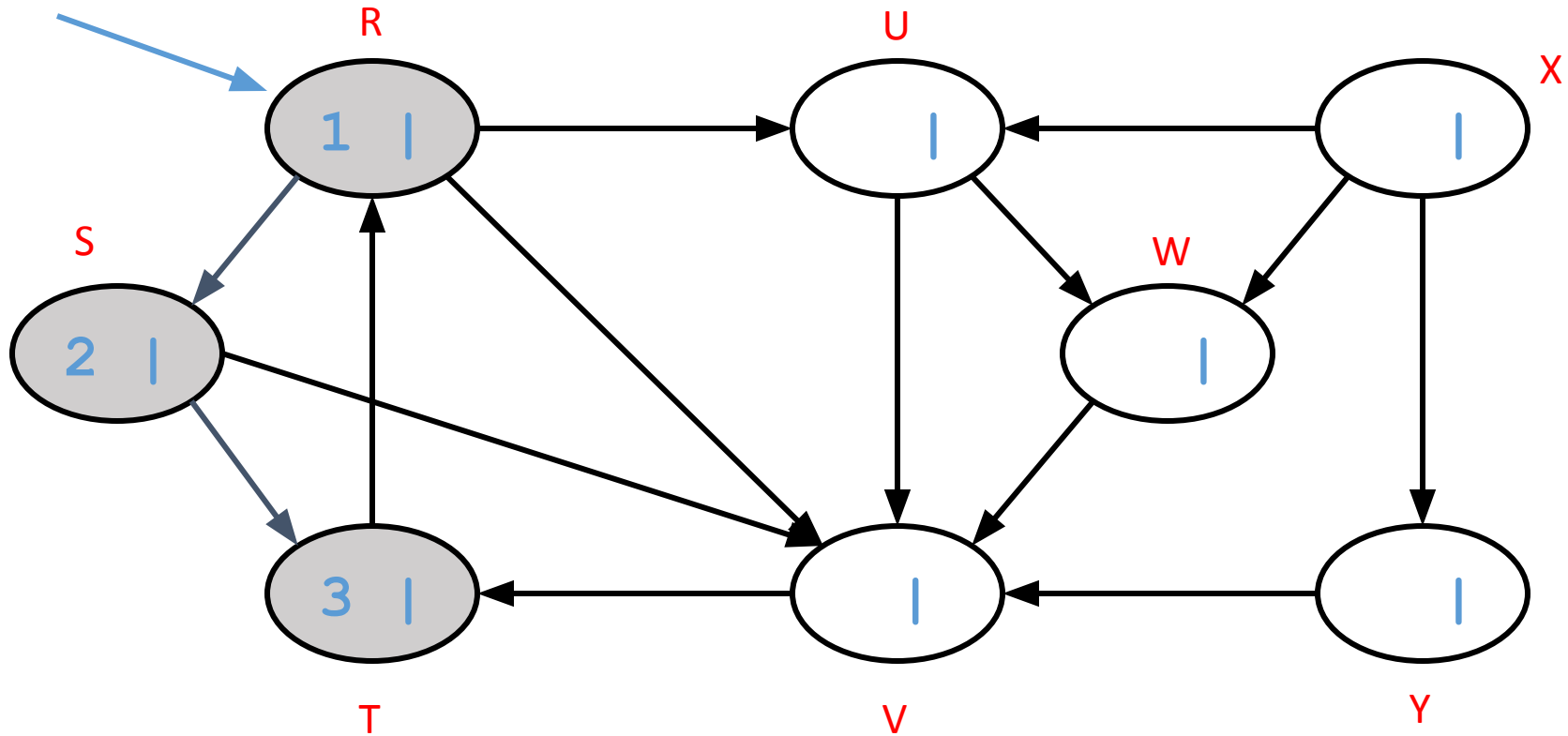
- $\pi[S] = R$
- $\text{color}[S] = \text{GREY}$
- $\text{time} = 1 + 1 = 2$
- $d[S] = 2$



# DFS Example

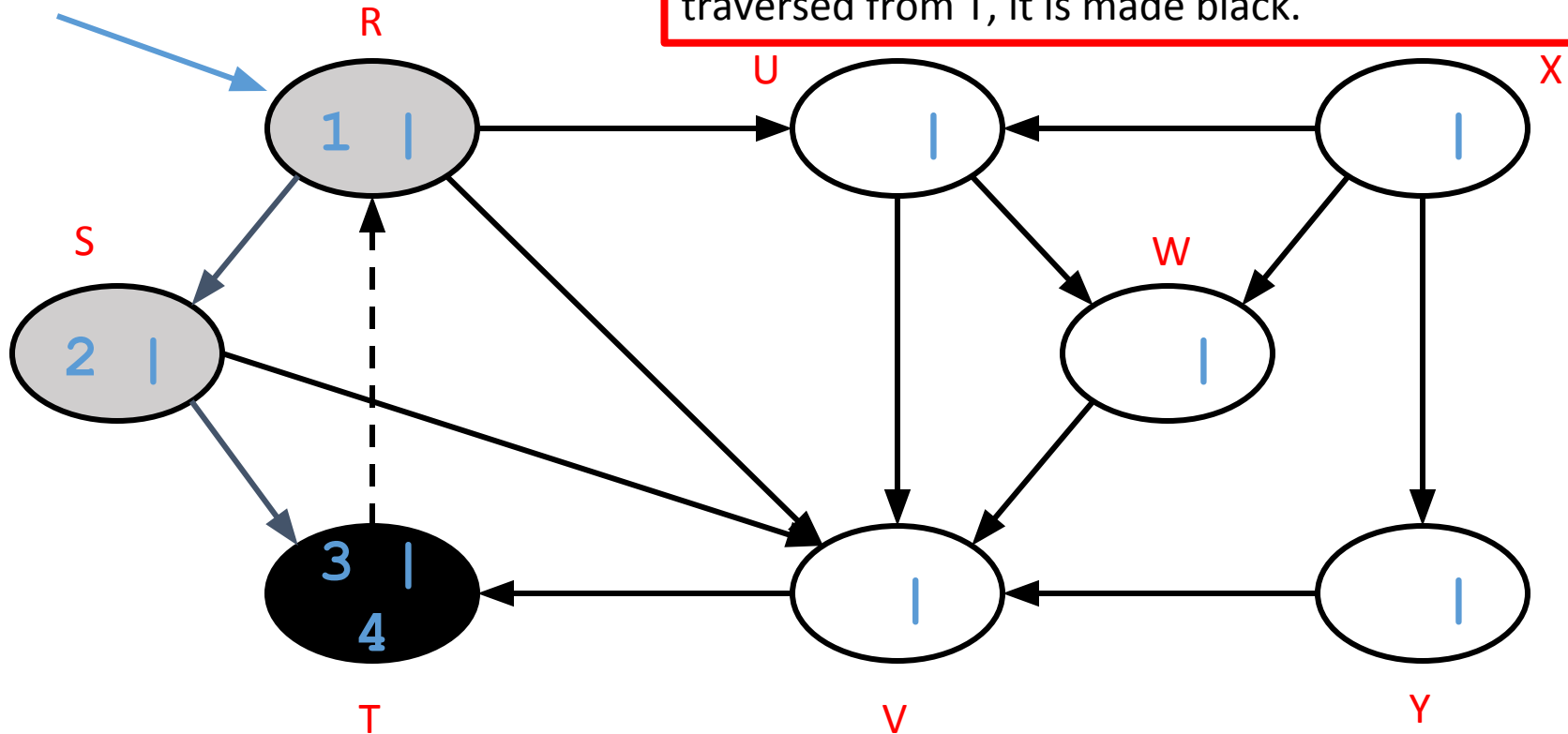
source  
vertex

- $\pi[T] = S$
- $\text{color}[T] = \text{GREY}$
- $\text{time} = 1 + 2 = 3$
- $d[T] = 3$



# DFS Example

source  
vertex



When DFS tries to extend the visit from vertex T to vertex R, it finds

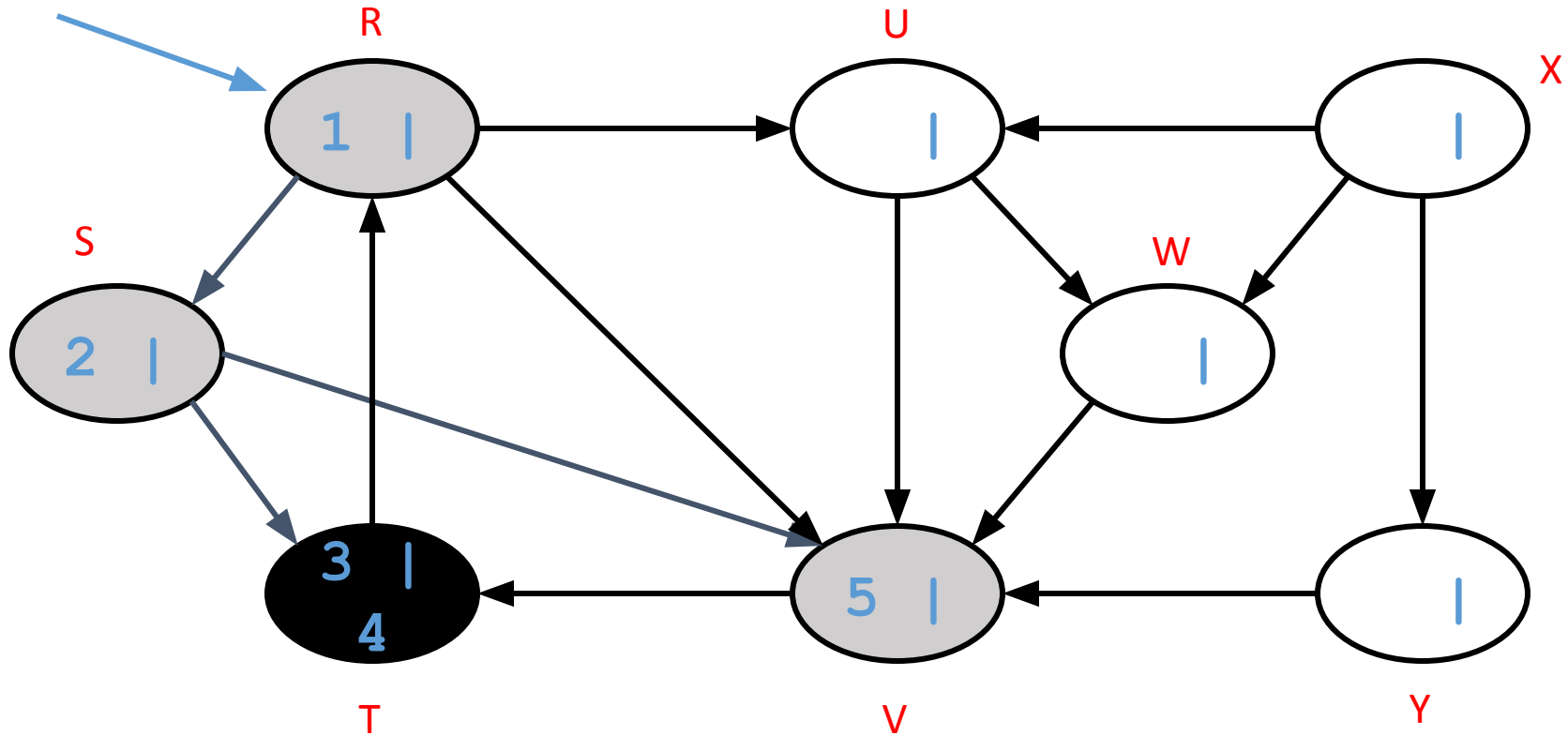
- Vertex R is already **BLACK** since it has already been discovered.
- Vertex R is **GREY** in color.

Thus, edge TR is a **back edge**. Since no node can be traversed from T, it is made black.

# DFS Example

source  
vertex

- $\pi[V] = S$
- $\text{color}[V] = \text{GREY}$
- $\text{time} = 4 + 1 = 5$
- $d[V] = 5$

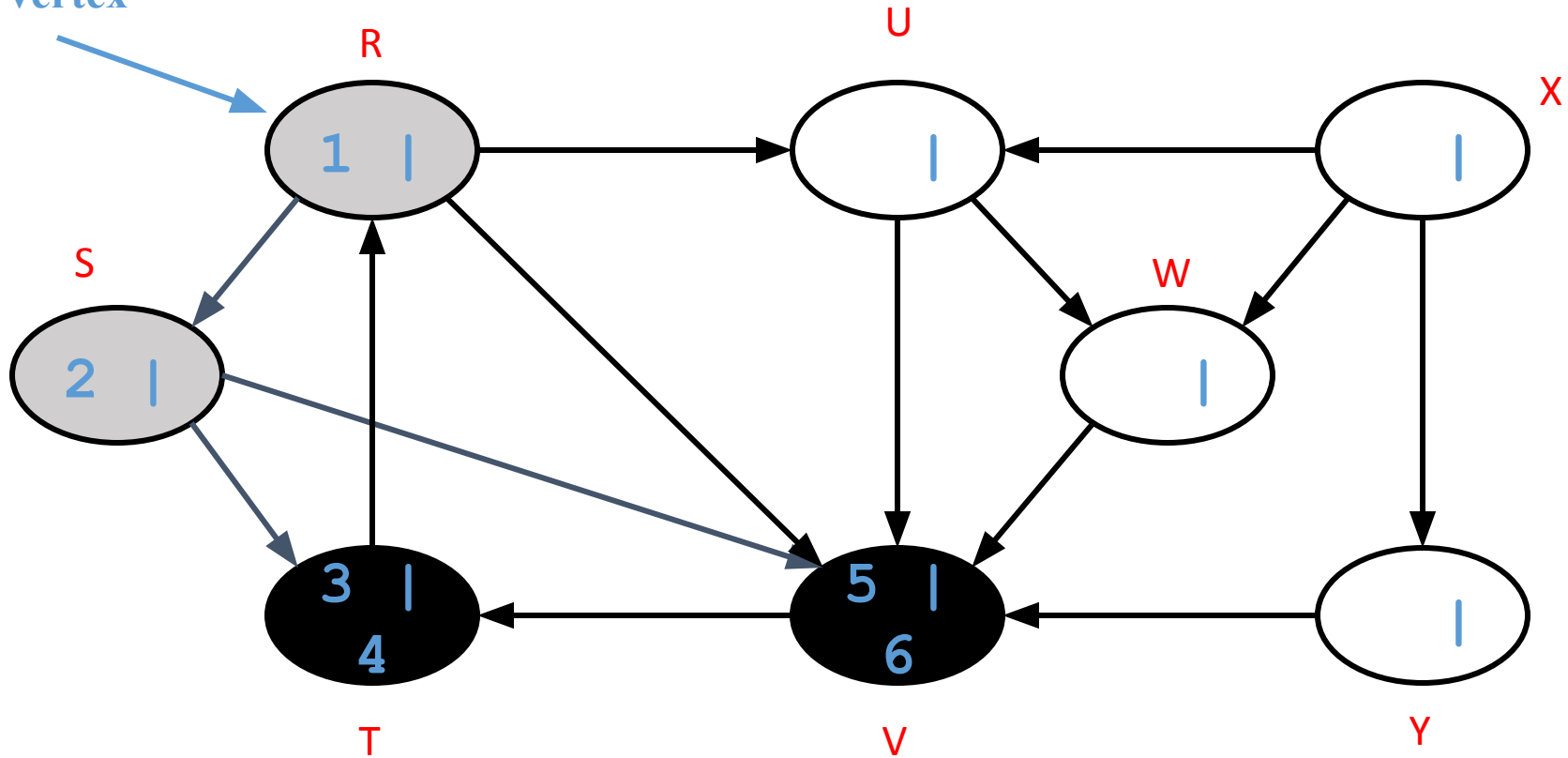




# DFS Example

source  
vertex

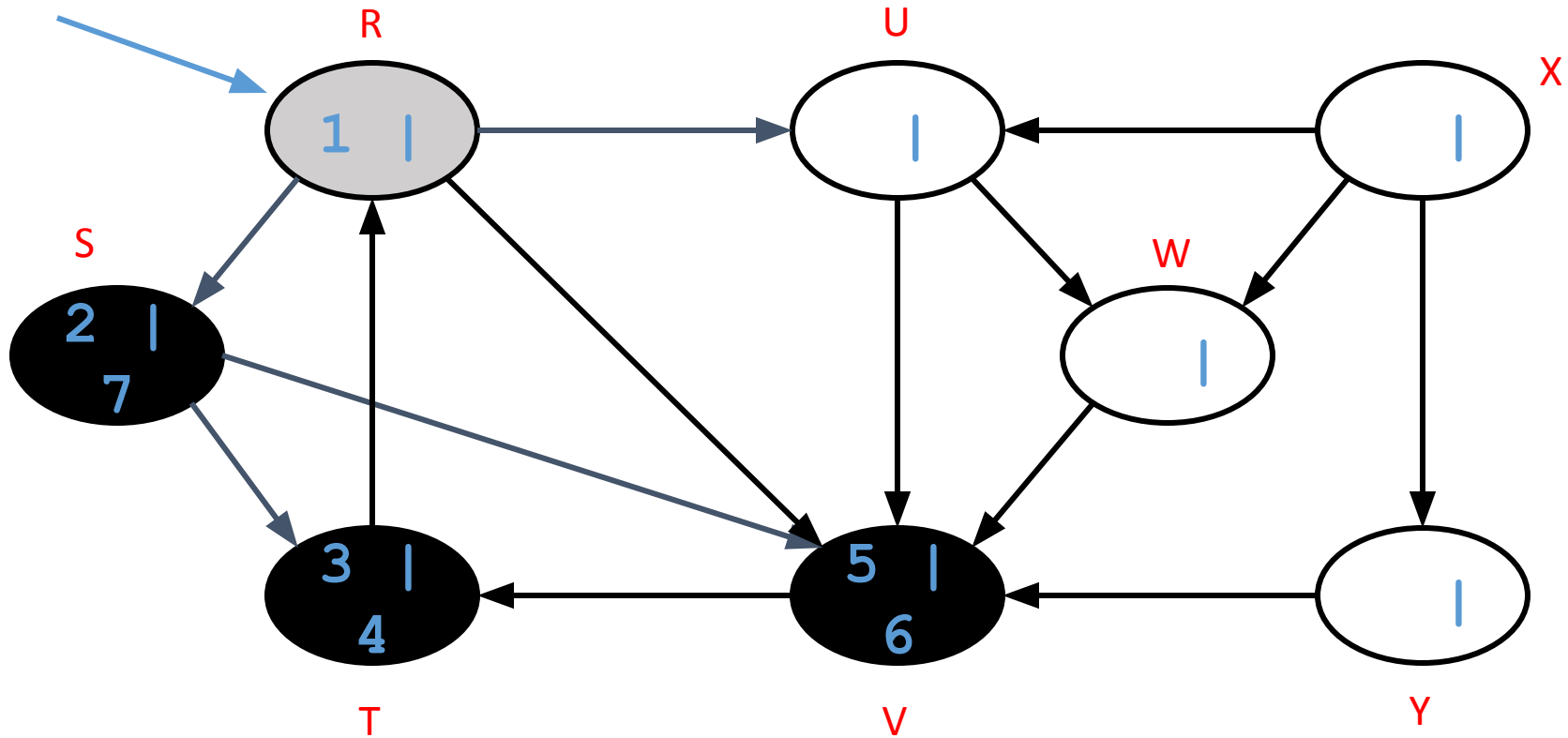
color[V] = BLACK  
time = 5 + 1 = 6  
f[V] = 6



# DFS Example

color[S] = BLACK  
time = 6 + 1 = 7  
f[S] = 7

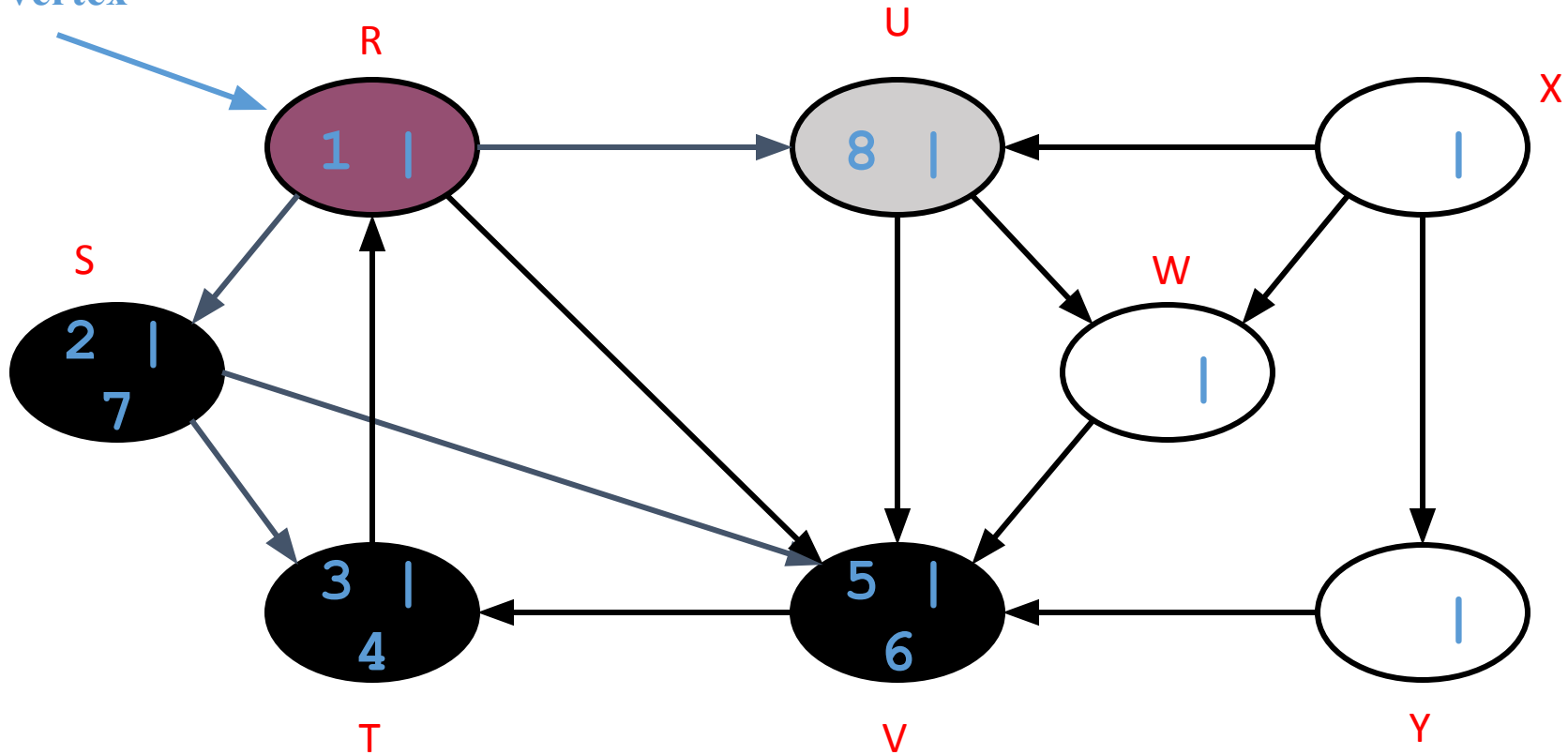
source  
vertex



# DFS Example

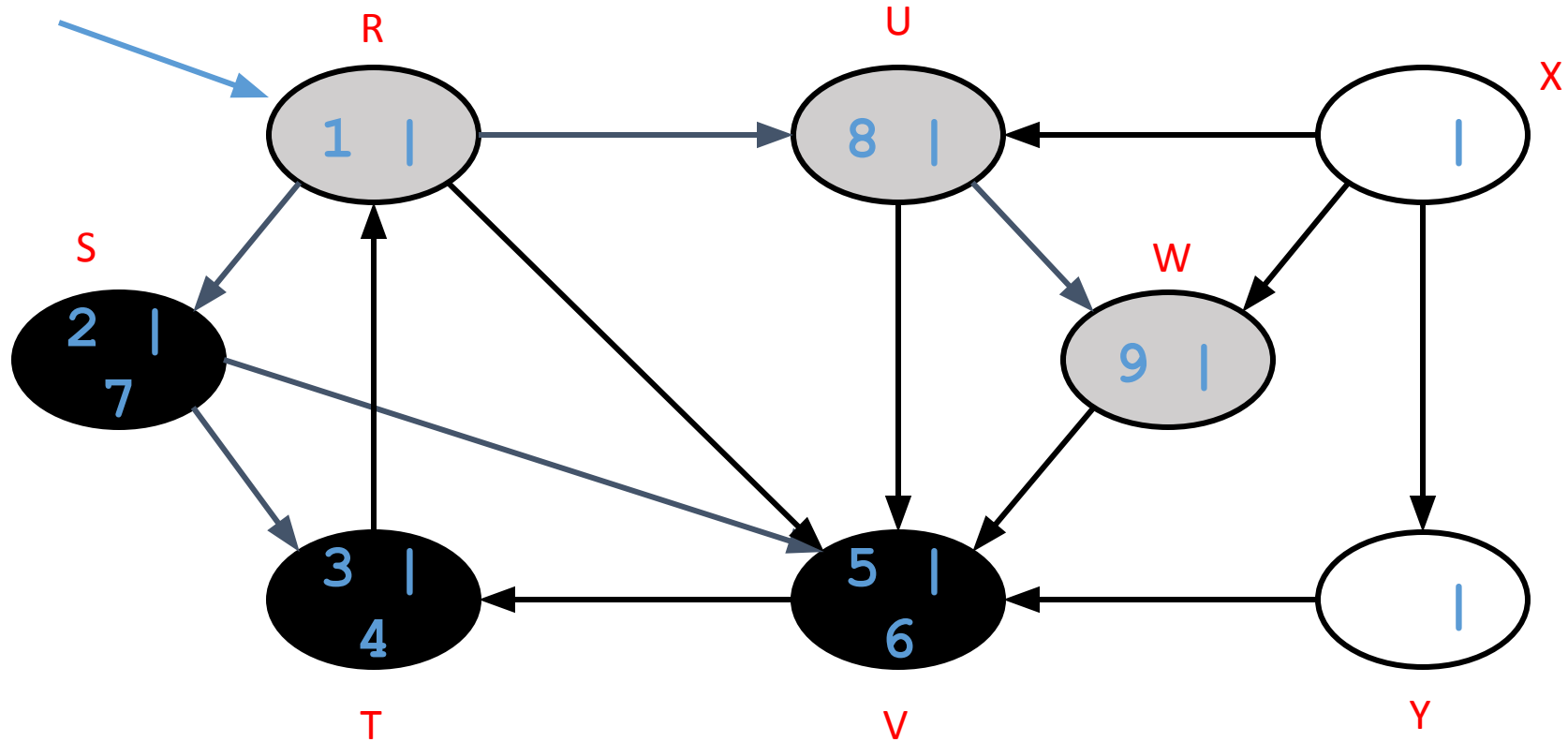
source  
vertex

- $\pi[U] = R$
- $\text{color}[U] = \text{GREY}$
- $\text{time} = 7 + 1 = 8$
- $d[U] = 8$



# DFS Example

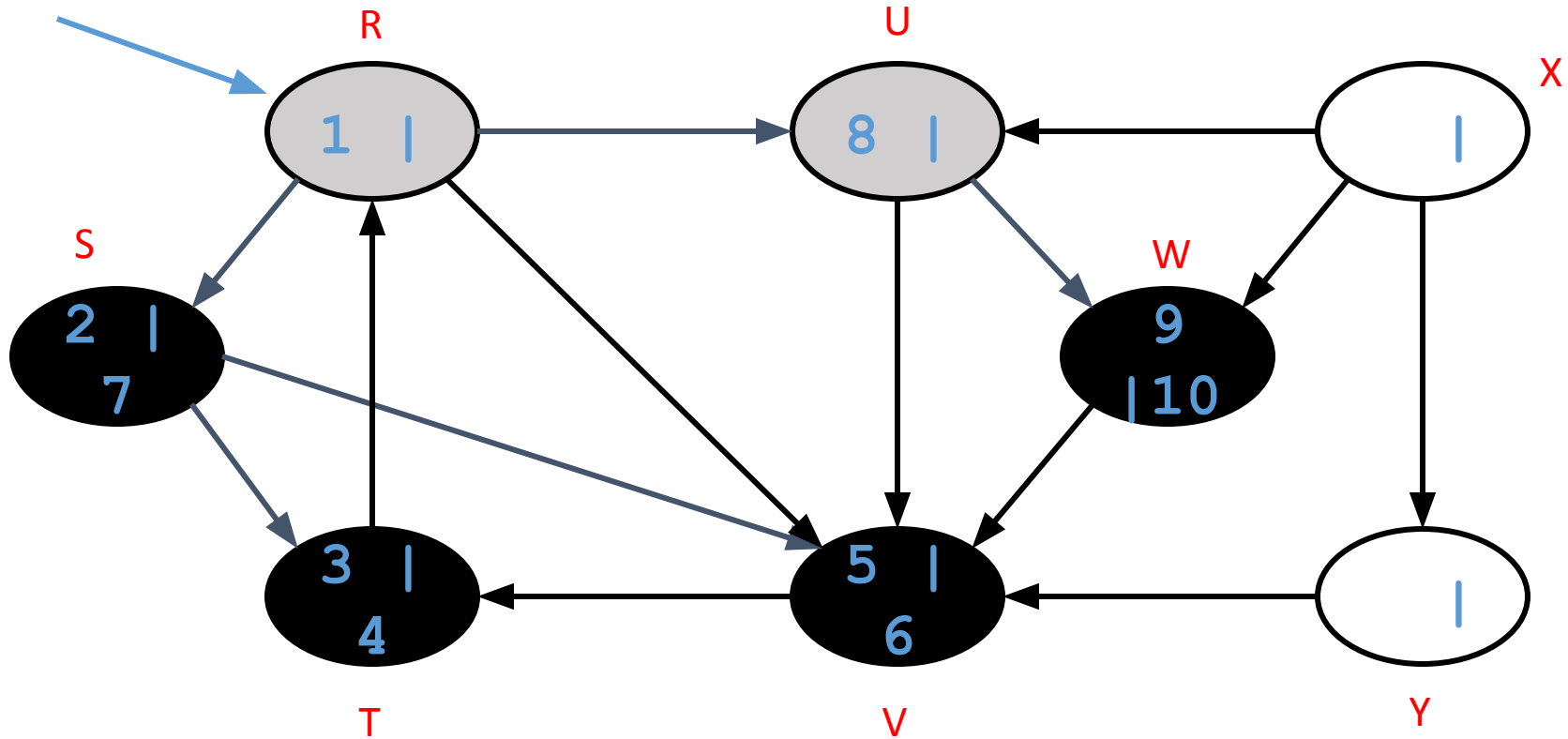
source  
vertex



# DFS Example

color[W] = BLACK  
time = 9 + 1 = 10  
f[S] = 10

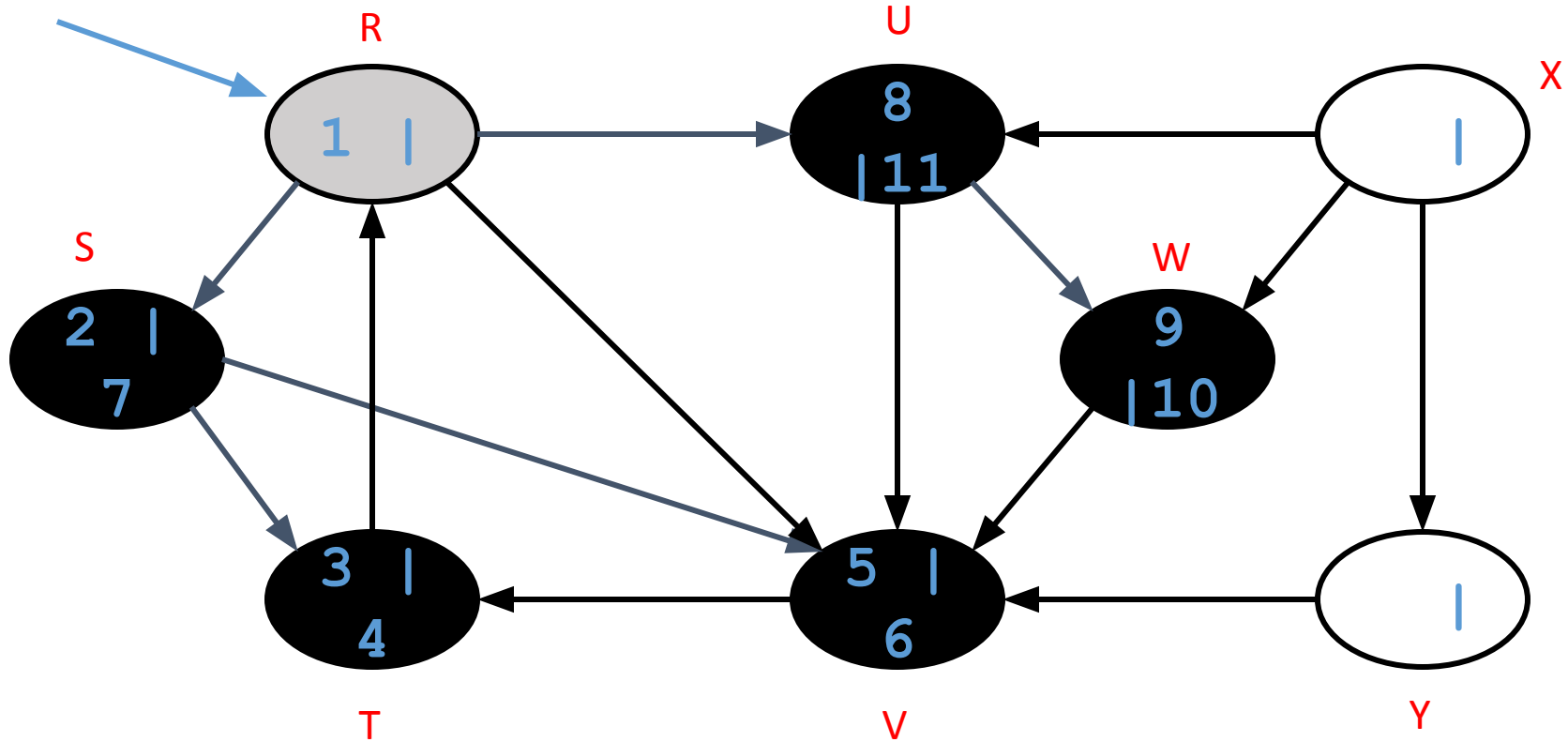
source  
vertex



# DFS Example

color[U] = BLACK  
time = 10 + 1 = 11  
f[S] = 11

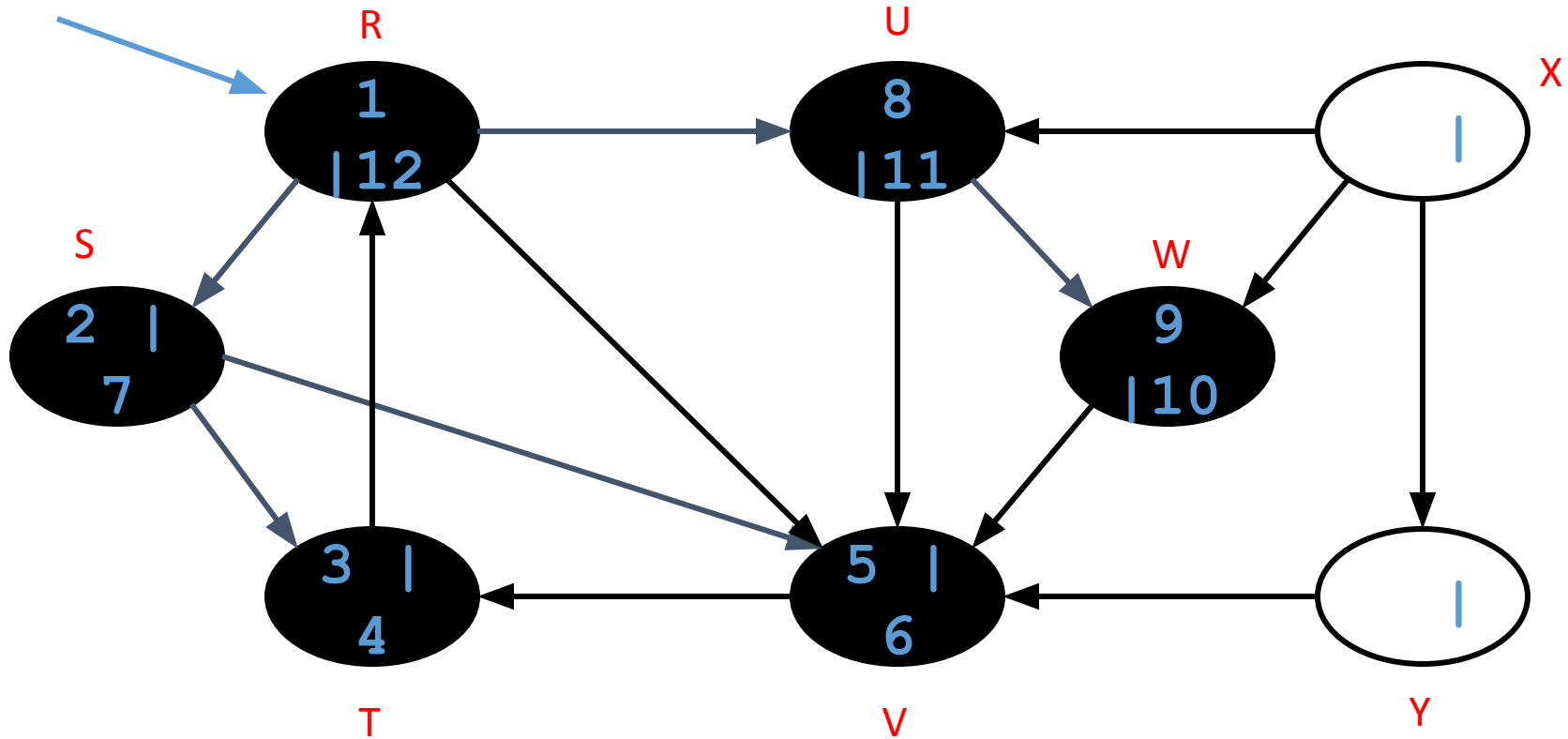
source  
vertex



# DFS Example

color[R] = BLACK  
time = 11 + 1 = 12  
f[S] = 12

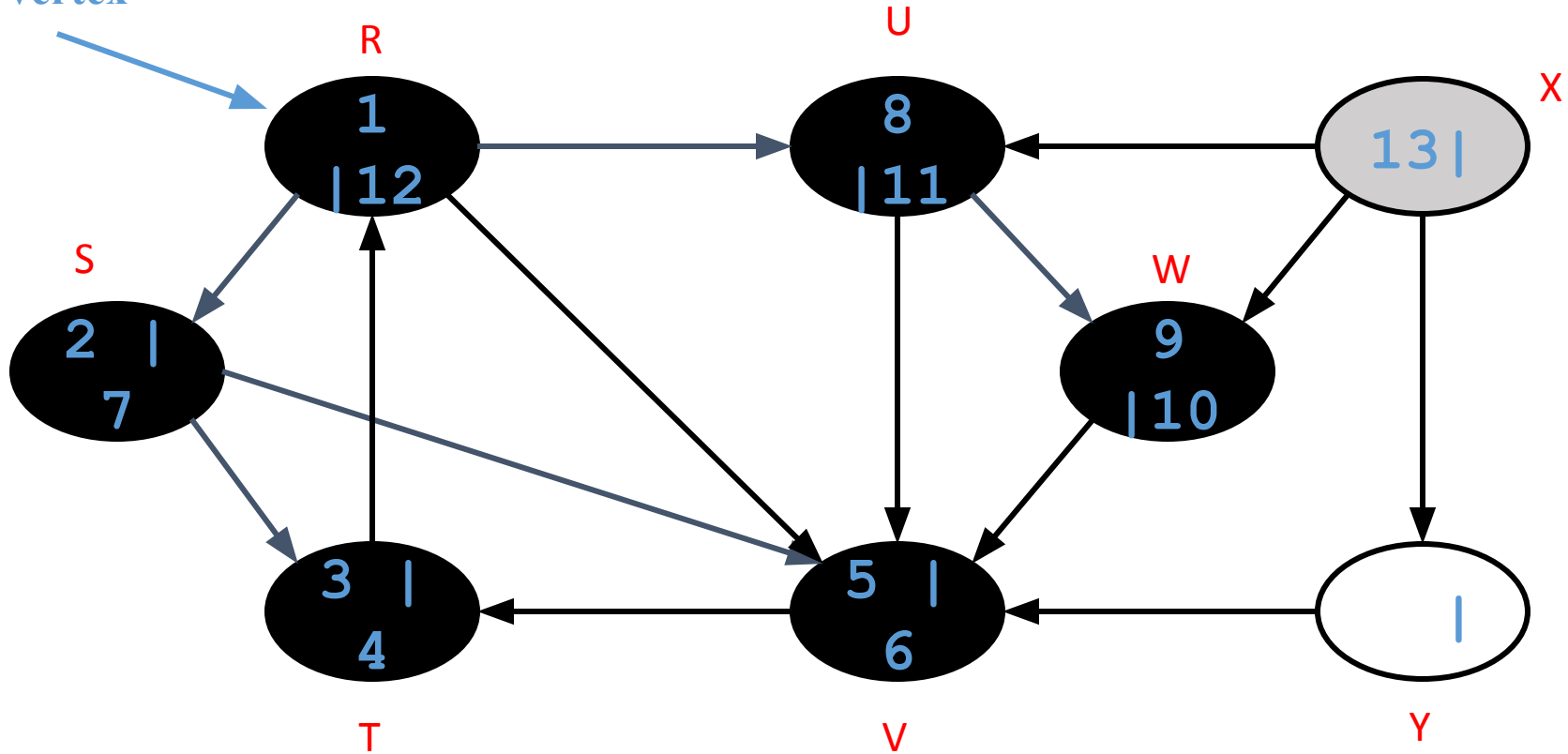
source  
vertex



# DFS Example

source  
vertex

- $\pi[X] = X$
- $\text{color}[X] = \text{GREY}$
- $\text{time} = 12 + 1 = 13$
- $d[X] = 13$

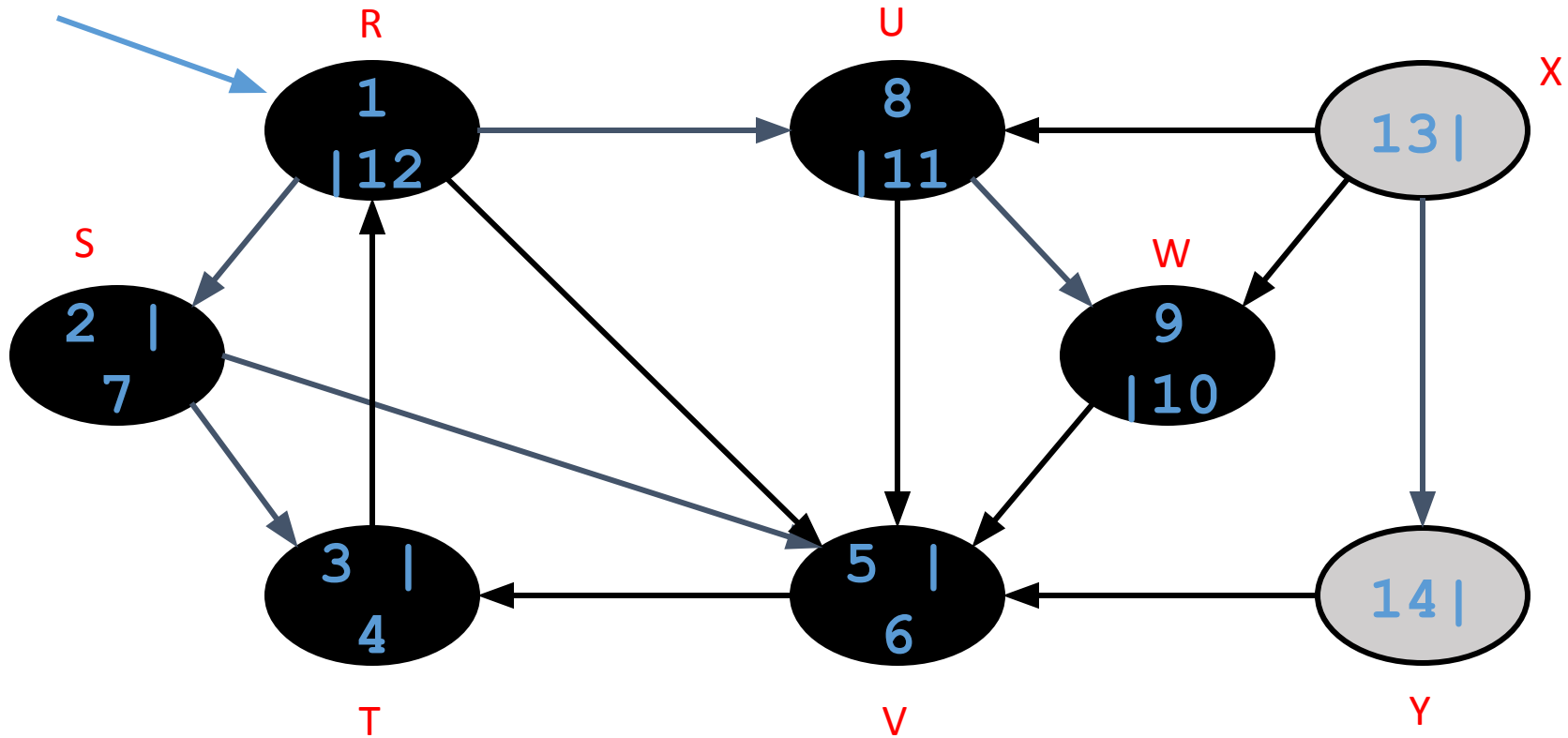




# DFS Example

source  
vertex

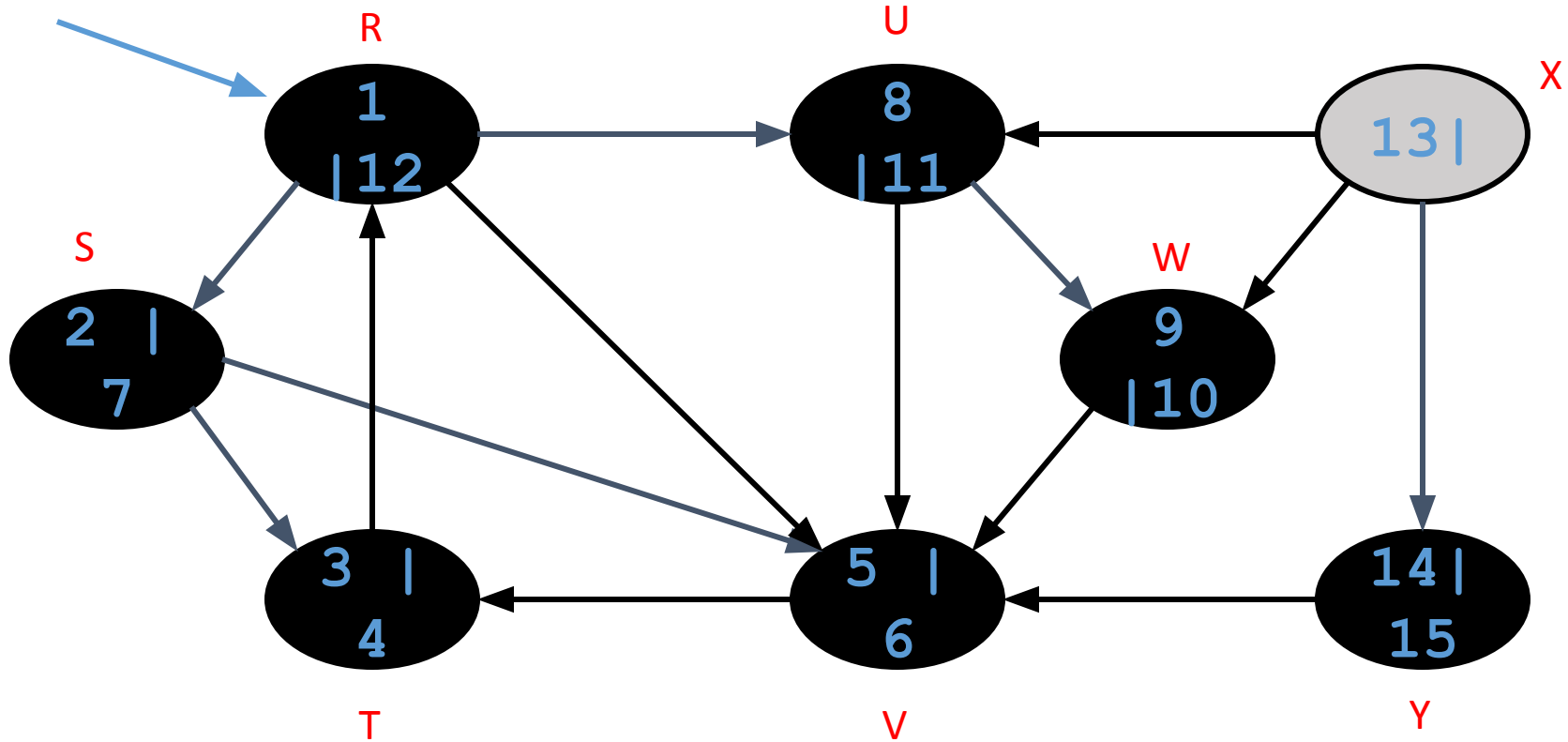
- $\pi[Y] = X$
- $\text{color}[Y] = \text{GREY}$
- $\text{time} = 13 + 1 = 14$
- $d[Y] = 14$



# DFS Example

color[Y] = BLACK  
time = 14 + 1 = 15  
f[S] = 15

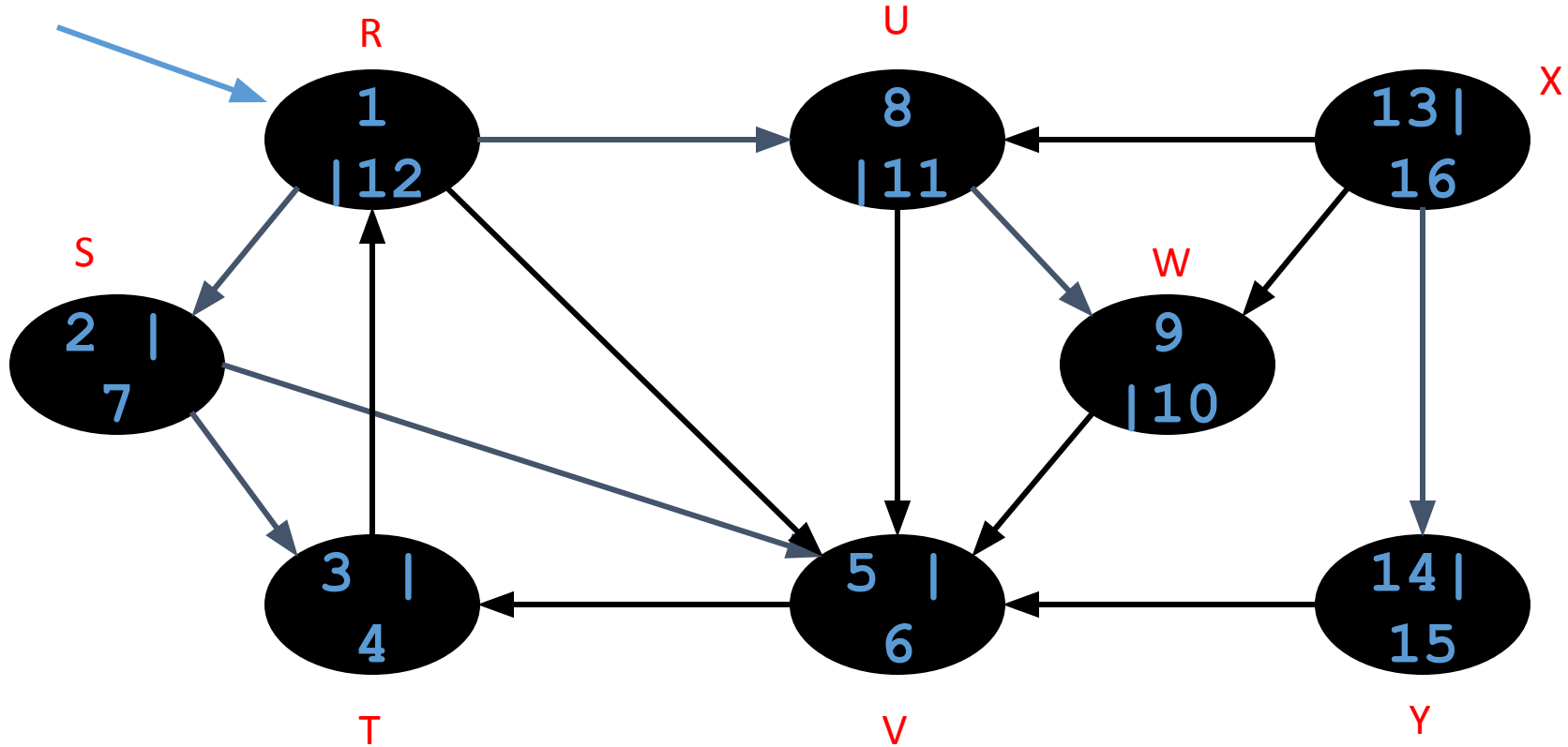
source  
vertex



# DFS Example

color[X] = BLACK  
time = 15 + 1 = 16  
f[S] = 16

source  
vertex



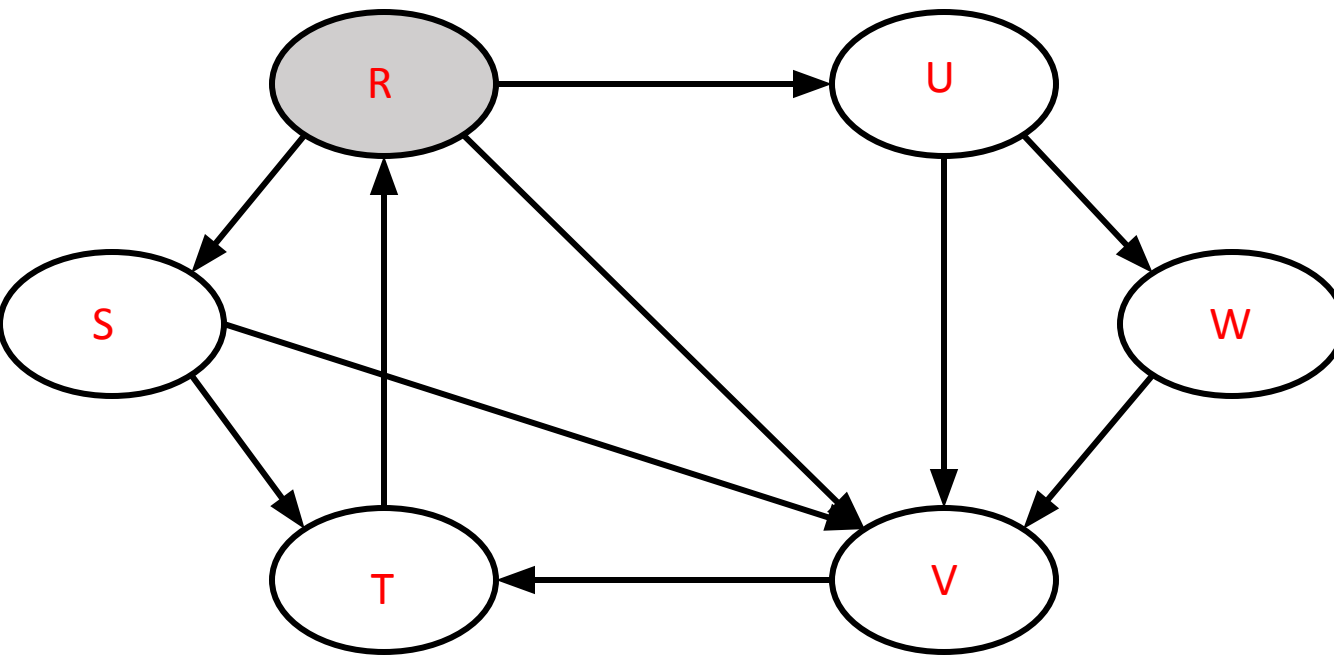
# DFS Iterative Algorithm

- DFS-iterative (G, x):      *//Where G is graph and x is source vertex*
- let S be stack
- S.push( x )      *//Inserting x in stack*
- mark x as *explored*.
- **while** ( S is not empty):
  - v = S.top( )      *//Pop a vertex from stack to visit next. Here vertex v is visited.*
  - S.pop( )
  - *//Push all the neighbours of v in stack that are not explored*
  - **for** all neighbours w of v in Graph G:
    - if** w is not explored :
    - S.push( w )
    - mark w as explored

# DFS Example

**We will traverse the given graph using DFS.**

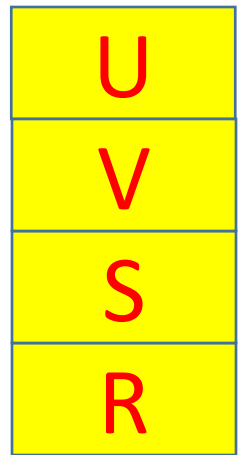
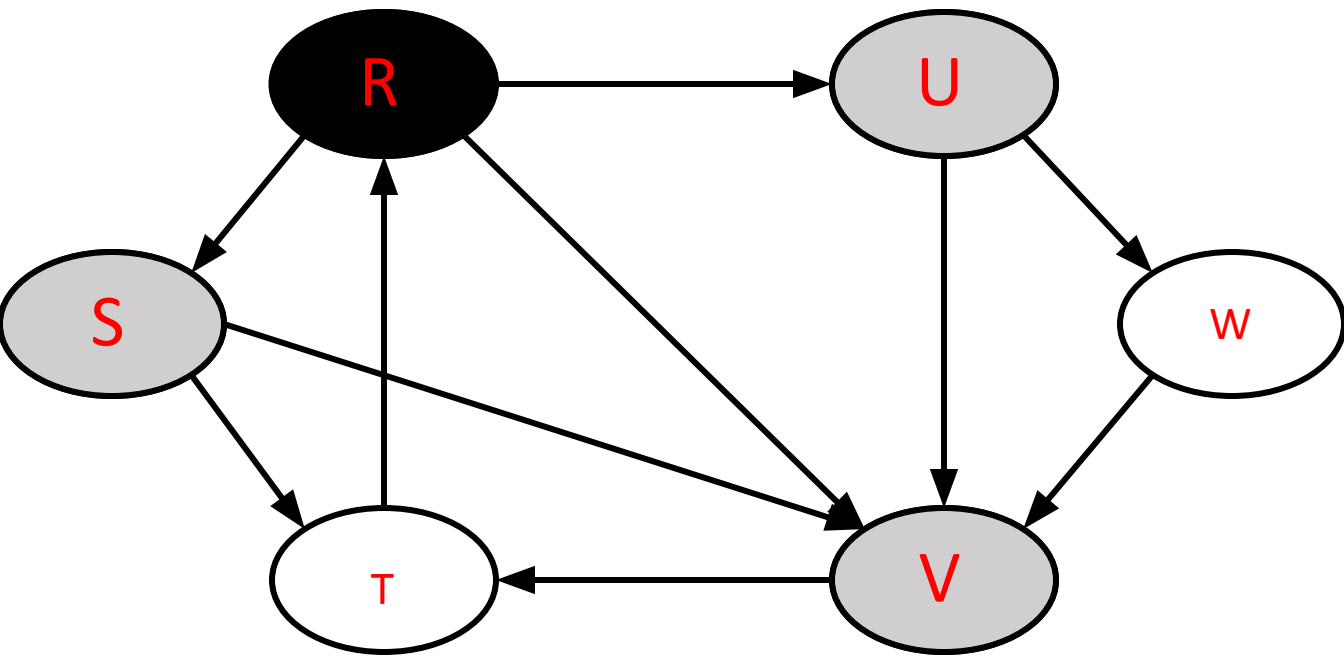
- Let us start processing the graph from vertex R and push its unexplored neighbours onto the stack.



**R**

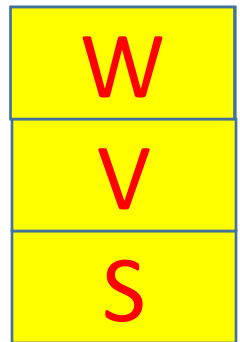
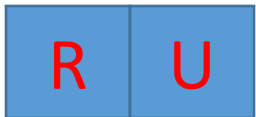
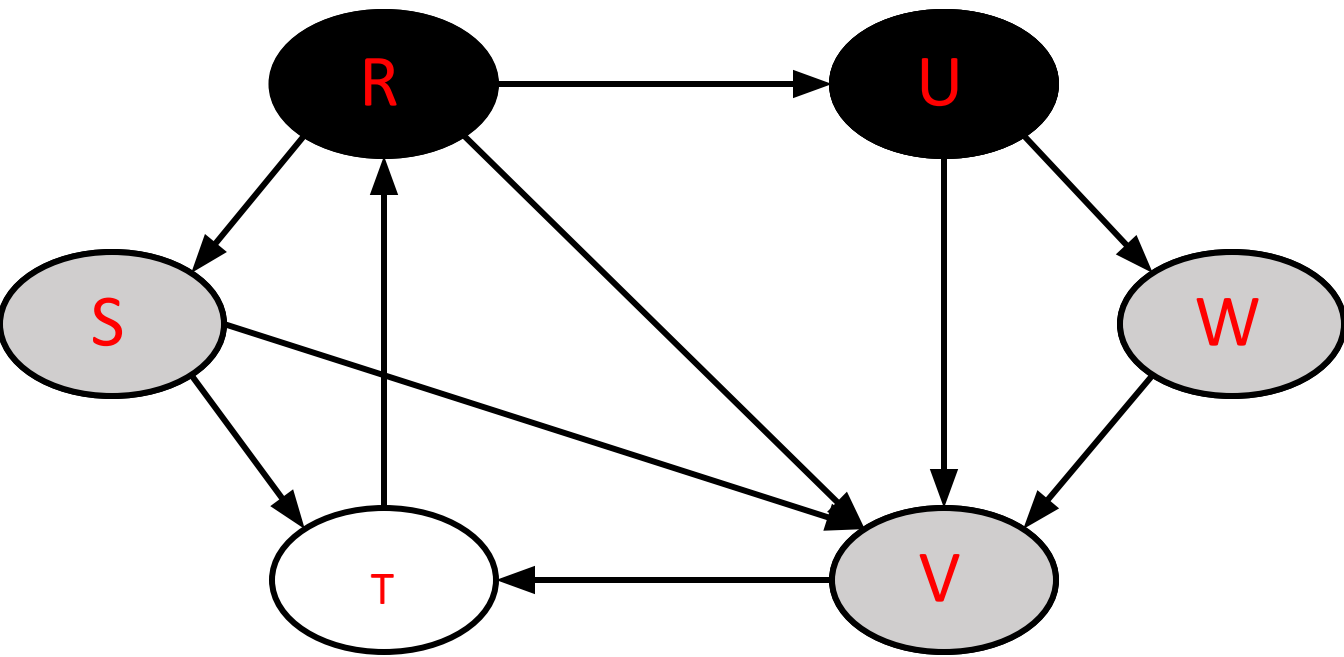
# DFS Example

- Now POP node R from the stack, mark it as visited and push all the explored neighbours onto the stack. All the neighbours which are pushed onto the stack must be marked as gray.



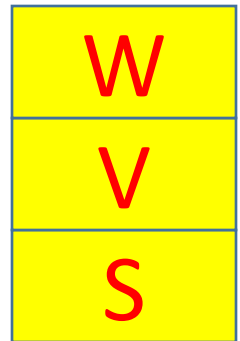
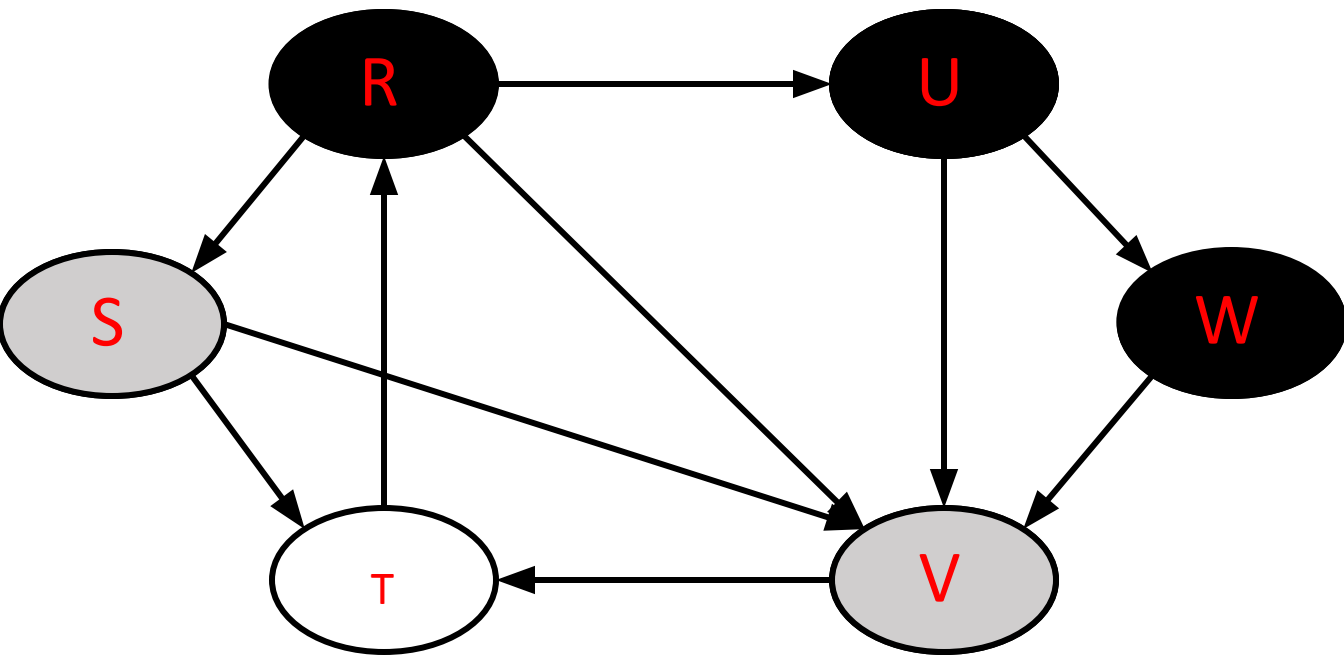
# DFS Example

- Now POP node U from the stack, mark it as visited and push all the unexplored neighbours onto the stack. All the neighbours which are pushed onto the stack must be marked as gray.



# DFS Example

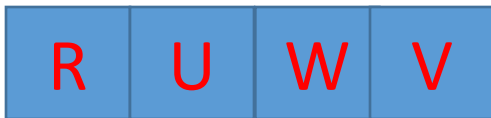
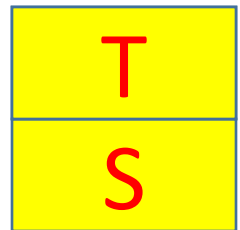
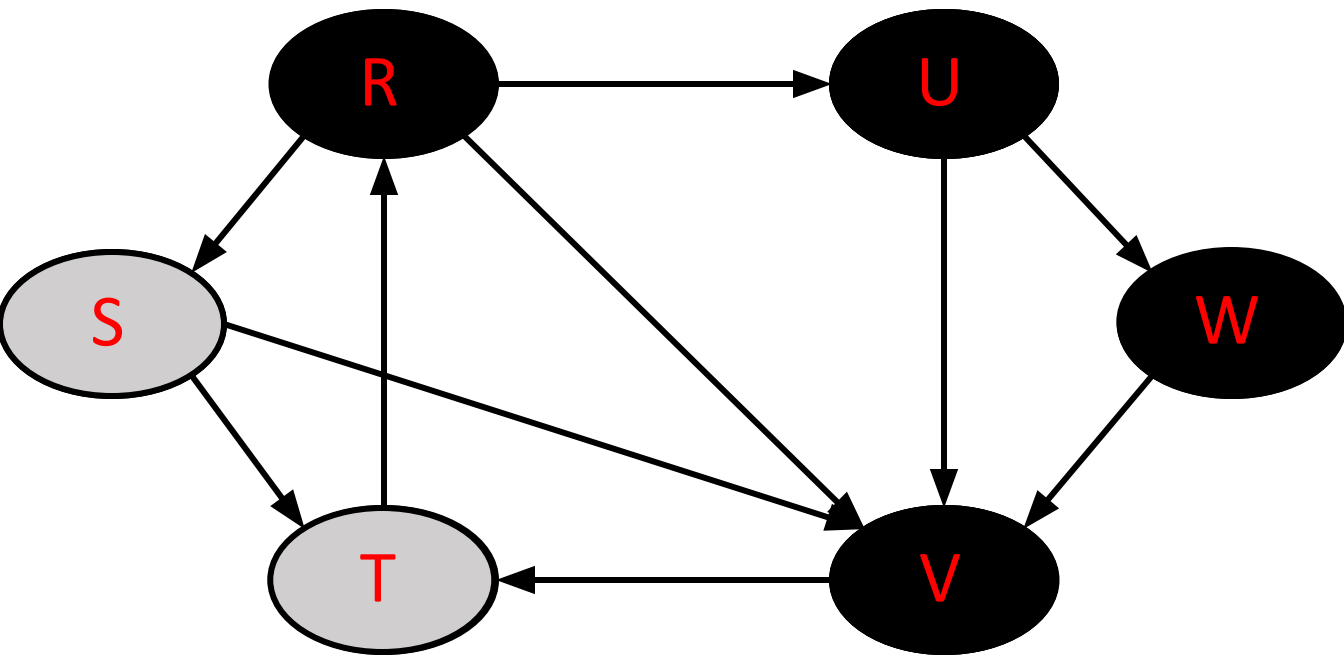
- Now POP node W from the stack, mark it as visited and push all the unexplored neighbours onto the stack. Here node W has no unexplored neighbours.





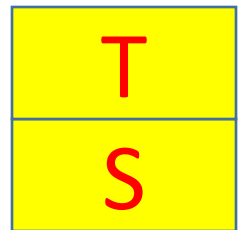
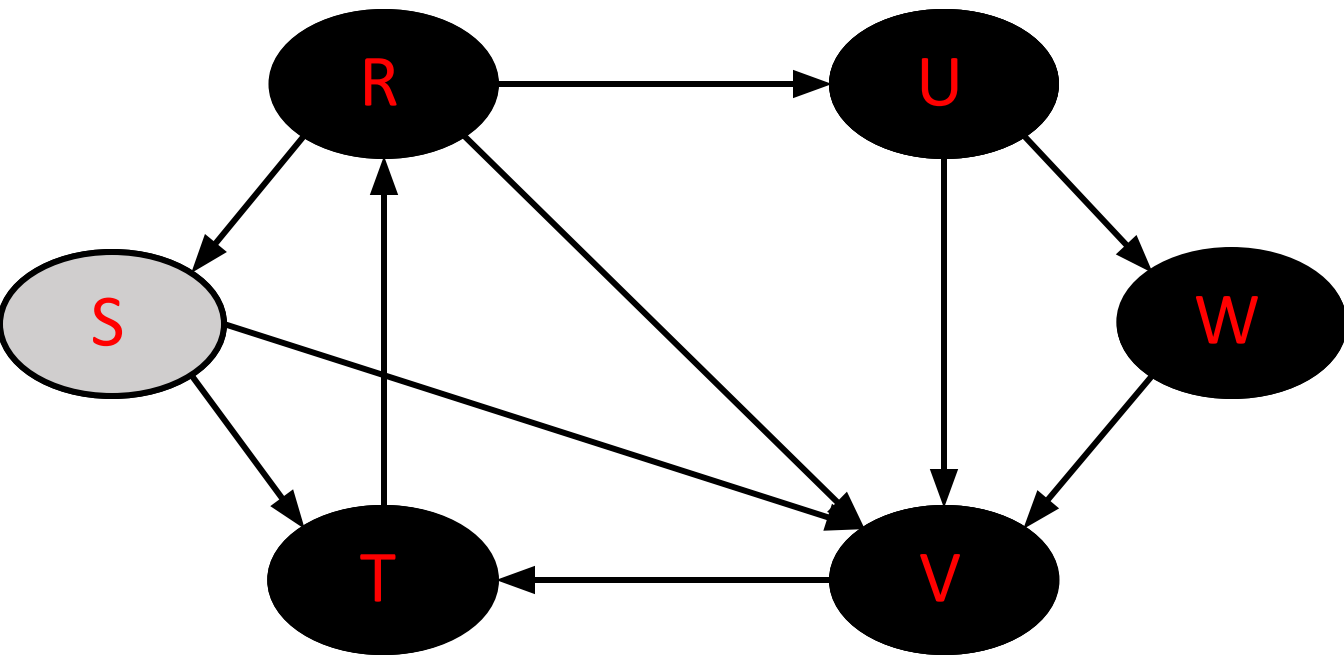
# DFS Example

- Now POP node V from the stack, mark it as visited and push all the unexplored neighbours onto the stack. Here node V has one unexplored neighbour as node T.



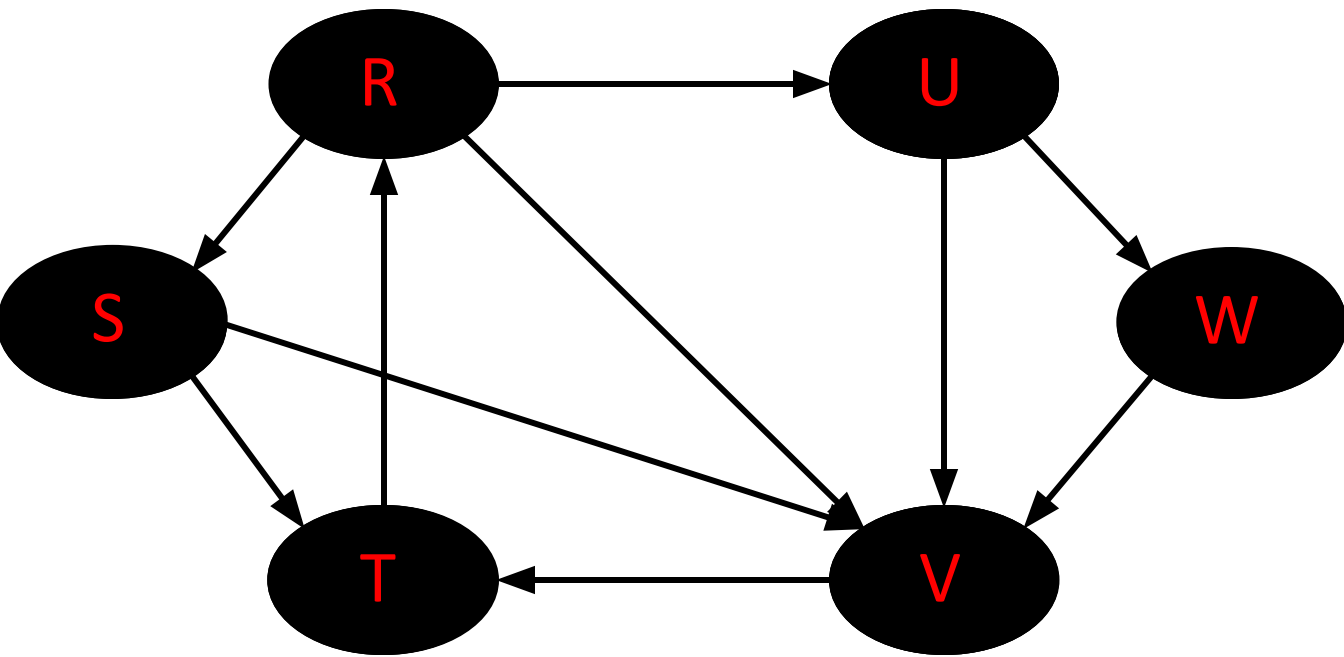
# DFS Example

- Now POP node T from the stack, mark it as visited and push all the unexplored neighbours onto the stack. Here node T has no unexplored neighbours.



# DFS Example

- Now POP node S from the stack, mark it as visited and push all the unexplored neighbours onto the stack. Here node S has no unvisited neighbours.



S

R	U	W	V	T	S
---	---	---	---	---	---



This is the final DFS traversal order

# Applications of DFS

- ❑ **Trees: preorder traversal**

- ❑ **Graphs:**

  - ❑ **Connectivity**

  - ❑ **Biconnectivity – articulation points**

  - ❑ **Euler graphs**

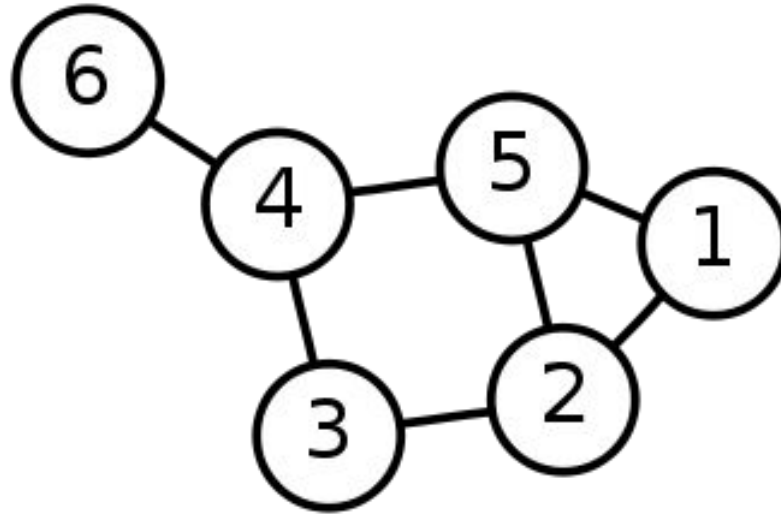
  - ❑ **cycle detection in graphs**

  - ❑ **solving puzzles with only one solution, such as a maze or a sudoku puzzle**

# Shortest Path Algorithms

# Single-Source Shortest Path Problem

**Single-Source Shortest Path Problem** - The problem of finding shortest paths from a source vertex  $v$  to all other vertices in the graph.



# Dijkstra's algorithm

# Dijkstra's algorithm

**Dijkstra's algorithm** - is a solution to the single-source shortest path problem in graph theory.

Works on both directed and undirected graphs. However, all edges must have **nonnegative weights**.

**Input:** Weighted graph  $G=\{E,V\}$  and source vertex  $v \in V$ , such that all edge weights are nonnegative

**Output:** Lengths of shortest paths (or the shortest paths themselves) from a given source vertex  $v \in V$  to all other vertices



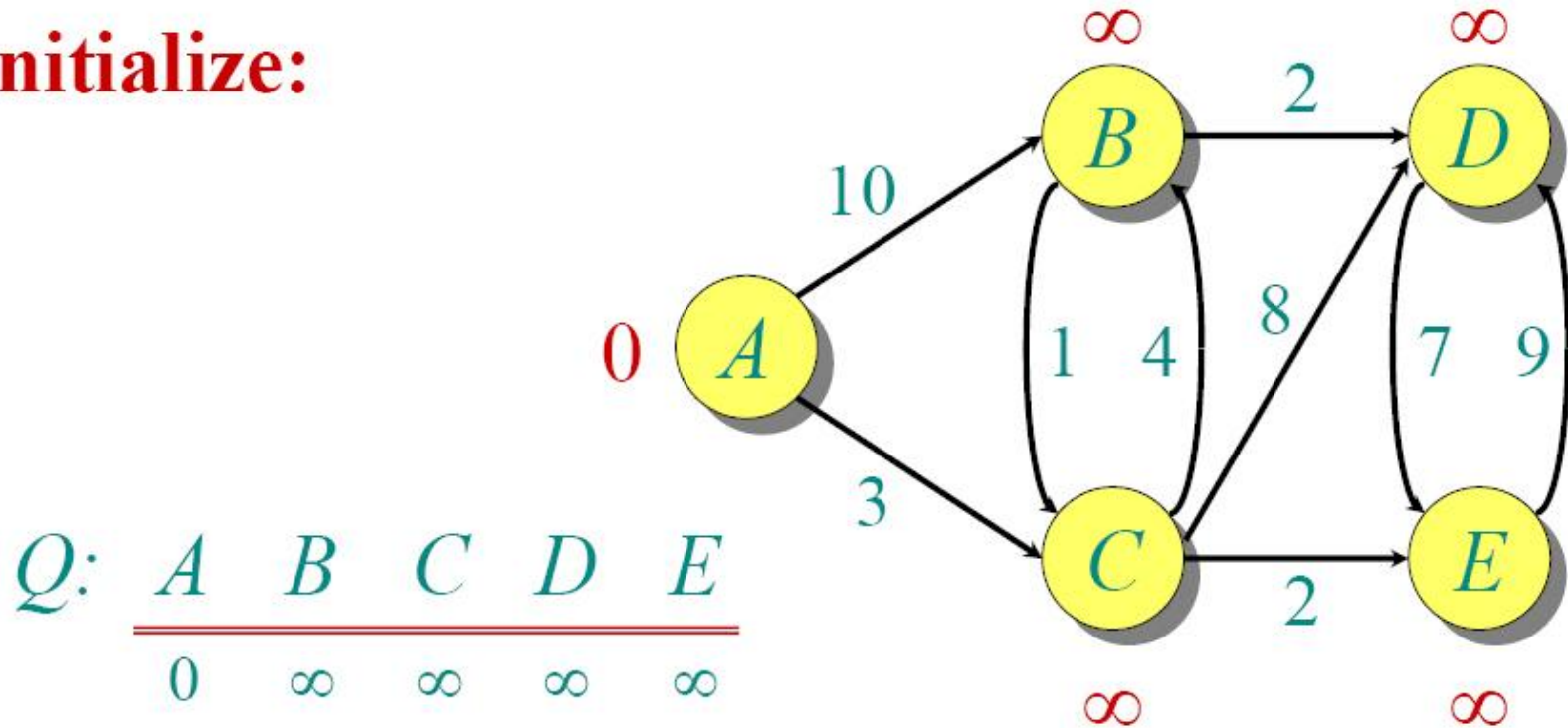
# Dijkstra's algorithm - Pseudocode

```
dist[s] ← 0                (distance to source vertex is zero)
for all v ∈ V - {s}
  do dist[v] ← ∞           (set all other distances to infinity)
S ← ∅                      (S, the set of visited vertices is initially empty)
Q ← V                      (Q, the queue initially contains all vertices)
while Q ≠ ∅                (while the queue is not empty)
  do u ← mindistance(Q, dist) (select the element of Q with the min. distance)
  S ← S ∪ {u}              (add u to list of visited vertices)
  for all v ∈ neighbors[u]
    do if dist[v] > dist[u] + w(u, v) (if new shortest path found)
       then d[v] ← d[u] + w(u, v)   (set new value of shortest path)

return dist
```

# Dijkstra Example

**Initialize:**

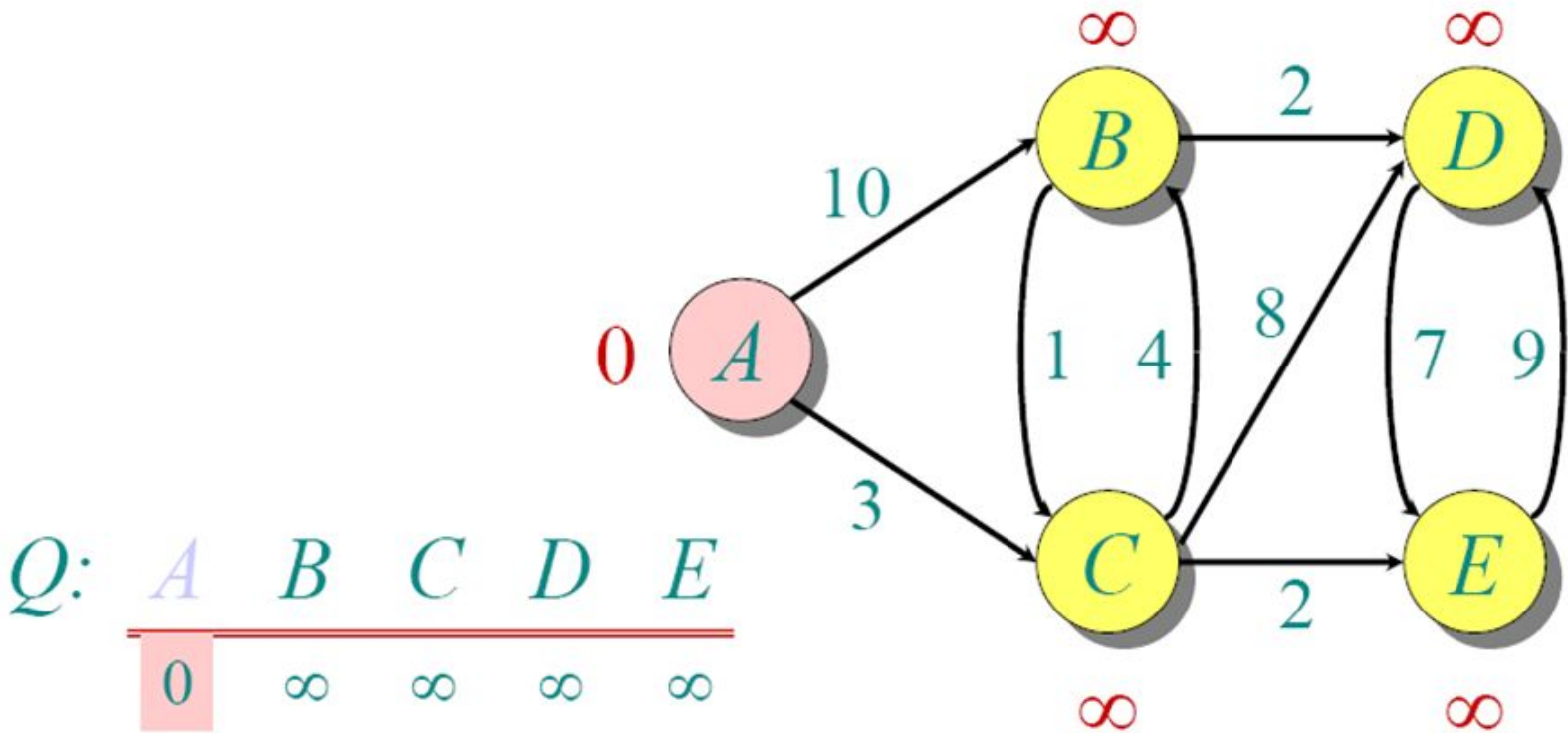


$Q:$ 

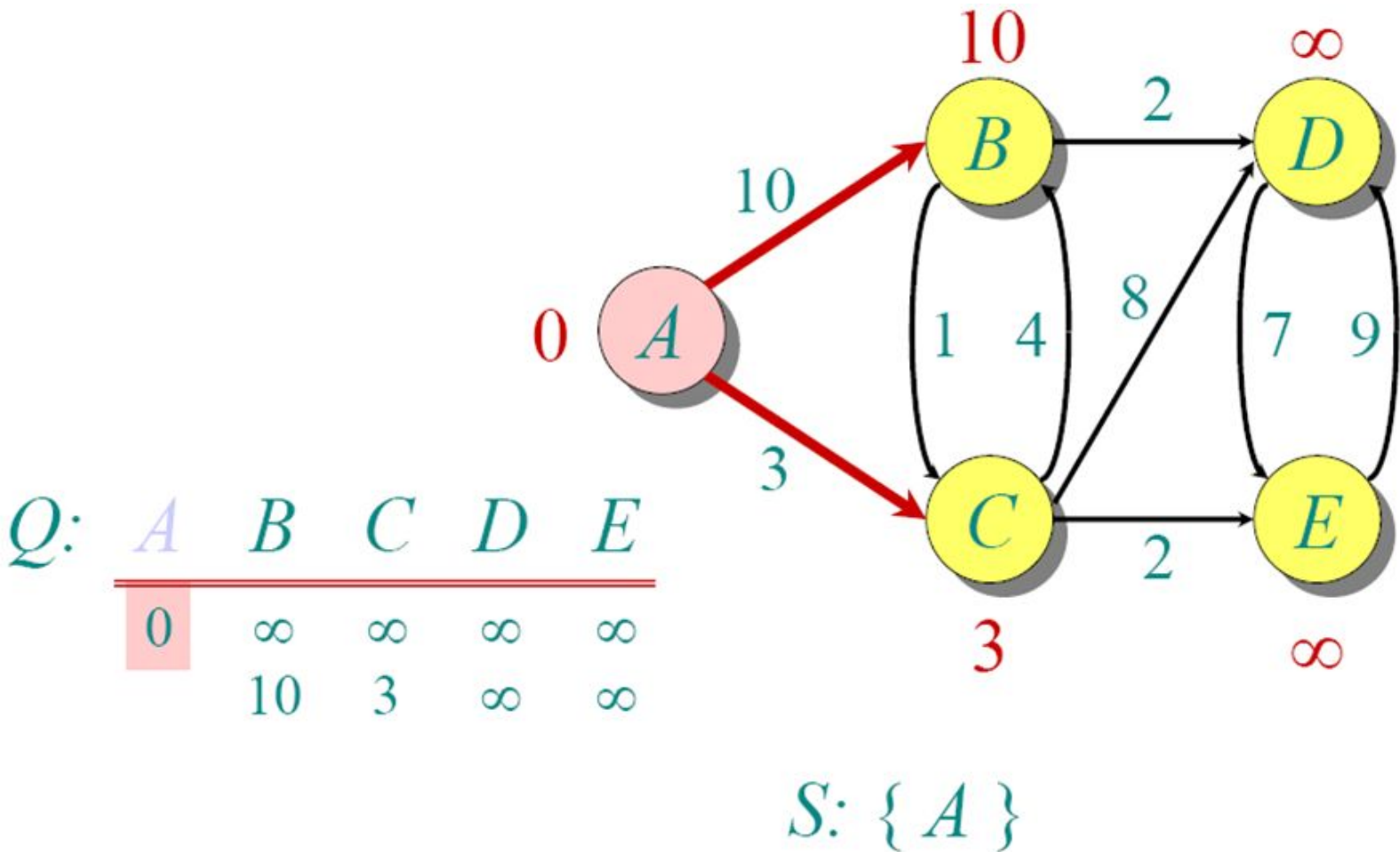
$A$	$B$	$C$	$D$	$E$
0	$\infty$	$\infty$	$\infty$	$\infty$

$S: \{\}$

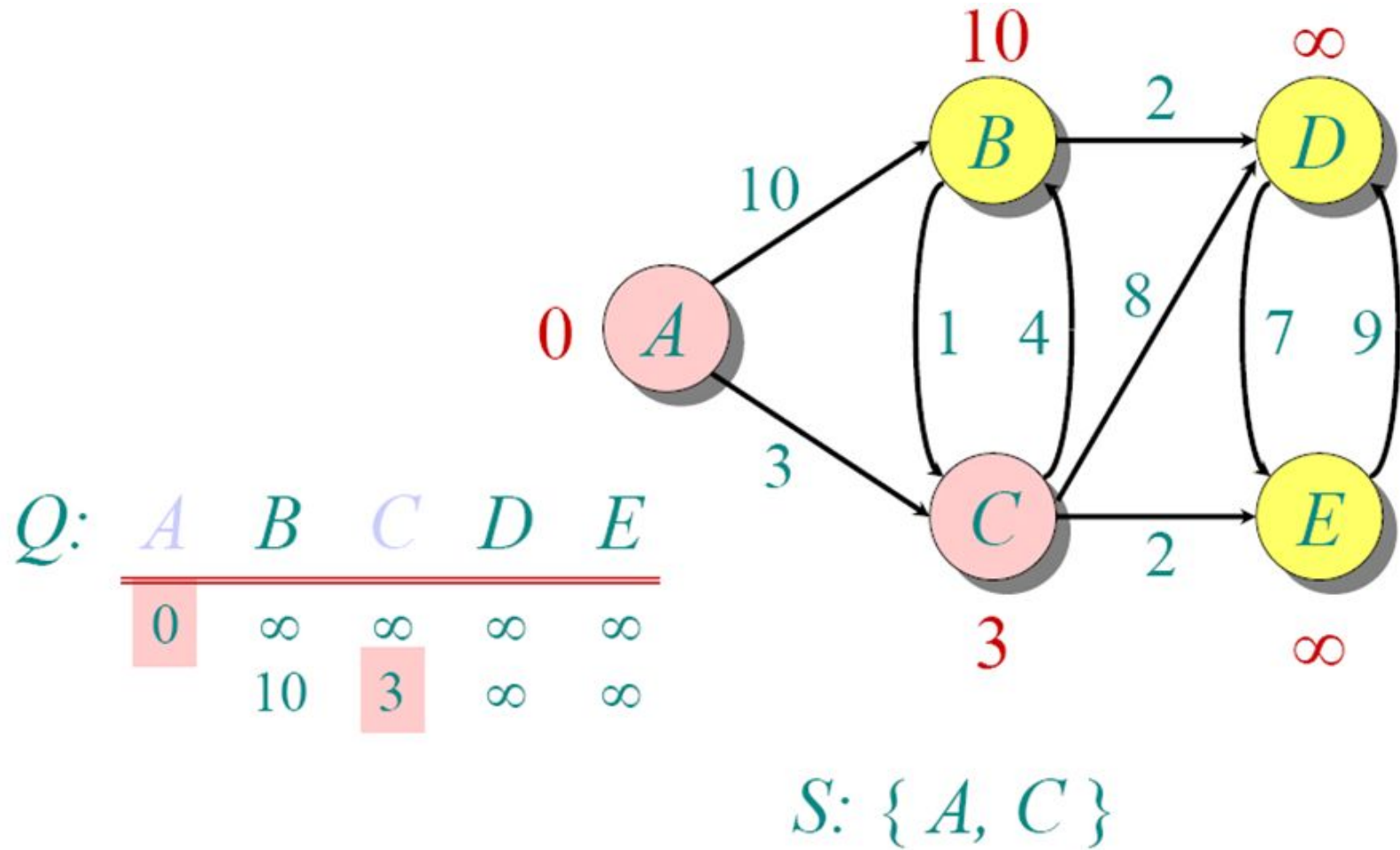
# Dijkstra Example



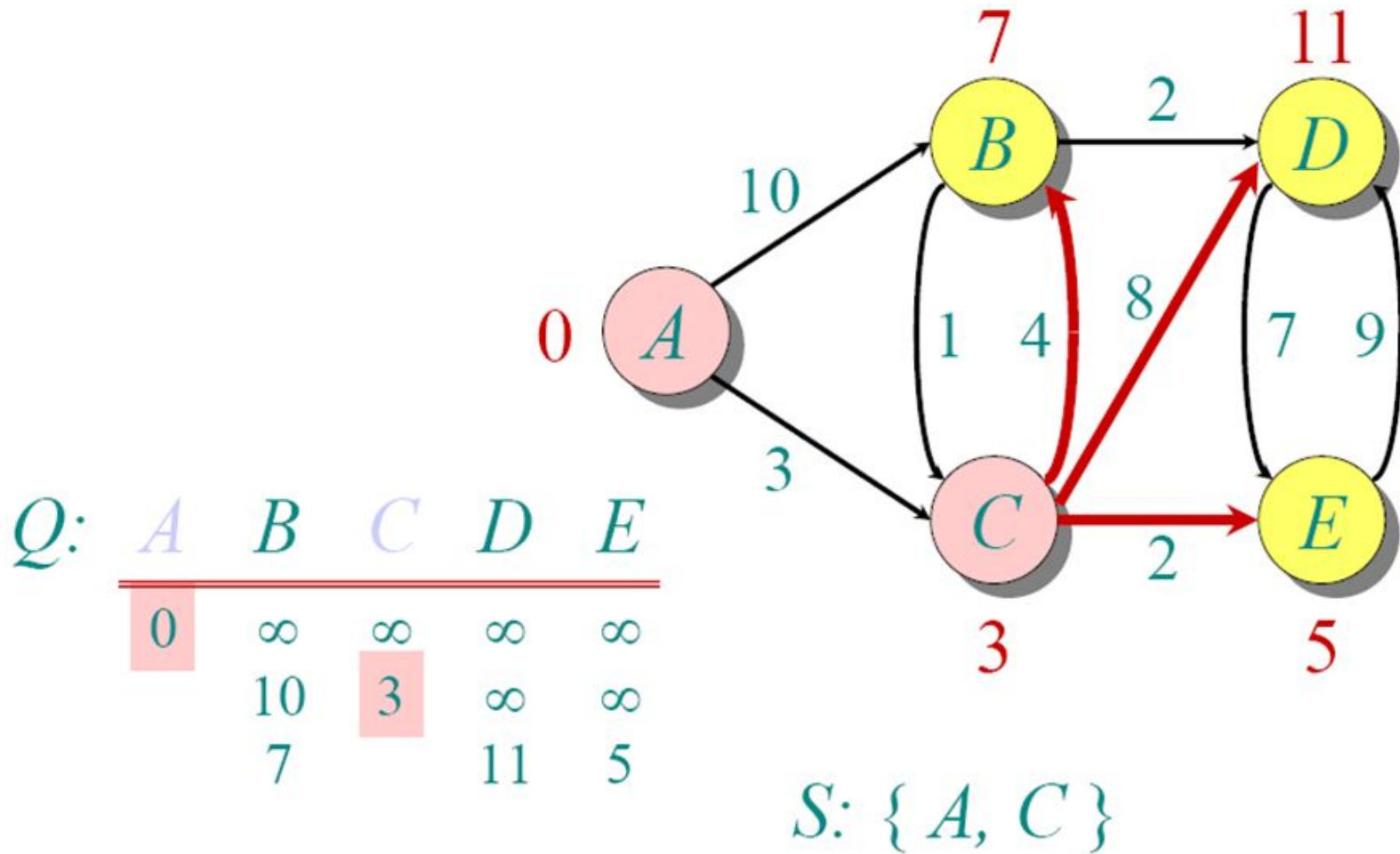
# Dijkstra Example



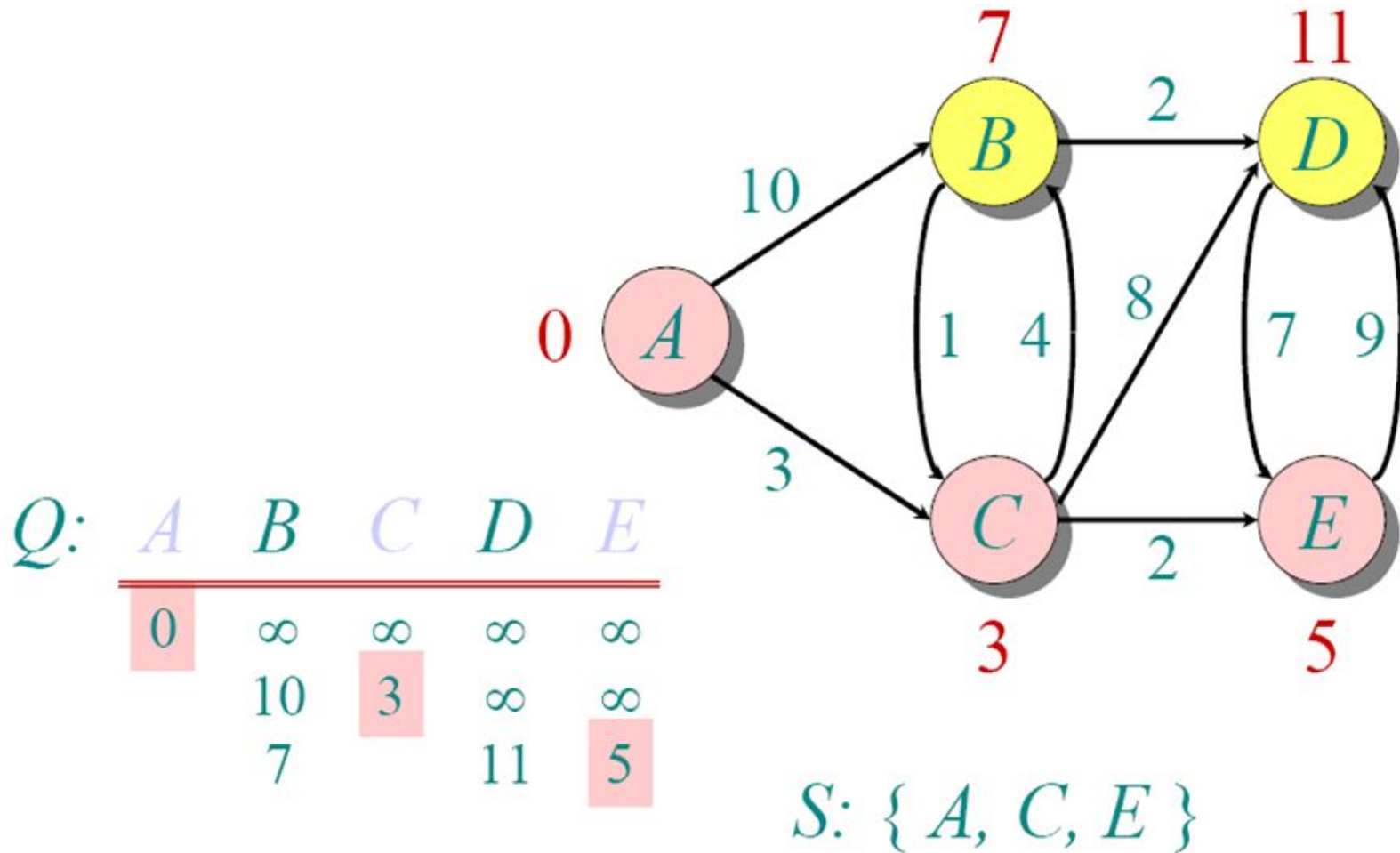
# Dijkstra Example



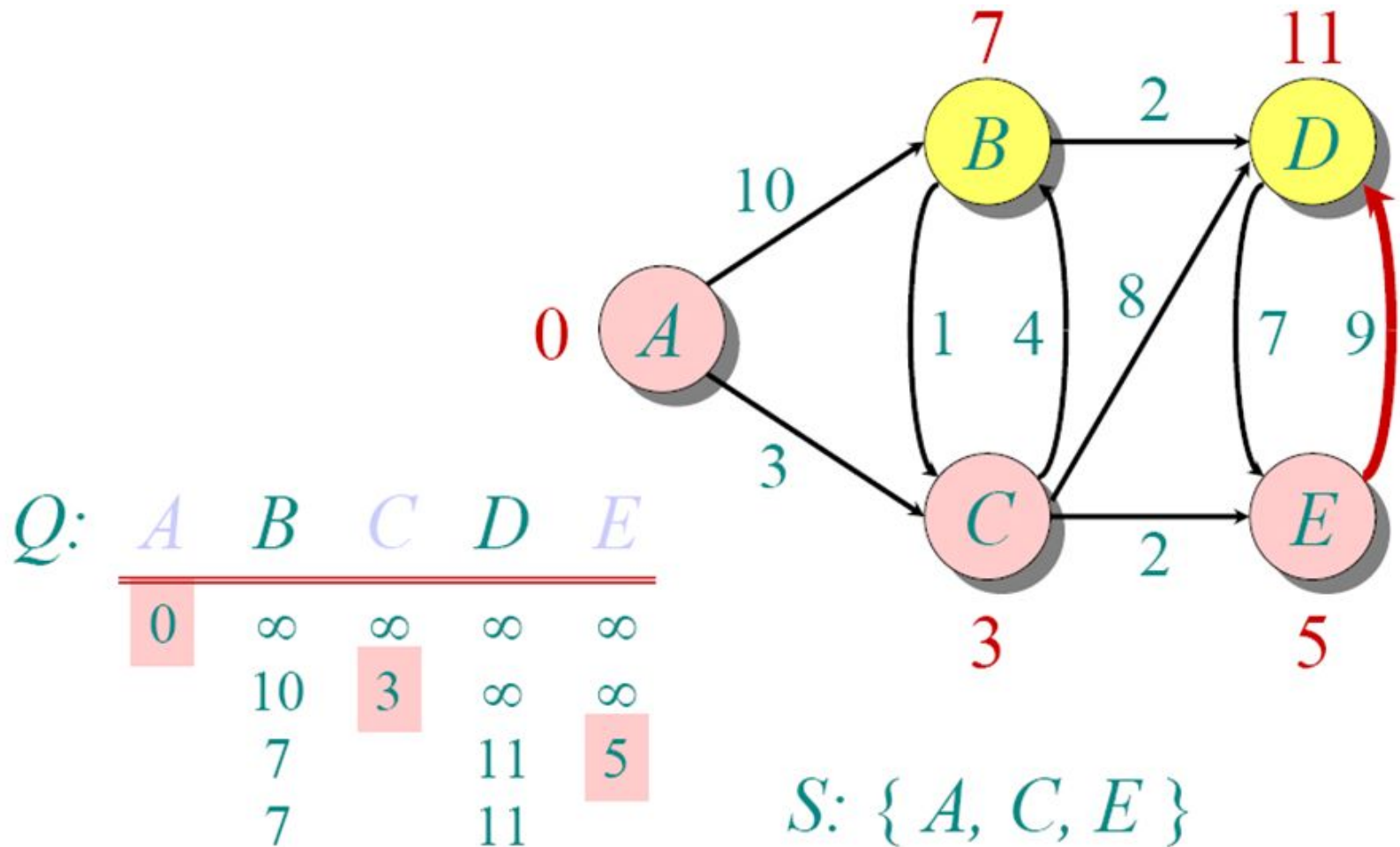
# Dijkstra Example



# Dijkstra Example

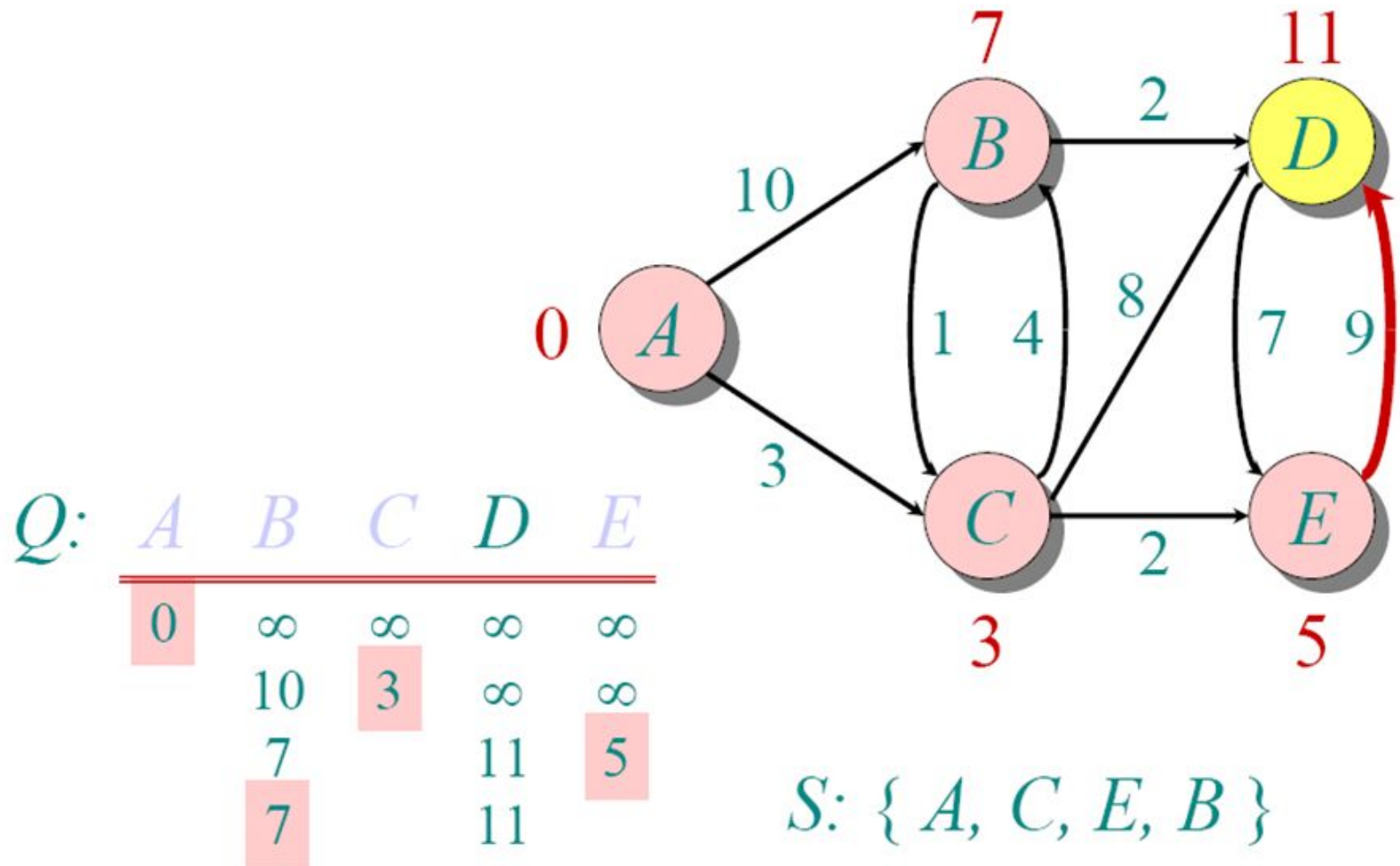


# Dijkstra Example

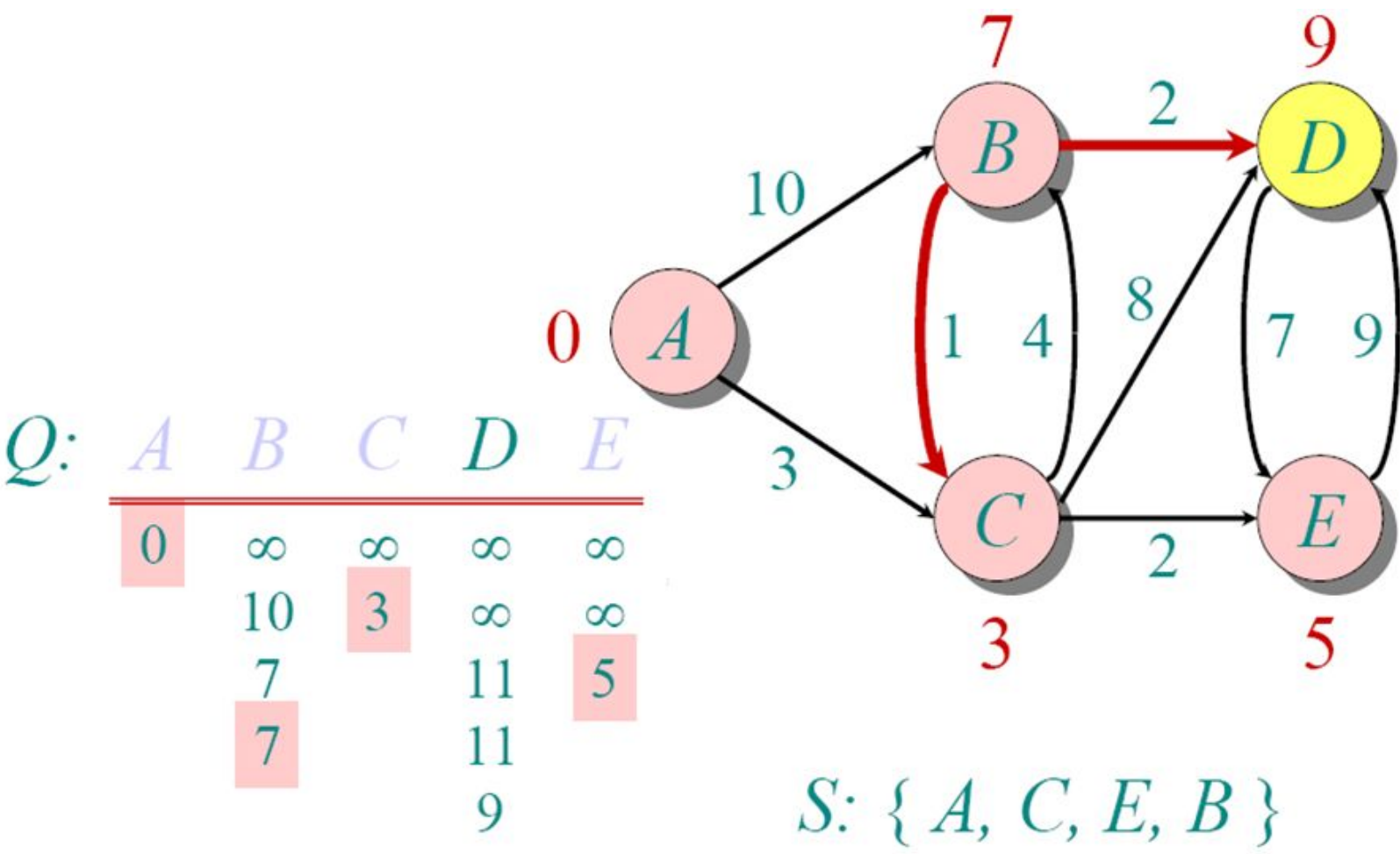




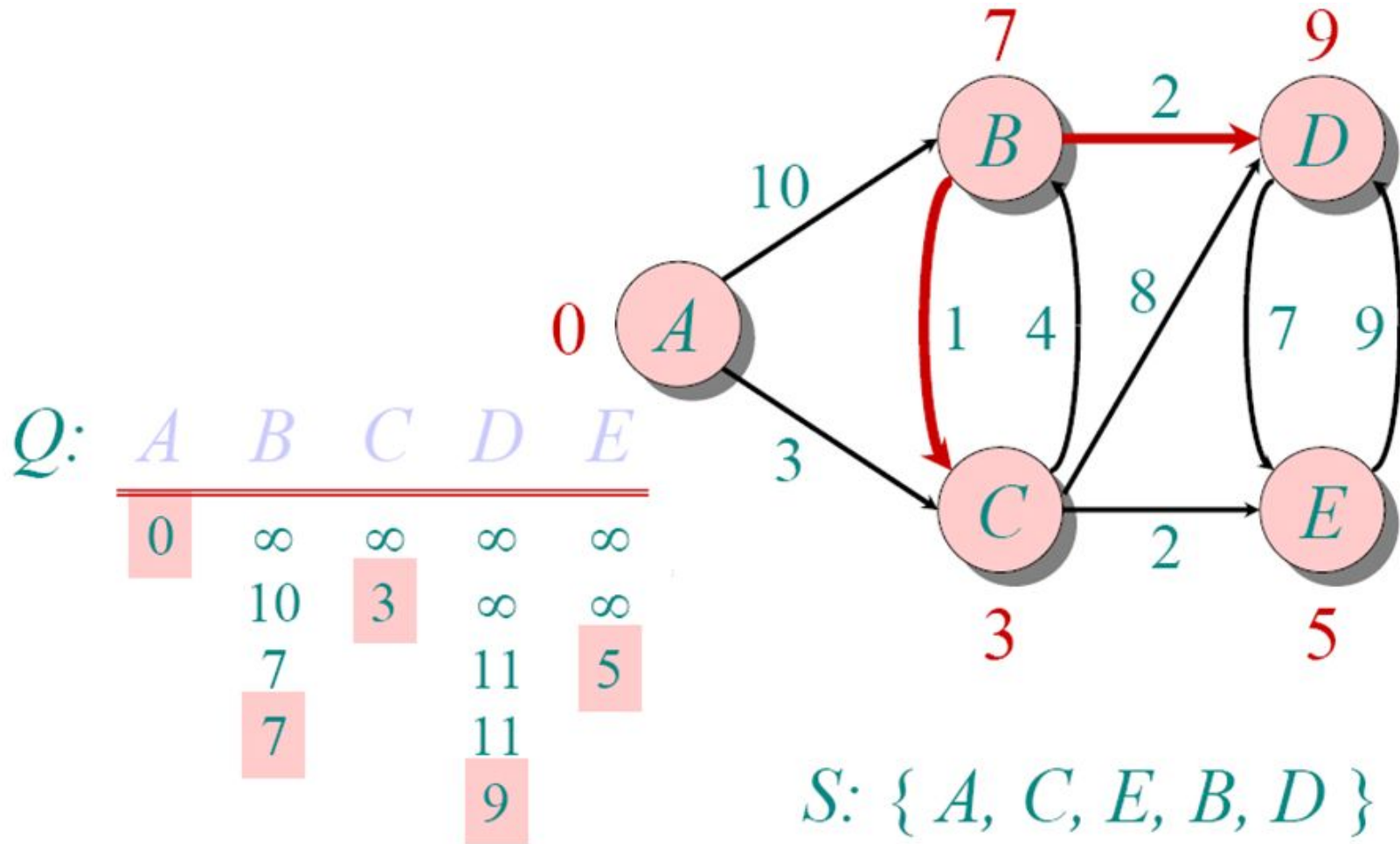
# Dijkstra Example



# Dijkstra Example



# Dijkstra Example



# Dijkstra-Complexity

- Dijkstra's algorithm is structurally identical to BFS. However, it is slower because the priority queue is computationally more demanding than the constant-time pop and push of BFS.
- Runtime analysis using a binary heap:
  - BuildPriorityQueue takes  $O(|V|)$ .
  - ExtractMin and Insert are executed  $|V|$  times each – once for each node, thus it takes  $O(|V|\log|V|)$ .
  - In the worst case, DecreaseKey can be executed for every edge, thus  $|E|$  times, giving  $O(|E|\log|V|)$ . Overall we get  $O((|V|+|E|)\log|V|)$

# Running Time Analysis of Dijkstra's Algorithm

- Look at different Q implementation, as did for Prim's algorithm

- Linear  
Unsorted Array:  $O(V^2+E)$
- Binary Heap:  $O(V \lg V + E \lg V) = O(E \lg V)$
- Fibonacci heap:  $O(V \lg V + E)$

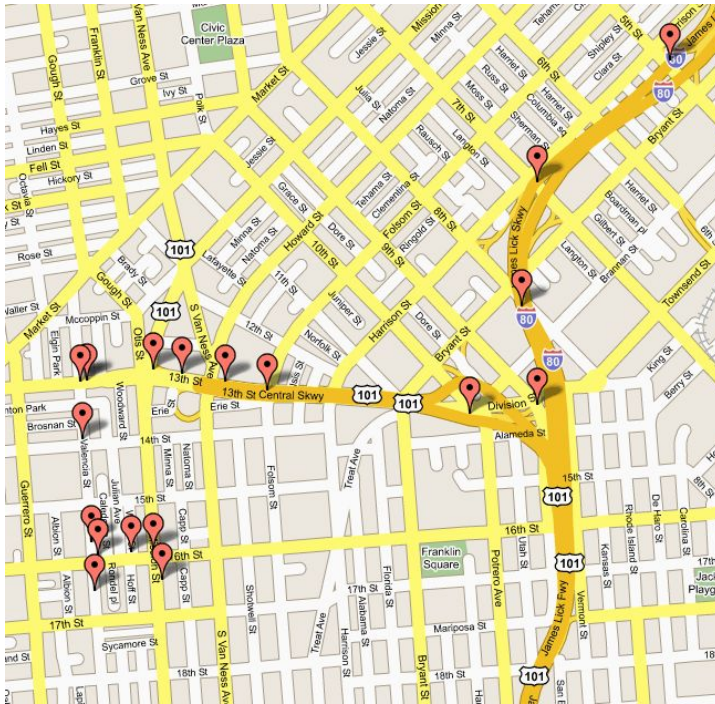
# DIJKSTRA'S ALGORITHM - WHY USE IT?

- As mentioned, Dijkstra's algorithm calculates the shortest path to every vertex.
- However, it is about as computationally expensive to calculate the shortest path from vertex  $u$  to every vertex using Dijkstra's as it is to calculate the shortest path to some particular vertex  $v$ .
- Therefore, anytime we want to know the optimal path to some other vertex from a determined origin, we can use Dijkstra's algorithm.

# Applications of Dijkstra's Algorithm

- Traffic Information Systems are most prominent use
- Mapping (Map Quest, Google Maps)
- Routing Systems

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## Router A Routing Table

To go to network:	Route via port #:
10.0.0.0	1
20.0.0.0	2
30.0.0.0	3
40.0.0.0	1

