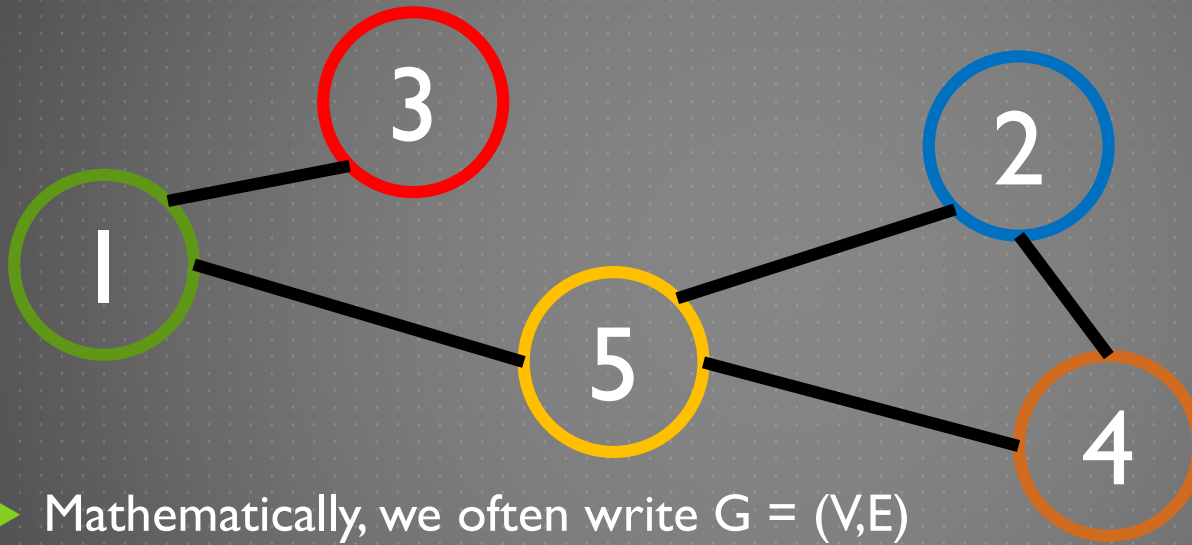


GRAPH

Yik Wai Pan

GRAPH

- ▶ A set of vertices (or nodes) linked by edges



- ▶ Mathematically, we often write $G = (V, E)$
 - ▶ V : set of vertices, so $|V|$ = number of vertices
 - ▶ E : set of edges, so $|E|$ = number of edges

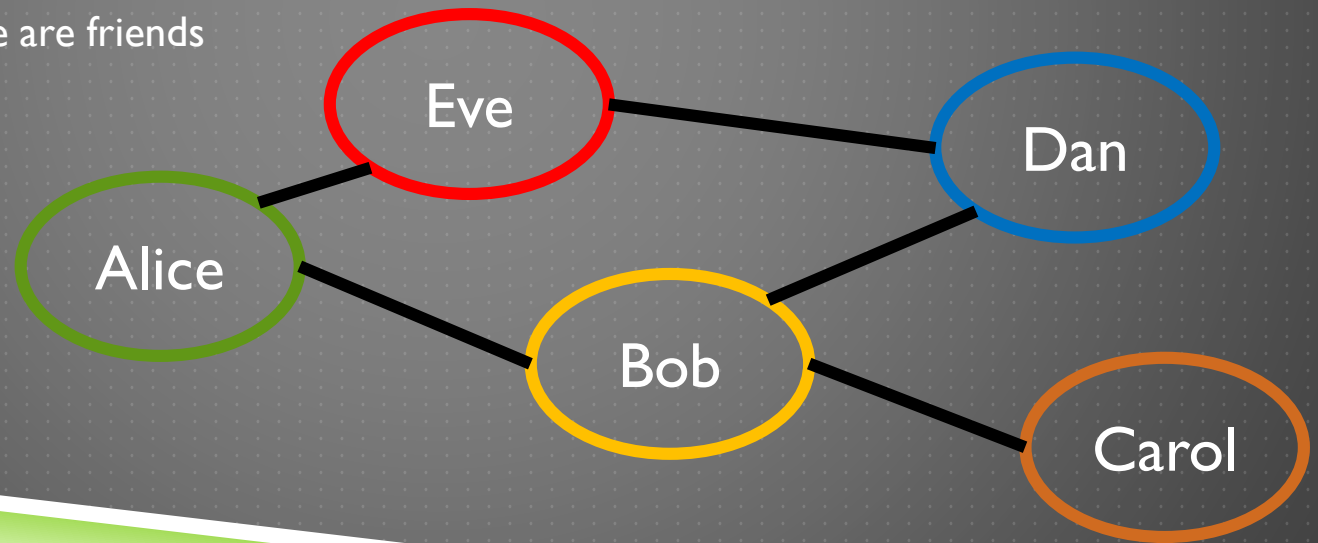
USAGE

- ▶ To present the relationships between different objects/elements in a mathematical way
- ▶ Examples:
 - ▶ Social Networks
 - ▶ Maps
 - ▶ Grids
 - ▶ States

USAGE - EXAMPLE

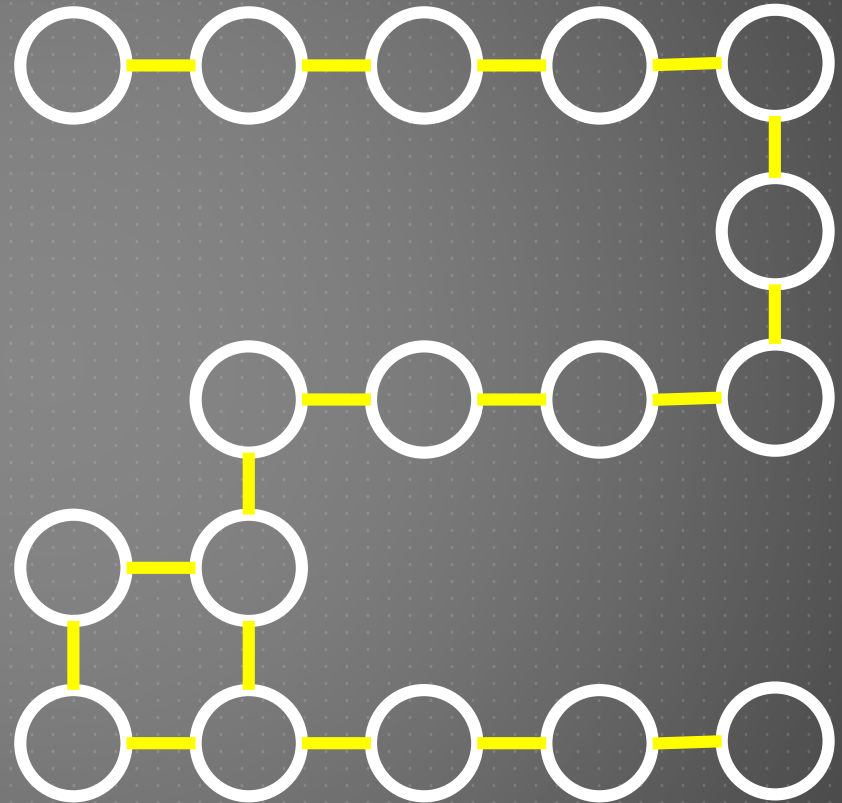
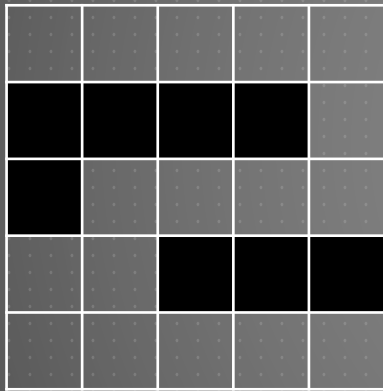
▶ Social Networks

- ▶ Alice and Bob are friends
- ▶ Bob and Carol are friends
- ▶ Bob and Dan are friends
- ▶ Dan and Eve are friends
- ▶ Alice and Eve are friends



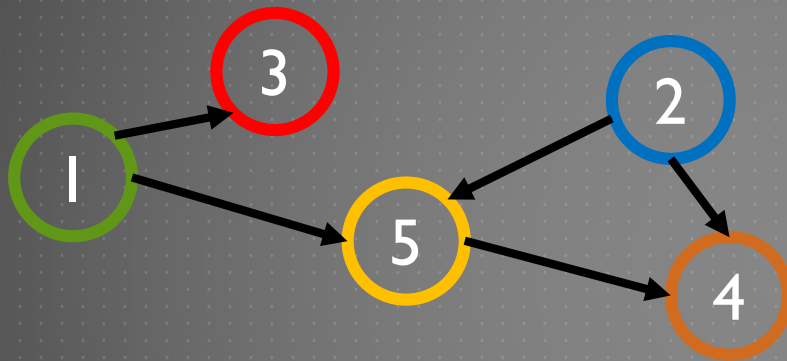
USAGE - EXAMPLE

► Maze

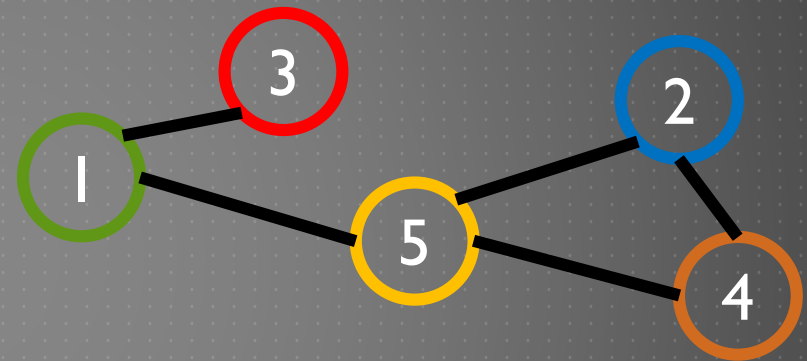


GRAPH

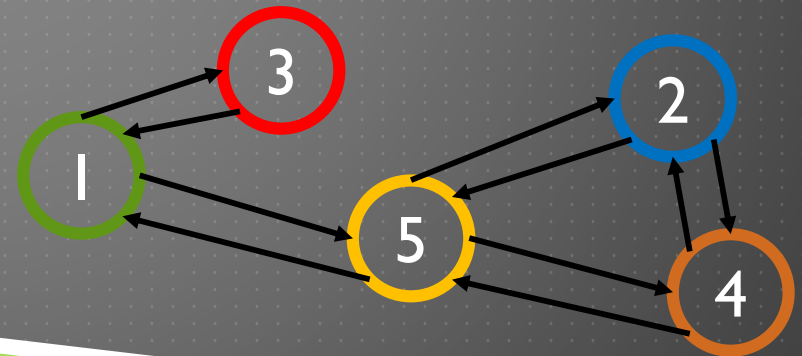
Directed graph:



Undirected graph:

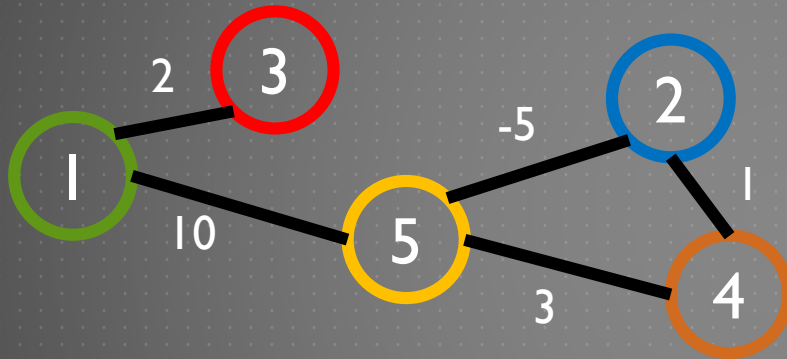


- ▶ You may use two directed edges to represent an undirected edge

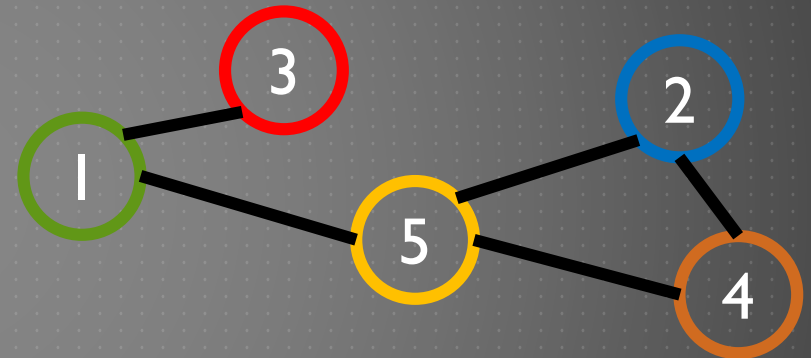


GRAPH

Weighted graph:



Unweighted graph:



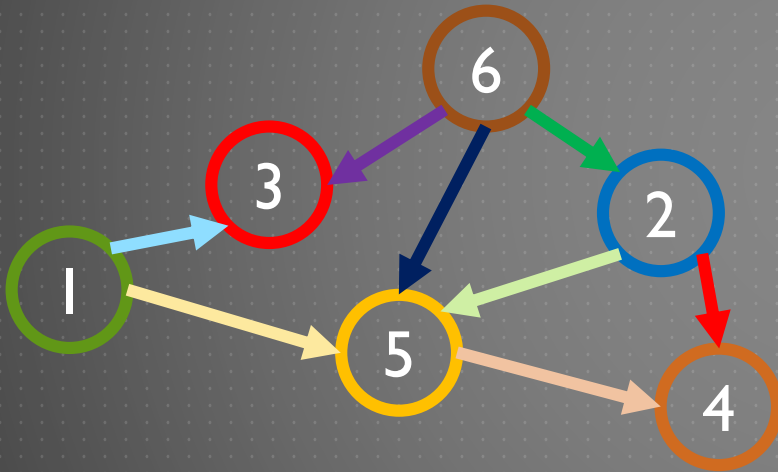
- ▶ You may treat unweighted edges to be weighted edges of equal weights

CONTENT

- ▶ Graph Adjacency Representation
- ▶ Special graphs
- ▶ Graph Traversal
 - ▶ Depth-First Search
 - ▶ Breadth-First Search
- ▶ Topological Sort

ADJACENCY MATRIX

- ▶ Use a 2D array to store the edges
- ▶ $A[i][j] = 0$ if there are no edges from vertex i to vertex j
- ▶ $A[i][j] = 1$ if there are edges from vertex i to vertex j

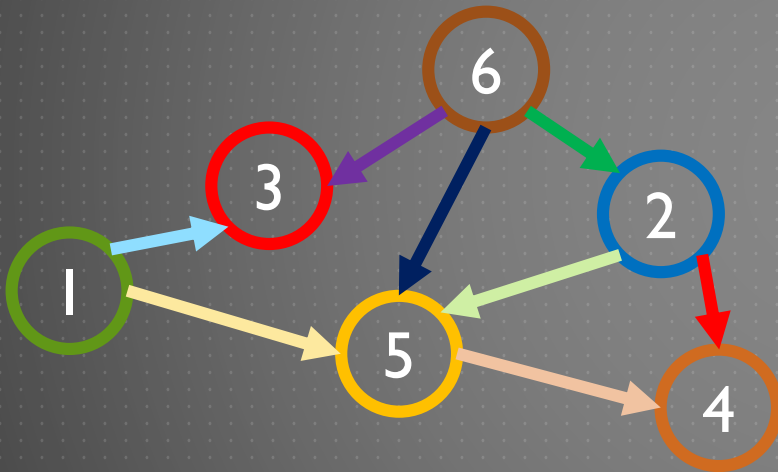


- ▶ Memory Complexity : $O(|V|^2)$

A	1	2	3	4	5	6
1	0	0	1	0	1	0
2	0	0	0	1	1	0
3	0	0	0	0	0	0
4	0	0	0	0	0	0
5	0	0	0	1	0	0
6	0	1	1	0	1	0

EDGE LIST

- ▶ A list of edges

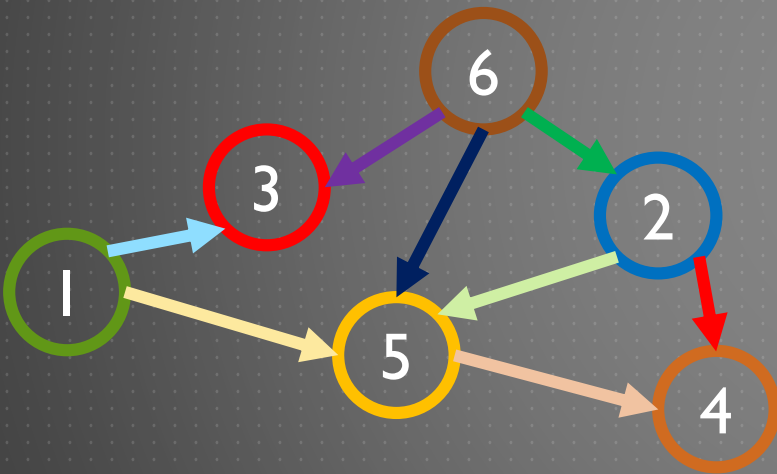


- ▶ Memory Complexity : $O(|E|)$

id	x	y
0	1	3
1	6	3
2	1	5
3	2	5
4	2	4
5	6	2
6	5	4
7	6	5

EDGE LIST

- ▶ You may sort the edges in ascending order of x so that all adjacency nodes of a given node can be easily found



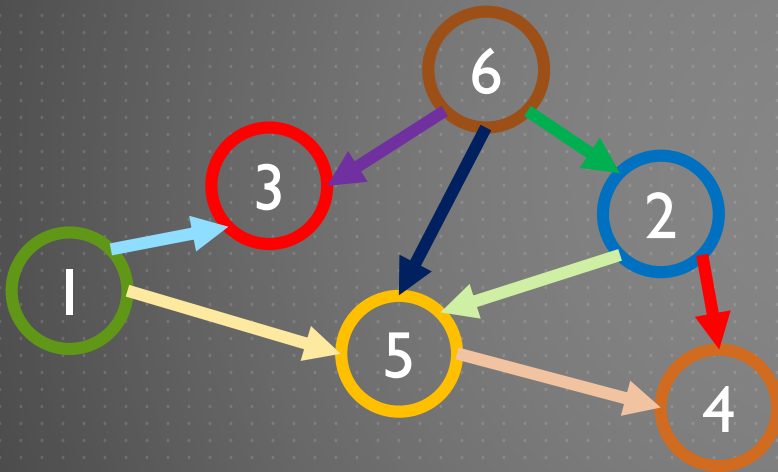
node	first	last
1	0	1
2	2	3
3	4	3
4	4	3
5	4	4
6	5	7

id	x	y
0	1	3
1	1	5
2	2	5
3	2	4
4	5	4
5	6	3
6	6	5
7	6	2

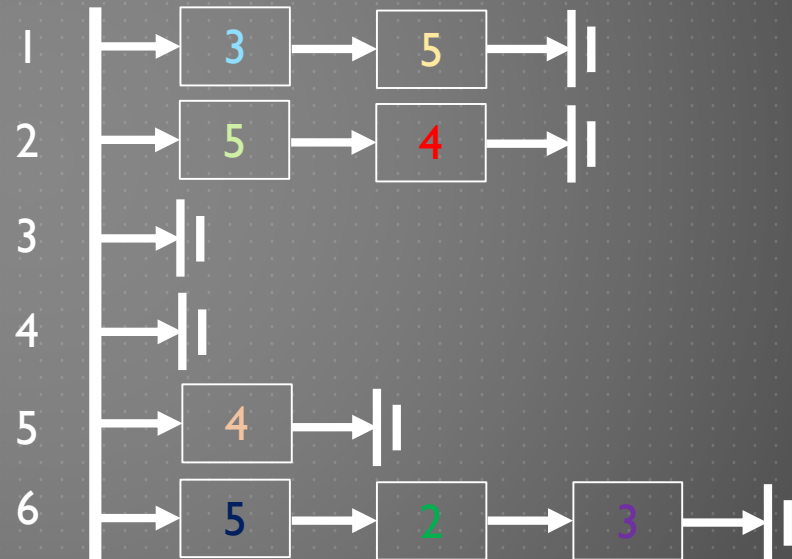
- ▶ Time Complexity : $O(|E| \log |E|)$

ADJACENCY LISTS

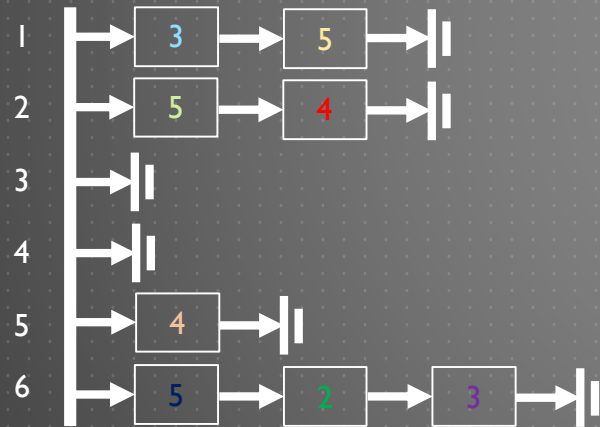
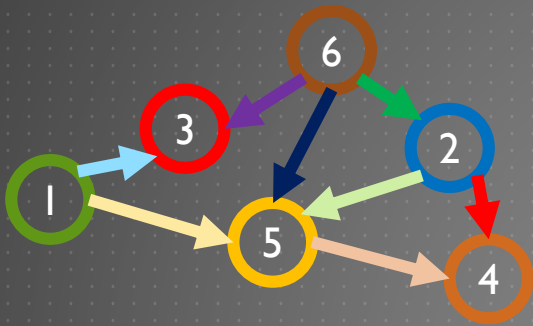
- ▶ Use $|V|$ linked list
- ▶ The i -th linked list stores the vertices connecting to vertex i



- ▶ Memory Complexity : $O(|E|)$



ADJACENCY LISTS-IMPLEMENTATION

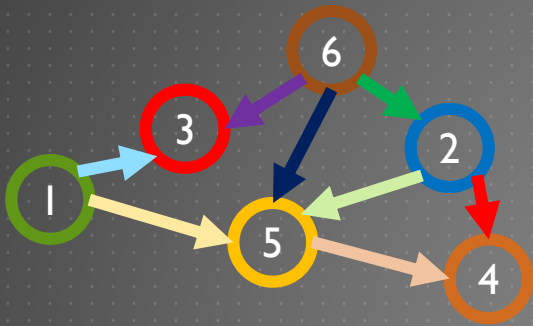


node	first
1	-1
2	-1
3	-1
4	-1
5	-1
6	-1

id	y	next

```
void initialize(){
    for (int i=1;i<=n;i++) first[i]=-1;
}
```

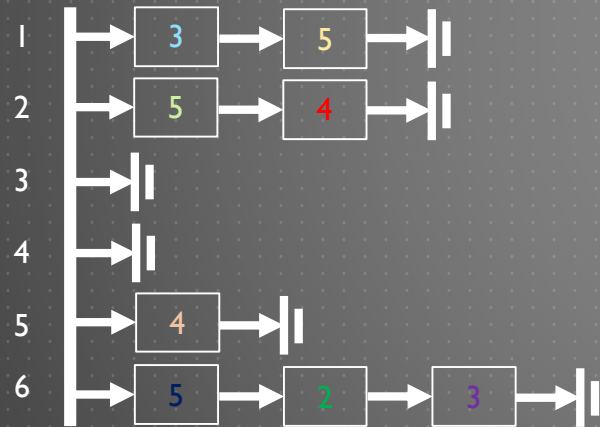
ADJACENCY LISTS-IMPLEMENTATION



► 1->3

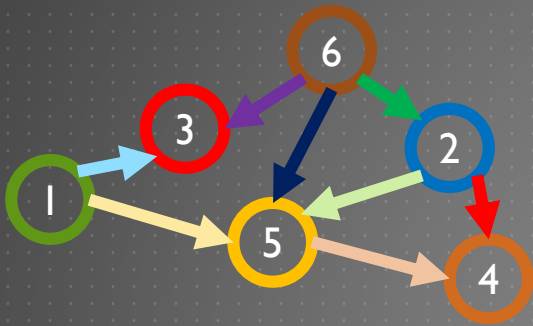
node	first
1	-1
2	-1
3	-1
4	-1
5	-1
6	-1

id	y	next
0	3	



```
void new_edge(int from,int to,int weight){
    v[m]=to;
    w[m]=weight;
    next[m]=first[from];
    first[from]=m;
    m++;
}
```

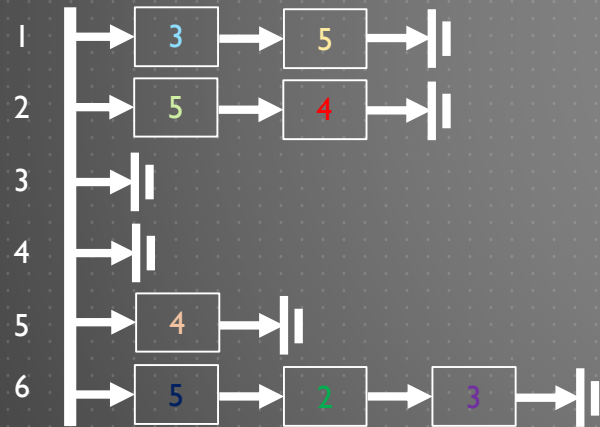
ADJACENCY LISTS-IMPLEMENTATION



► 6->3

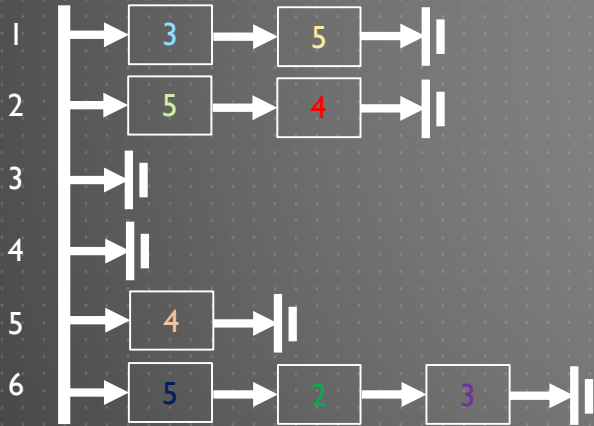
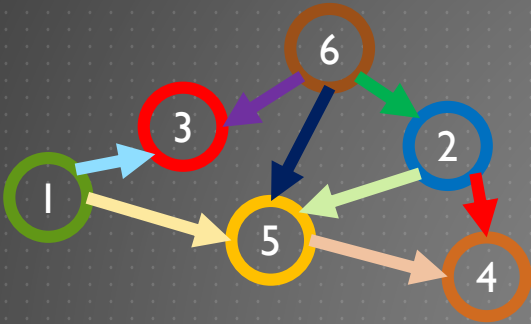
node	first
1	0
2	-1
3	-1
4	-1
5	-1
6	1

id	y	next
0	3	-1
1	3	-1



```
void new_edge(int from,int to,int weight){
    v[m]=to;
    w[m]=weight;
    next[m]=first[from];
    first[from]=m;
    m++;
}
```

ADJACENCY LISTS-IMPLEMENTATION



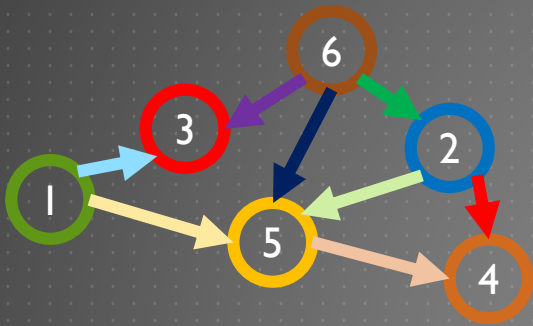
► 1->5

node	first
1	0
2	-1
3	-1
4	-1
5	-1
6	1

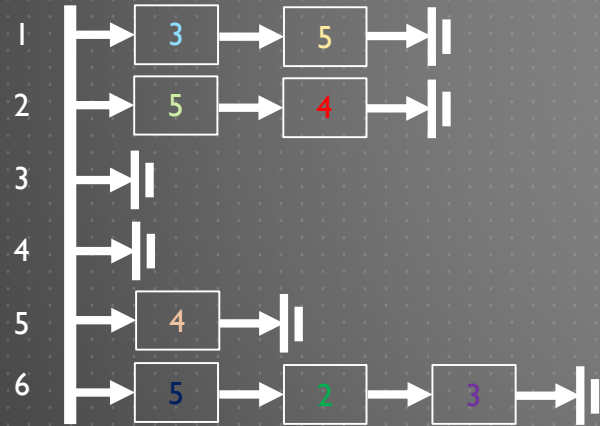
id	y	next
0	3	-1
1	3	-1
2	5	-1

```
void new_edge(int from,int to,int weight){
    v[m]=to;
    w[m]=weight;
    next[m]=first[from];
    first[from]=m;
    m++;
}
```


ADJACENCY LISTS-IMPLEMENTATION



► 2->5

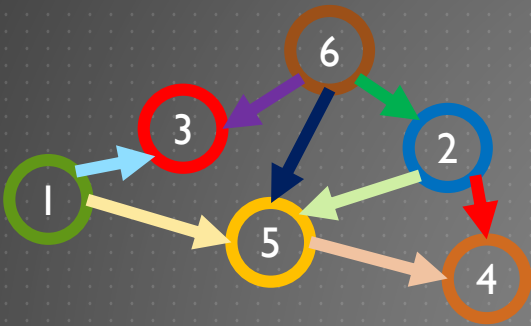


node	first
1	2
2	3
3	-1
4	-1
5	-1
6	1

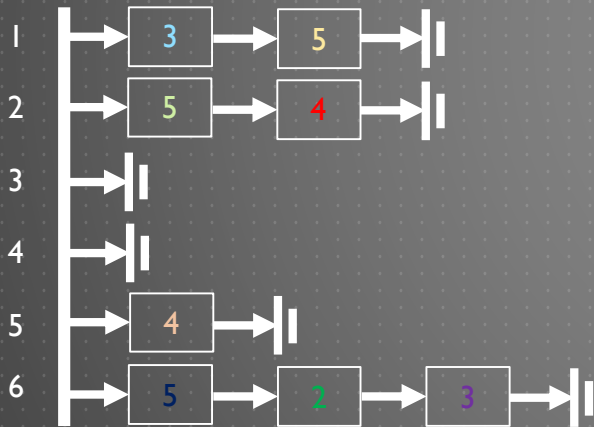
id	y	next
0	3	-1
1	3	-1
2	5	0
3	5	-1

```
void new_edge(int from,int to,int weight){
    v[m]=to;
    w[m]=weight;
    next[m]=first[from];
    first[from]=m;
    m++;
}
```

ADJACENCY LISTS-IMPLEMENTATION



► 2->4

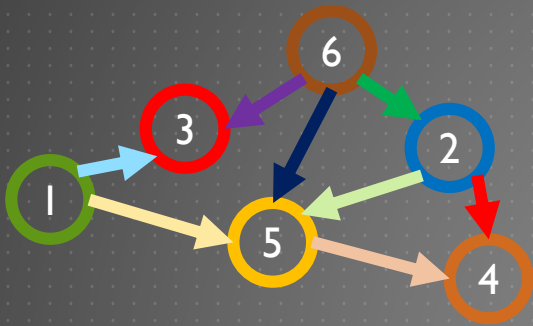


node	first
1	2
2	4
3	-1
4	-1
5	-1
6	1

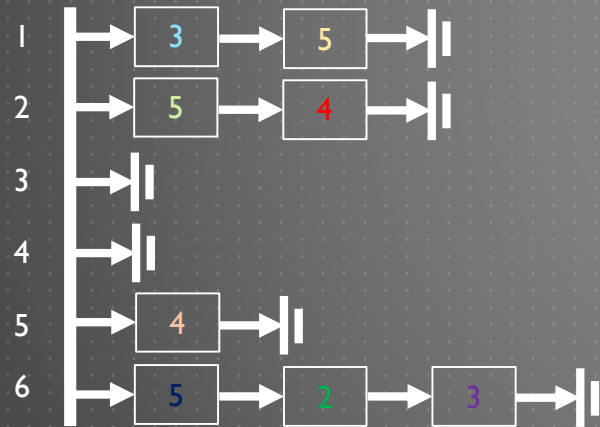
id	y	next
0	3	-1
1	3	-1
2	5	0
3	5	-1
4	4	3

```
void new_edge(int from,int to,int weight){
    v[m]=to;
    w[m]=weight;
    next[m]=first[from];
    first[from]=m;
    m++;
}
```

ADJACENCY LISTS-IMPLEMENTATION



► 6->2

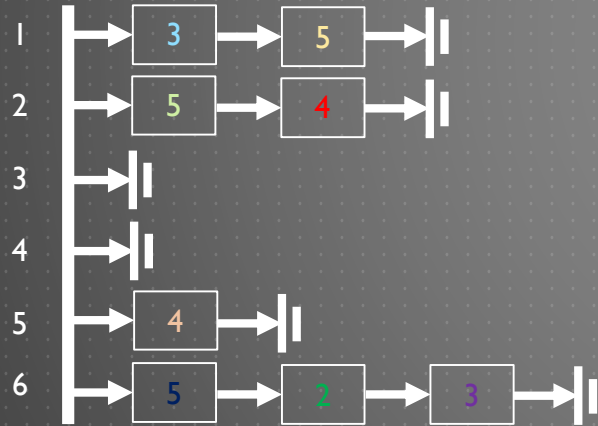
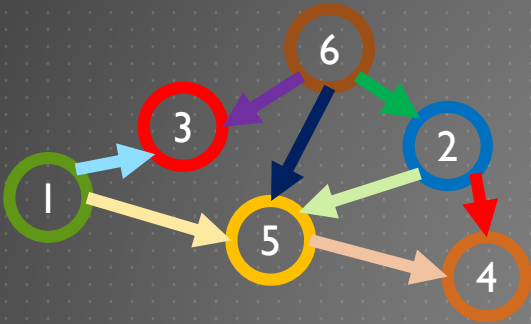


node	first
1	2
2	4
3	-1
4	-1
5	-1
6	5

id	y	next
0	3	-1
1	3	-1
2	5	0
3	5	-1
4	4	3
5	2	1

```
void new_edge(int from,int to,int weight){
    v[m]=to;
    w[m]=weight;
    next[m]=first[from];
    first[from]=m;
    m++;
}
```

ADJACENCY LISTS-IMPLEMENTATION



► 5->4

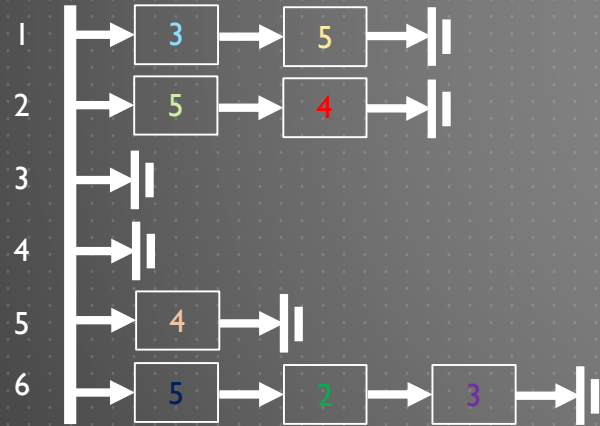
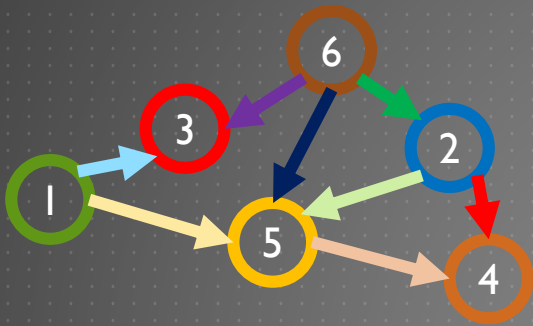
node first

1	2
2	4
3	-1
4	-1
5	-1
6	5

id	y	next
0	3	-1
1	3	-1
2	5	0
3	5	-1
4	4	3
5	2	1
6	4	-1

```
void new_edge(int from,int to,int weight){
    v[m]=to;
    w[m]=weight;
    next[m]=first[from];
    first[from]=m;
    m++;
}
```

ADJACENCY LISTS-IMPLEMENTATION



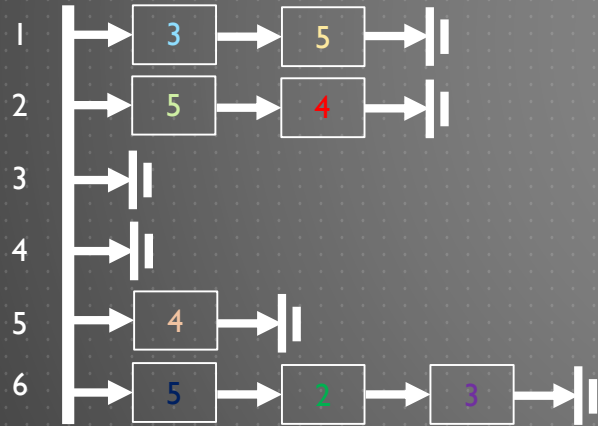
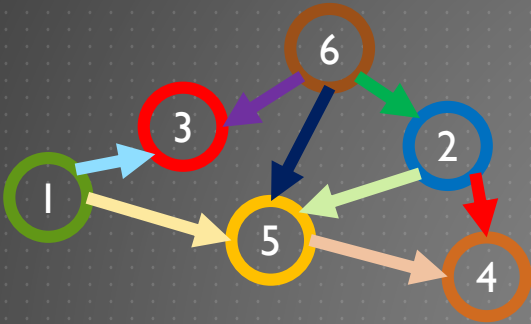
► 6->5

node	first
1	2
2	4
3	-1
4	-1
5	6
6	7

id	y	next
0	3	-1
1	3	-1
2	5	0
3	5	-1
4	4	3
5	2	1
6	4	-1
7	5	5

```
void new_edge(int from,int to,int weight){
    v[m]=to;
    w[m]=weight;
    next[m]=first[from];
    first[from]=m;
    m++;
}
```

ADJACENCY LISTS-IMPLEMENTATION



► Query 6's neighbors

node	first	id	y	next
1	2	0	3	-1
2	4	1	3	-1
3	-1	2	5	0
4	-1	3	5	-1
5	6	4	4	3
6	7	5	2	1
		6	4	-1
		7	5	5

```

void query(int x){
    //Querying all adjacent nodes of a given node x
    for (int i=first[x];i!=-1;i=next[i])
        printf("%d\n",v[i]);
}
    
```

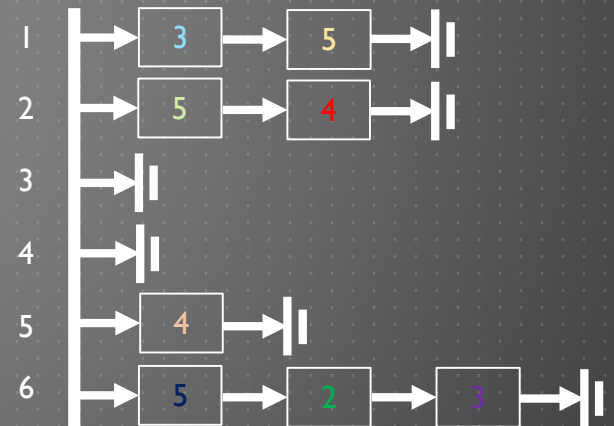
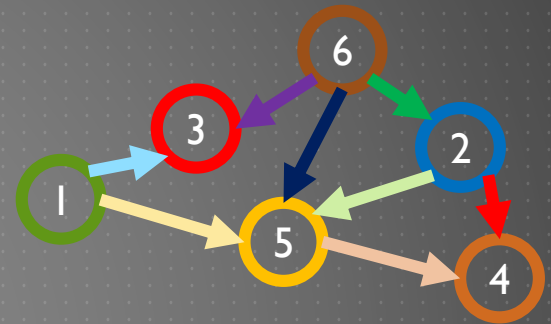
ADJACENCY LISTS-IMPLEMENTATION

```
int v[10000],w[10000],next[10000];
int first[1000];
int n,m=0;

void initialize(){
    for (int i=1;i<=n;i++) first[i]=-1;
}

void new_edge(int from,int to,int weight){
    v[m]=to;
    w[m]=weight;
    next[m]=first[from];
    first[from]=m;
    m++;
}

void query(int x){
    //Querying all adjacent nodes of a given node x
    for (int i=first[x];i!=-1;i=next[i])
        printf("%d\n",v[i]);
}
```



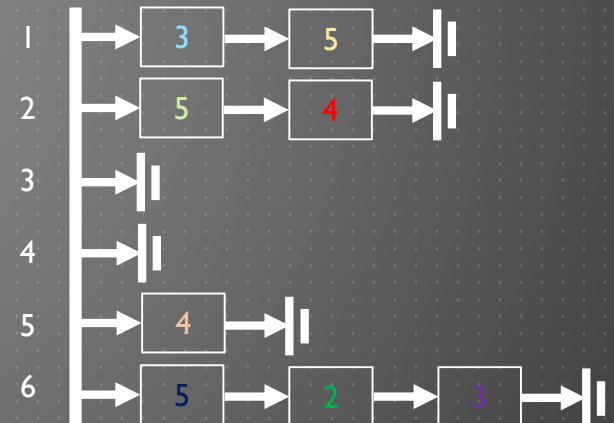
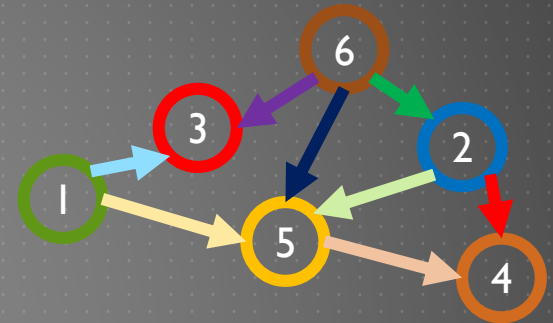
ADJACENCY LISTS-IMPLEMENTATION

- ▶ We can use vector in C++ to implement the lists

```
#include<vector>
using namespace std;

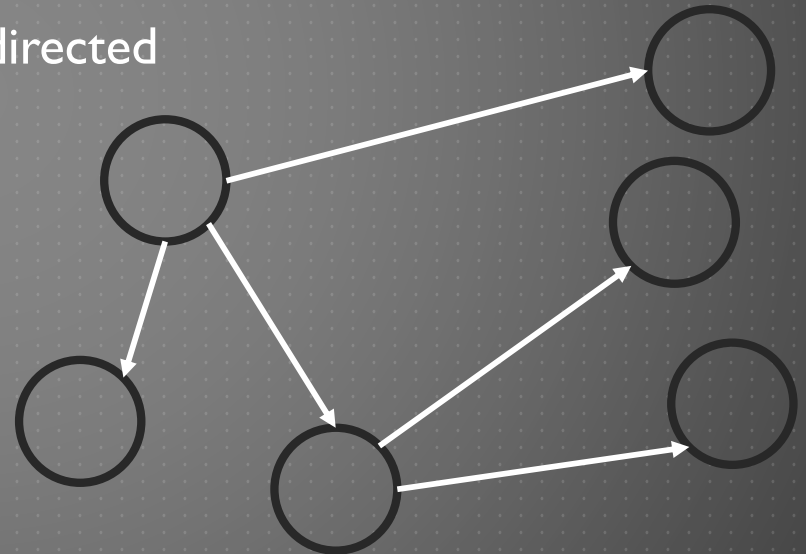
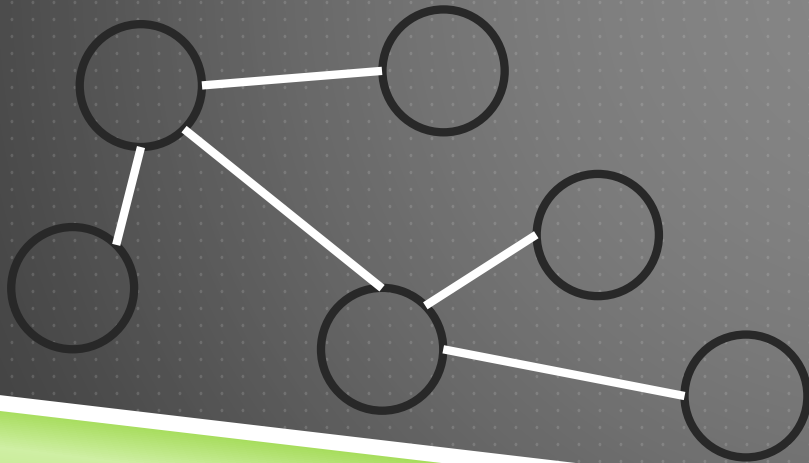
int n,m;
vector<int> v[10000],w[10000];
void new_edge(int from,int to,int weight){
    v[from].push_back(to);
    w[from].push_back(weight);
}

void query(int x){
    //Querying all adjacent nodes of a given node (x)
    for (int i=0;i<v[x].size();i++)
        printf("%d\n",v[x][i]);
}
```



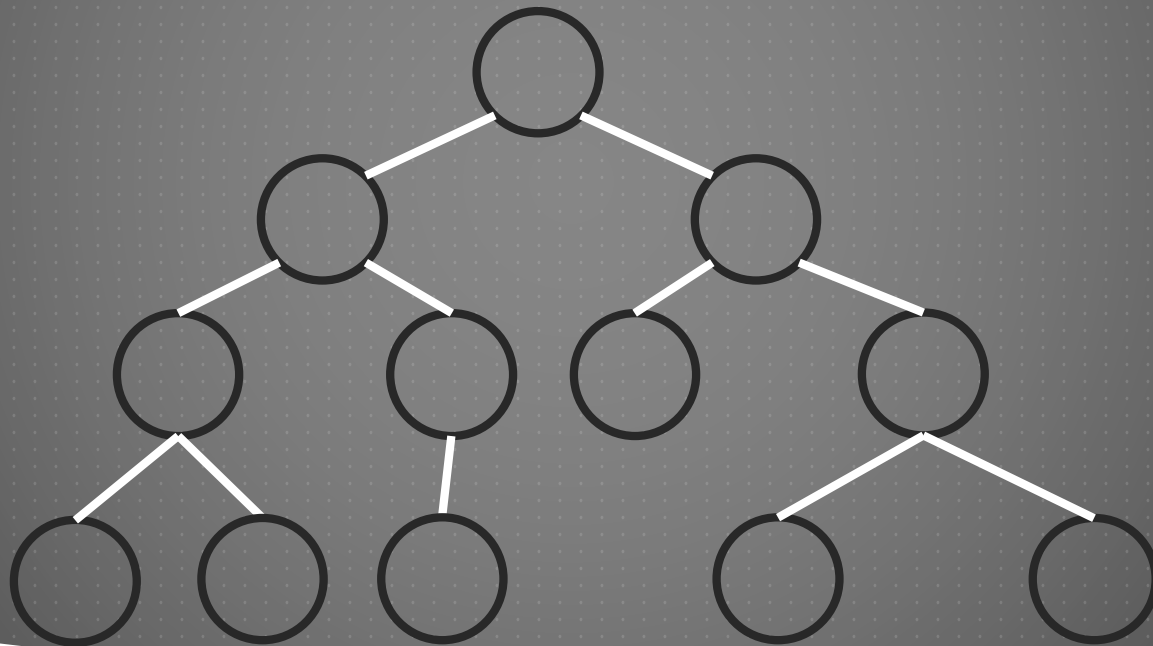
SPECIAL GRAPHS - TREES

- ▶ Either one of the followings is the definition
 - ▶ A connected graph with $|V| - 1$ edges
 - ▶ A connected graph without cycles
 - ▶ A graph with exactly one path between every pair of vertices
- ▶ Tree edges could be directed or undirected



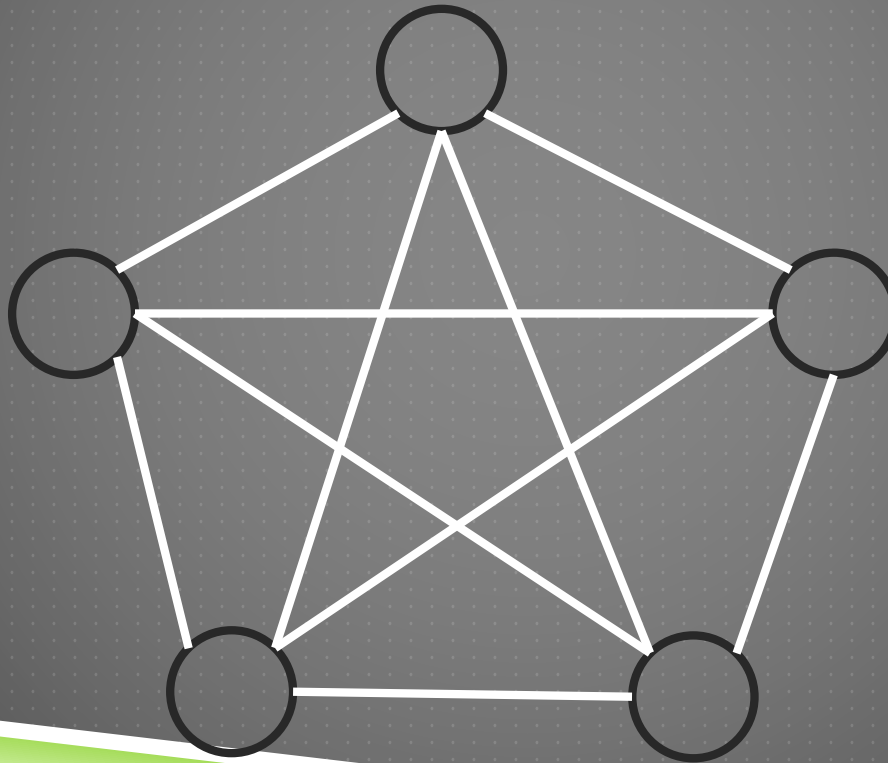
SPECIAL GRAPHS – BINARY TREES

- ▶ A tree in which each node has at most two children
- ▶ Commonly used as other data structures



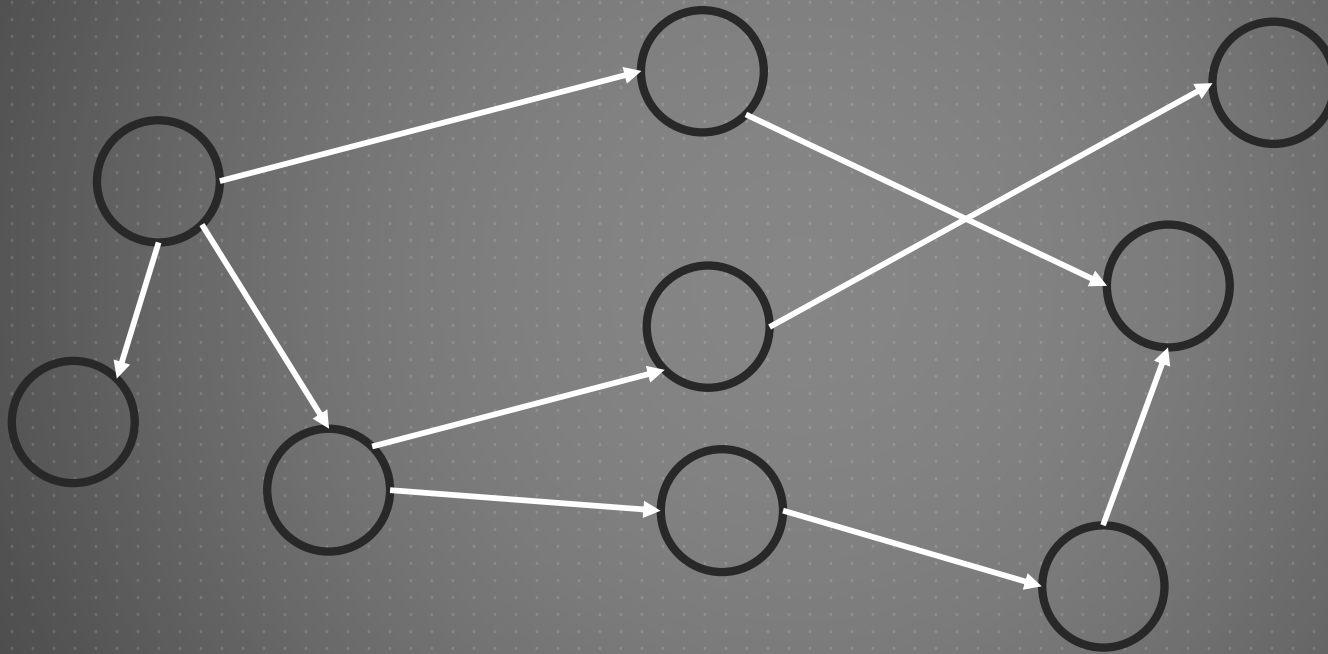
SPECIAL GRAPHS - COMPLETE GRAPH

- ▶ Every pair of distinct vertices is connected by a unique edge



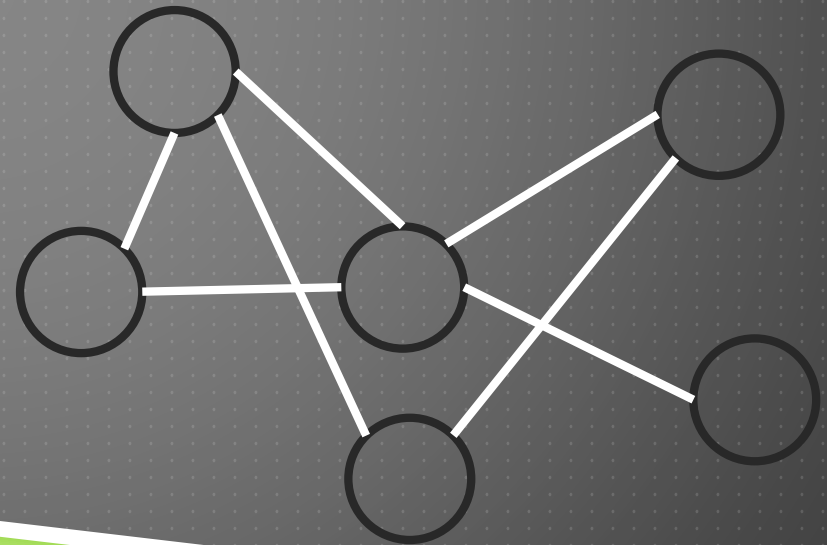
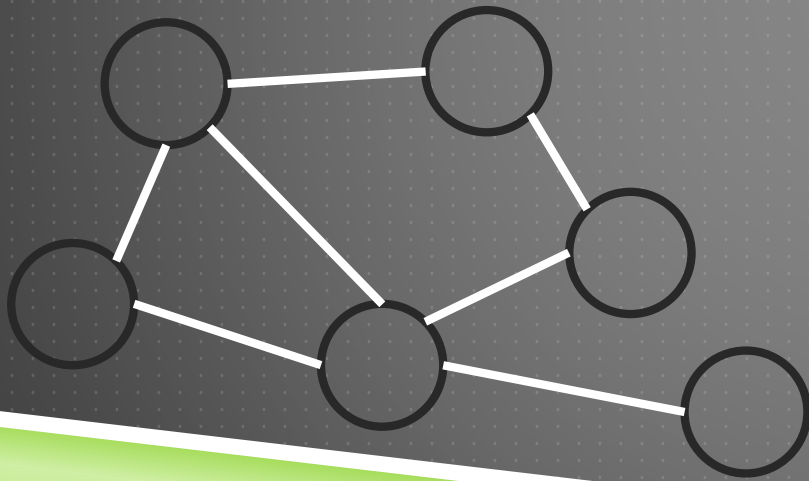
SPECIAL GRAPHS – DIRECTED ACYCLIC GRAPHS (DAG)

- ▶ A directed graph with no directed cycles



SPECIAL GRAPHS – PLANAR GRAPHS

- ▶ A graph whose vertices and edges can be drawn in a plane such that no two of the edges intersect
- ▶ More efficient algorithms can be applied on planar graphs



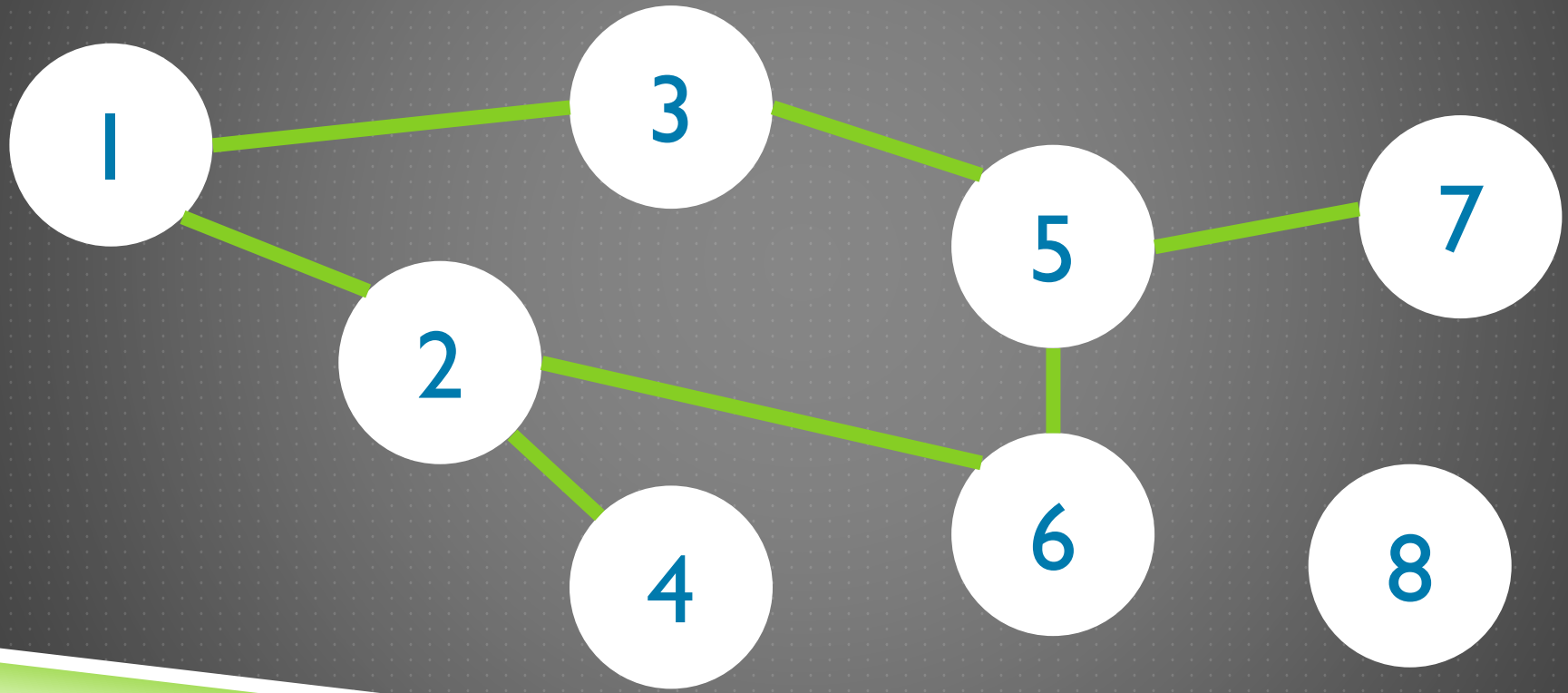
GRAPH TRAVERSAL

- ▶ The process of visiting (checking and/or updating) each vertex in a graph.
- ▶ Classified by the order in which the vertices are visited
 - ▶ Depth-first search
 - ▶ Breadth-first search

DEPTH-FIRST SEARCH

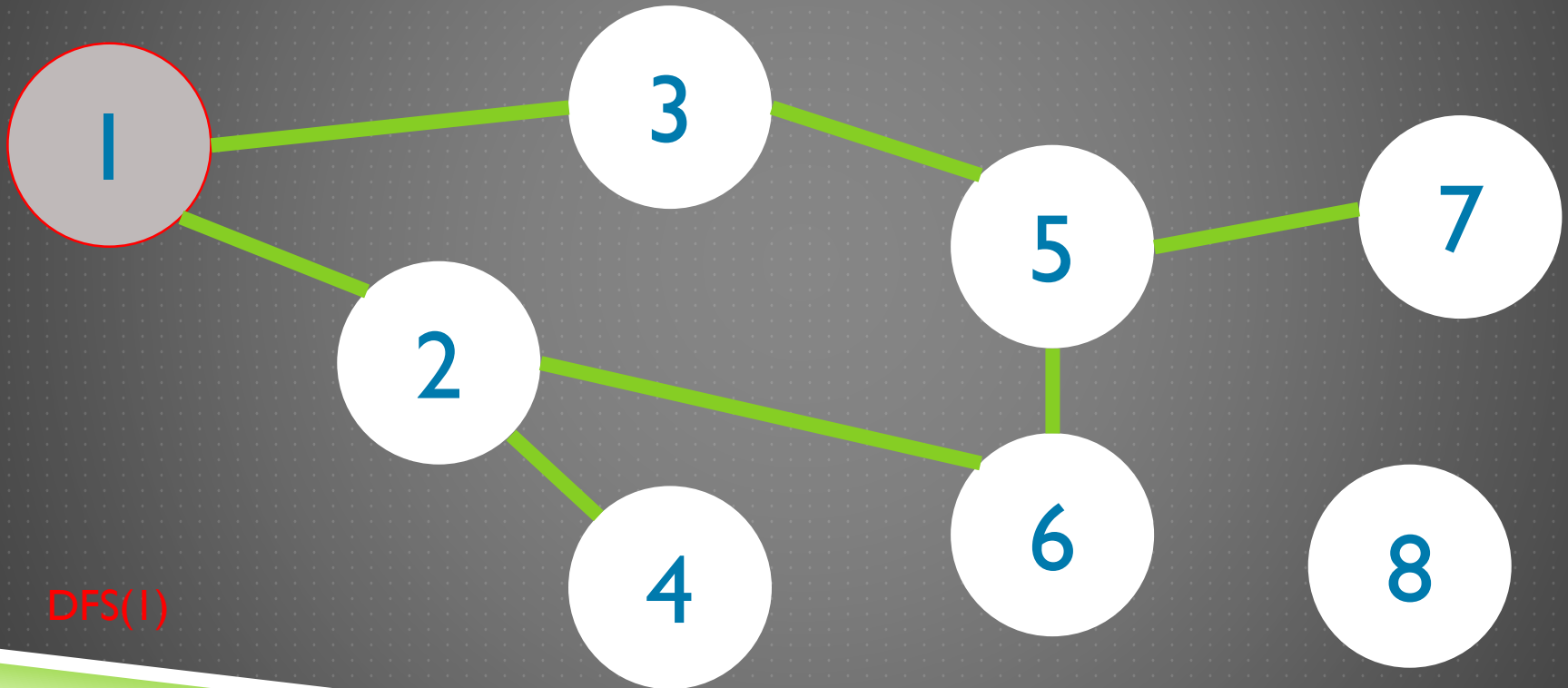
- ▶ Starts at a node
 - ▶ Explores as far as possible along each branch before backtracking
 - ▶ Recursion is often used
- 

DEPTH-FIRST SEARCH - EXAMPLE



DEPTH-FIRST SEARCH - EXAMPLE

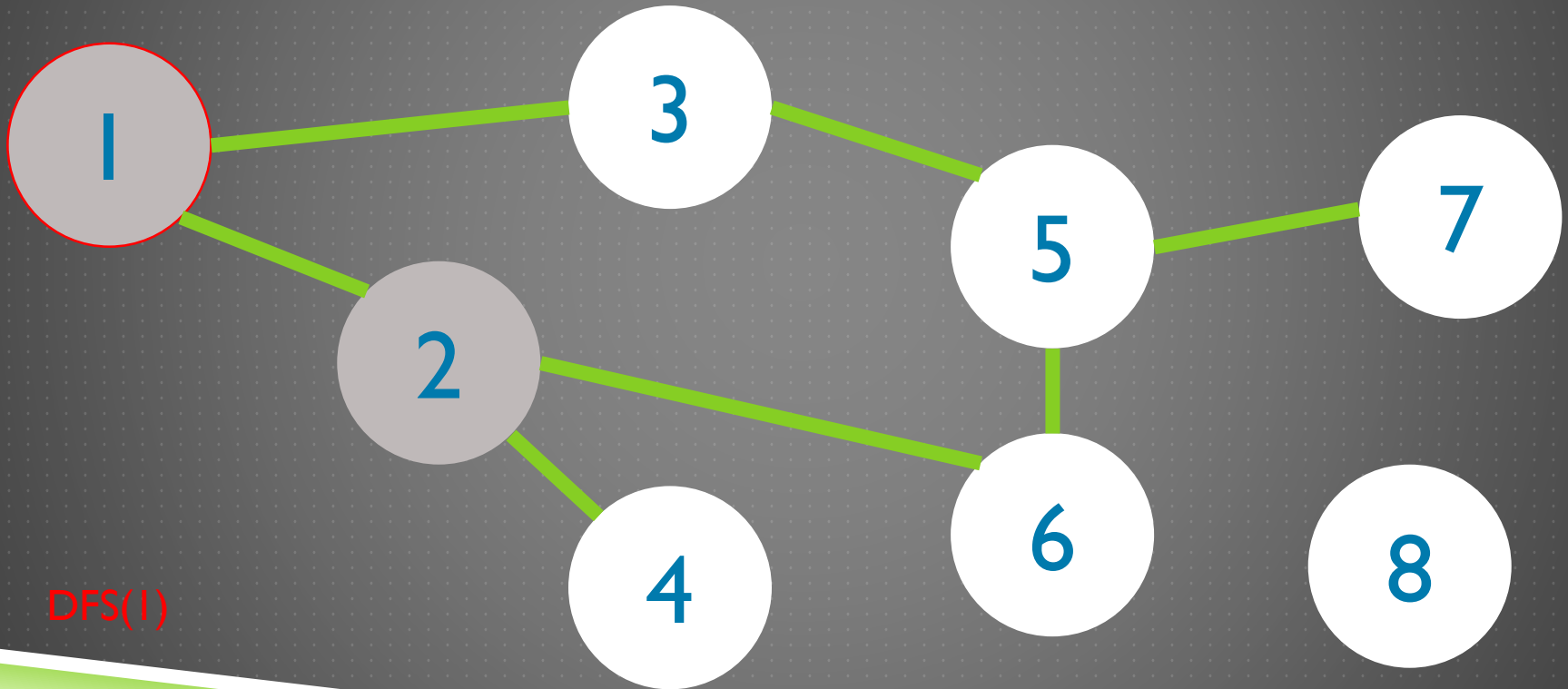
► Perform DFS on node 1



DFS(1)

DEPTH-FIRST SEARCH - EXAMPLE

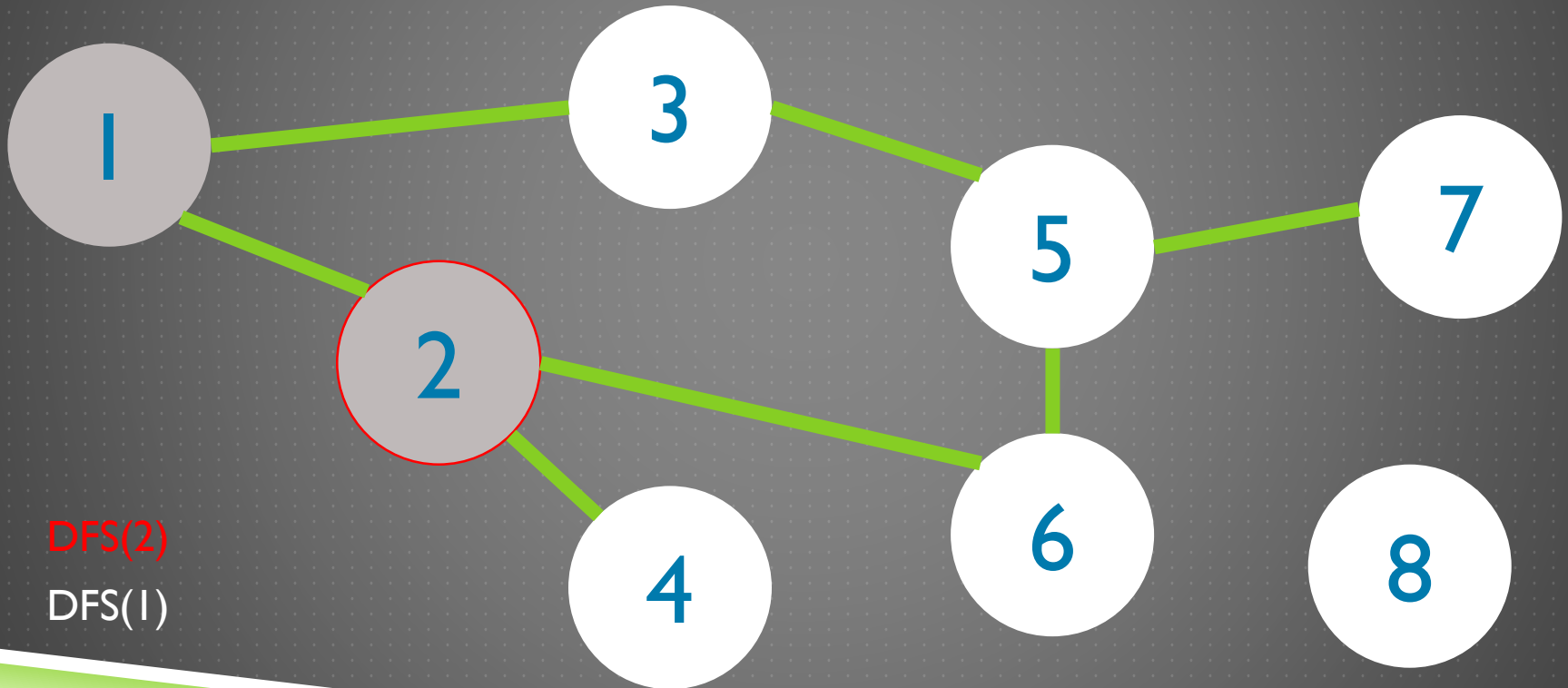
- ▶ Node 2 is not visited, perform DFS on node 2



DFS(1)

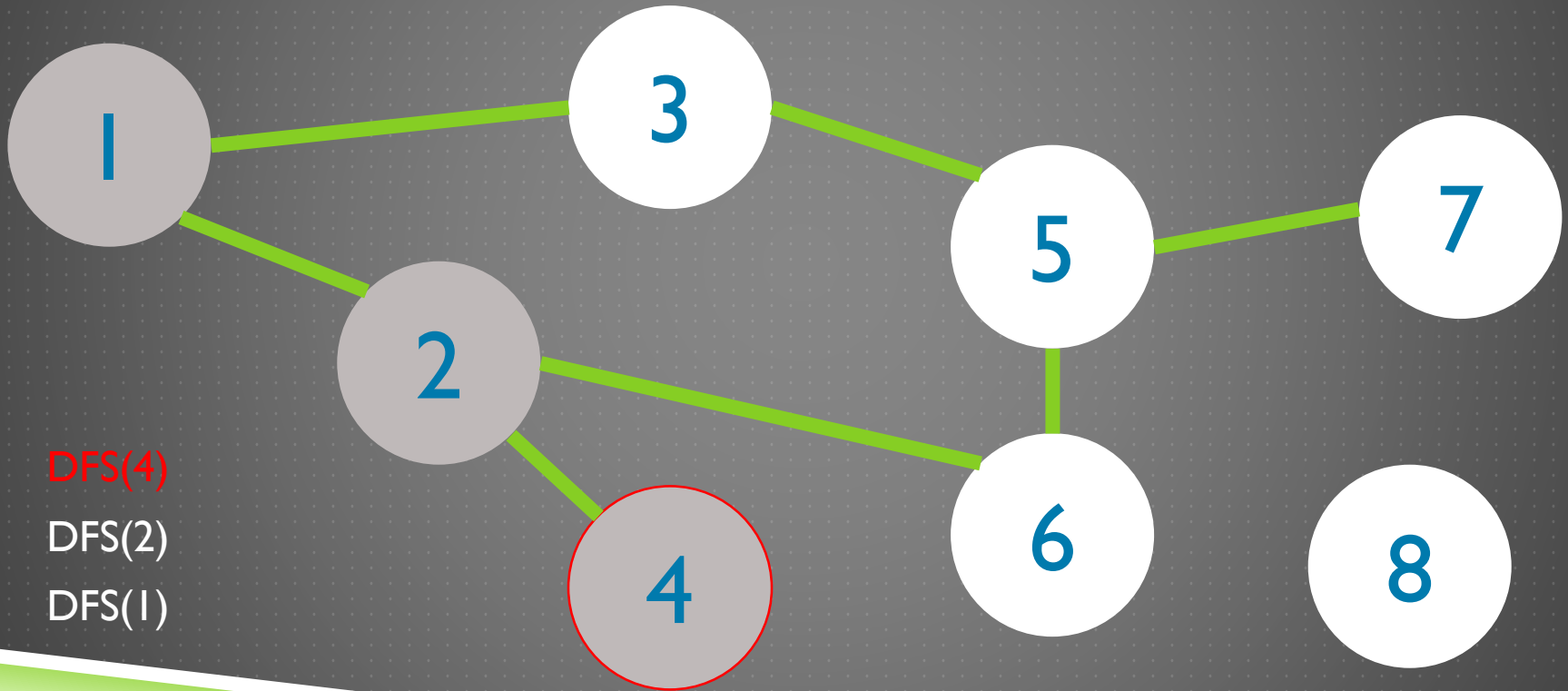
DEPTH-FIRST SEARCH - EXAMPLE

- ▶ Node 4 is not visited, perform DFS on node 4



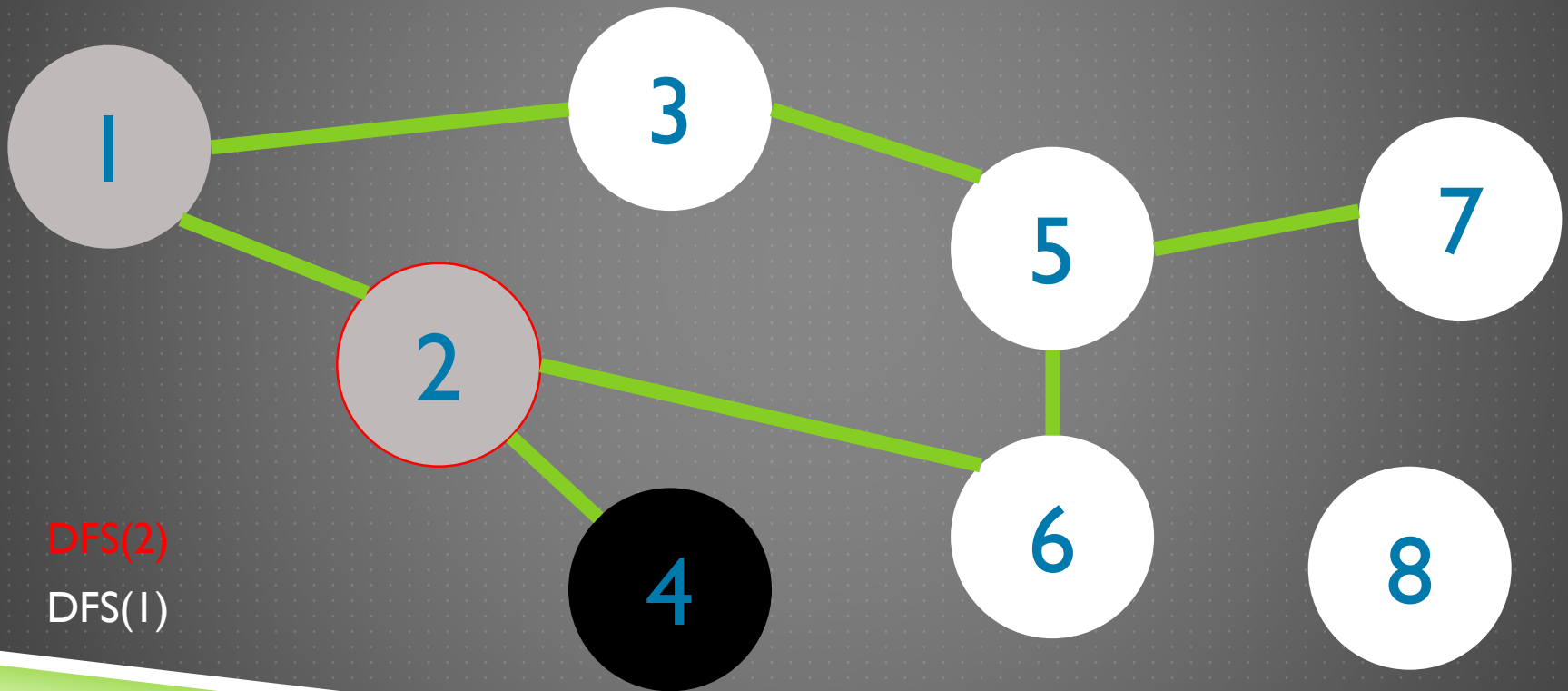
DEPTH-FIRST SEARCH - EXAMPLE

- ▶ Node 2 is visited, no need to perform DFS on node 2



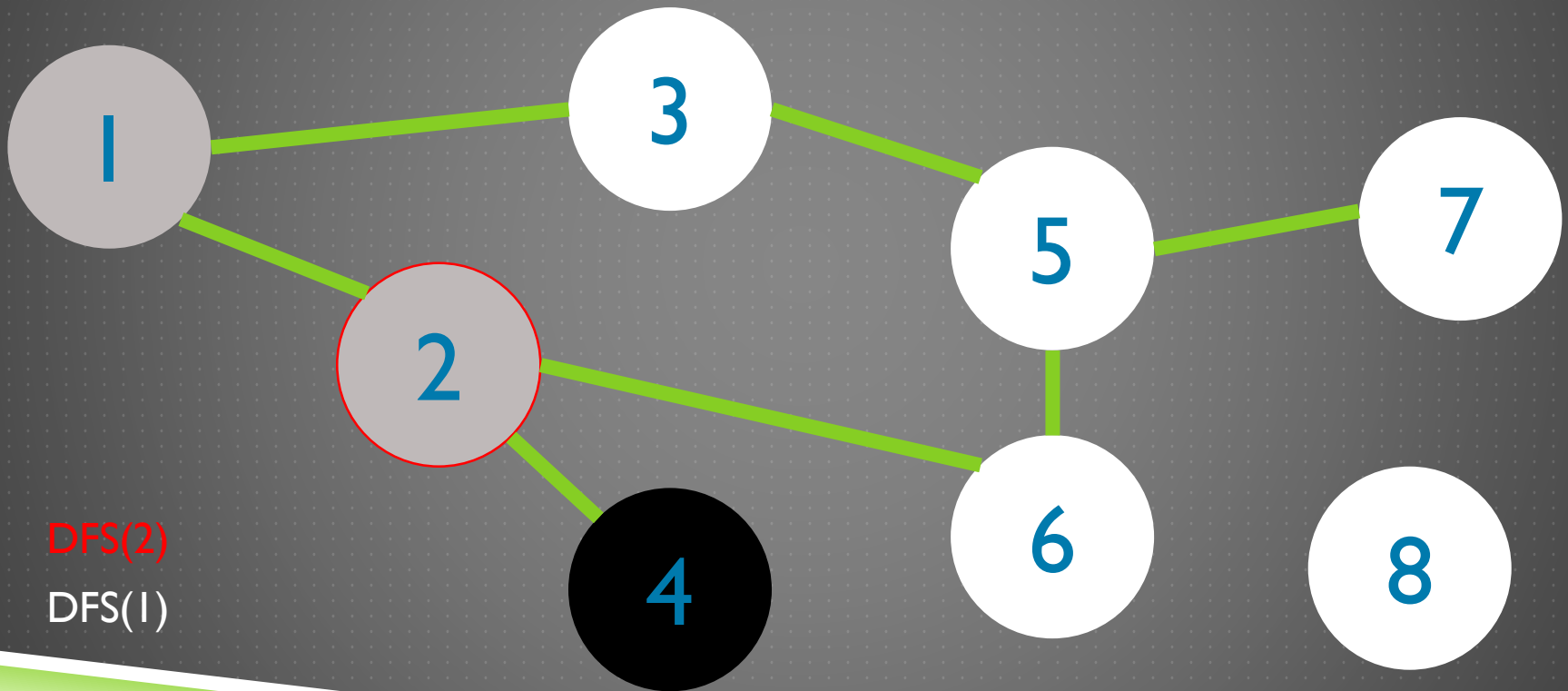
DEPTH-FIRST SEARCH - EXAMPLE

- ▶ DFS(4) is finished, go back to DFS(2)



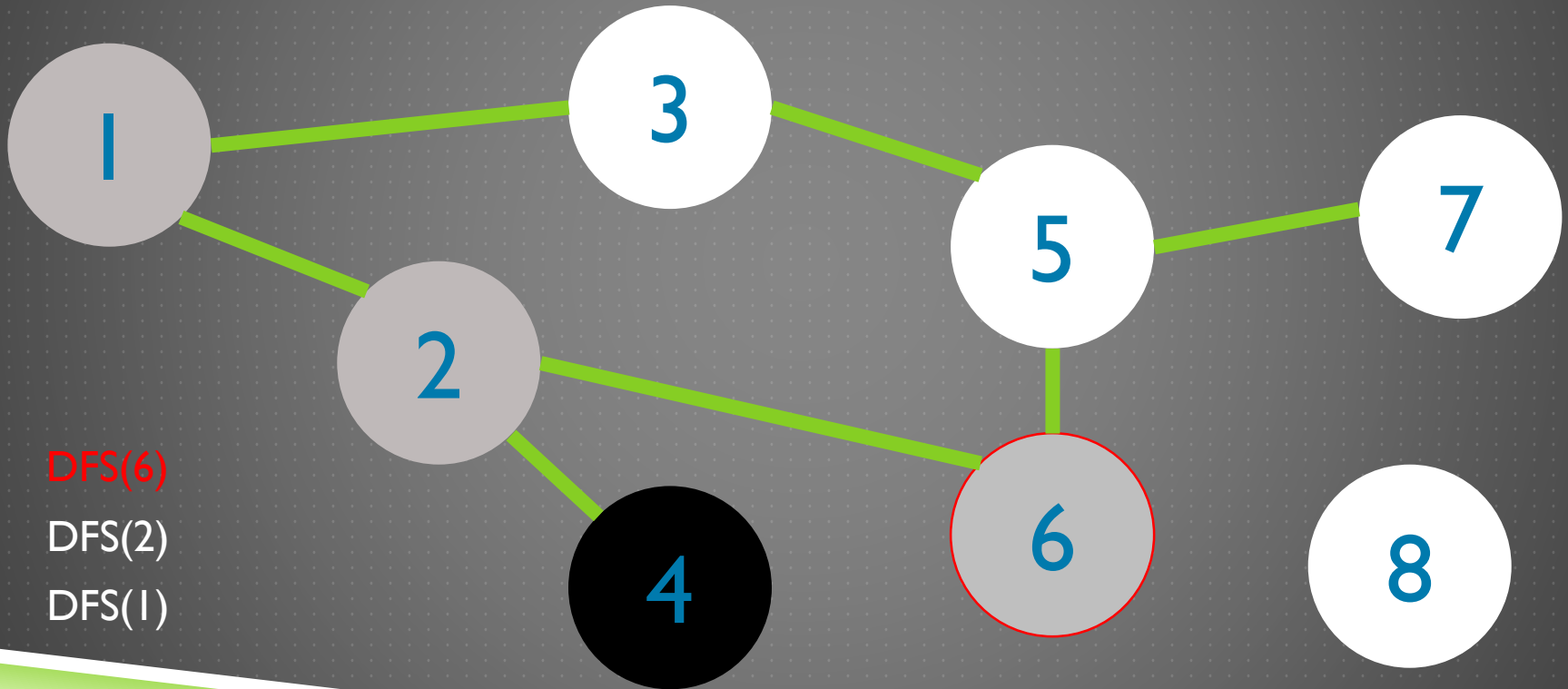
DEPTH-FIRST SEARCH - EXAMPLE

- ▶ Node 6 is not visited, perform DFS on node 6



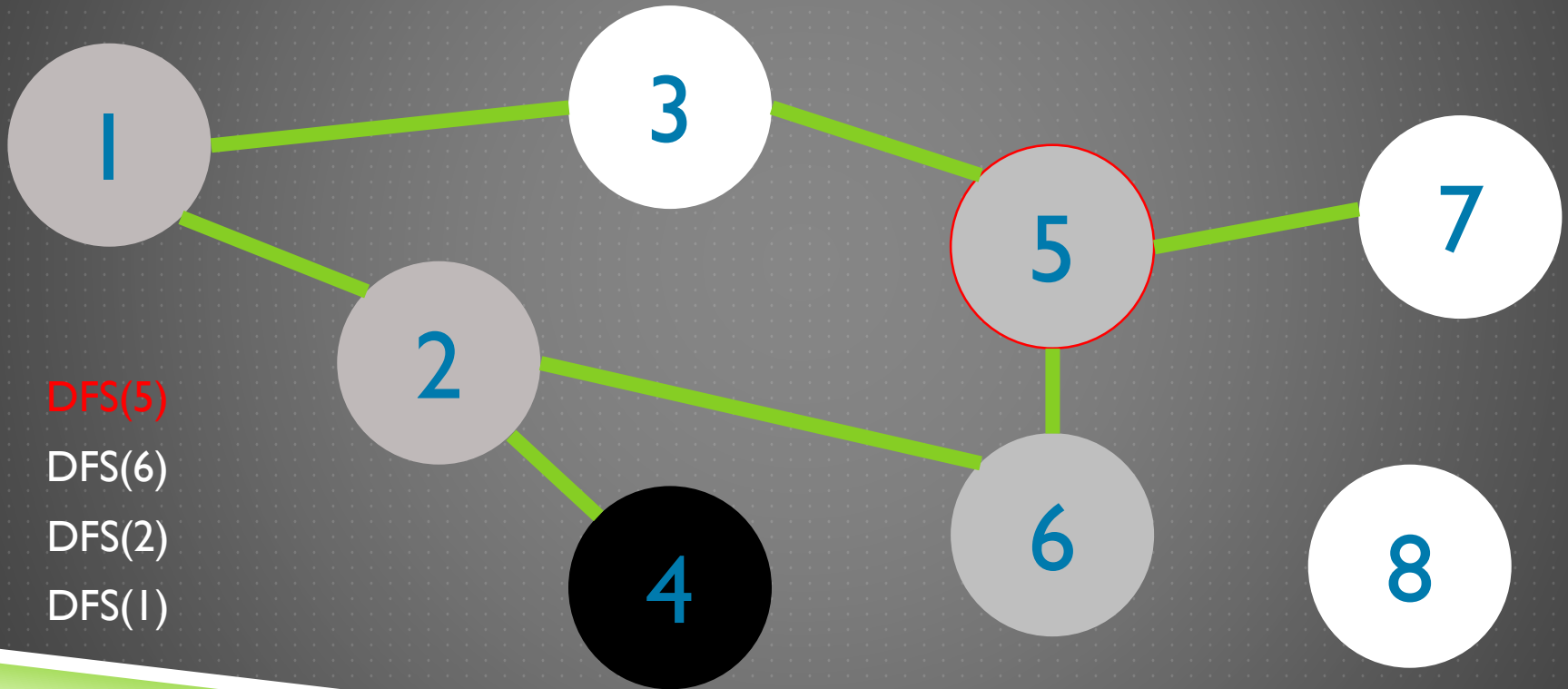
DEPTH-FIRST SEARCH - EXAMPLE

- ▶ Node 5 is not visited, perform DFS on node 5



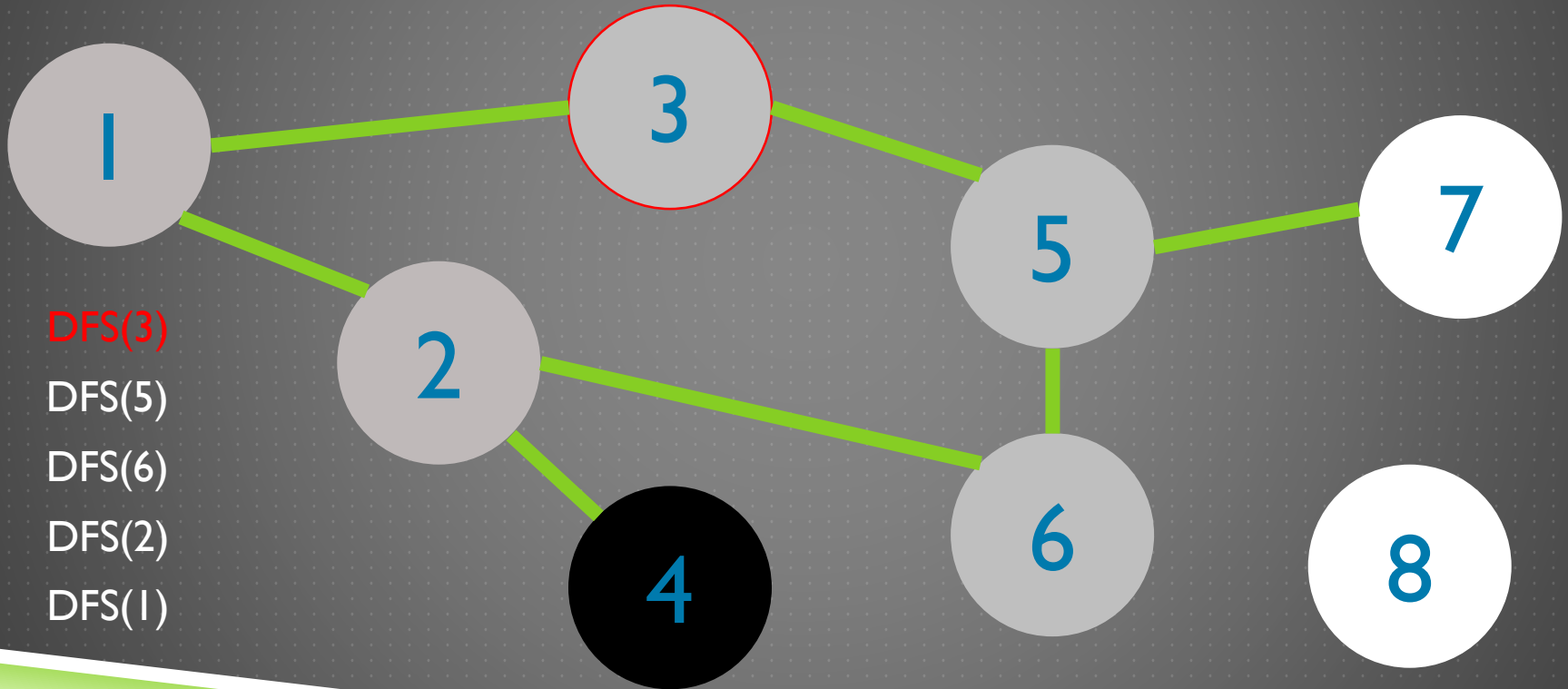
DEPTH-FIRST SEARCH - EXAMPLE

- ▶ Node 3 is not visited, perform DFS on node 3



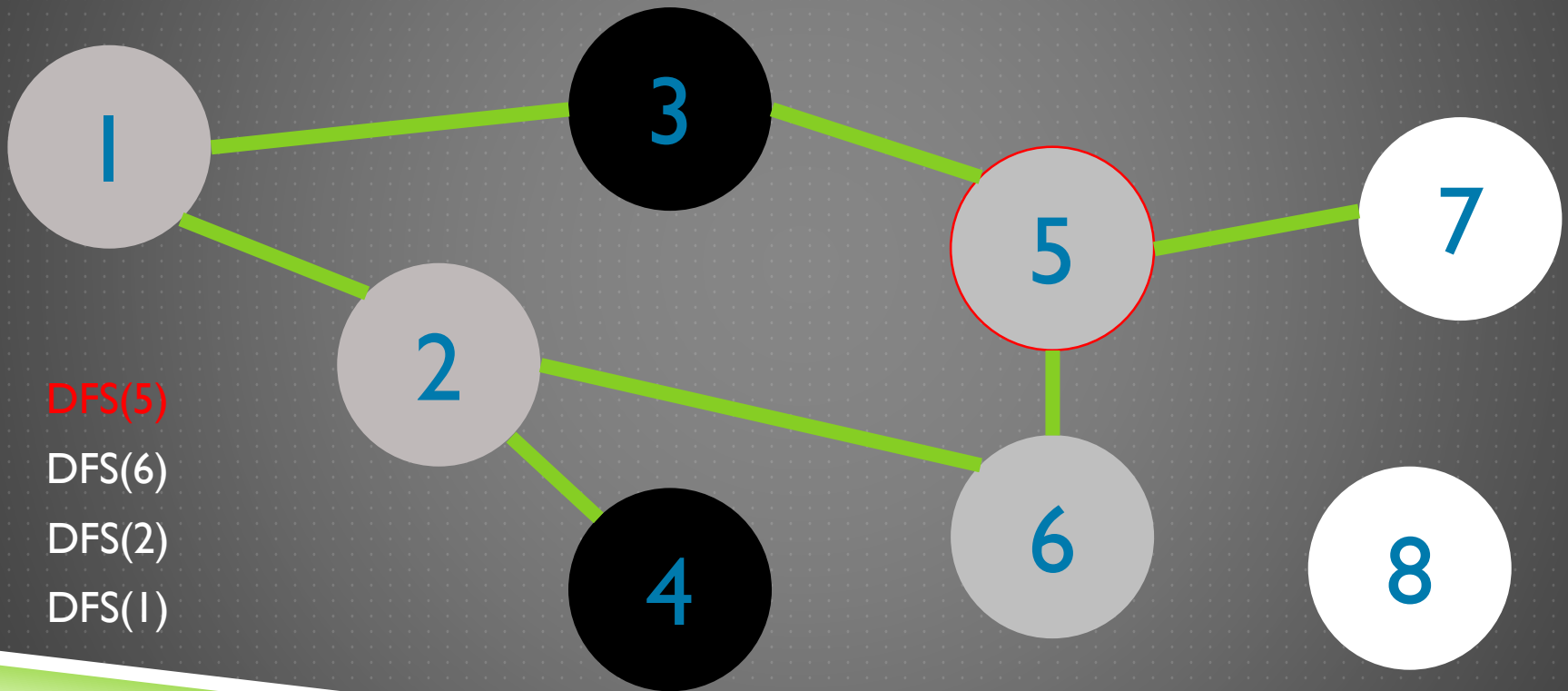
DEPTH-FIRST SEARCH - EXAMPLE

▶ No neighbors of node 3 is not visited, go back to DFS(5)



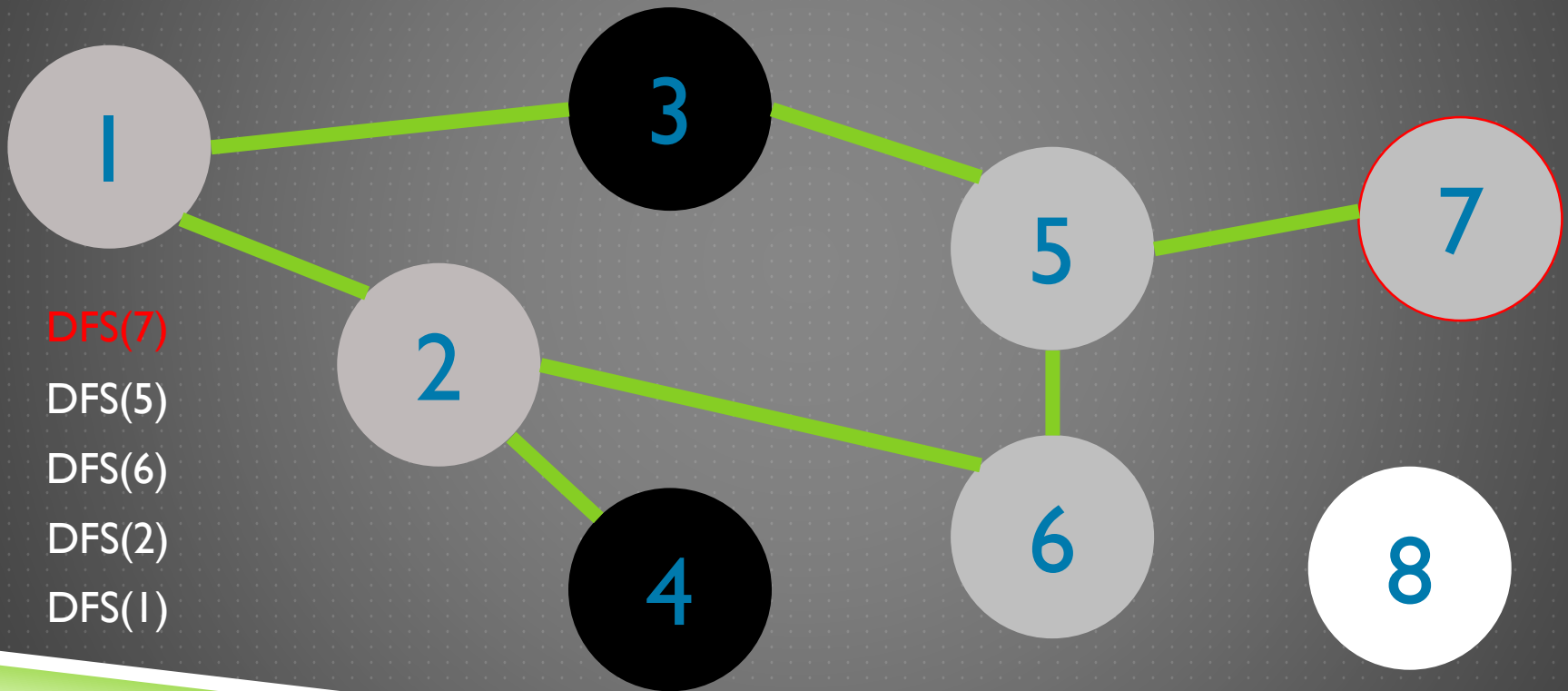
DEPTH-FIRST SEARCH - EXAMPLE

► ... and so on



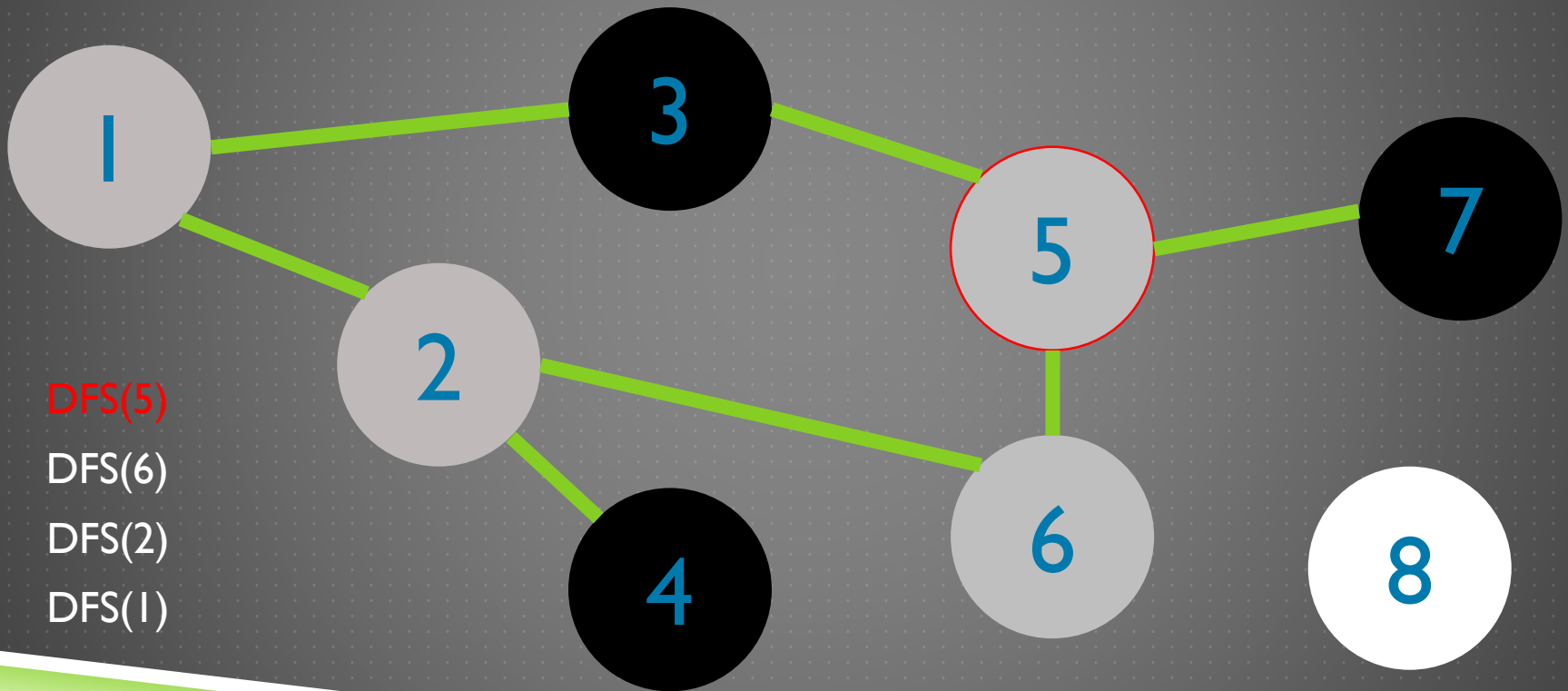
DEPTH-FIRST SEARCH - EXAMPLE

► ... and so on



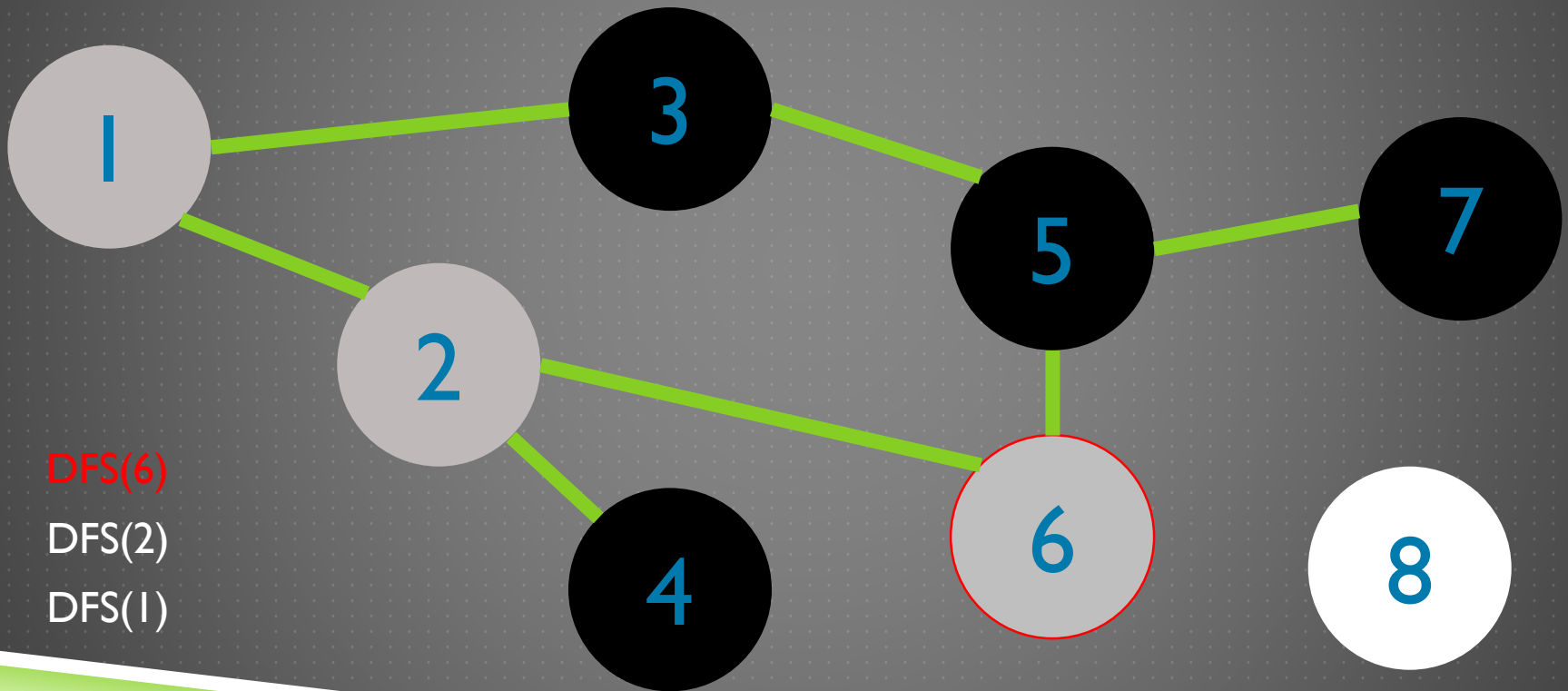
DEPTH-FIRST SEARCH - EXAMPLE

► ... and so on



DEPTH-FIRST SEARCH - EXAMPLE

► ... and so on



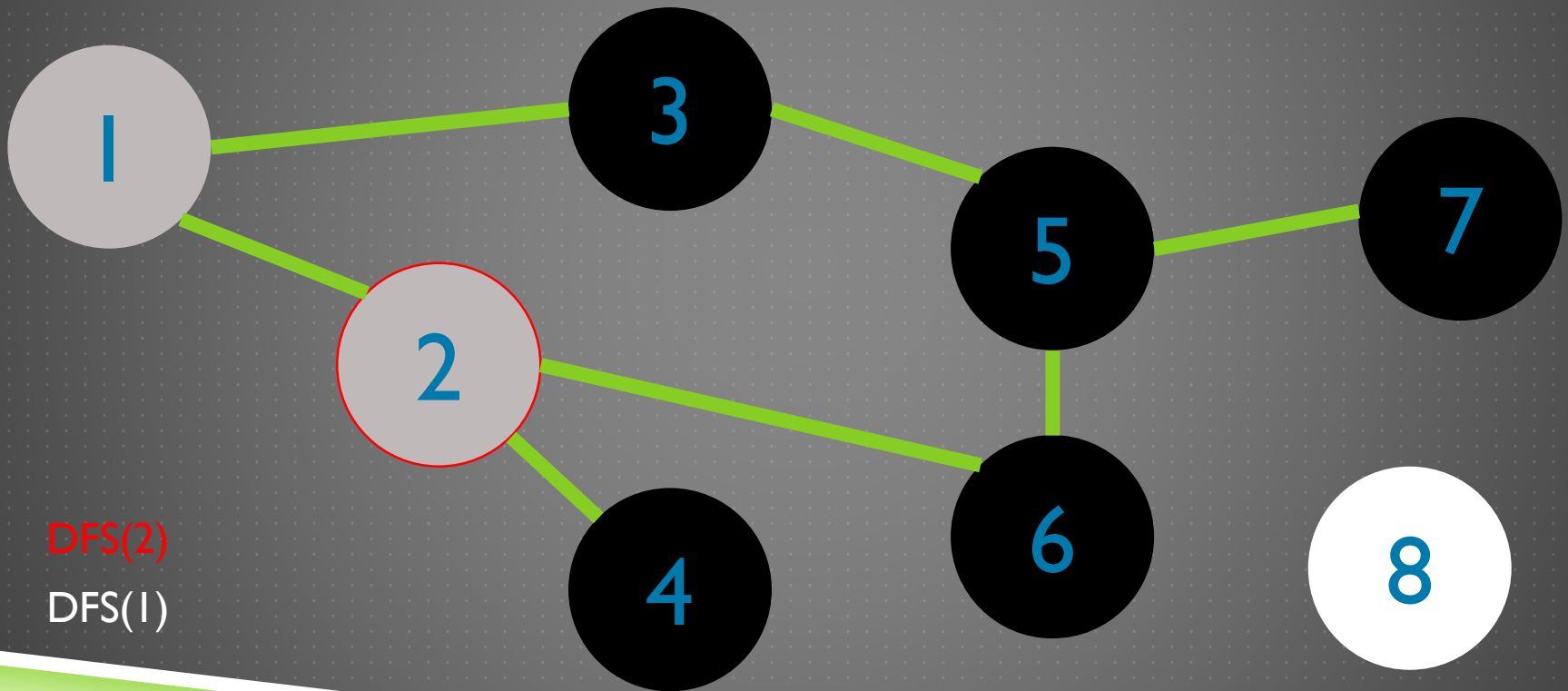
DFS(6)

DFS(2)

DFS(1)

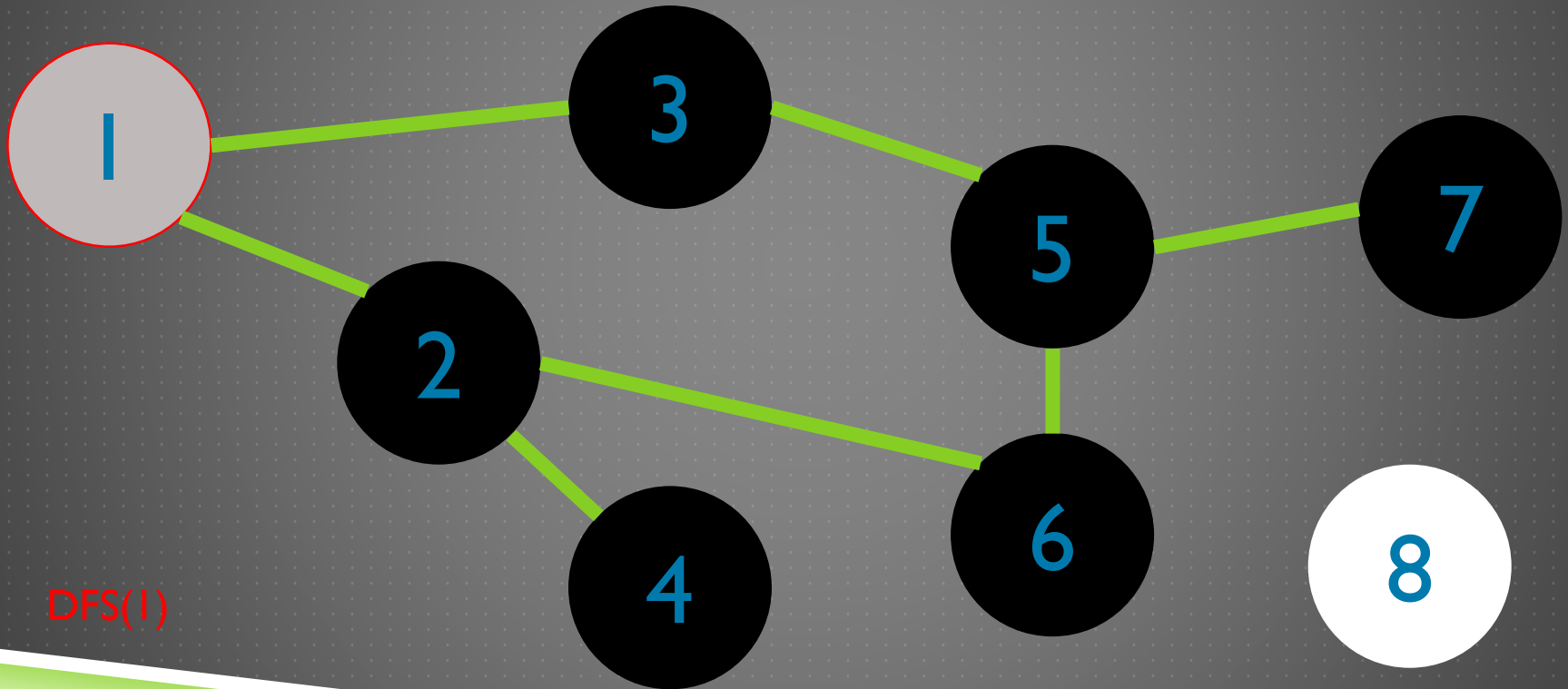
DEPTH-FIRST SEARCH - EXAMPLE

► ... and so on



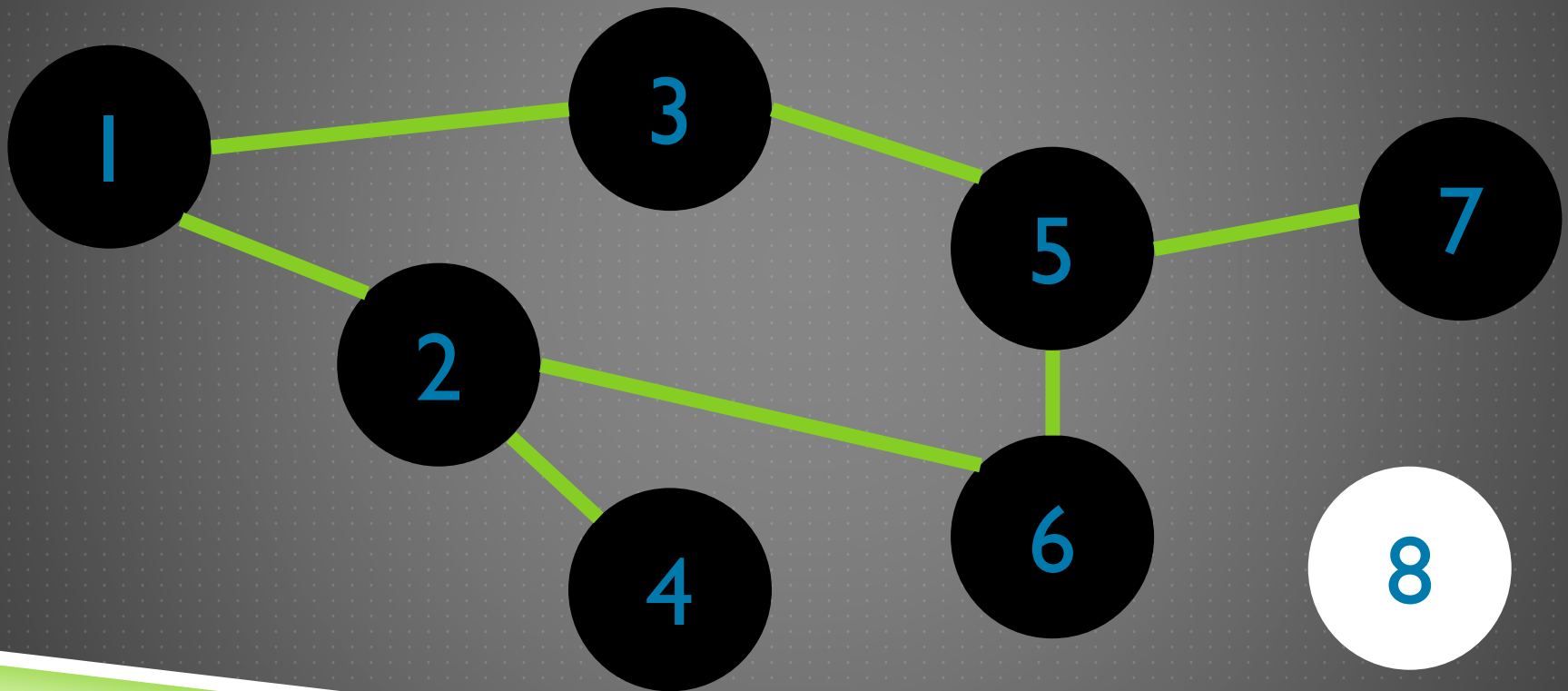
DEPTH-FIRST SEARCH - EXAMPLE

► ... and so on



DEPTH-FIRST SEARCH - EXAMPLE

► Done



DEPTH-FIRST SEARCH - CODE

```
procedure DFS(vertex v){  
    label v as discovered  
    for all w adjacent to v do  
        if w is not labeled as discovered then  
            DFS(w)  
}
```

DEPTH-FIRST SEARCH

- ▶ Time Complexity:
 - ▶ $O(|V|^2)$ when using adjacency matrix
 - ▶ $O(|V|+|E|)$ when using adjacency list / edge list

DEPTH-FIRST SEARCH - APPLICATION

- ▶ Solving mazes
- ▶ Finding connected components
- ▶ Bi-coloring a graph

PROBLEM

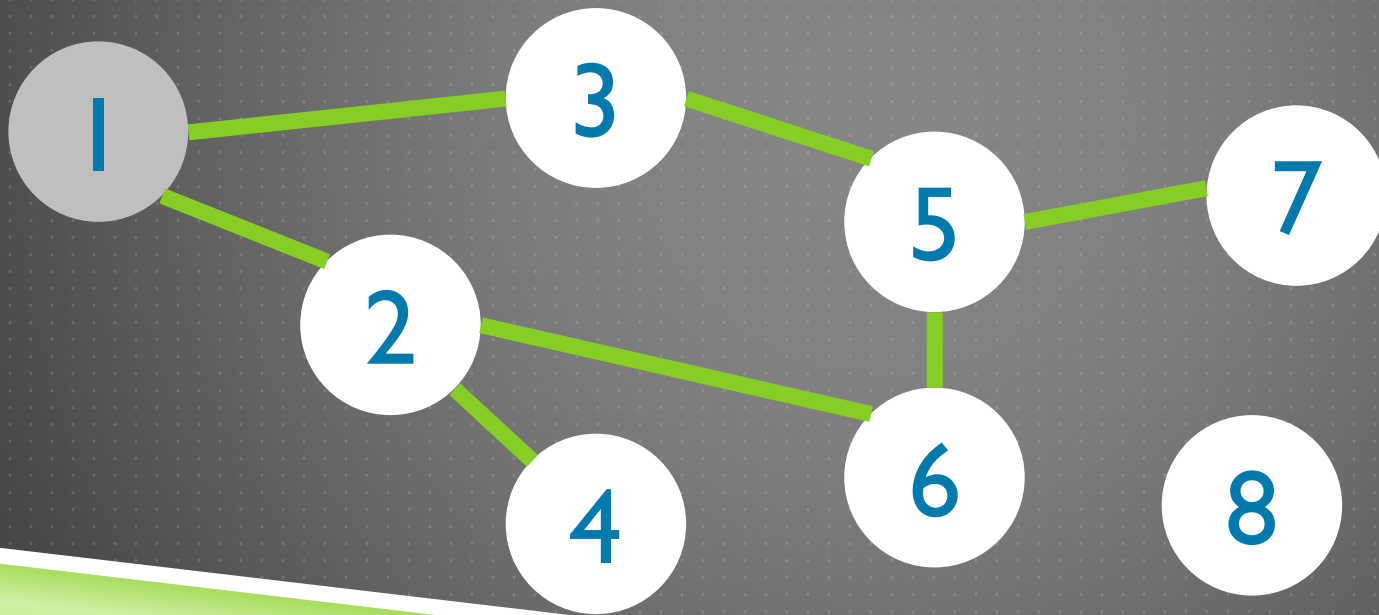
- ▶ HKOJ 01035 Patrol Area

BREADTH-FIRST SEARCH

- ▶ Starts at a node
- ▶ Explores the neighbor nodes first before moving to the next level neighbors
- ▶ Use a queue to implement

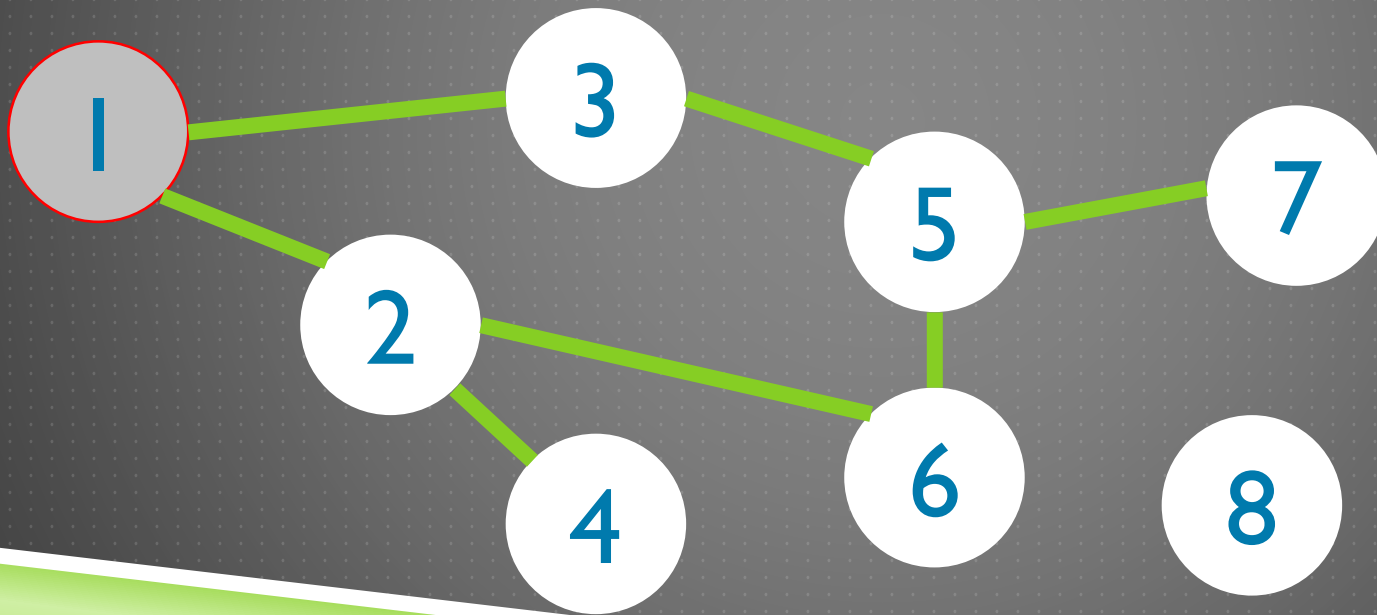
BREADTH-FIRST SEARCH - EXAMPLE

- ▶ Push 1 into the queue and mark node 1 as visited first



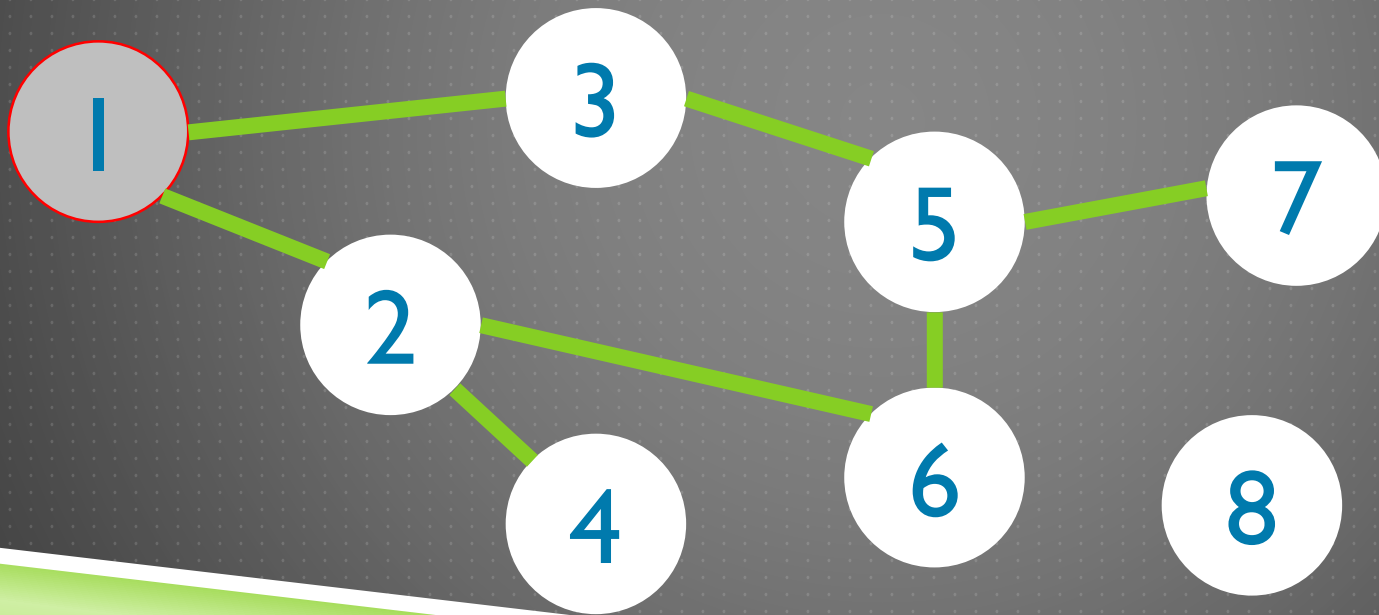
BREADTH-FIRST SEARCH - EXAMPLE

► Perform BFS on node 1



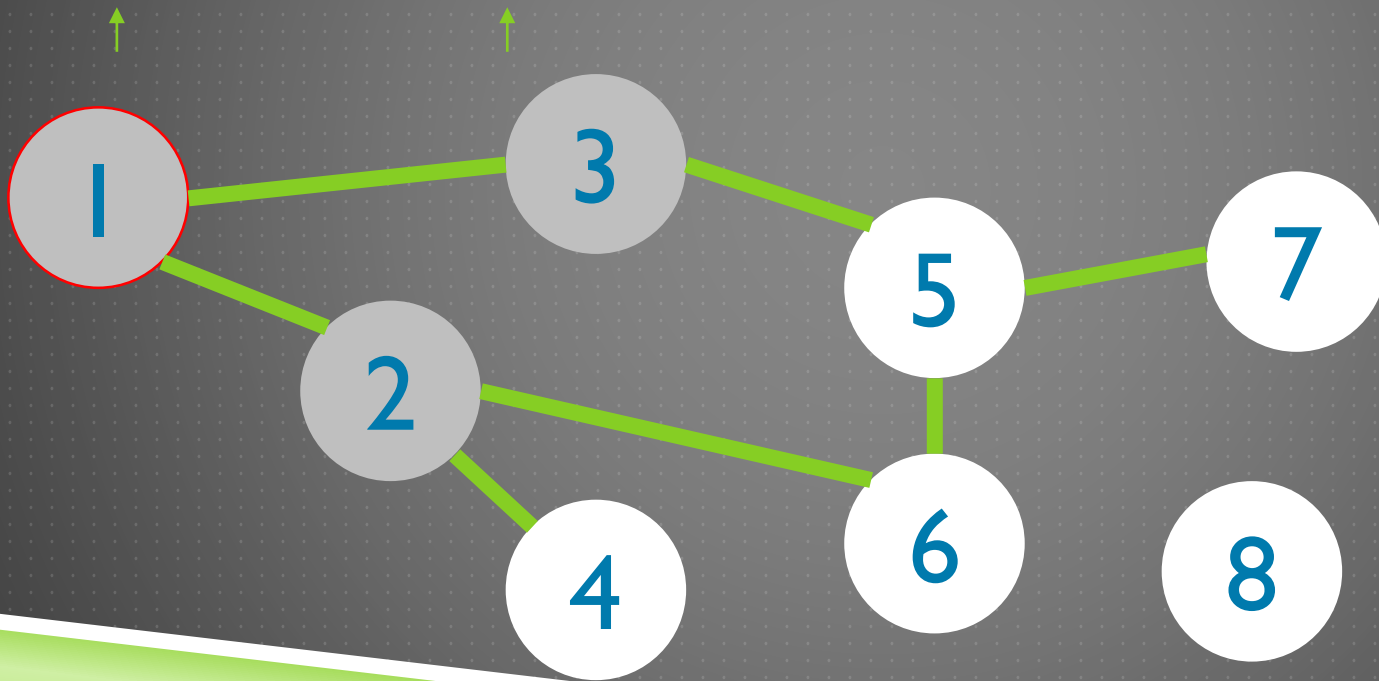
BREADTH-FIRST SEARCH - EXAMPLE

- ▶ Node 2 and 3 are adjacent to node 1 and they are not visited



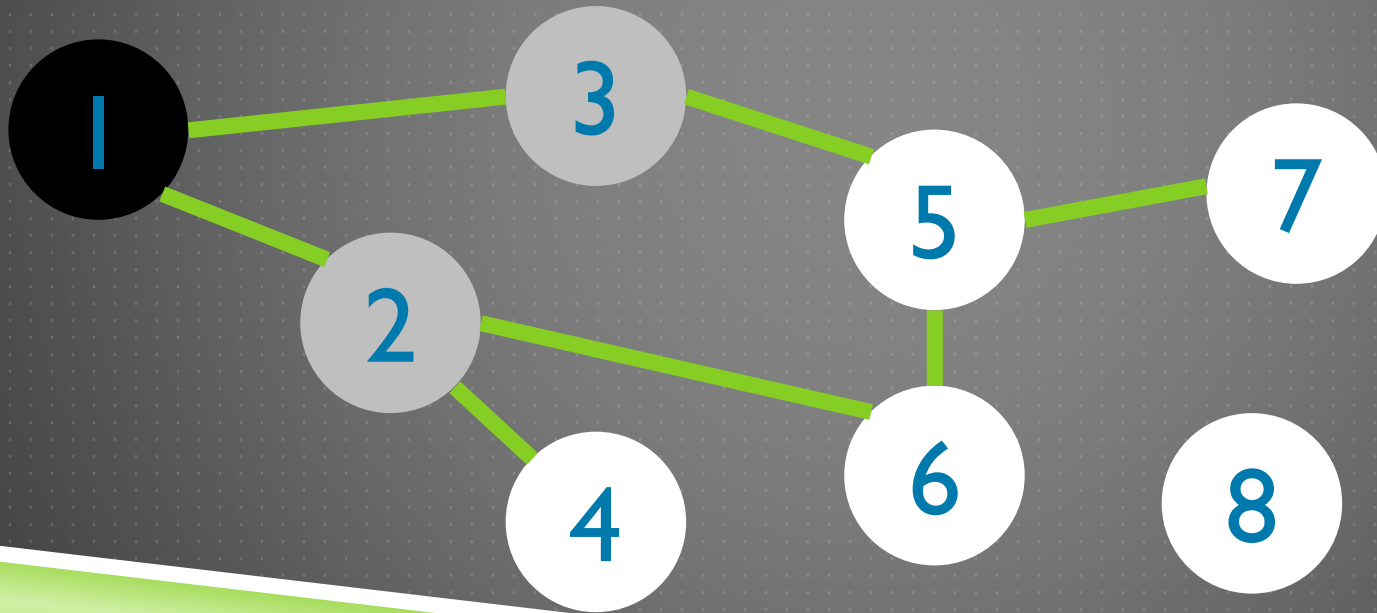
BREADTH-FIRST SEARCH - EXAMPLE

- ▶ Mark node 2 and 3 as visited and push them into the queue



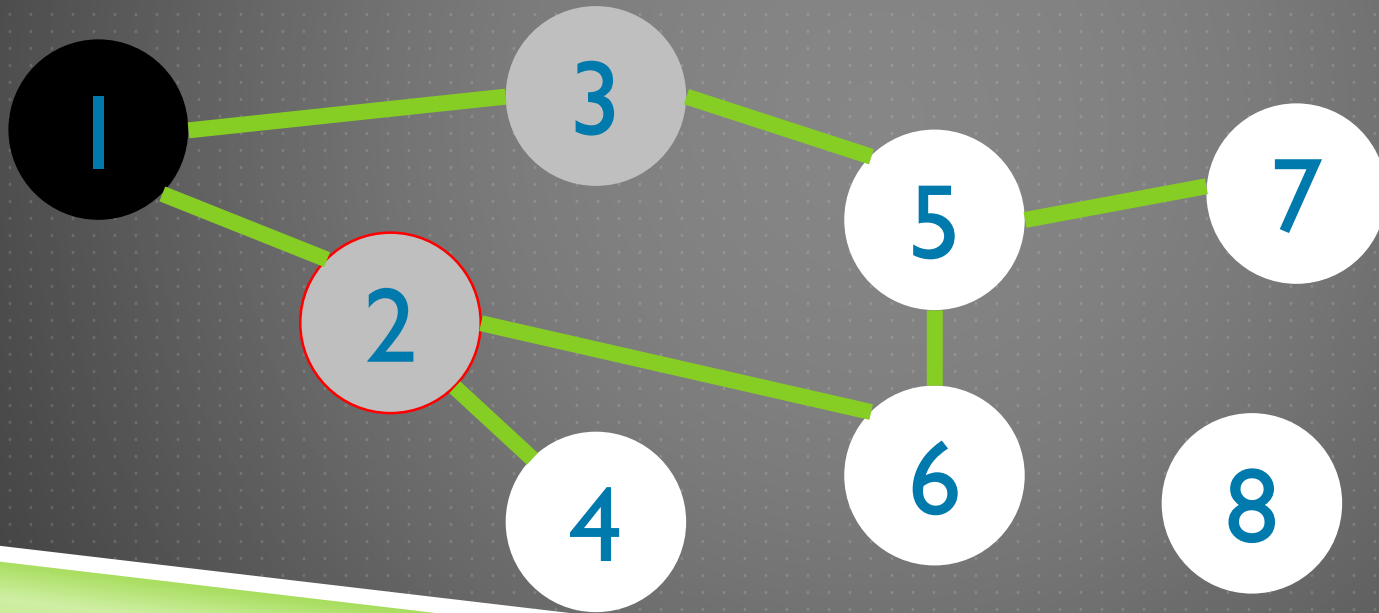
BREADTH-FIRST SEARCH - EXAMPLE

- ▶ BFS on node 1 is finished, pop 1 from the queue



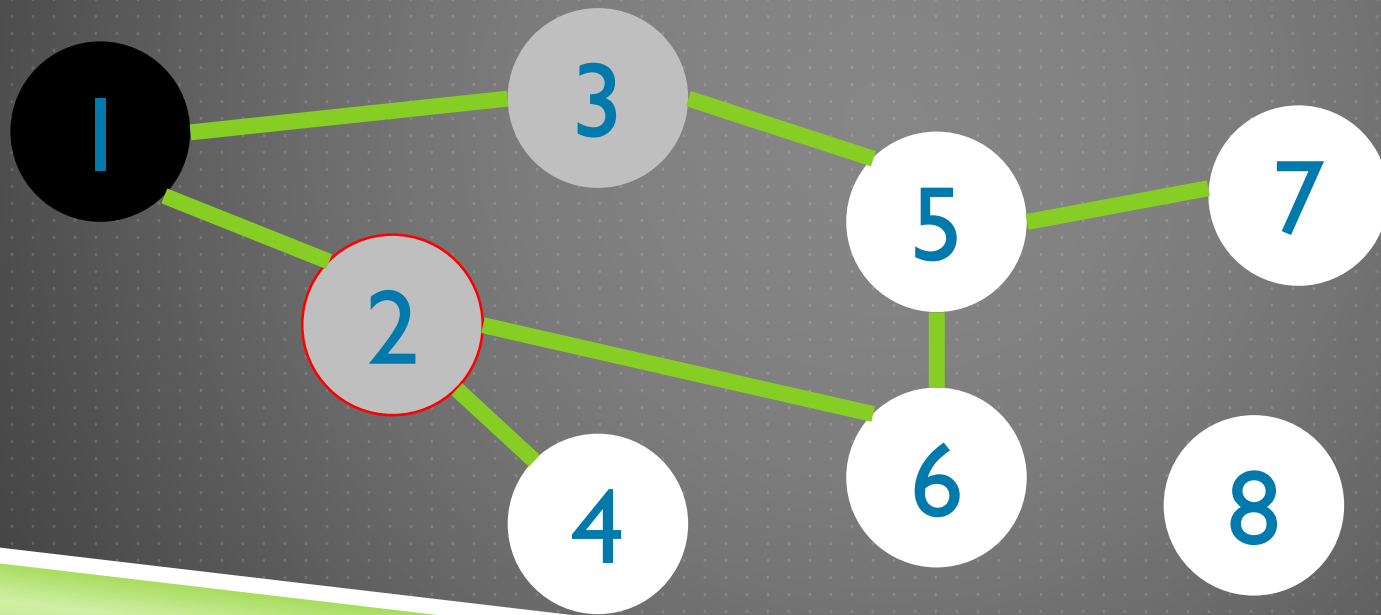
BREADTH-FIRST SEARCH - EXAMPLE

► Perform BFS on node 2



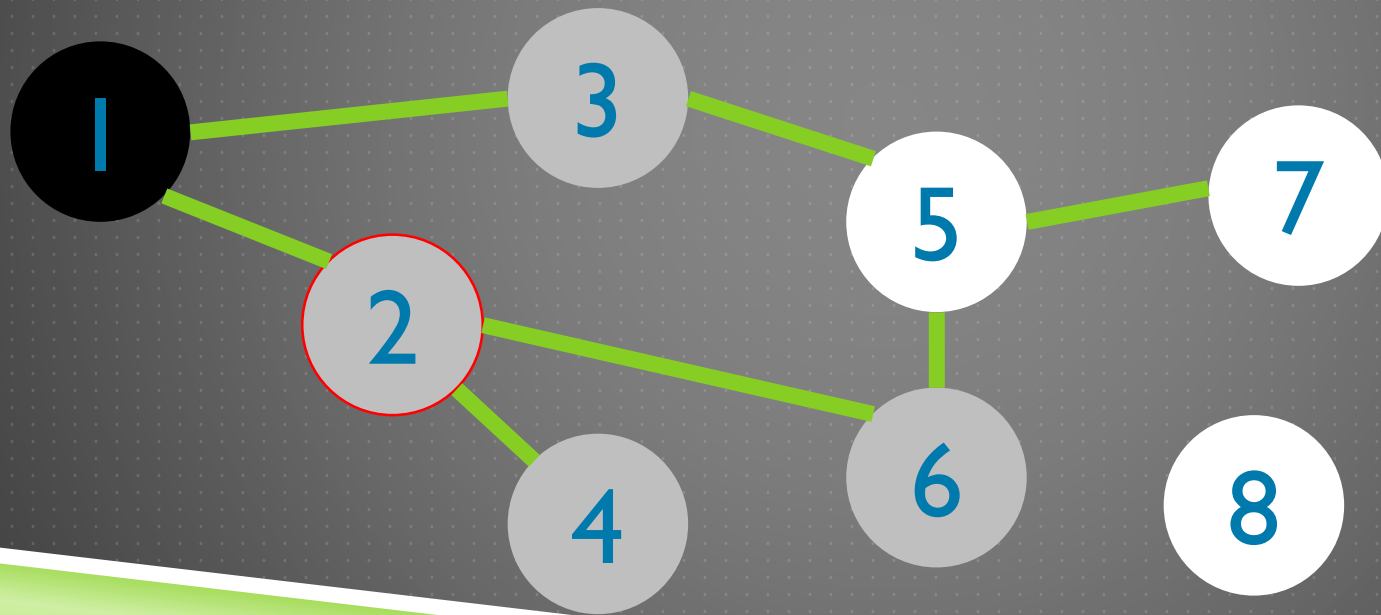
BREADTH-FIRST SEARCH - EXAMPLE

- ▶ Node 4 and 6 are adjacent to node 2 and they are not visited



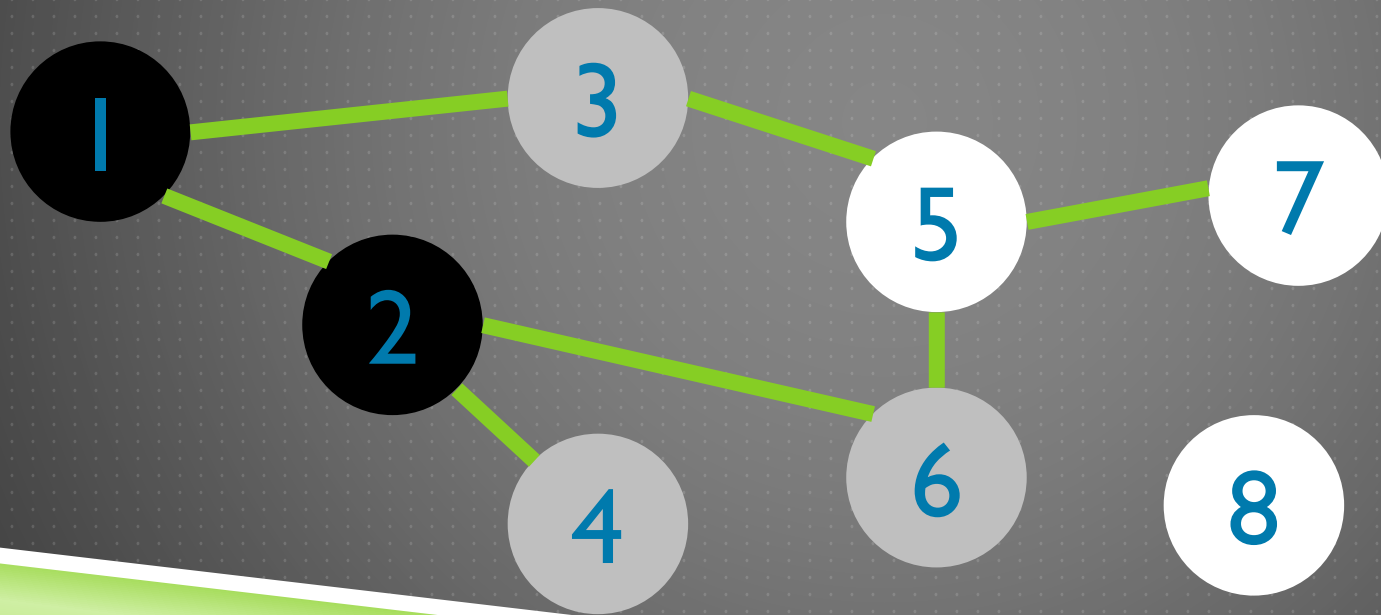
BREADTH-FIRST SEARCH - EXAMPLE

- ▶ Mark node 4 and 6 as visited and push them into the queue



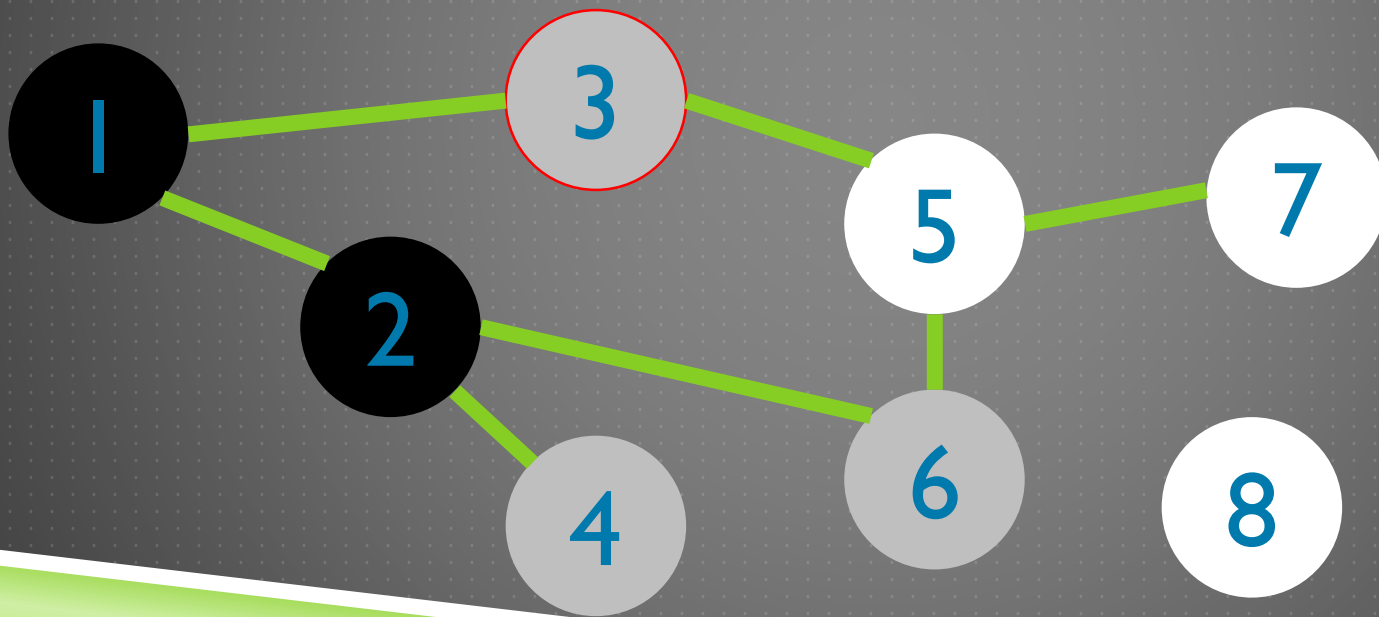
BREADTH-FIRST SEARCH - EXAMPLE

► BFS on node 2 is finished, pop 2 from the queue



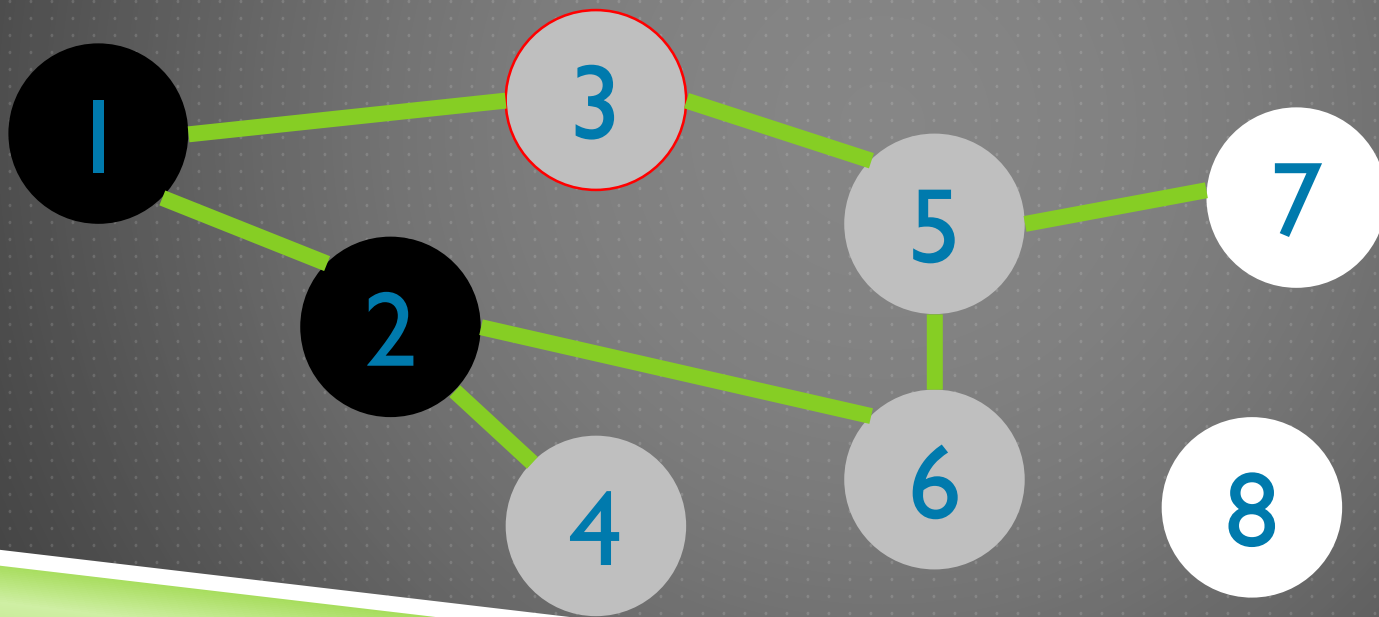
BREADTH-FIRST SEARCH - EXAMPLE

► ... and so on



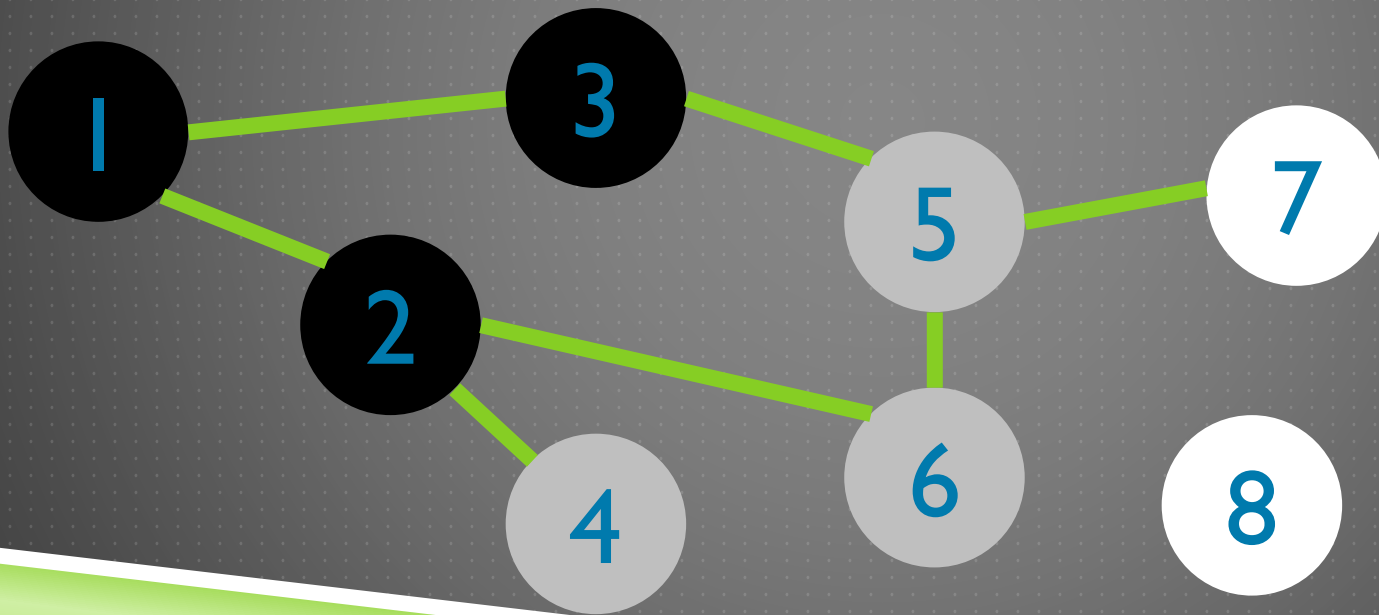
BREADTH-FIRST SEARCH - EXAMPLE

► ... and so on



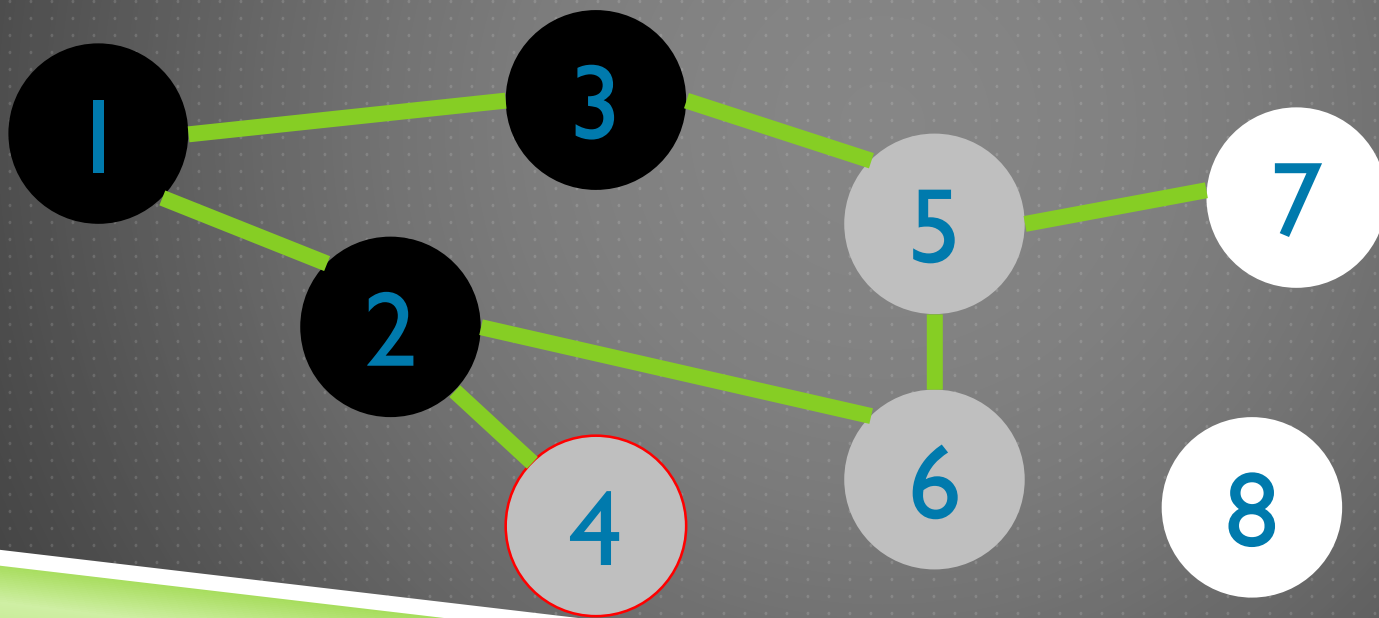
BREADTH-FIRST SEARCH - EXAMPLE

► ... and so on



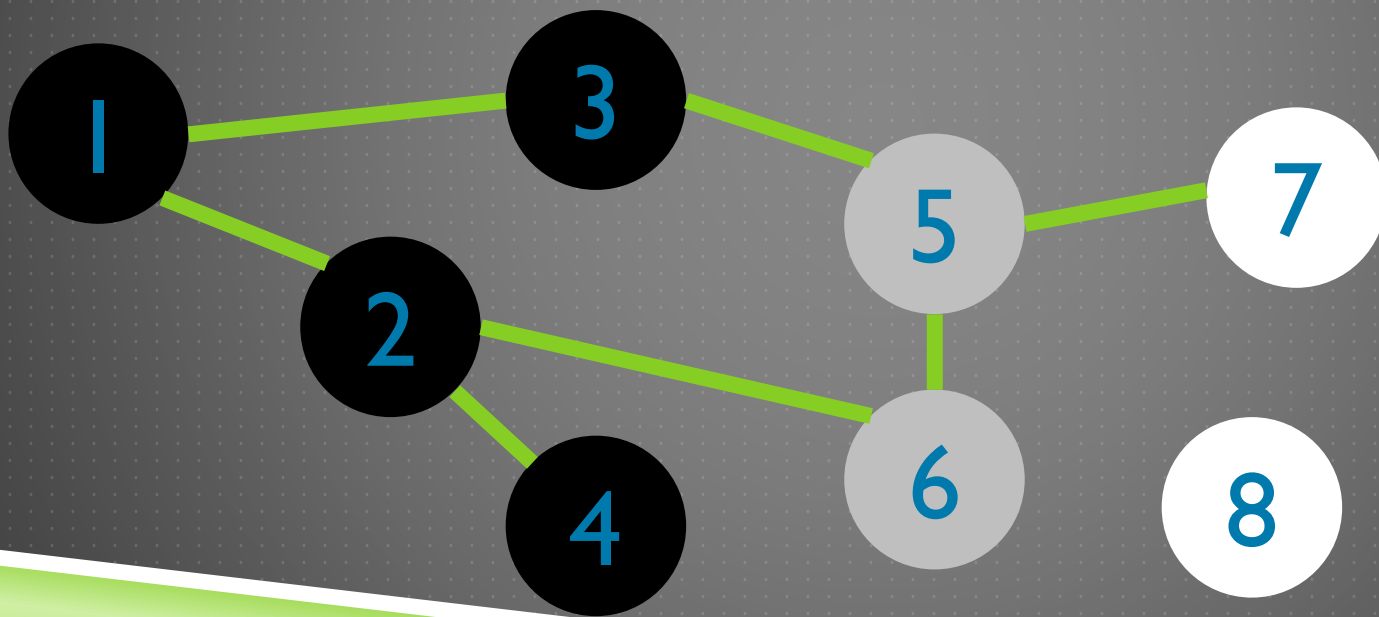
BREADTH-FIRST SEARCH - EXAMPLE

► ... and so on



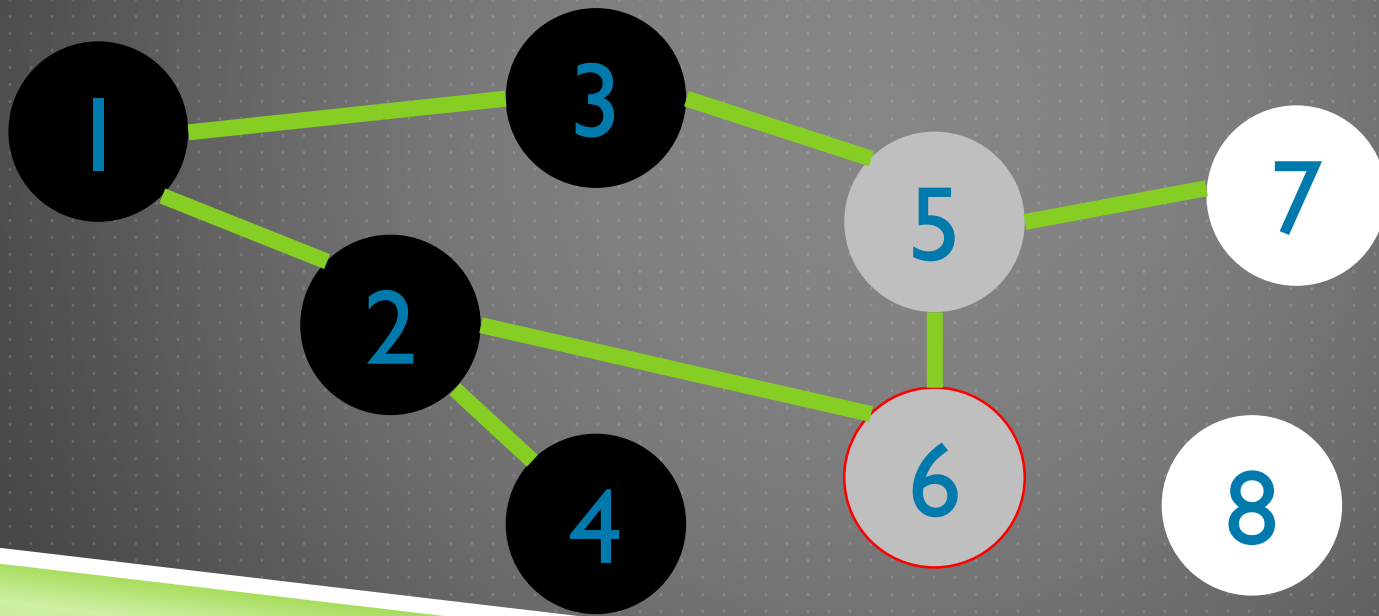
BREADTH-FIRST SEARCH - EXAMPLE

► ... and so on



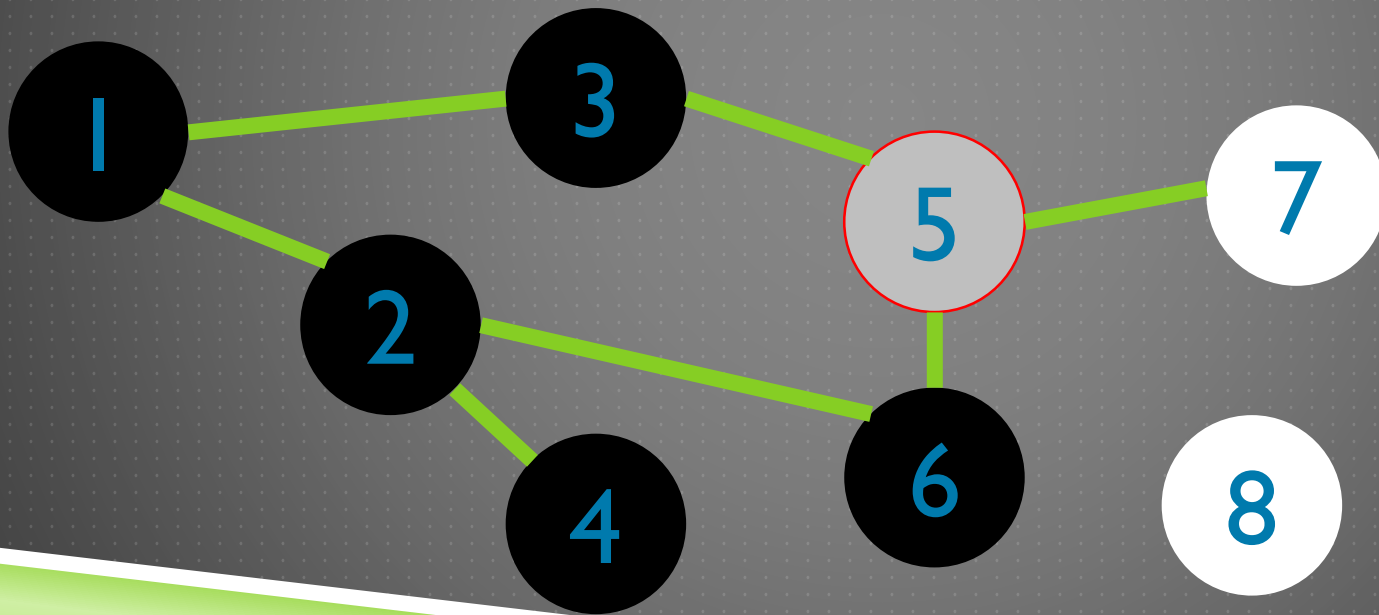
BREADTH-FIRST SEARCH - EXAMPLE

► ... and so on



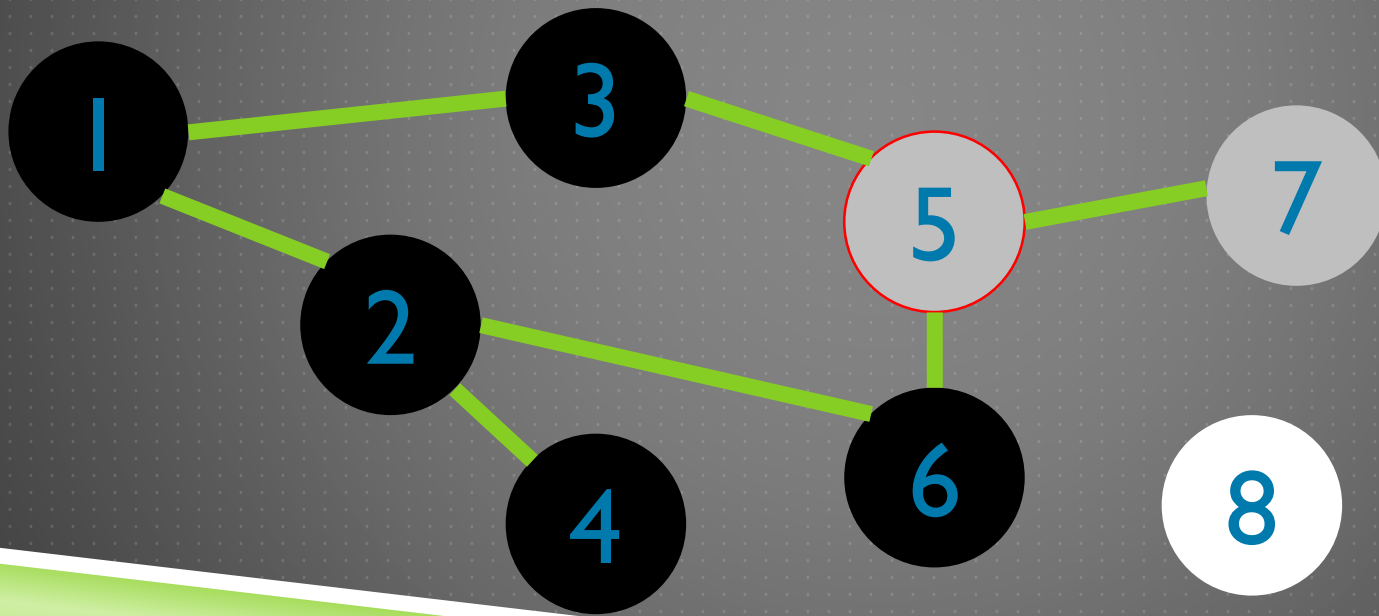
BREADTH-FIRST SEARCH - EXAMPLE

► ... and so on



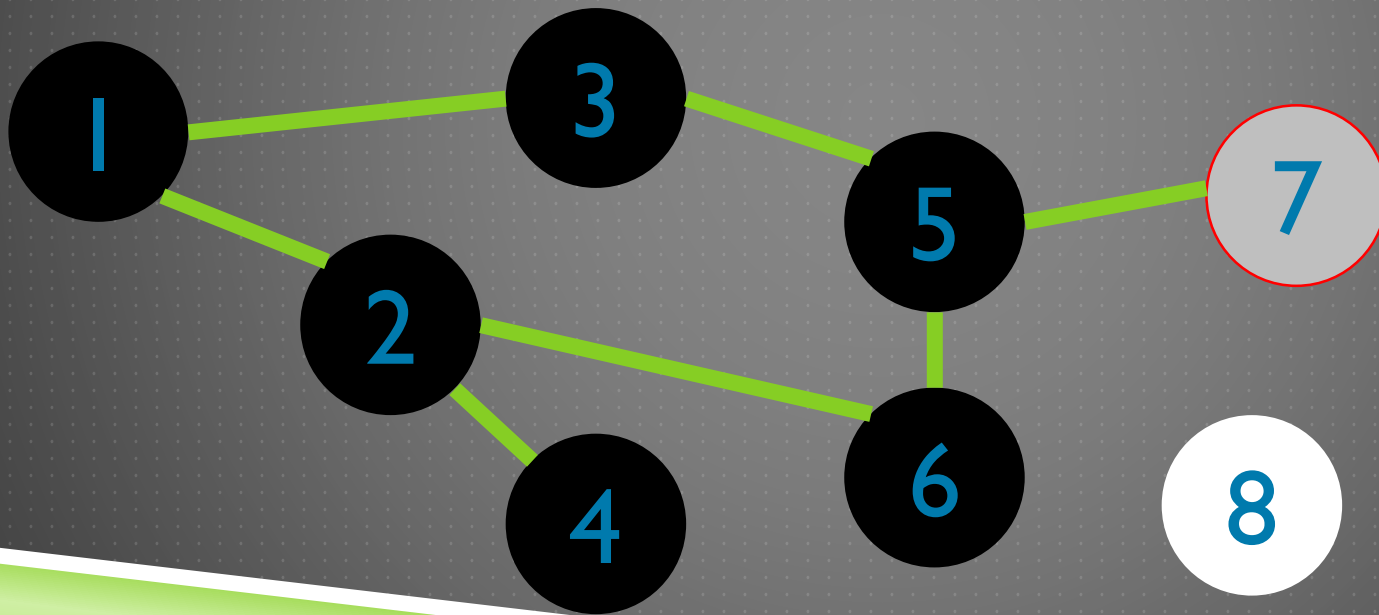
BREADTH-FIRST SEARCH - EXAMPLE

► ... and so on



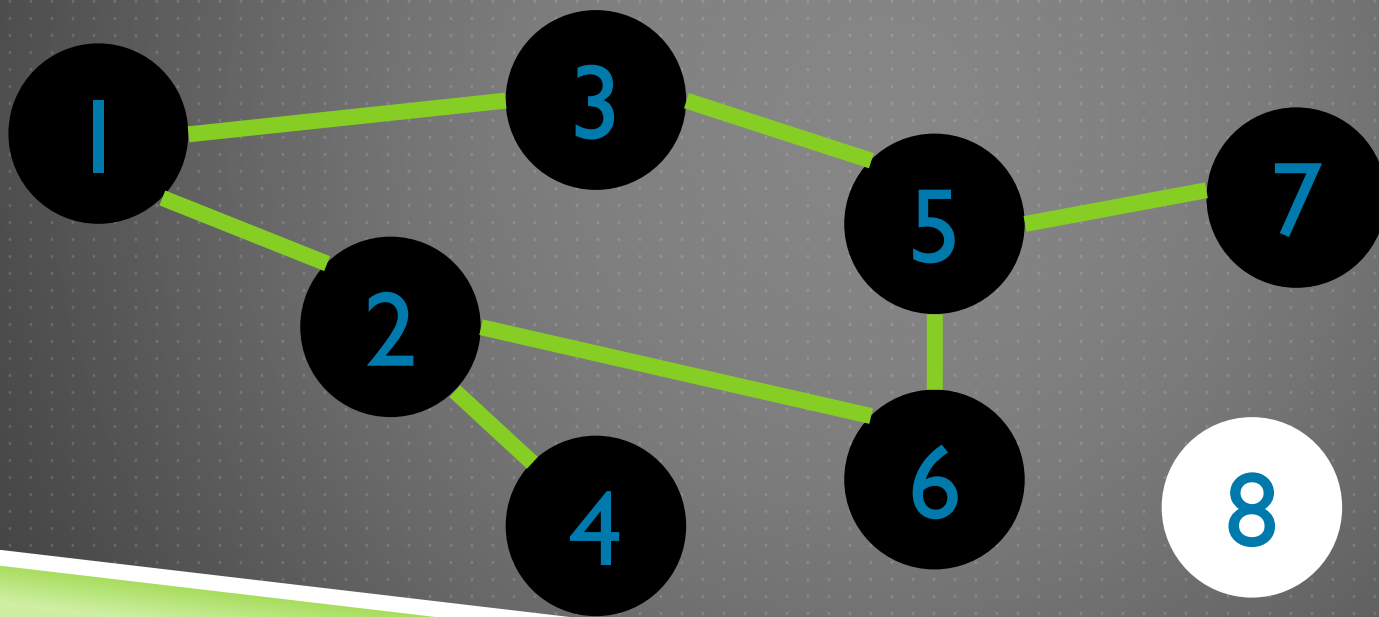
BREADTH-FIRST SEARCH - EXAMPLE

► ... and so on



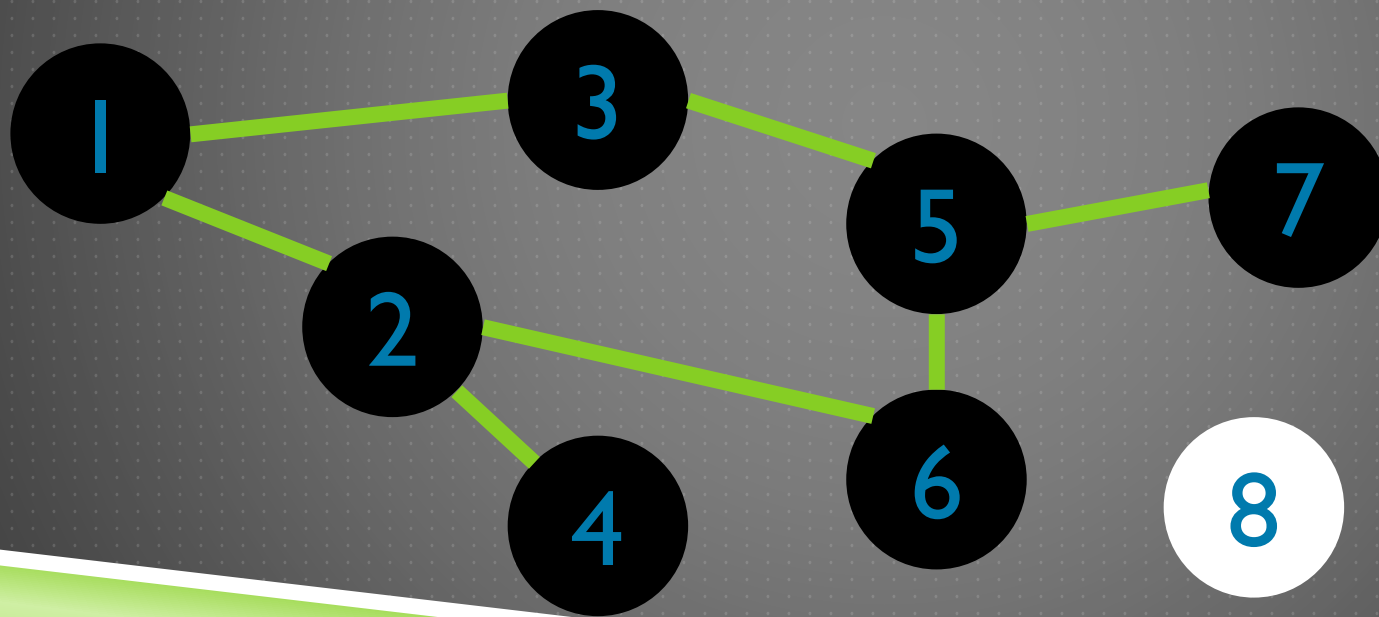
BREADTH-FIRST SEARCH - EXAMPLE

► ... and so on



BREADTH-FIRST SEARCH - EXAMPLE

- ▶ Since the queue is empty now, the search can be stopped



BREADTH-FIRST SEARCH - CODE

```
Procedure bfs(vertex v){  
    mark v is visited  
    push v into the queue  
    while the queue is not empty do  
        t = front of the queue  
        for all vertex w adjacent to t do  
            if w is not visited  
                mark w as visited  
                push w into the queue  
        pop t from the queue  
}
```

BREADTH-FIRST SEARCH

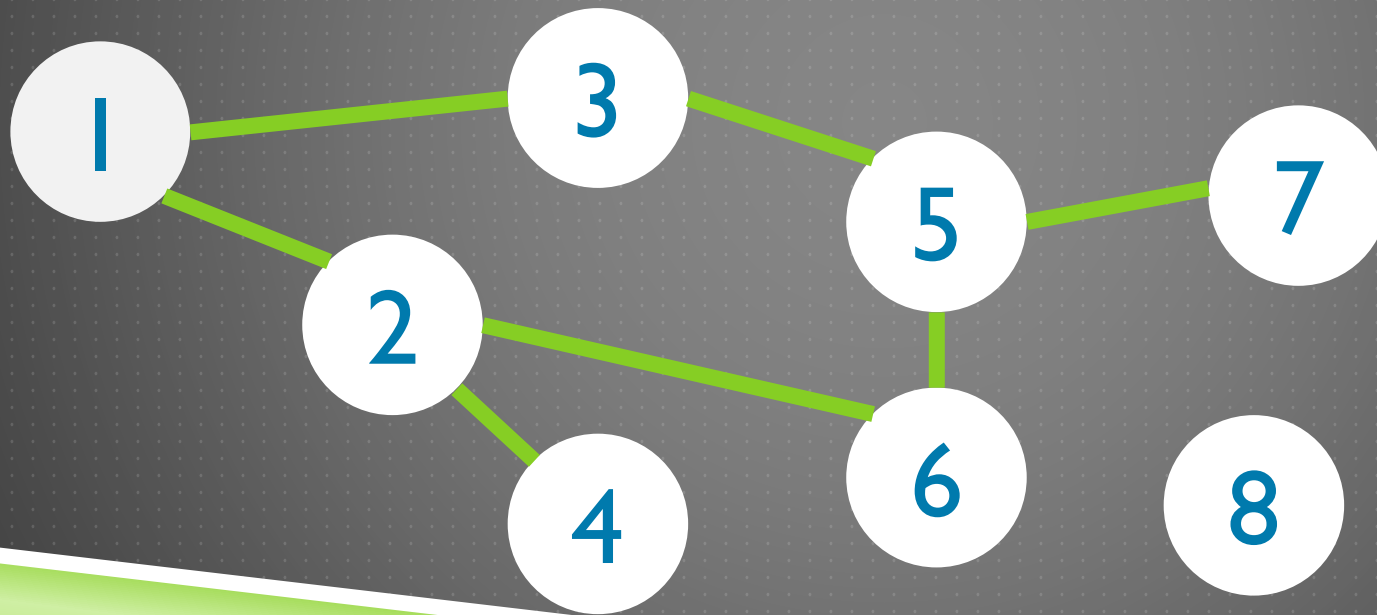
- ▶ Time Complexity:
 - ▶ $O(|V|^2)$ when using adjacency matrix
 - ▶ $O(|V|+|E|)$ when using adjacency list / edge list

BREADTH-FIRST SEARCH - APPLICATION

- ▶ Find the shortest path of all nodes from one node, with path length measured by number of edges

BREADTH-FIRST SEARCH - EXAMPLE

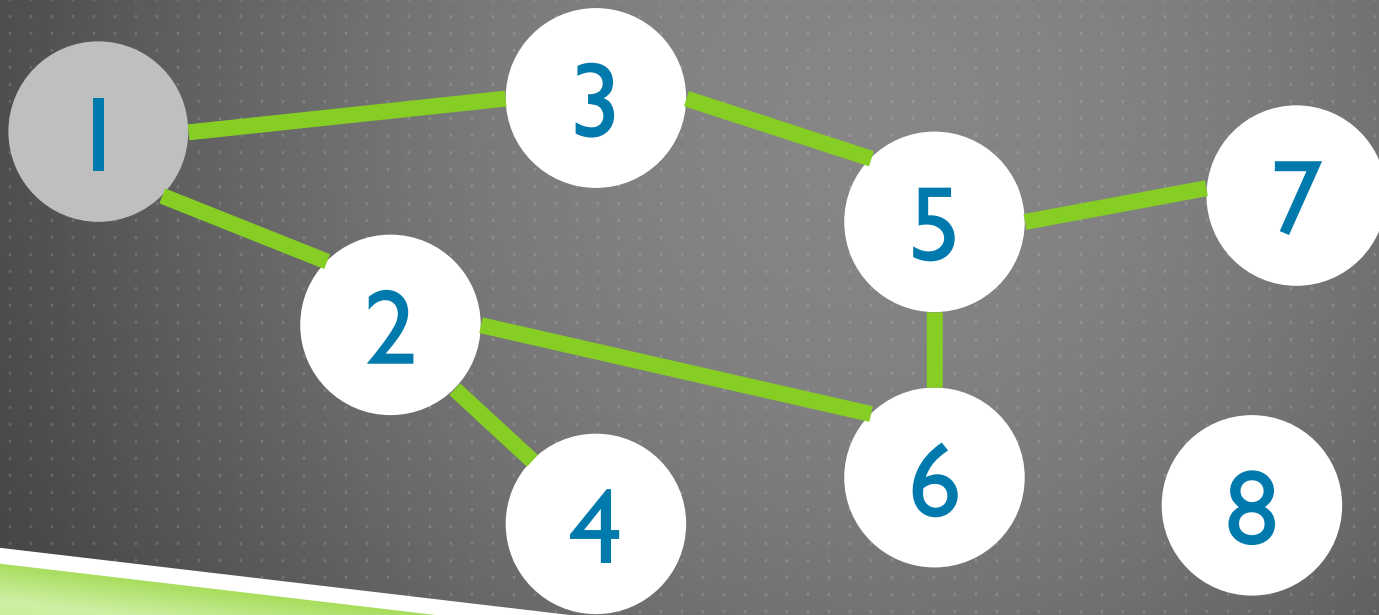
- ▶ Find the shortest paths from node 1



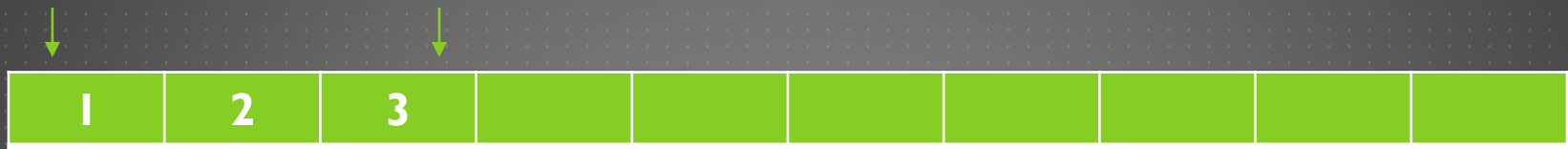
BREADTH-FIRST SEARCH - EXAMPLE



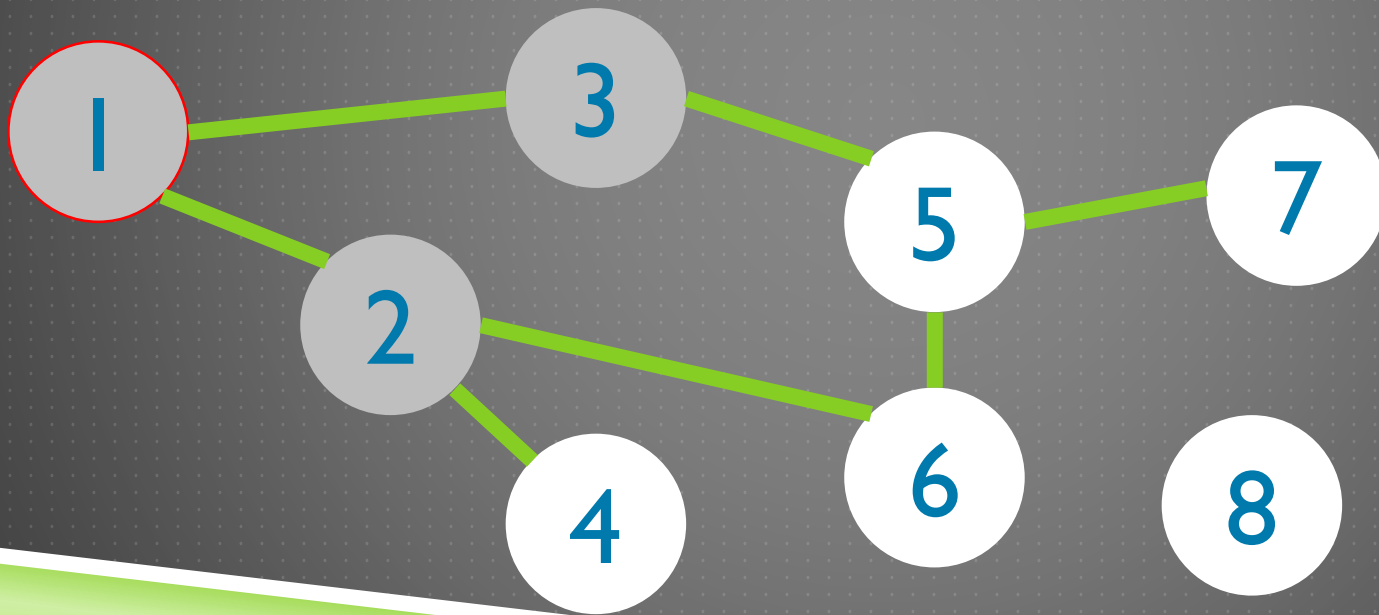
Node	1	2	3	4	5	6	7	8
Distance	0	∞	∞	∞	∞	∞	∞	∞



BREADTH-FIRST SEARCH - EXAMPLE



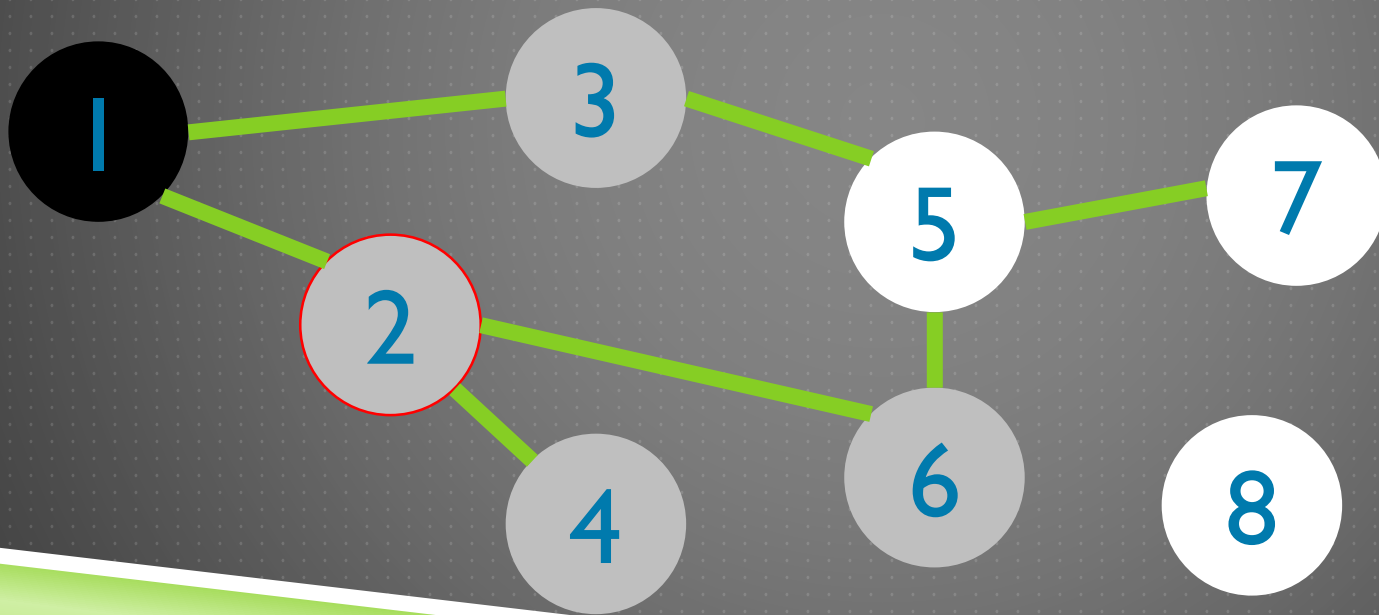
Node	1	2	3	4	5	6	7	8
Distance	0	1	1	∞	∞	∞	∞	∞



BREADTH-FIRST SEARCH - EXAMPLE

1	2	3	4	6					
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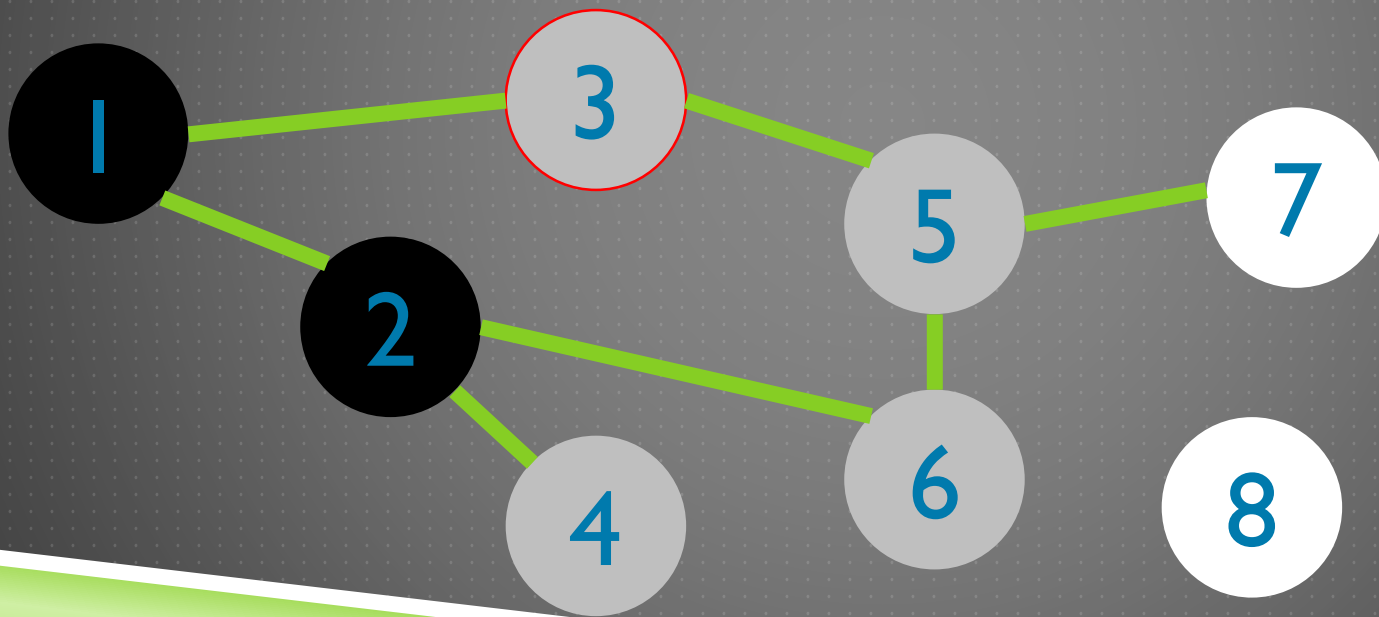
Node	1	2	3	4	5	6	7	8
Distance	0	1	1	2	∞	2	∞	∞



BREADTH-FIRST SEARCH - EXAMPLE

1	2	3	4	6	5				
---	---	---	---	---	---	--	--	--	--

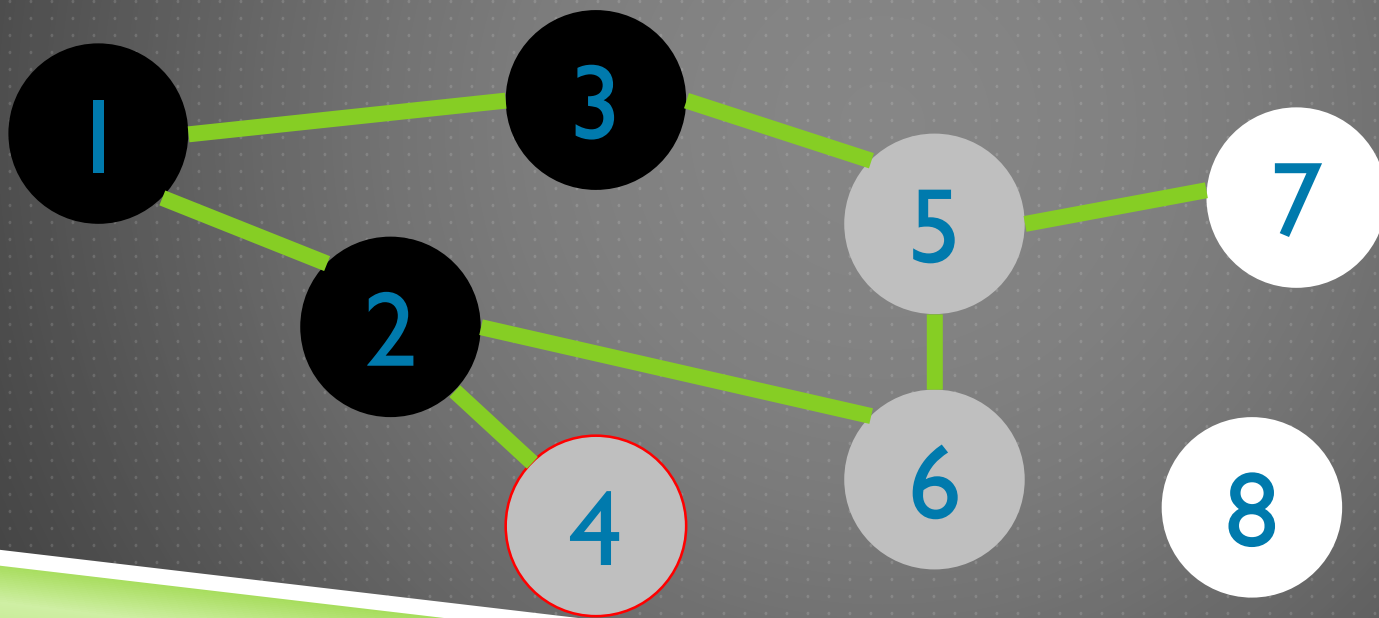
Node	1	2	3	4	5	6	7	8
Distance	0	1	1	2	2	2	∞	∞



BREADTH-FIRST SEARCH - EXAMPLE

1	2	3	4	6	5				
---	---	---	---	---	---	--	--	--	--

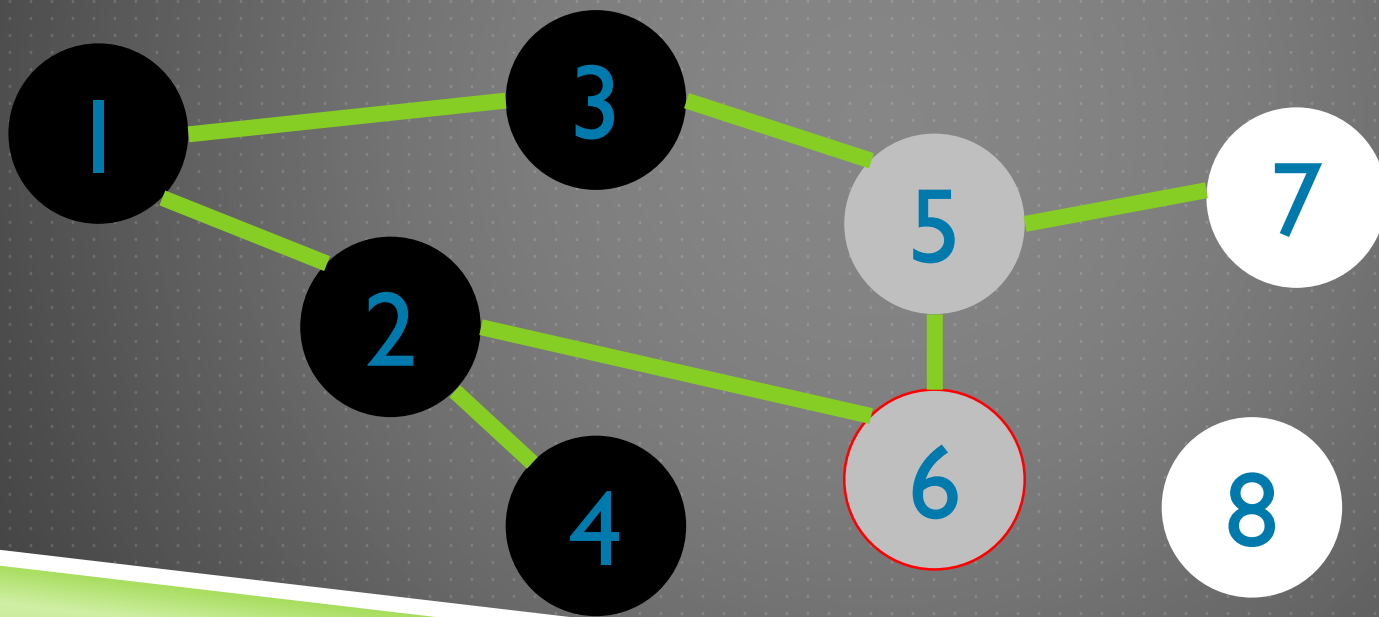
Node	1	2	3	4	5	6	7	8
Distance	0	1	1	2	2	2	∞	∞



BREADTH-FIRST SEARCH - EXAMPLE

1	2	3	4	6	5				
---	---	---	---	---	---	--	--	--	--

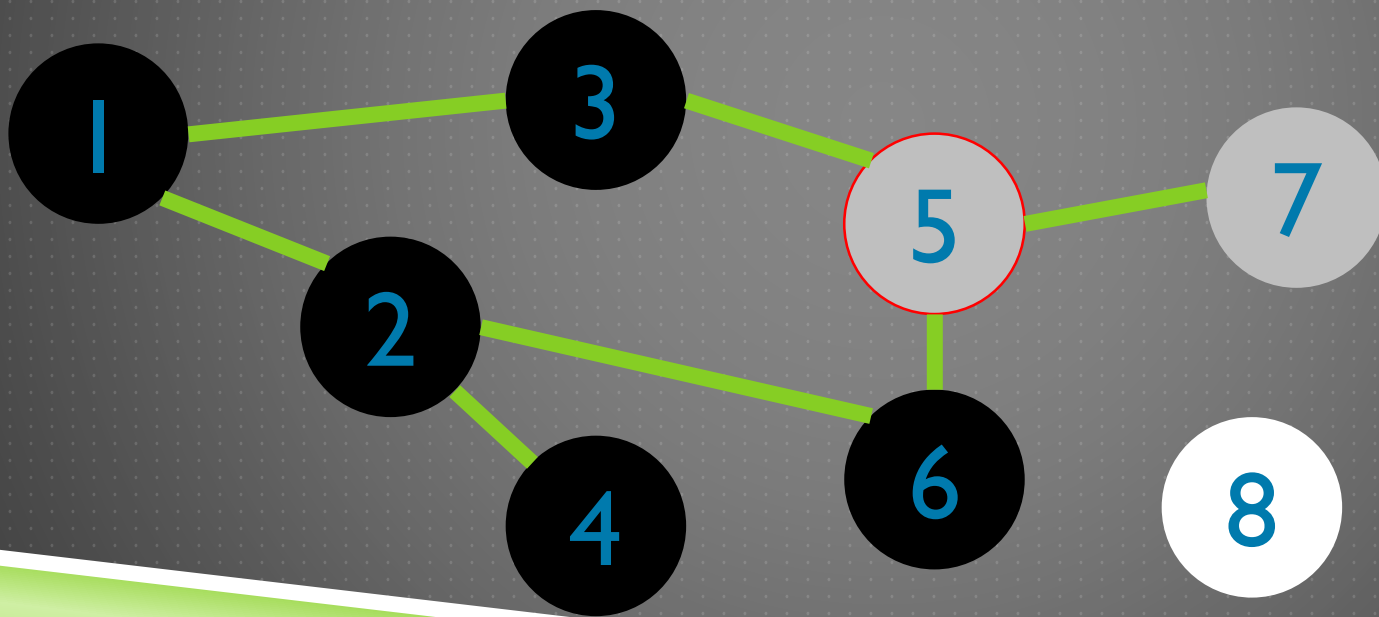
Node	1	2	3	4	5	6	7	8
Distance	0	1	1	2	2	2	∞	∞



BREADTH-FIRST SEARCH - EXAMPLE

1	2	3	4	6	5	7			
---	---	---	---	---	---	---	--	--	--

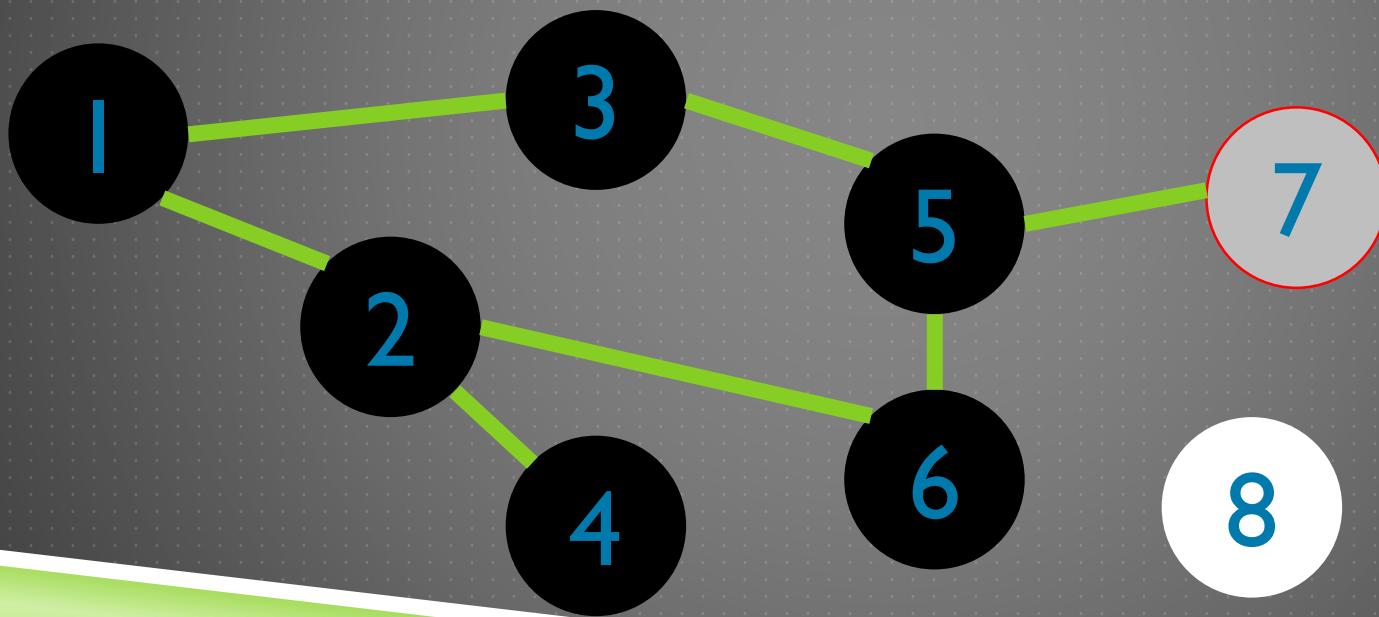
Node	1	2	3	4	5	6	7	8
Distance	0	1	1	2	2	2	3	∞



BREADTH-FIRST SEARCH - EXAMPLE

1	2	3	4	6	5	7			
---	---	---	---	---	---	---	--	--	--

Node	1	2	3	4	5	6	7	8
Distance	0	1	1	2	2	2	3	∞

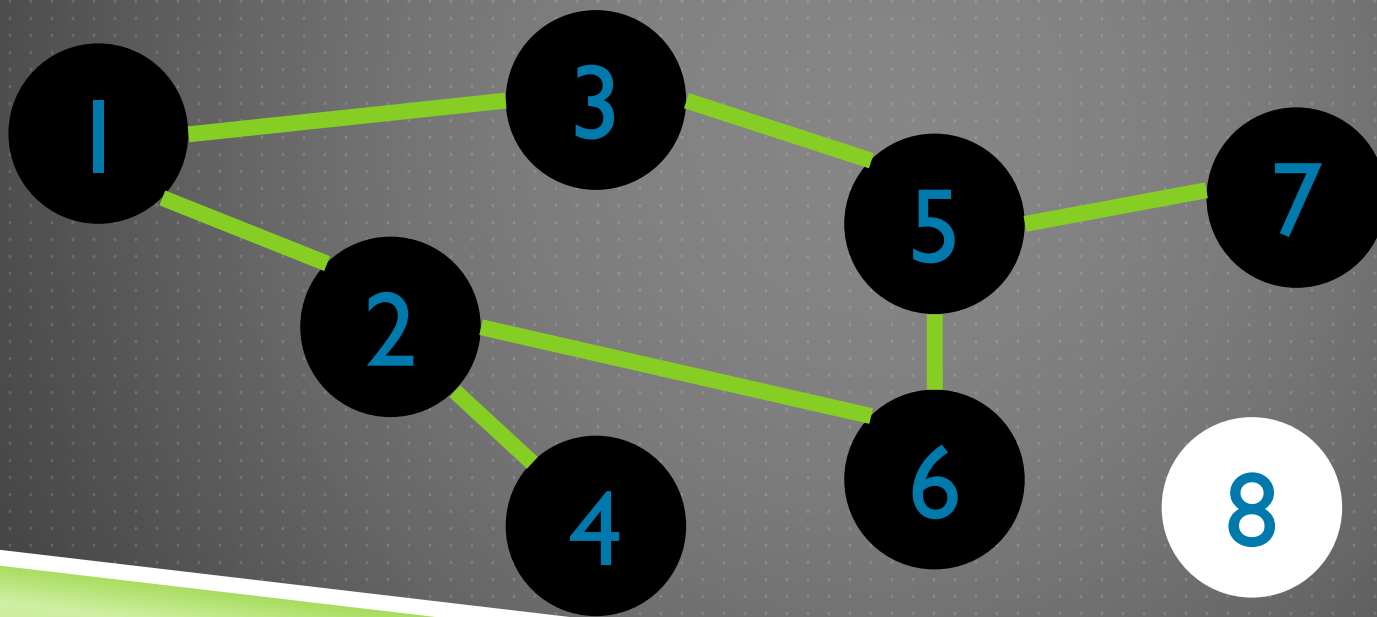


BREADTH-FIRST SEARCH - EXAMPLE



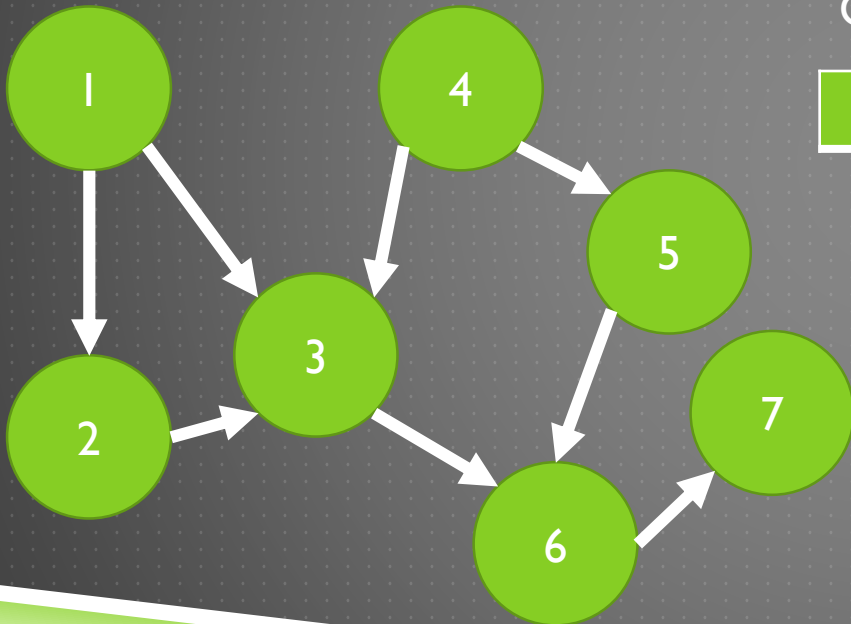
1	2	3	4	6	5	7			
---	---	---	---	---	---	---	--	--	--

Node	1	2	3	4	5	6	7	8
Distance	0	1	1	2	2	2	3	∞



TOPOLOGICAL SORT

- ▶ Find a linear ordering of the vertices such that for every directed edge from vertex u to vertex v , u comes before v in the ordering



One of the topological orders:

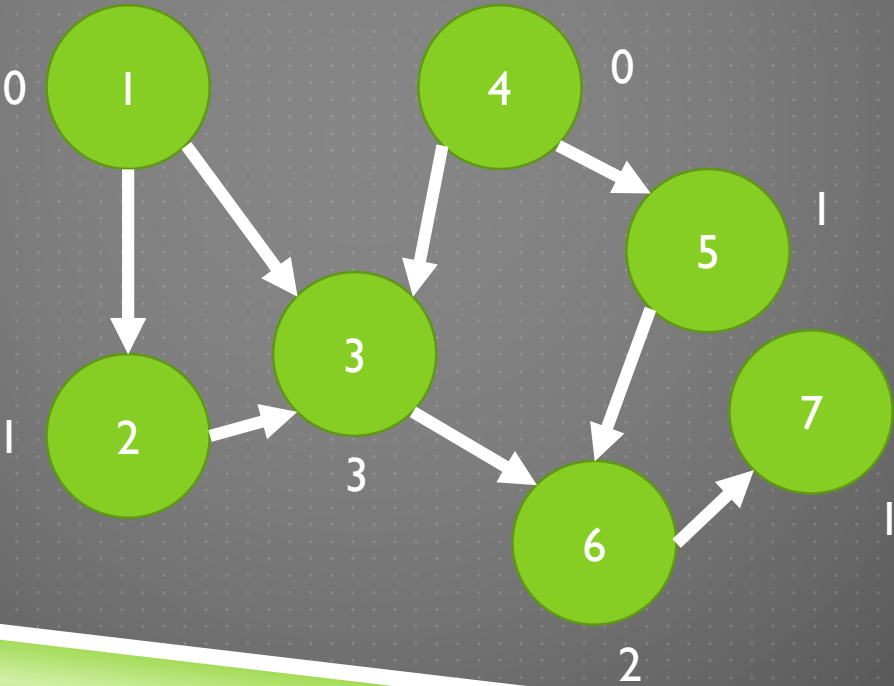
1	4	2	3	5	6	7
---	---	---	---	---	---	---

TOPOLOGICAL SORT

- ▶ Find a vertex with no incoming edges. Number it and remove all outgoing edges from it
- ▶ Repeat the above process
- ▶ Can be implemented by DFS or BFS

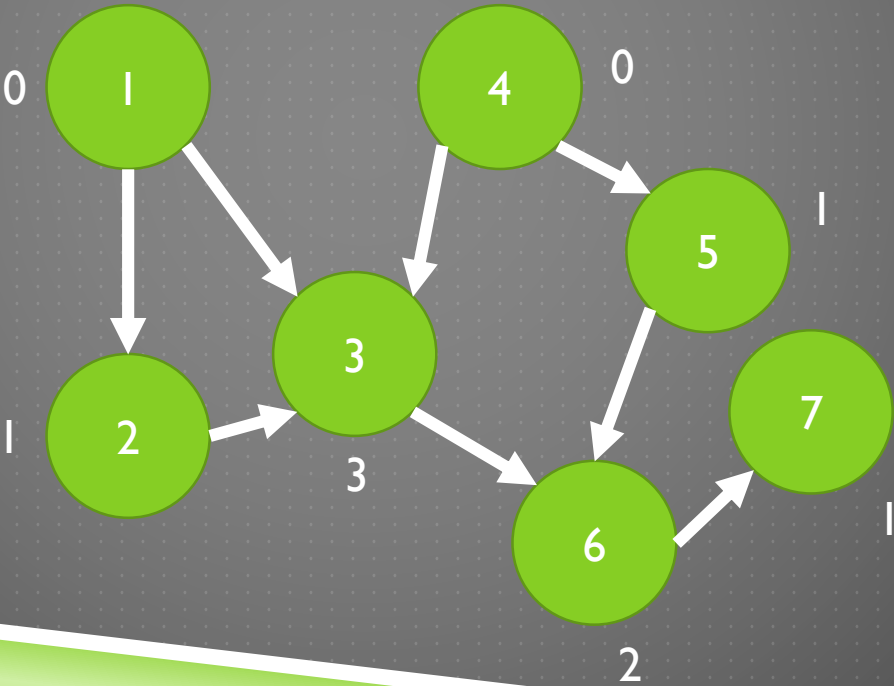
TOPOLOGICAL SORT - EXAMPLE

► Topological order:



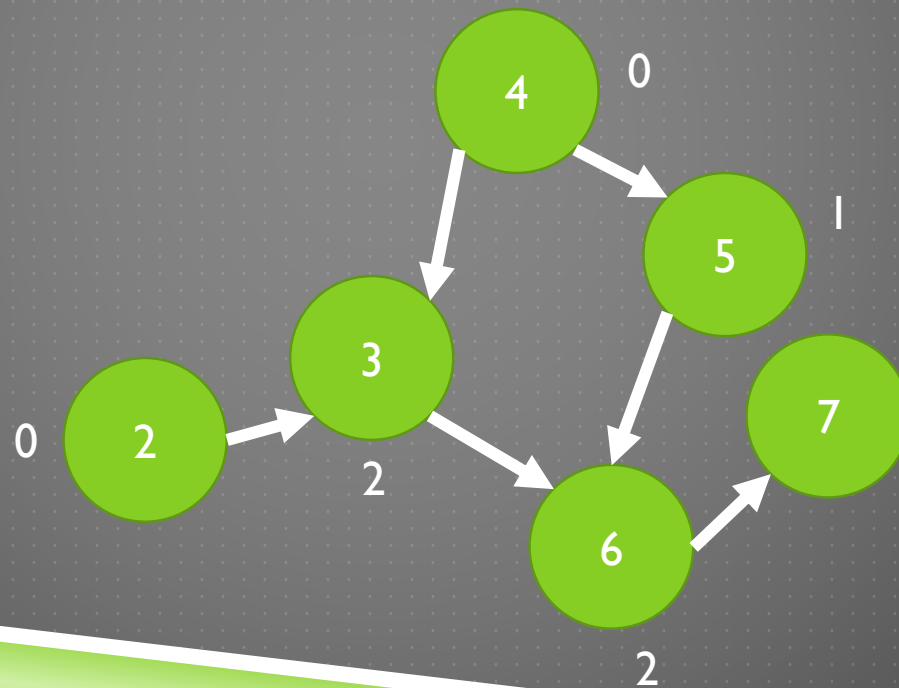
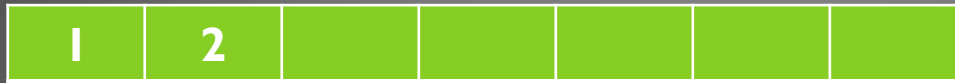
TOPOLOGICAL SORT - EXAMPLE

► Topological order:



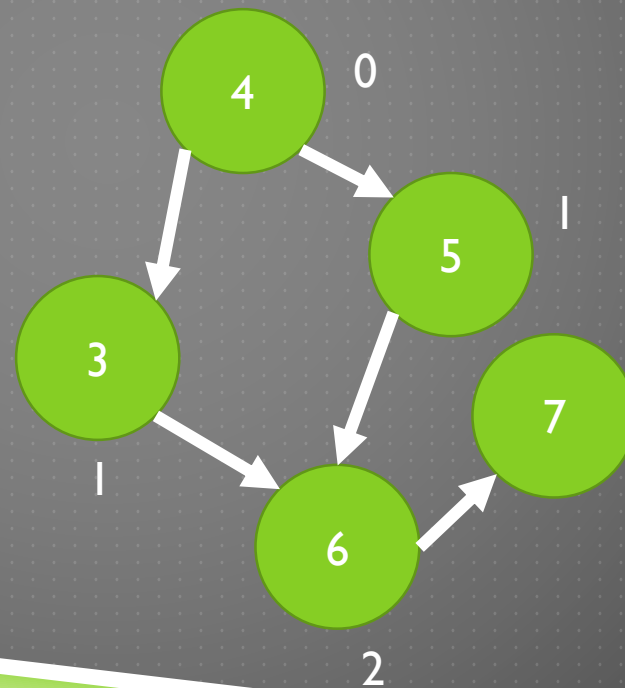
TOPOLOGICAL SORT - EXAMPLE

► Topological order:



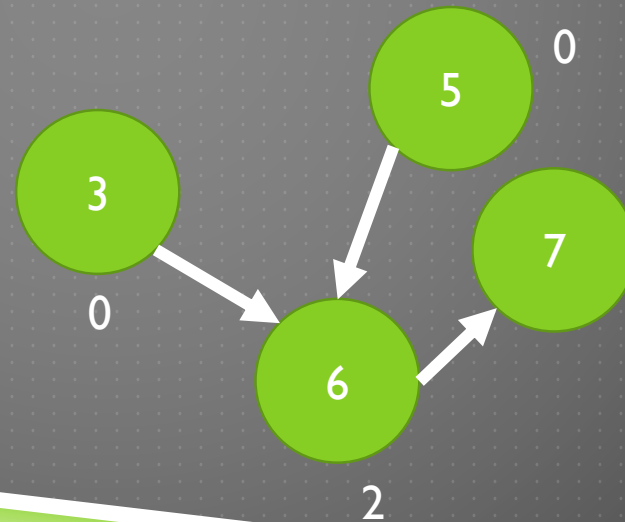
TOPOLOGICAL SORT - EXAMPLE

► Topological order:



TOPOLOGICAL SORT - EXAMPLE

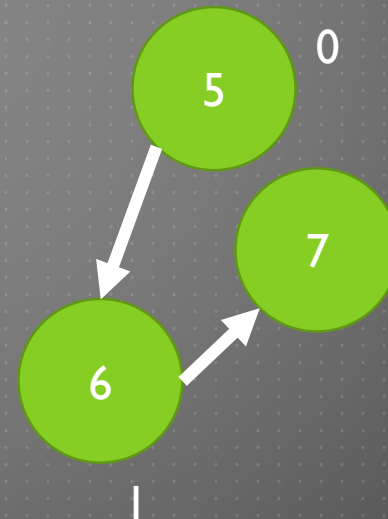
► Topological order:



TOPOLOGICAL SORT - EXAMPLE

► Topological order:

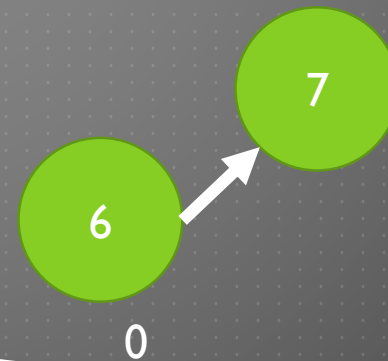
1	2	4	3	5		
---	---	---	---	---	--	--



TOPOLOGICAL SORT - EXAMPLE

► Topological order:

1	2	4	3	5	6	
---	---	---	---	---	---	--



TOPOLOGICAL SORT - EXAMPLE

► Topological order:

1	2	4	3	5	6	7
---	---	---	---	---	---	---



0

TOPOLOGICAL SORT

- ▶ Time complexity : $O(|V|+|E|)$
- ▶ Application
 - ▶ Determine whether a graph is a directed acyclic graph (DAG)

PROBLEMS

- ▶ 01067 Maze
- ▶ S042 Teacher's Problem
- ▶ T022 Bomber Man
- ▶ 01075 Sokoban