

# Graph (I)

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### **Pre-Requisites**

#### Data Structure (I):

- Queue
- Stack
- Linked lists

#### Recursion, divide and conquer:

Recursion

#### **Contents**

#### Introduction to Graph

- What is a graph?
- Types of graphs
- Modelling problems as graphs

#### **Graph Representation**

- Adjacency Matrix
- Edge List
- Adjacency List
- Grid graphs

#### **Graph Traversal**

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

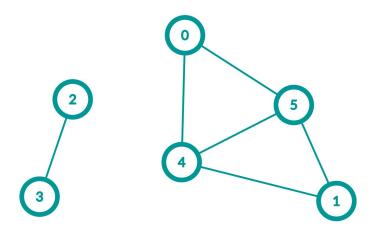
#### **Special Graphs**

- Cycles
- Trees
  - Chains
  - Stars
- Bipartite graph
- Connected graph
- Planar graph

## **Introduction to Graph**

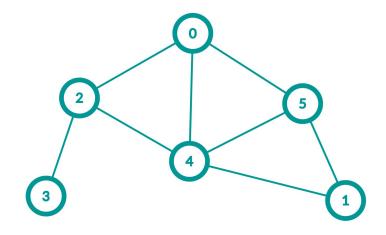
### **Types of Graphs**

Disconnected Graph



{2, 3} and {0, 1, 4, 5} are connected components

Connected Graph



undirected edge = two oppositely directed edges

#### What is a Graph?

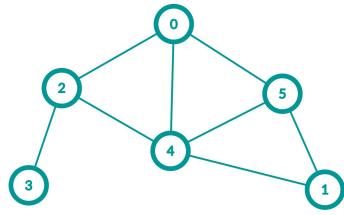
A set of vertices/nodes linked by edges

We call a graph (G) = (V,E) where

 $V = set of vertices \rightarrow |V| = number of vertices$ 

 $E = \text{set of edges} \rightarrow |E| = \text{number of edges}$ 

Path = sequence of edges which joins a sequence of vertices (usually distinct)

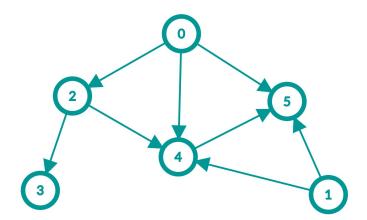


graph with 6 vertices and 8 edges

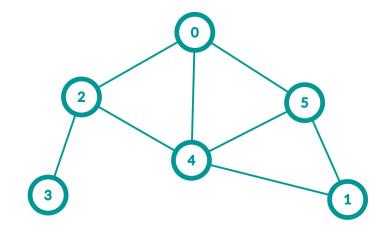
valid path:  $4 \rightarrow 5 \rightarrow 0 \rightarrow 2$ invalid path:  $1 \rightarrow 2 \rightarrow 5$ 

### **Types of Graphs**

**Directed Graph** 



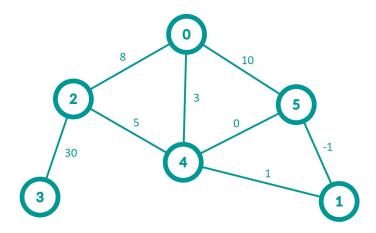
**Undirected Graph** 



undirected edge = two oppositely directed edges

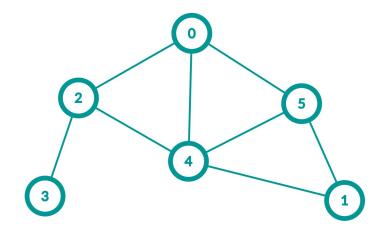
### **Types of Graphs**

Weighted Graph



a value / cost is assigned to each edge

**Unweighted Graph** 



consider as all edges having same weight

### Modelling Problems as Graphs

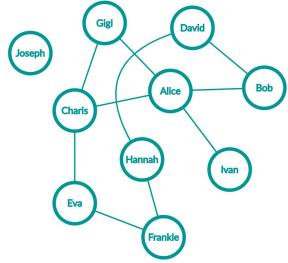
A graph can show relations/transitions between nodes (objects) using edges.

#### Examples:

- Map
- Maze
- Social networks
- Game states
- Conflict graph

#### A social network

- nodes = people
- edges = friendship



We can ask:

Do Bob and Charis have any common friends?

#### Modelling Problems as Graphs

#### Represent:

- States/ Objects as a vertices
- Possible transitions/ relations as edges
- Transitional costs as weights

It forms a graph and makes things easier to handle.

### Modelling Problems as Graphs

#### Common use cases:

- Find possible paths
- Find shortest path
- Find longest path
- Count number of connected components
- Find nodes reachable with cost less than k
- Find cycles
- ...

#### **States - Water Jug Problem**

There are 2 water jugs with capacities N and M litres respectively.

Initially, both of them are empty.

You can perform the following operations for infinitely many times (one operation a time)

- 1. Empty a jug
- 2. Fully fill a jug
- 3. Pour water from one jug to another until either one jug is empty / full

How to get a specific volume K in one of the jugs?

#### **States**

The states in this problem would be the volumes of the two jugs (v1, v2)

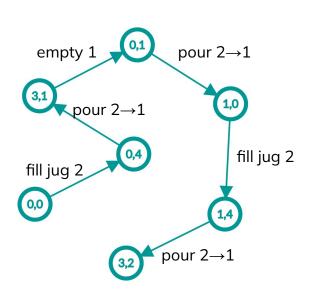
How to we represent them as a graph?

$$N = 3$$
 (jug 1),  $M = 4$  (jug 2),  $K = 2$  (goal)

Initial state = (0, 0); Final state = (3, 2)

We can represent the solution as a path in the graph

We will further discuss this problem later.



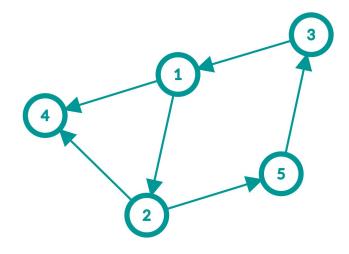
## **Graph Representation**

#### How can we store a graph?

- 1. Adjacency Matrix
- 2. Edge List
- 3. Adjacency List

#### Methods needed:

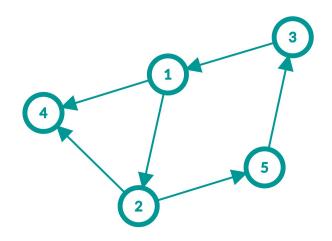
- 1. Add an edge between two nodes
- 2. Get a node's neighbors (or parent/child)



example: can we go from node 2 to node 1?

### **Adjacency Matrix**

A |V|x|V| array representing the relation / weight of every pair of vertices adj[i][j] = 1 (or weight) if there is an edge from vertex i to vertex j else adj[i][j] = 0



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

### **Adjacency Matrix - Implementation**

Memory:  $O(|V|^2)$ 

 $O(|V|^2)$ 

O(|E|)

for all query if 
$$u \rightarrow v$$
 exist:  
output adj[u][v]

O(1) per query

4		3
	2	

adj	1	2	3	4	5
1	0	0	0	0	0
2	0	0	0	Φ	0
3	<b>O</b>	0	0	0	0
4	0	0	0	0	0
5	0	0	00	0	0

### **Adjacency Matrix - Implementation**

How to output all children of node x? all nodes y that exist an edge  $x \rightarrow y$ 

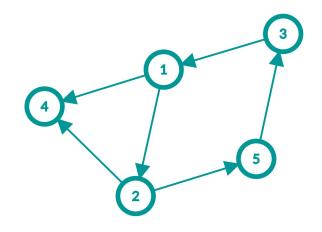
for 
$$i \leftarrow 1$$
 to  $V$ 

if  $adj[x][i] == 1$ 

output  $i$ 
 $O(|V|)$  per query

How to output all parents of node x? all nodes y that exist an edge  $y \rightarrow x$ 

for 
$$i \leftarrow 1$$
 to  $V$   
if  $adj[i][x] == 1$   
output i



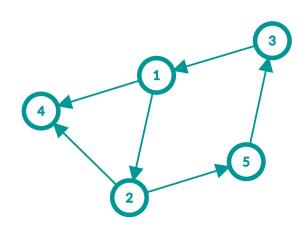
adj	1	2	3	4	5
1	0	1	0	1	0
2	0	0	0	1	1
3	1	0	0	0	0
4	0	0	0	0	0
5	0	0	1	0	0

### **Edge List**

Array of size |E| to store each edge:

from[i], to[i] and weight[i] represent the the origin, the destination and the path weight

of the i-th edge respectively.



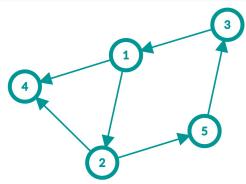
ID	from	to	weight
1	1	2	1
2	1	4	1
3	2	4	1
4	2	5	1
5	3	1	1
6	5	3	1

### **Adjacency Matrix - Implementation**

```
edge[E]
edge_no = 0

for all edges from u to v:
    edge[edge_no] = edge(u,v)
    edge_no++

for all query if u → v exist:
    for i ← 0 to edge_no - 1:
        if edge[i] is edge(u,v):
        O(|E|) per query
        output YES
```



ID	from	to
1	1	2
2	1	4
3	2	4
4	2	5
5	3	1
6	5	3

### **Adjacency Matrix - Implementation**

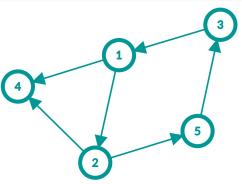
#### Implement with C++ struct and vector

```
struct Edge {
    int from, to, weight;
};

vector<Edge> edge_list; (easier memory allocation)

Insert edge u → v

Edge edge;
edge.from = u, edge.to = v, edge.w = 1;
edge_list.push_back(edge);
```



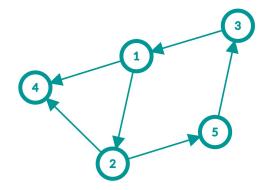
ID	from	to
1	1	2
2	1	4
3	2	4
4	2	5
5	3	1
6	5	3

### **Adjacency List**

Idea: for each node, maintain a list of nodes/edges connected to it in practice, it is usually neighbours in undirected edges, or child for directed edges

#### The list may be:

- Arrays of size | E |
- Linked lists
- Vectors



1	2	4
2	4	5
3	1	
4		
5	3	

### **Adjacency List - Implementation**

```
neighbour[V]
```

```
for all edges from u to v:
    neighbour[u].push_back(v)
    neighbour[v].push_back(u)

all neighbours of node u
    for x in neighbour[u]:
        output x

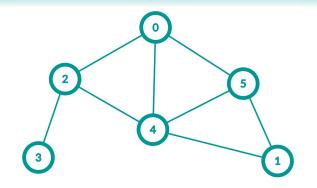
is v a neighbour of node u
```

O(|E|) per query

for x in neighbour[u]:

output YES

if x == v:



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

fill the matrix

### **Adjacency List - Implementation**

#### Implement with C++ vector

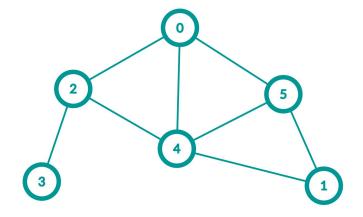
```
vector<int> neighbour[V];
```

#### Insert edge u - v

```
neighbour[u].push_back(v);
neighbour[v].push_back(u);
```

#### All neighbours of node u

```
for auto i in neighbour[u]:
    cout << i << " ";</pre>
```



### **Adjacency List - Implementation**

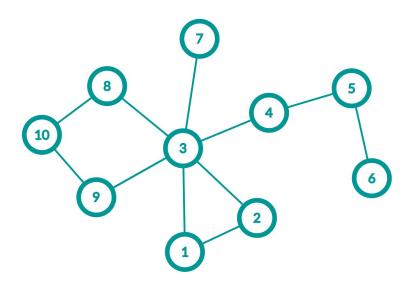
	Array	Linked List	Vector
Declaration	int neighbour[V][E]	Node* neighbour[V]	vector <int> neighbour[V]</int>
Space Efficiency	O( V  E )	O( V + E )	O( E )

for more implementation detail, refer to data structure (I)

in practice, just use vector

#### **Practice**

Adjacency list for this graph?



1	2	3				
2	1	3				
3	1	2	4	7	8	9
4	3	5				
5	4	6				
6	5					
7	3					
8	3	9	10			
9	3	10				
10	8	9				

#### **Pros and Cons**

	Adjacency Matrix	Edge List	Adjacency List
Ease of Implement	High	Middle	Low
Space Efficiency	$O( V ^2)$	O( E )	O( V + E )
Retrieve 1 edge	O(1)	O( E )	faster than O( E )
Retrieve all neighbour	O( V )	O( E )	O( V + E ) for all nodes
Multiple Edges	No	Yes	Yes

#### Which to choose?

Adjacency Matrix	Adjacency List						
V  is small (e.g. <= 500)	V  is large (most cases)						
dense edges	sparse edges						
query random and unrelated edges	query all edges connected to a node						
Use Cases							
Floyd-warshall algorithm	Dijkstra's (and other BFS-based) algorithm						
	Searching (DFS, BFS)						

In practice, we almost never use edge list

#### **Break + Practice**

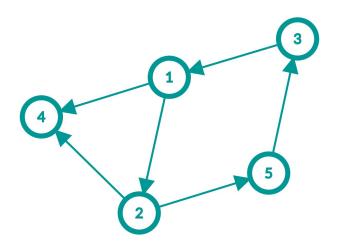
Given a graph of 5 nodes, which has no edges initially.

We want to support the following online queries:

- 1. Add an edge from node a to node b
- 2. Remove the edge from node a to node b
- 3. Output if there is an edge from node a to node b

Each line (representing a query) contains 3 integers: cmd a b

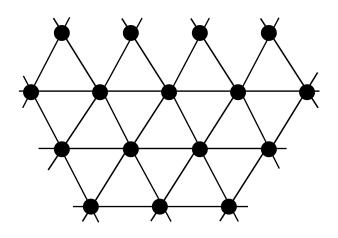
- 1 4 5 add an edge from node 4 to node 5
- 2 2 5 remove an edge from node 2 to node 5
- 3 3 4 output if there is an edge from node 3 to node 4

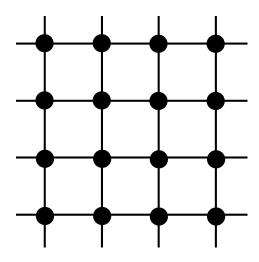


Try to test with this graph

### **Grid graphs**

In some problems, vertices form a regular tiling (square, triangle...)





### **Grid graphs**

vertices represented by coordinates (row, column)

edges are often implicitly given
e.g. in a maze you could only go up/down/left/right
→ edge between each grid and all grids it can visit

assume that every node has these edges

→ check if these edges are valid as we traverse
the graph (e.g. the grid is blocked?)

in practice, usually touching edges (and corners)

	0	1	2	3	4	5	6	7	8
0									
1									
2									
3									
4									
5									
6									
7									
8									
9									

blocked

### **Grid graphs - Implementation**

- 1. get neighbors
- 2. scan all the directions
- check if the vertex is out-of-bound or invalid

```
N = 3 M = 4
..#.
.#.
...
Neighbors of (1, 2) :(2, 2) (1, 3)
Neighbors of (0, 3) :(1, 3)
```

```
const int MAX_N = 10;
char grid[MAX_N][MAX_N];
int dx[] = \{-1, 1, 0, 0\};
int dv[] = \{0, 0, 1, -1\};
void print_neighbors(int r, int c) {
    cout << "Neighbors of (" << r << ", " << c << "):";</pre>
    for (int i = 0; i < 4; i++){
        int nx = dx[i] + r;
        int ny = dy[i] + c;
        bool out_of_bound = nx < 0 || ny < 0 || nx >= N
              | | ny \rangle = M;
        bool valid = (grid[nx][ny] == '.');
        if (!out_of_bound && valid) {
            cout << "(" << nx << ", " << ny << ") ";
    cout << "\n";
```

## **Graph Traversal**

### **Depth-First Search**

#### Idea:

- 1. Choose an unvisited path
- 2. Go as far as possible
- 3. Go back
- 4. Explore a new path

Repeat until there is no unvisited path left.

#### Time complexity

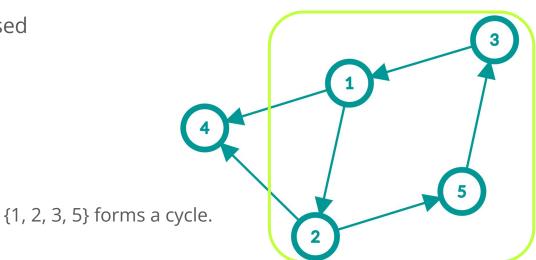
- $O(|V|^2)$  for adjacency matrix
- O(|V|+|E|) for adjacency list

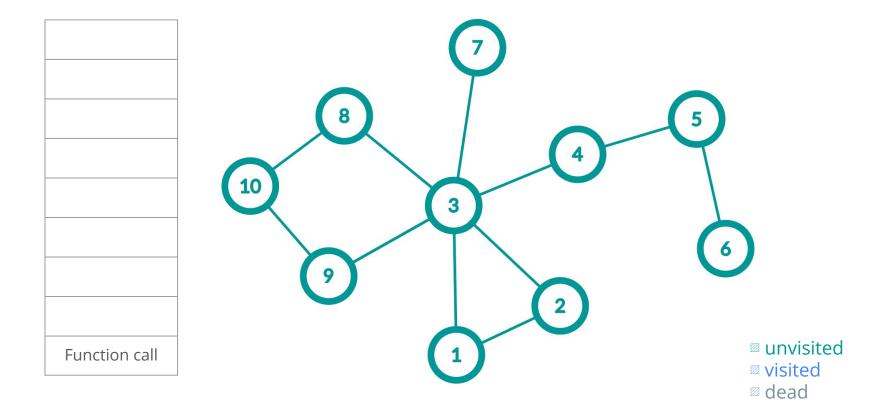
### **Depth-First Search**

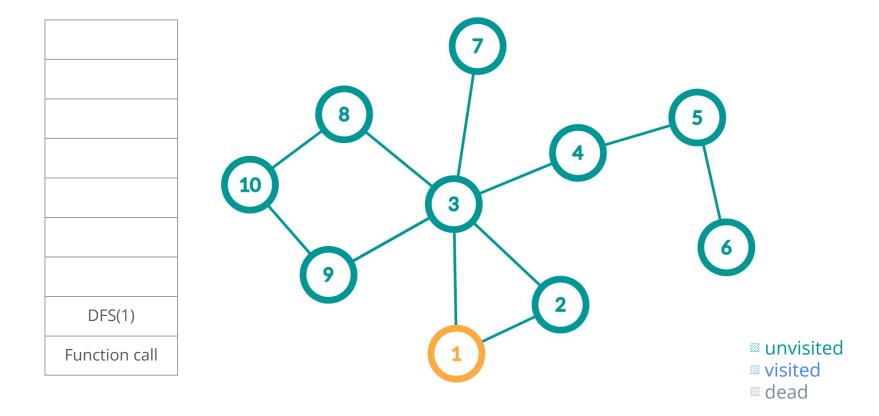
There can be cycles - there exists a path that starts from and ends at the same vertex.

Recall that we do not go on a visited path, so we can stop going forward and treat the current vertex as a 'dead end'

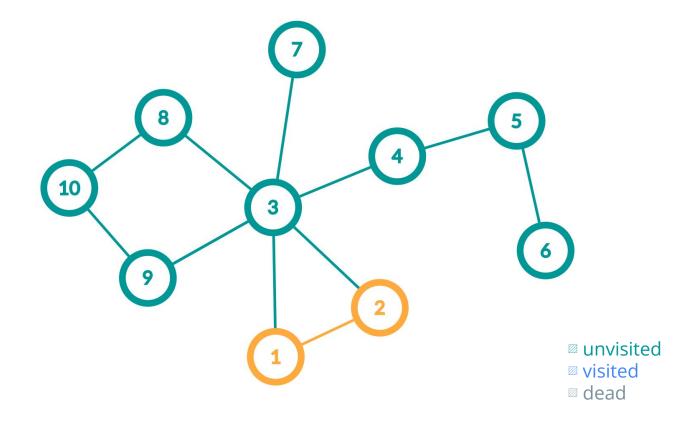
In this case, not all edges are used but all vertices are travelled



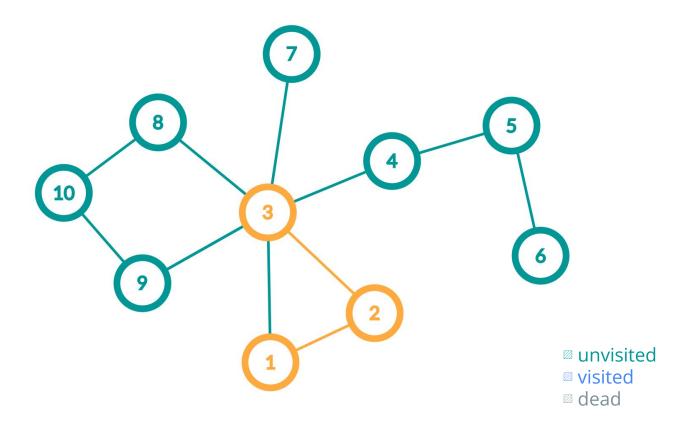


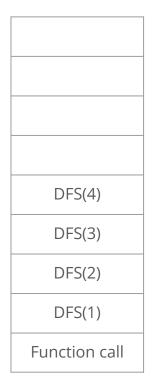


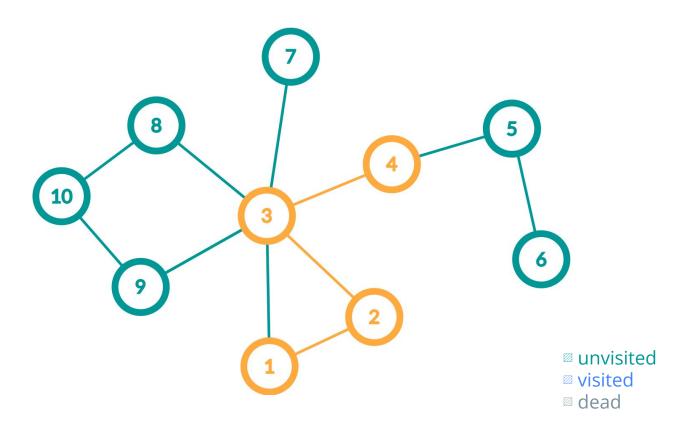




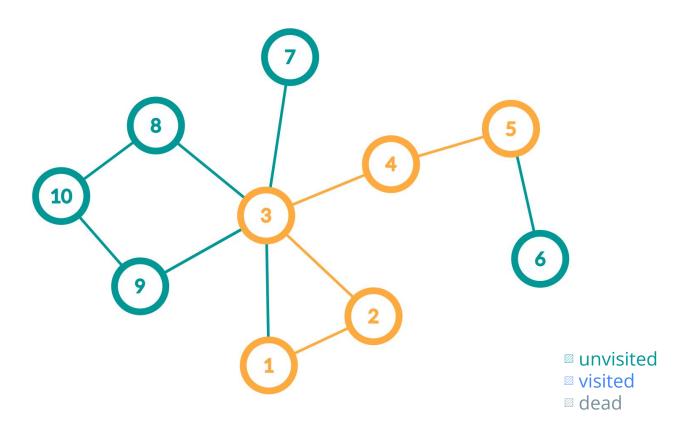


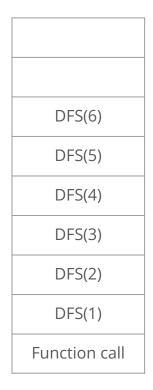


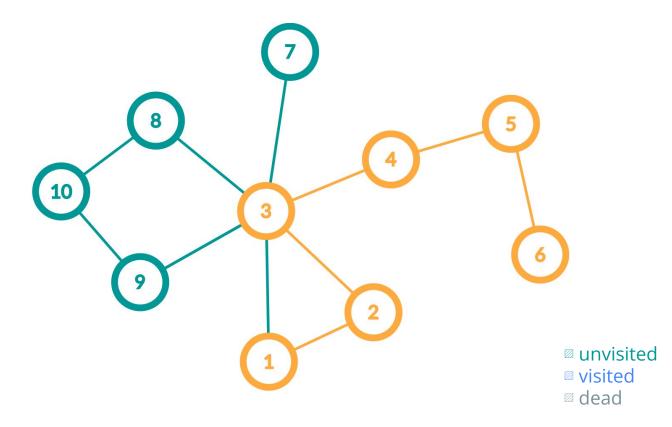


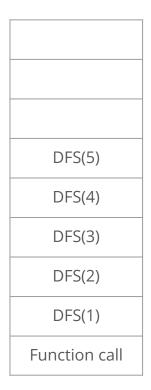


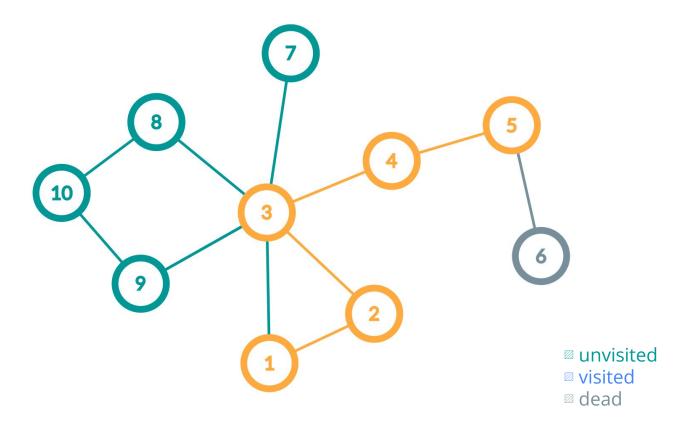




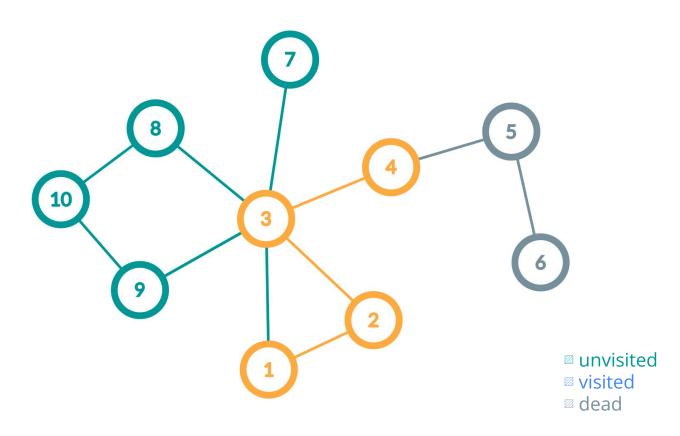




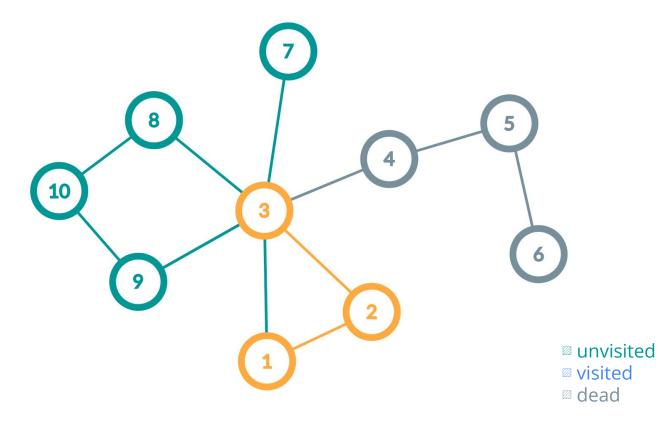


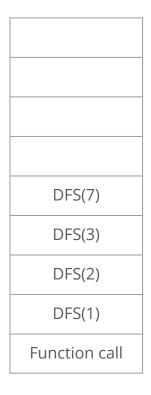


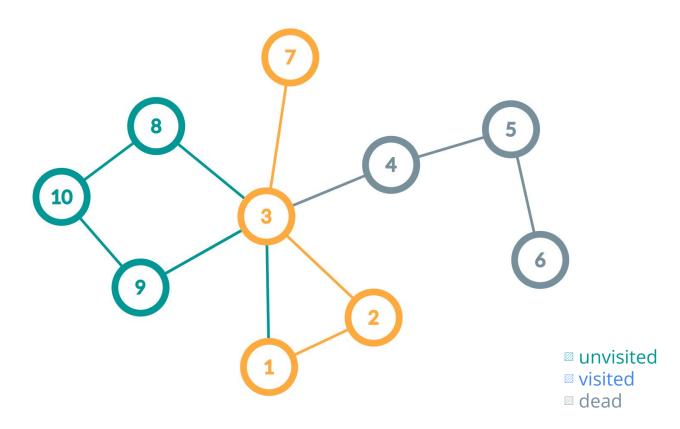




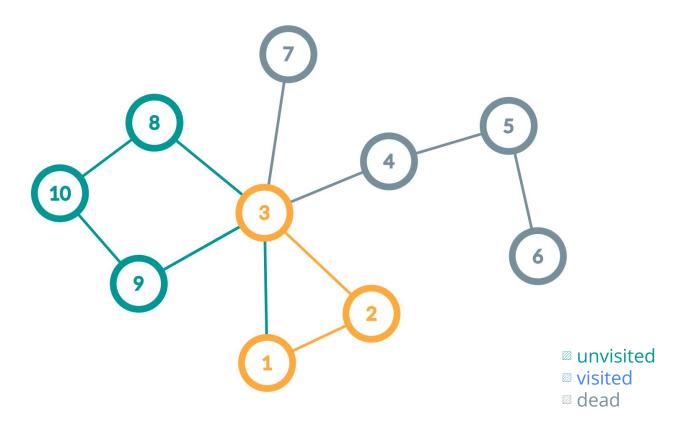




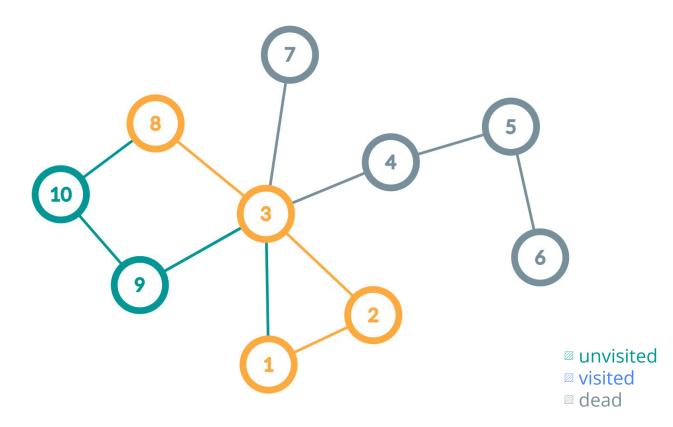




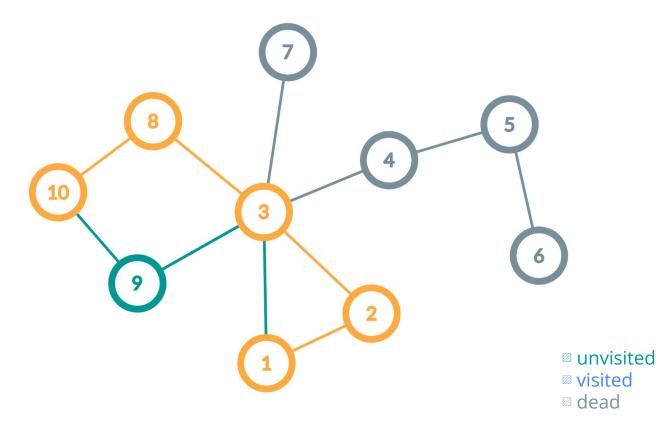




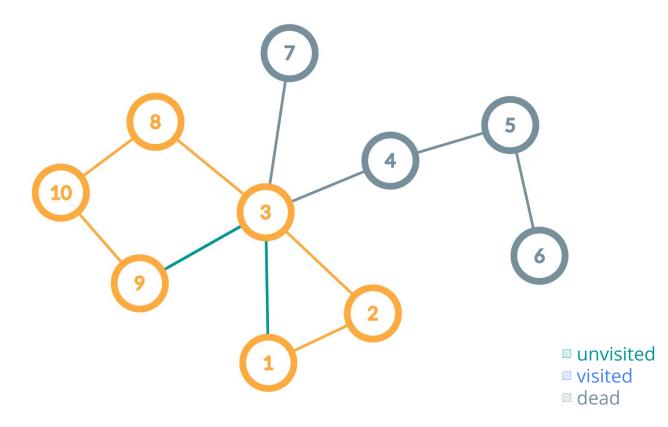


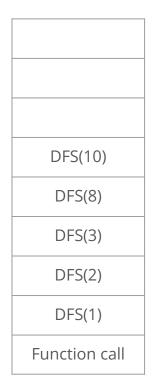


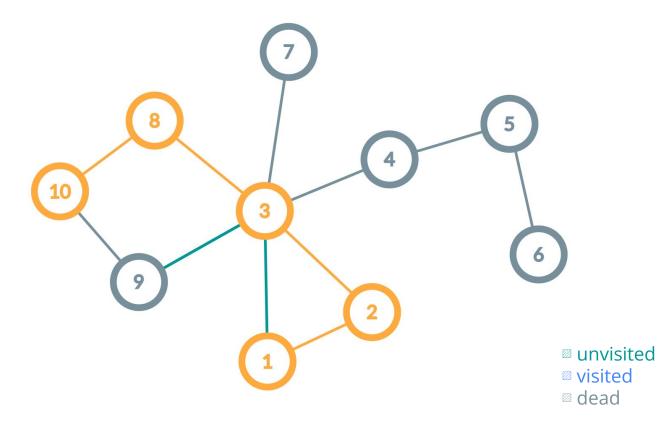


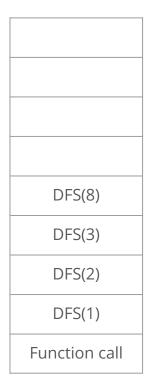


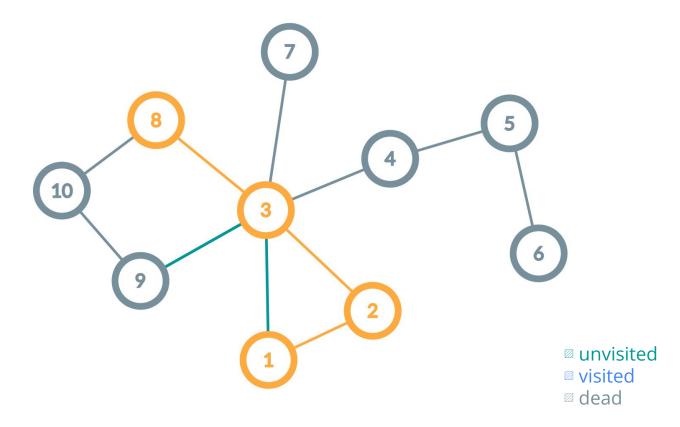




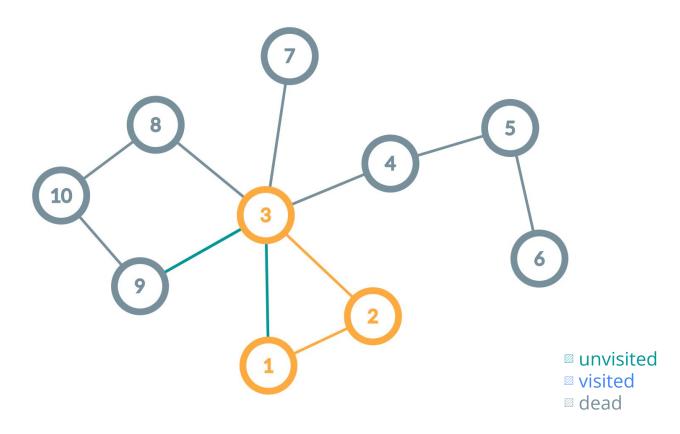




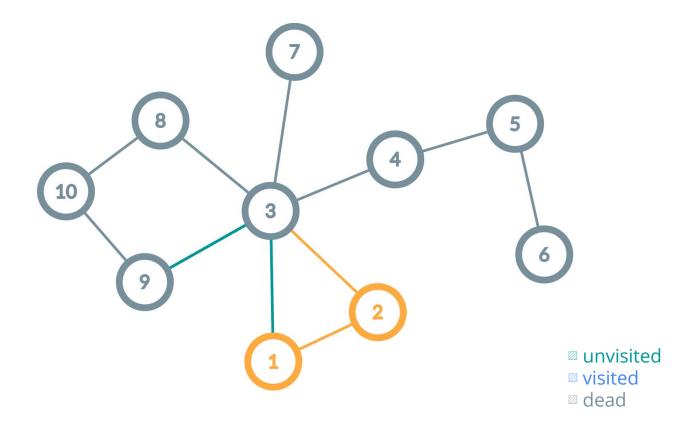


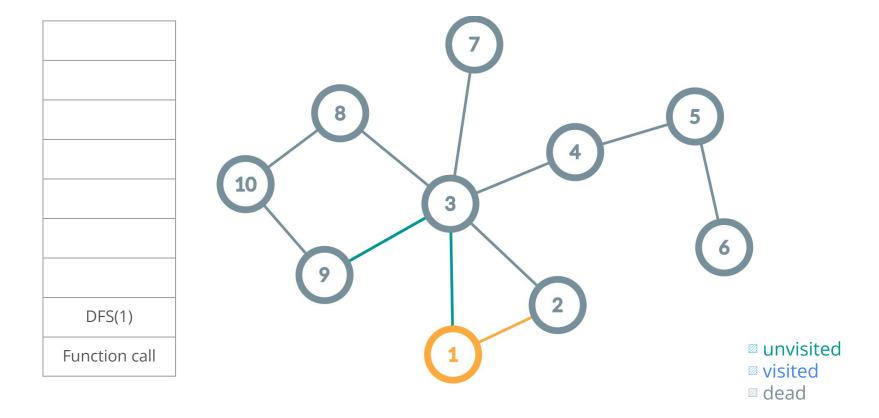




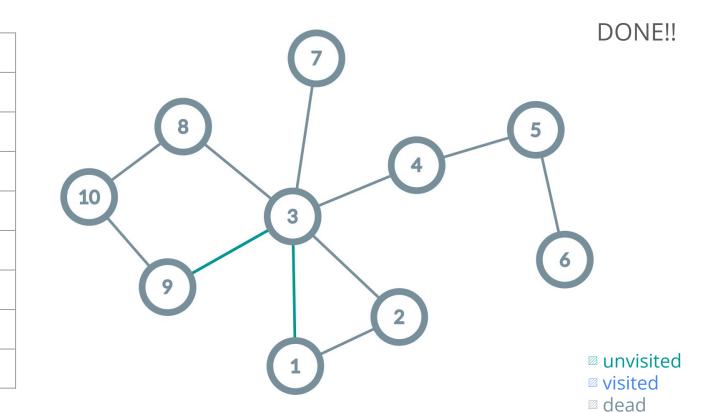








Function call



# **Depth-First Search**

(1) Iterative (stack)

```
push source vertex (denote as u) into stack S while (S is not empty) pop the top element (x) in S if x is not visited push all the unvisited vertices that are neighbors of x into S mark x as visited
```

# **Depth-First Search**

(2) Recursive (more common)

```
Procedure DFS(vertex x)

mark x as visited

For all vertices that are neighbors of x and are unvisited (v)

Call DFS(v)
```

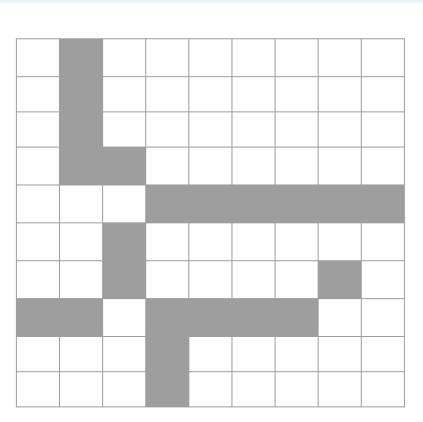
To start the search, call DFS(u) (source vertex)

From a empty cell, you can go up/down/left/right to reach another empty cell.

Mutually reachable cells form a region.

How many regions are there?

How large is each region?

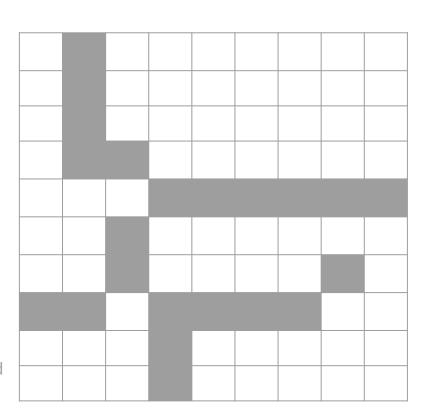


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We name each cell by its coordinate (row, column)

For example, top-left cell: (1, 1) bottom-right: (10, 9)

When we detect an unvisited empty cell, we run DFS on it and count the number of cells in this region.

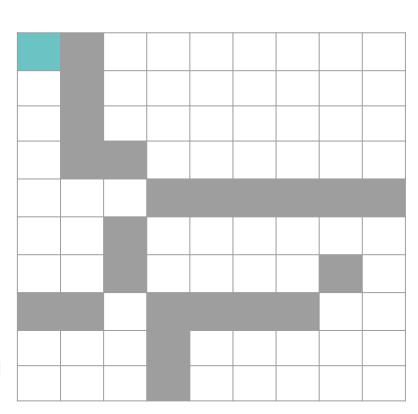


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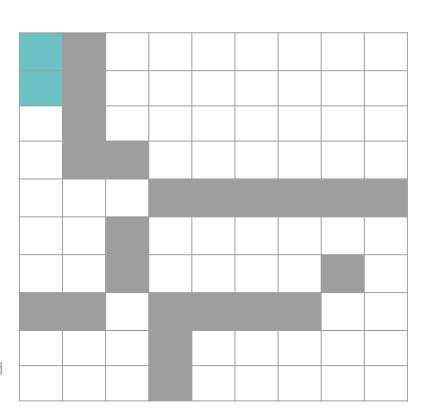


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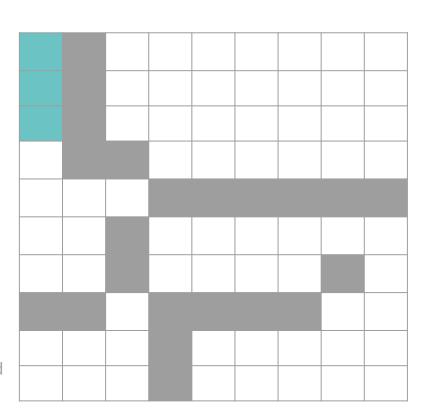


blocked

We name each cell by its coordinate (row, column)

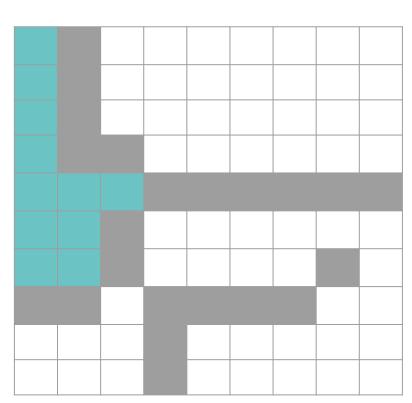
For example, top-left cell: (1, 1) bottom-right: (10, 9)

When we detect an unvisited empty cell, we run DFS on it and count the number of cells in this region.



blocked

After visiting a region, we perform DFS on the remaining unvisited empty cells until all empty cells are visited.



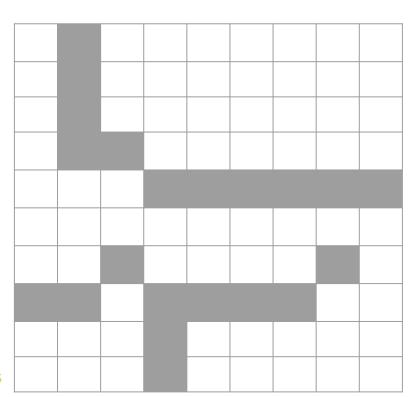
blocked

### Maze - DFS

Find a way from the top-left corner (1, 1) to the bottom-right corner (10, 9) You can go up / down / left / right.

blocked

one of the possible paths



#### Maze - DFS

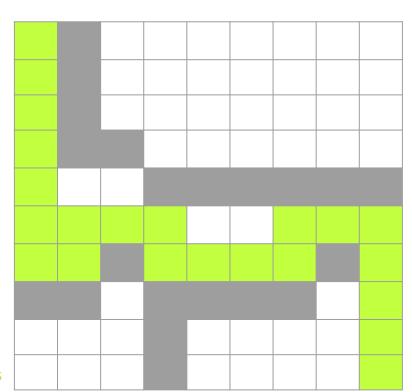
Call DFS(1, 1)

When the destination is reached, backtrack the path.

To backtrack, maintain a list containing parent of each nodes in the current path

□ blocked
 □

one of the possible paths



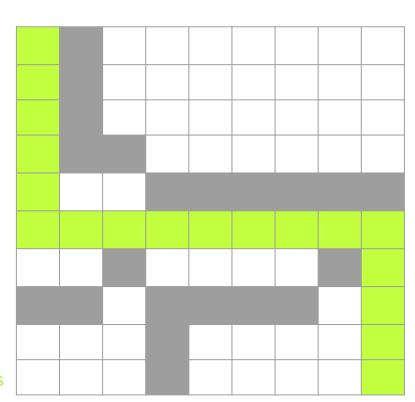
#### Maze - DFS

Note that the path **may not** be shortest

(To find shortest paths using concepts similar to DFS, read about Iterative Deepening DFS, it was covered in 2018 Graph II materials)

– Fixing depth of traversal for each search

one of the possible paths



### **Breadth-First Search**

Though Depth-First Search can provide us a path from u (source node) to v (any node reachable), it may not be the shortest path.

Given the graph is **unweighted**, we can use Breadth-First Search (BFS) to find the shortest path from *u* to *v*.

For weighted graph shortest path, refer to Graph (II).

### **Breadth-First Search**

Starting from the source vertex, we visit all reachable nodes using minimum of *i* steps.

- (1) Visit all the neighbors of *u*
- (2) Visit all the unvisited neighbors of {x}
- (3) Visit all the unvisited neighbors of {y}

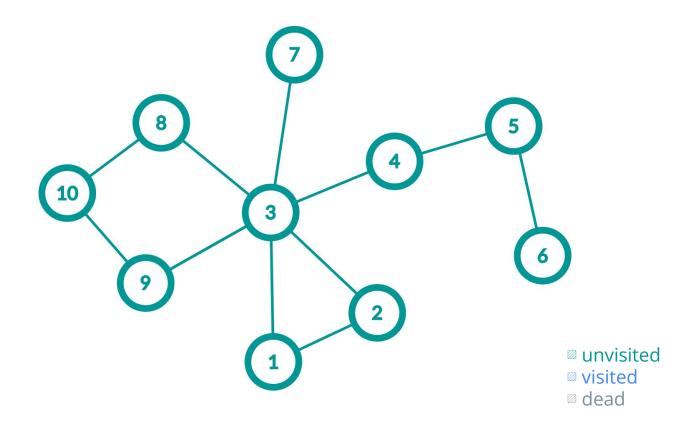
... until no new vertices are visited

{x : set of vertices that are 1-step reachable from *u*}

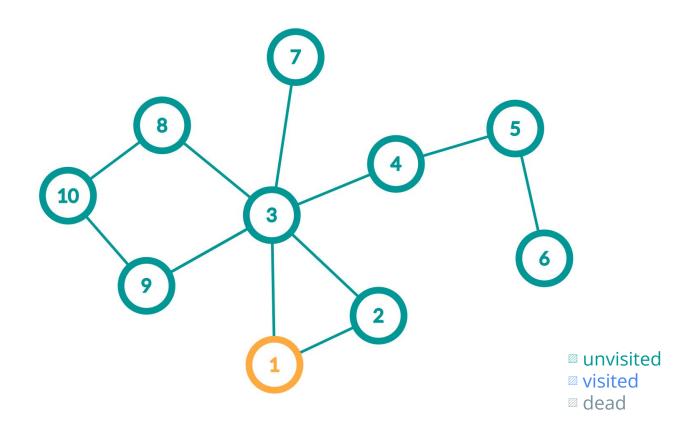
{y : set of vertices that are 2-step reachable from *u*}

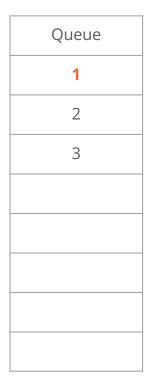
{z : set of vertices that are 3-step reachable from *u*}

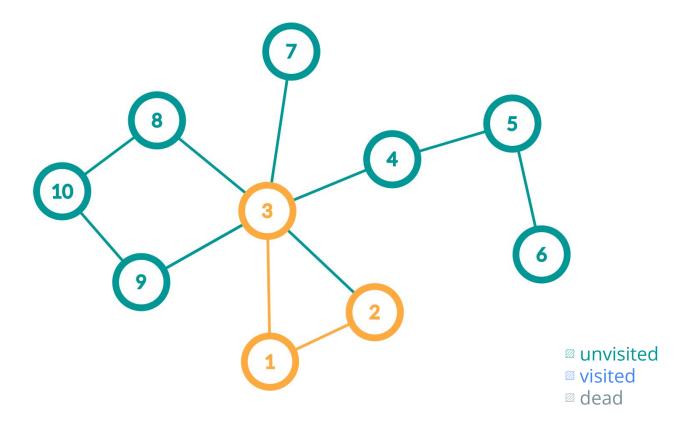




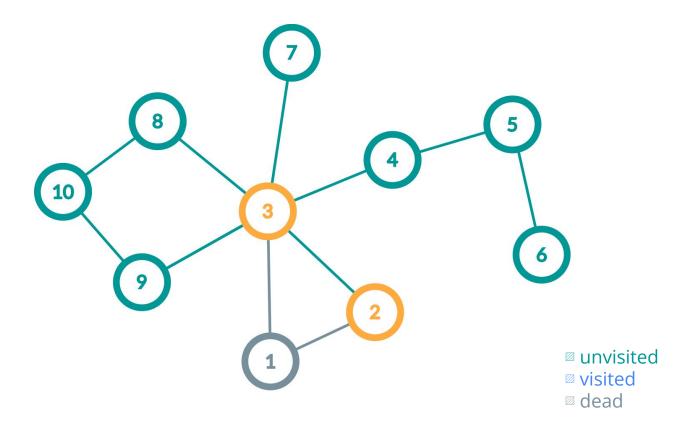




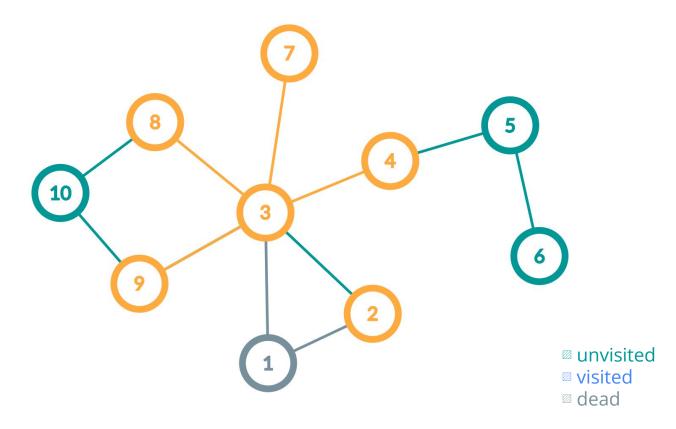


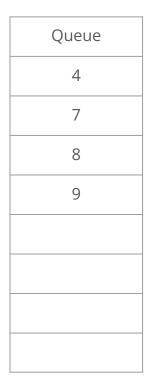


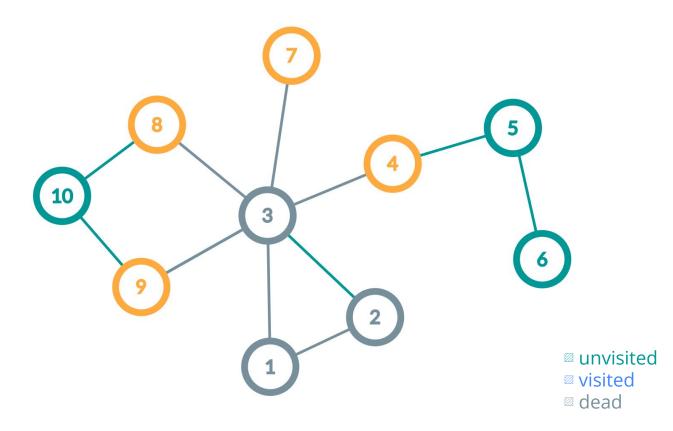




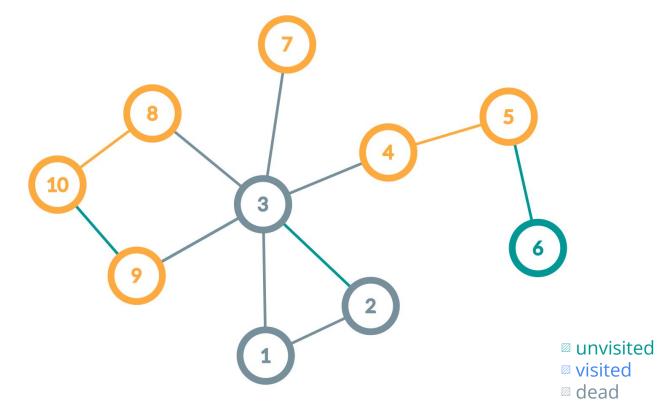




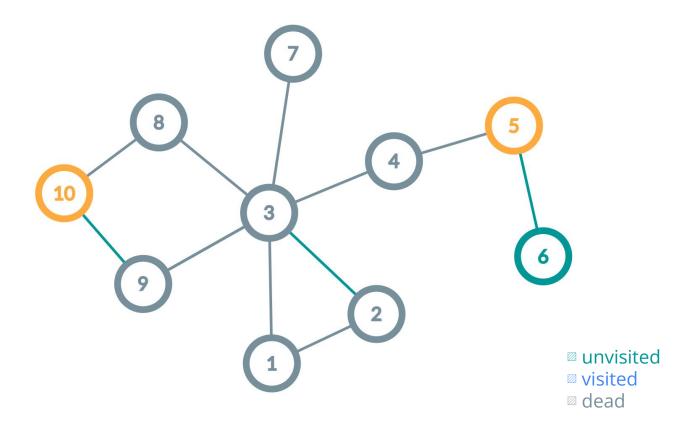




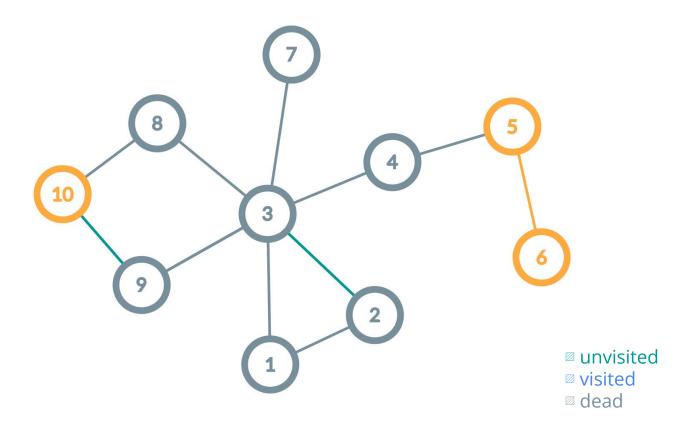




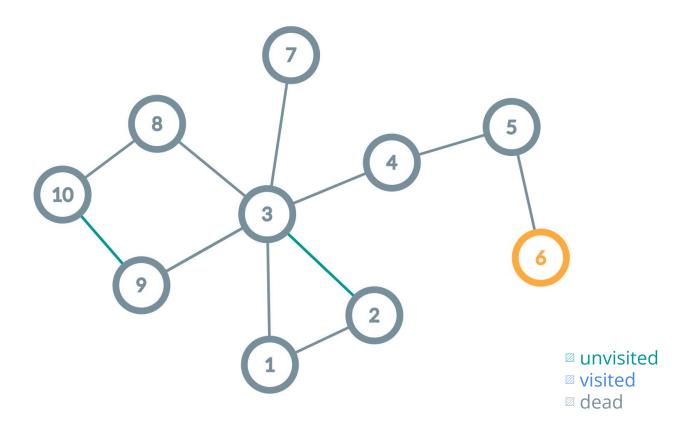


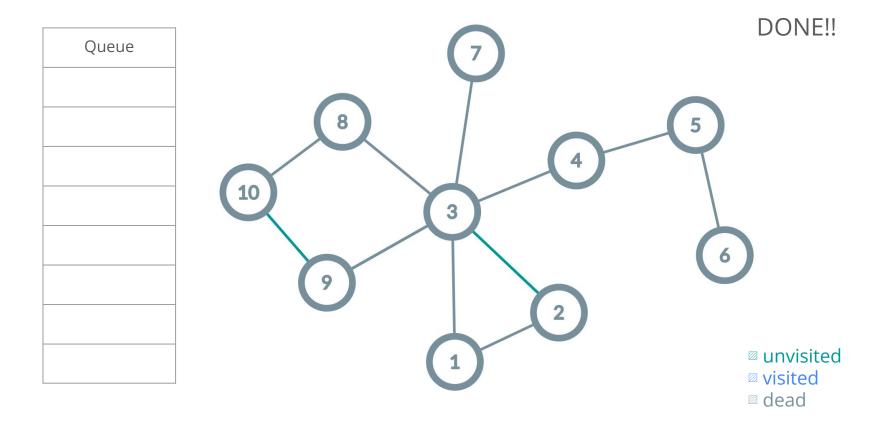












#### **Breadth-First Search**

```
Push source vertex (denote as u) into queue Q

Mark u as visited

While (Q is not empty)

Pop the front element (x) in Q

Push all the unvisited vertices that are neighbors of x into Q

Mark them as visited
```

## **BFS - Water Jug Problem**

There are 2 water jugs with capacities N and M litres respectively.

Initially, both of them are empty.

You can perform the following operations for infinitely many times (one operation a time)

- 1. Empty a jug
- 2. Fully fill a jug
- 3. Pour water from one jug to another until either one jug is empty / full

How to get a specific volume K in one of the jugs?

# **BFS - Water Jug Problem**

N = 3, M = 4, K = 2

States:

(0, 0)	(0, 1)	(0, 2)	(0, 3)	(0, 4)
(1, 0)	(1, 1)	(1, 2)	(1, 3)	(1, 4)
(2, 0)	(2, 1)	(2, 2)	(2, 3)	(2, 4)
(3, 0)	(3, 1)	(3, 2)	(3, 3)	(3, 4)

<sup>☐</sup> initial state

□ target states

Run BFS from (0,0)

## **BFS - Water Jug Problem**

#### Transitions from (x, y)

- 1. Empty a jug (x, 0) and (0, y)
- 2. Fully fill a jug (x,M) and (N, y)
- 3. Pour water from the first jug to the second (x + y M, M) or (0, x + y)
- 4. Pour water from the second jug to the first (N, x+y-N) or (x+y, 0)

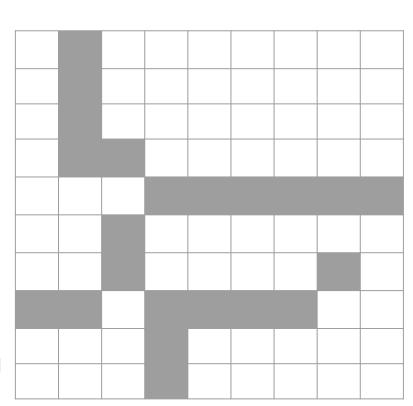
## **BFS - Maze Problem with Bomb**

There is a N x M maze.

You can go U/ D/ L/ R one cell each move.

You have B bombs to destroy a wall of one cell

Find the **shortest path** from (1, 1) to (N, M)



□ blocked
 □ block

## **BFS - Maze Problem with Bomb**

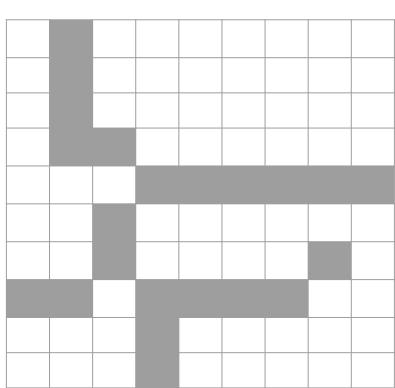
States: (x, y, b) [you are in cell (x, y) and you have b bombs]

#### **Transitions**

- (x, y + 1, b) if (x, y + 1) is not blocked
- (x, y + 1, b 1) if (x, y + 1) is blocked and b is greater than 0

Same for other directions Run BFS.





## **Practice - CF1033A King Escape**

https://codeforces.com/problemset/problem/1033/A

Alice and Bob are playing chess on a chessboard with dimensions NxN.

Alice has a queen at (ax, ay), Bob has a king at (bx, by)

Bob wins if he can move his king from (bx, by) to (cx, cy) without getting in check.

A king is in check if it is on the same row/column/diagonal as the enemy queen. "obstacle"

Remember that a king can move to any of the 8 adjacent squares. rule to form edge

Find whether Bob can win or not.

Task: solve it with both DFS and BFS (ignore the analytic O(1) solution for now)

## **Practice - CF1033A King Escape**

#### Modify it as a graph problem:

- an edge exists between nodes sharing a corner/edge
- "obstacle" are grids on same row/column/diagonal line with (ax, ay)

- 1. start at (bx, by)
- 2. search all possible grids reachable
- 3. stop when reaching (cx, cy)

# **Practice - CF1033A King Escape - Tricks**

**Visit the surrounding grids efficiently** (without hard-coding 8 directions)

observe that the dx, dy combinations are:

```
\{-1, -1\}, \{-1, 0\}, \{-1, 1\}, \{0, -1\}, \{0, 1\}, \{1, -1\}, \{1, 0\}, \{1, 1\}

\rightarrow a combination of dx = \{-1, 0, 1\} and dy = \{-1, 0, 1\} (except \{0, 0\})
```

```
for dx = -1 to 1
for dy = -1 to 1
   if valid(cur_x + dx, cur_y + dy)
      visit(cur_x + dx, cur_y + dy)
```

# **Practice - CF1033A King Escape - Tricks**

#### **Check for diagonals**

	1	2	3	4	5	6
1		(1, 2)				
2			(2, 3)			
3	(3, 1)			(3, 4)		
4		(4, 2)			(4, 5)	
5			(5, 3)			(5, 6)
6			30	(6, 4)		

observe that all green grids are (1+k, 2+k)

 $\rightarrow$  generalize to (x0+k, y0+k), (x0, y0) = top left of each diagonal

eliminate k:

• 
$$(x0 + k) - (y0 + k) = x0 - y0$$

all grids (x, y) in same top-left to bottom-right diagonal share the same (x - y)

# **Practice - CF1033A King Escape - Tricks**

#### **Check for diagonals**

	1	2	3	4	5	6
1			(1, 3)			
2		(2, 2)				
3	(3, 1)					
4						
5						
6						

observe that all green grids are (3 - k, 1 + k)

 $\rightarrow$  generalize to (x0 - k, y0 + k), (x0, y0) = bottom left of each diagonal

eliminate k:

• 
$$(x0 - k) + (y0 + k) = x0 - y0$$

all grids (x, y) in same top-left to bottom-right diagonal share the same (x - y)

## Multi-source BFS - Flood Fill

Given N sources, find the distance between each cell from the nearest source.

Method 1: BFS from one source at a time

Time complexity: O(N \* (V + E))

Method 2: BFS from all sources (perform BFS once)

Time complexity: O(V + E)

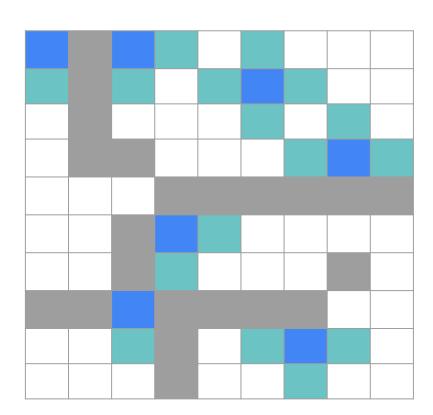
Multi-source BFS on flood fill...

blockedsources

Multi-source BFS on flood fill...

blocked

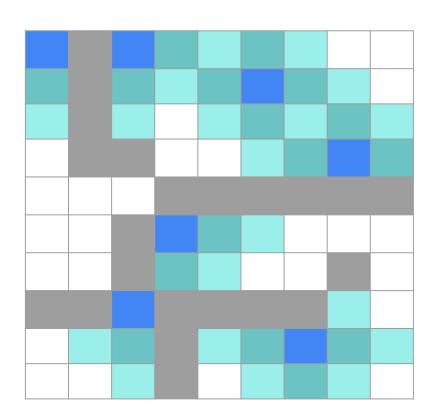
sources



Multi-source BFS on flood fill...

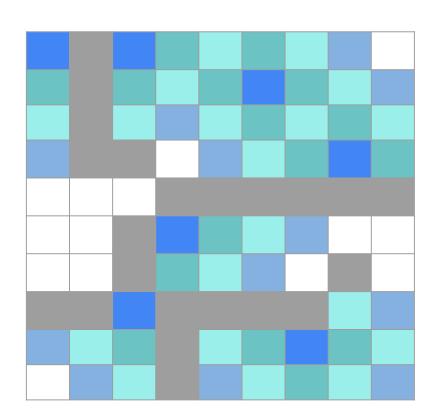
blocked

sources



Multi-source BFS on flood fill...
And so on...

☑ blocked
 ☑ dist = 1
 ☑ dist = 2
 ☑ dist = 3
 ☑ sources



## **Bidirectional search**

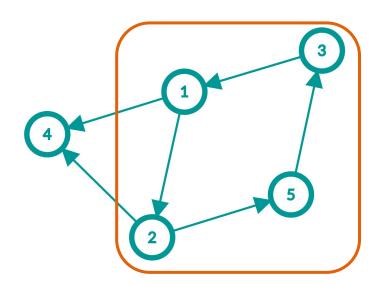
To speed up finding unweighted shortest path from u to v we can perform BFS with both u and v as sources

Stop when two paths meet in the middle

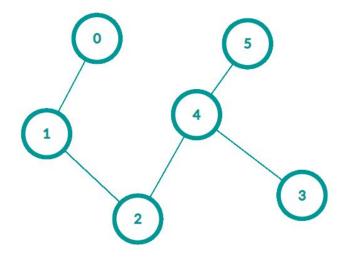
# **Special Graphs**

# **Cycles**

Graph with cycles

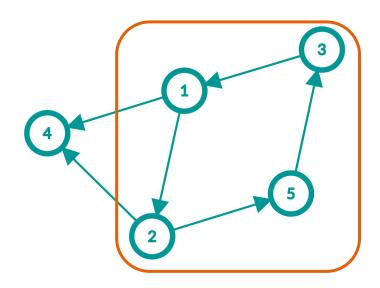


## Acyclic graph



# Cycles

## Graph with cycles



#### How to detect cycles in a graph?

Recall searching, we avoid going to visited nodes again... why?

It indicates a cycle!

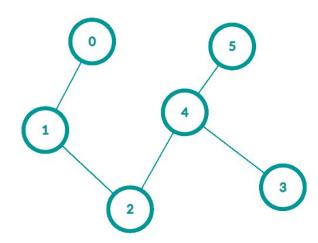
When we visit a node the second time, we know it is in a cycle

#### **Trees**

- A connected graph with |V|-1 edges
- A connected graph without cycles
- A graph with exactly one path between every pair of vertices

You will learn more about trees in Graph(II) and (III)

- Minimum spanning tree
- Lowest common ancestor
- Tree traversal
- ...



## **Chains**

A tree with all vertices having 2 neighbors, except the two ends having only 1

#### Properties:

- Acyclic
- No branches



usually appear in earlier subtasks

<sup>\*</sup> Traverse from the ends

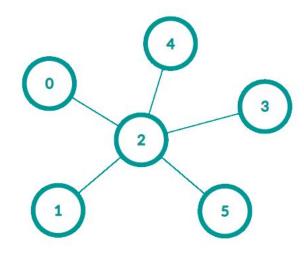
#### **Stars**

A tree with one internal node and remaining nodes as leaves

#### Properties:

- Acyclic
- Max distance between 2 nodes = 2
- \* Special handling on the internal node

usually appear in earlier subtasks

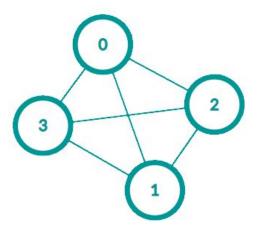


# **Complete Graph**

Every pair of distinct vertices is connected by a unique edge

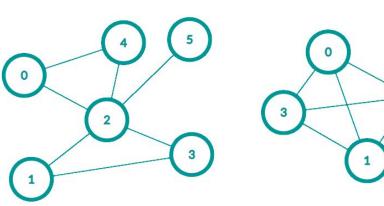
## Properties:

• 
$$|E| = |V| * (|V| - 1) / 2$$

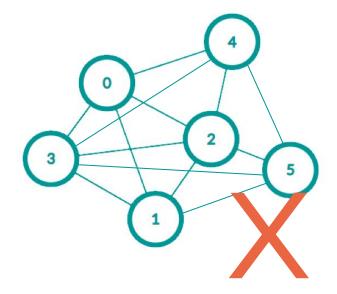


# **Planar Graph**

Vertices and edges in such graph can be drawn in a plane such that no two edges intersect







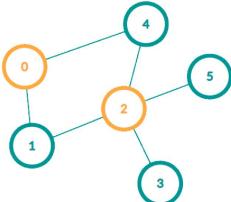
# **Bipartite Graph**

Vertices can be divided into two disjoint and independent sets U and V, such that every edge connects a vertex in U to a vertex in V.

You can assign one of two colours for each node such that all edges have different colour on two side

#### Properties:

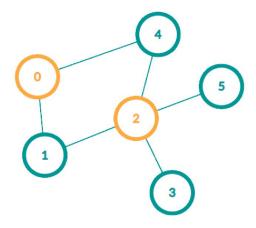
Does not contain odd cycles



# **Bipartite Graph**

Algorithm to check if the graph is bipartite / color the graph into a bicolor graph Perform DFS/BFS on any node

Assign 0 and 1 alternately to every node according to the depth
If a node is assigned 0, assign 1 to its neighbors, and vice versa
If any edge has same number on two sides, the graph is not bipartite



#### **Practice Problems**

HKOJ 01035 Patrol Area

HKOJ 01067 Maze

HKO M1311 Dokodemo Door

**HKOJ T022 Bomber Man** 

HKOJ M0911 Theseus and the Minotaur

HKOJ 30422 Knights in FEN

CF 1033A King Escape

CF 893C Rumor

<dfs or equivalent / graph tag in codeforces>

演算法筆記

Graph Theory by Teb's Lab