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School of Computing

# Tutorial 8: Graphs and Traversal I

October 17, 2022

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*\* Partly adopted from tutorial slides by [Wang Zhi Jian](#).*

# Midterm

*How to do better... Is there still chance?*

What is the time complexity for the following program?

```
void foo(int n){  
    if (n < 1)  
        return;  
    for (int i = 0; i < n * n; i++)  
        System.out.println("*");  
    foo(n/2);  
    foo(n/2);  
}
```

Very close to our  
tutorial questions!

...

A is a linked list of length N;

`A[i + K] += 1;`

Linked lists have no  
random access!

`while(true)`

Infinite while loop,  
unable to end!

`// no break keyword inside  
do something`

## 1. Focus on the basics!

- *What are the pros and cons of each data structure?*
- *Which functions does the data structure support?*

## 2. Understand the problem-solving strategies in tutorials!

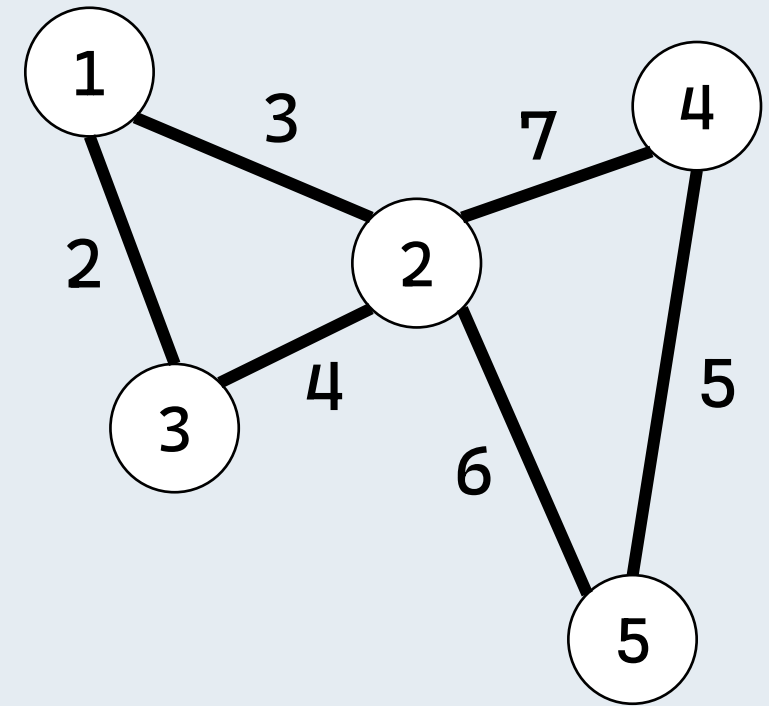
- *How to determine the runtime of an algorithm?*
- *How to choose a good hash function?*
- *Can we come up with a trivial answer first?*

# Graph Representation

*How to store a graph?*

# Graph Data Structure

- A set  $V$  of vertices,
- A set  $E$  of edges.
- The edge  $[(u, v), w]$  connects vertices  $u$  and  $v$ , and has a weight  $w$  (optional).



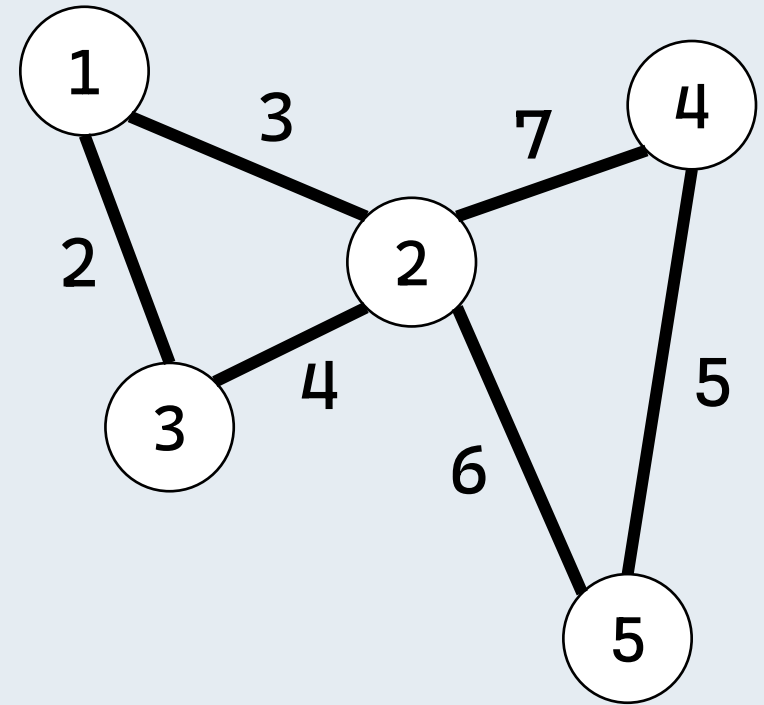
# Representation of Graphs

As **edge list**:

- Simply store all edges in a list.

$[(1, 2), 3], [(1, 3), 2], [(2, 3), 4],$   
 $[(2, 4), 7], [(2, 5), 6], [(4, 5), 5]$

- **Space needed:**  $O(|E|)$ .
- **Time to query edge:**  $O(|E|)$ .





# Representation of Graphs

As **adjacency list**:

- For each vertex, store its neighbours and weight.

1: [2,3], [3,2]

2: [1,3], [3,4], [4,7], [5,6]

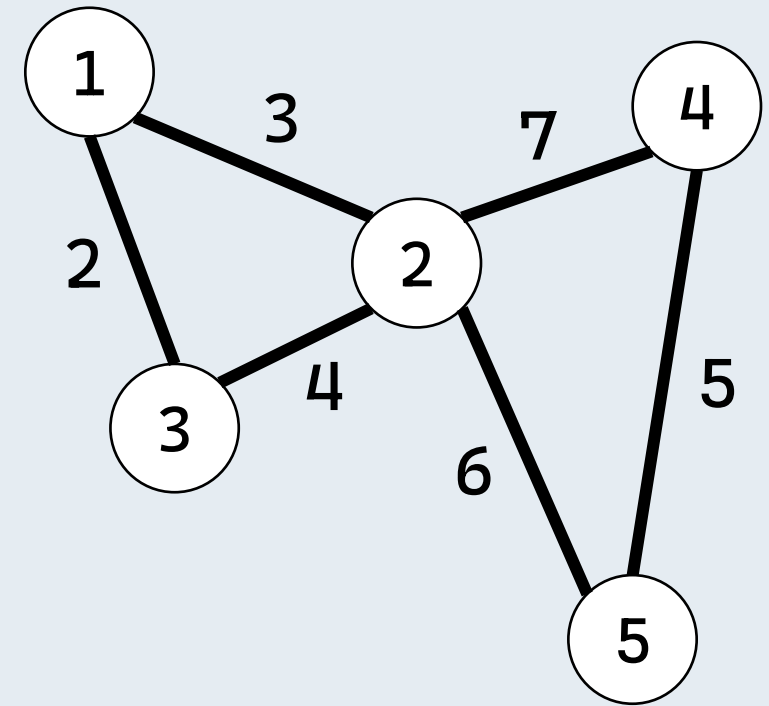
3: [1,2], [2,4]

4: [2,7], [5,5]

5: [2,6], [4,5]

- **Space needed:**  $O(|V| + |E|)$ .

- **Time to query edge:**  $O(d)$ , where  $d$  is maximum degree.

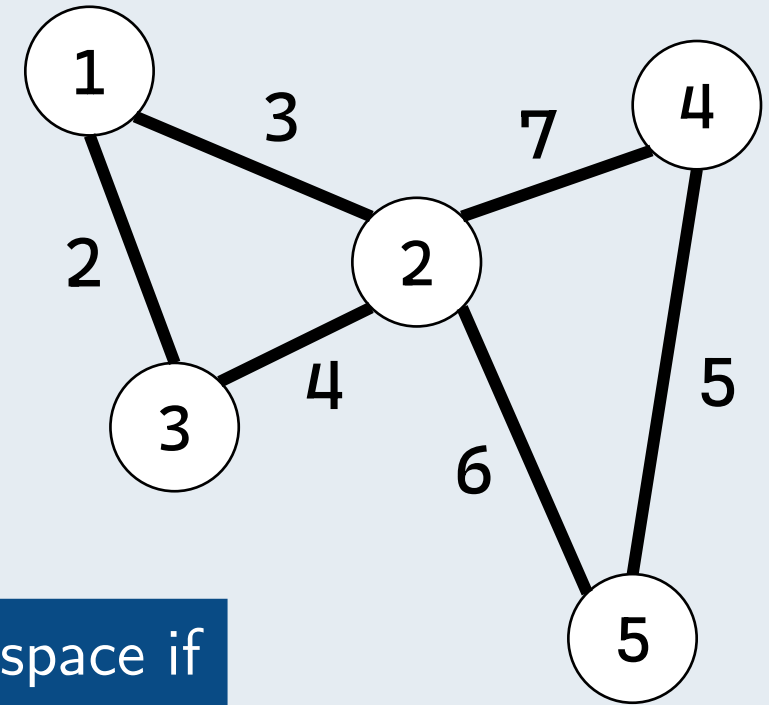


# Representation of Graphs

As **adjacency matrix**:

- Store the weight of  $(u, v)$  on  $u$ -th row and  $v$ -th column.

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



- **Space needed:**  $O(|V|^2)$ .
- **Time to query edge:**  $O(1)$ .

waste a lot of space if  
graph is sparse.

Two ways of graph traversal:

- **Depth-First Search (DFS):** Explore the closest nodes to the last visited node first. (LIFO)
- **Breadth-First Search (BFS):** Explore the closest nodes to the first visited node first. (FIFO)

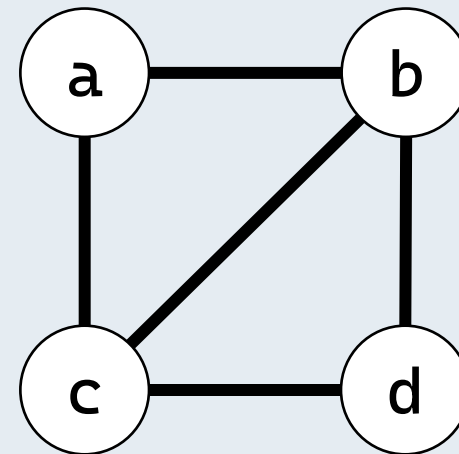
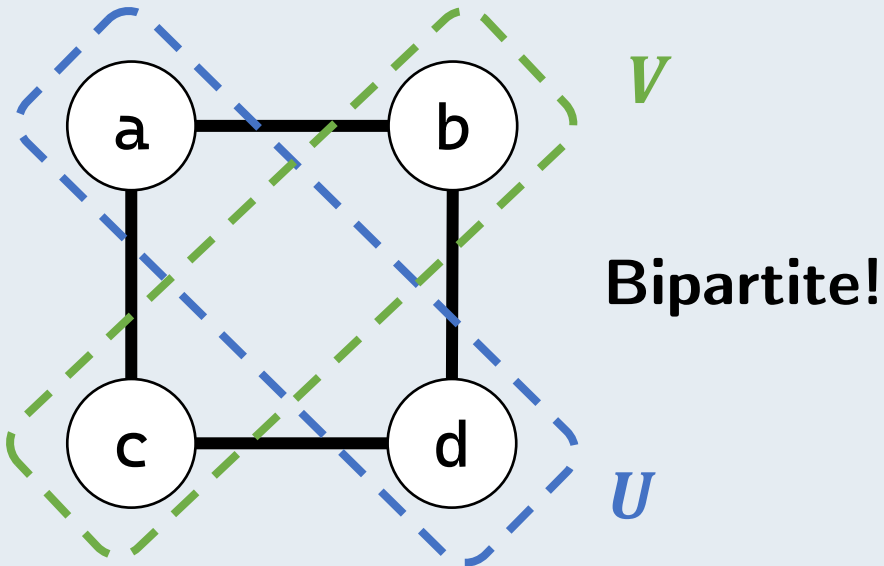
Both costs  $O(|V| + |E|)$  time.

```
traversal(G, v):  
    D.push(v);  
    while D is not empty do  
        v = D.pop();  
        if v is not visited then  
            visit(v);  
            D.push(all unvisited neighbours of v);
```

**For DFS: D is a stack**  
**For BFS: D is a queue**

A **bipartite graph** is a graph whose vertices can be divided into two disjoint sets  $U$  and  $V$  such that every edge connects a vertex in  $U$  to one in  $V$ ; but there is no edge between vertices in  $U$  and also no edge between vertices in  $V$ .

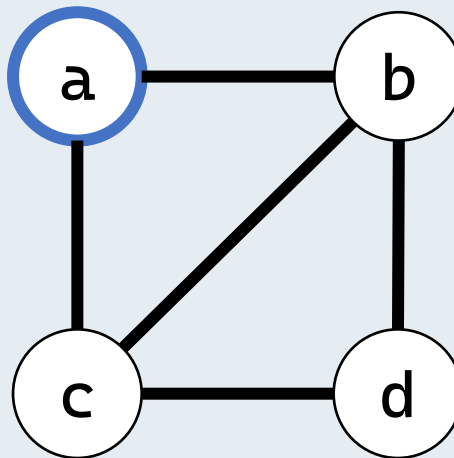
**Goal:** check if an undirected graph is bipartite.



Is it bipartite?

Suppose this graph is bipartite.

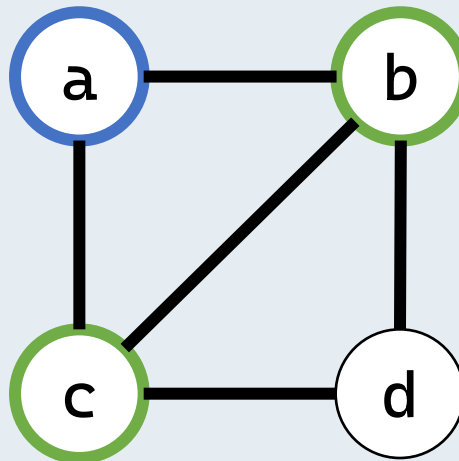
- Suppose vertex **a** is in set  $U$ . **What do we know about other nodes?**



Suppose this graph is bipartite.

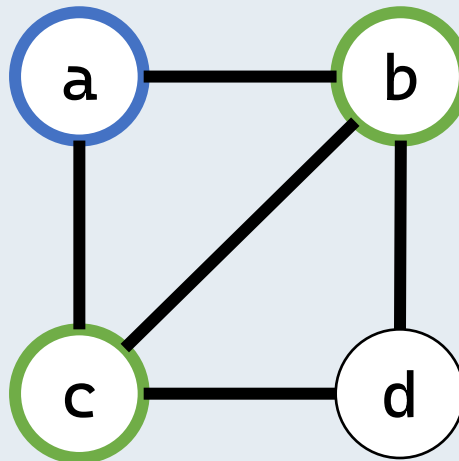
- Suppose vertex **a** is in set  $U$ .
- Vertices **b** and **c** must be in set  $V$ !
- But there's an edge between **b** and **c**... Contradiction!

No way to divide nodes into 2 sets... **Not bipartite!**



**Idea:**

- Start from a vertex, assign it to set  $U$ .
- Traverse through the graph.
- As we visit a vertex, try to assign all neighbours to a different set.
- If a neighbour is already assigned the same set, it's not bipartite!





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**Algorithm 1** DFS for Bipartite Graph Detection

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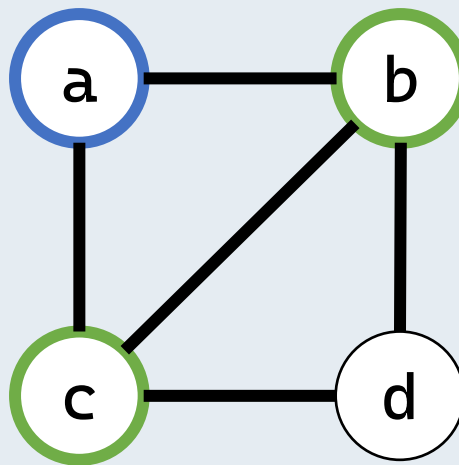
```
1:  $colour[1 \dots n] \leftarrow WHITE$  ▷ Unvisited nodes are white
2:  $isBipartite \leftarrow true$  ▷ Flag to indicate if graph is bipartite
3: procedure DFS( $u, c$ ) ▷  $u$  is the current vertex,  $c$  is the colour to be assigned to  $u$ 
4:   if  $colour[u] \neq white$  then ▷ This node has been visited before
5:     if  $colour[u] \neq c$  then ▷ Colour of this node is different from colour to be assigned
6:        $isBipartite \leftarrow false$ 
7:     end if
8:     return
9:   end if
10:   $colour[u] \leftarrow c$ 
11:  for each neighbour  $v$  of  $u$  do
12:    if  $c = BLUE$  then
13:      DFS( $v, RED$ )
14:    else
15:      DFS( $v, BLUE$ )
16:    end if
17:  end for
18: end procedure
```

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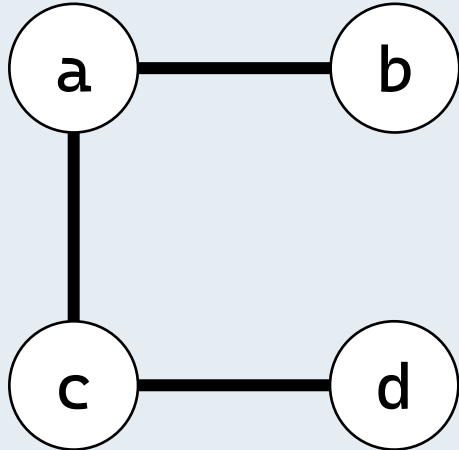
- **Time complexity:** the same as DFS,  $O(|V| + |E|)$ .

**Note:** Checking if a graph is *bipartite* is equivalent to

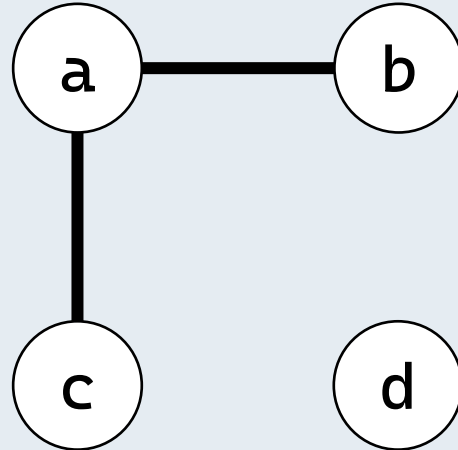
- Checking if the graph is *2-colorable* (use only 2 colours to colour the nodes, with all neighbouring nodes in different colours).
- Checking if there exists an *odd-length cycle*.



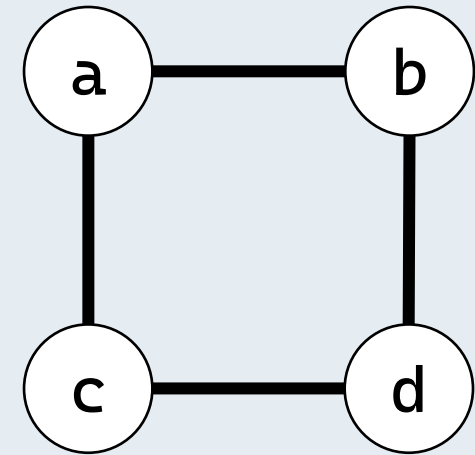
*Check if an undirected graph contains cycles.*



**No cycle.**



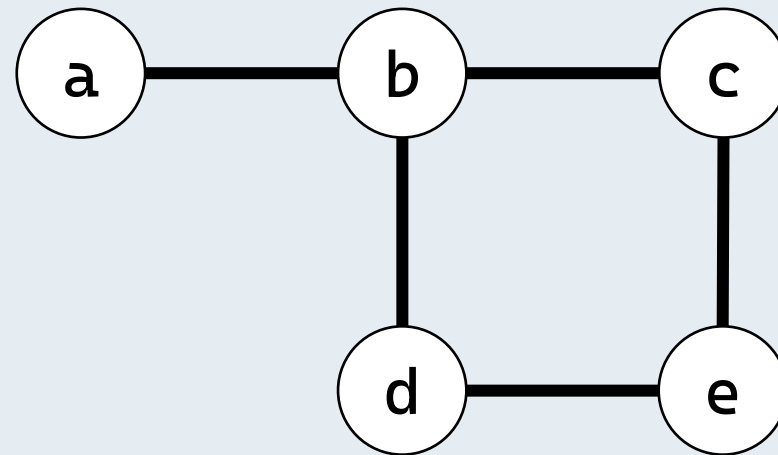
**No cycle.**



**Has cycle!**

If a graph has no cycles, then there's only one path connecting any pair of vertices.

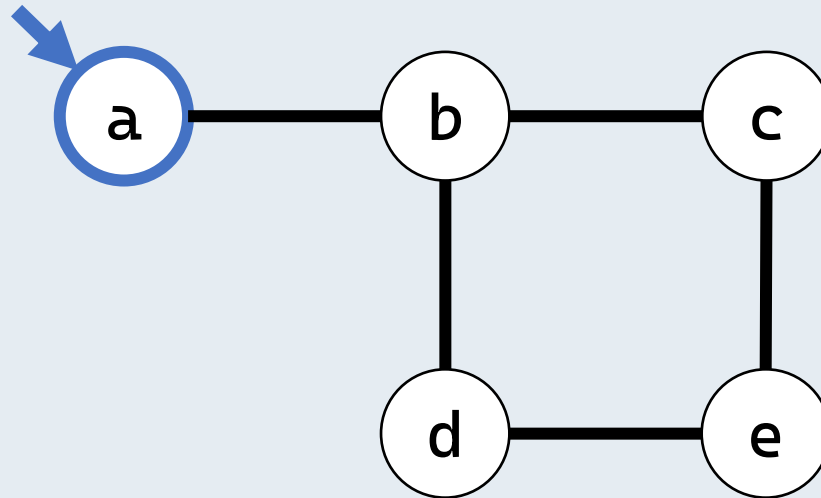
If we **find 2 paths connecting a pair of vertices**, we are done!



Use which graph traversal to try finding paths?

Let's try using DFS:

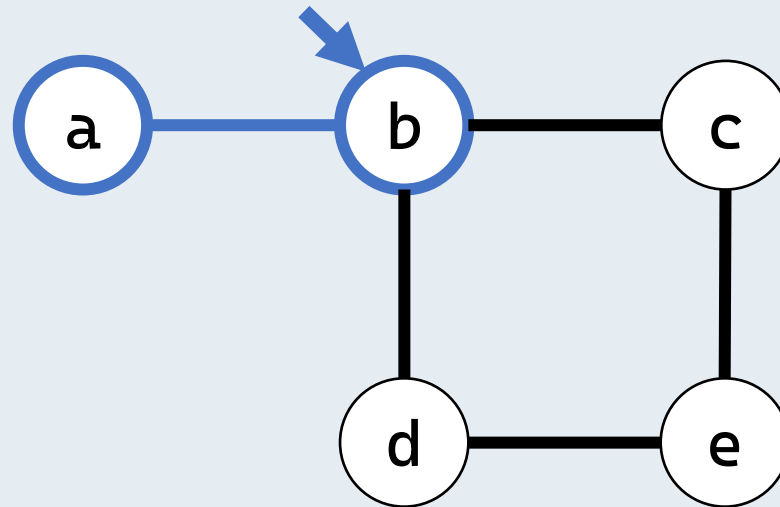
- Start from **a**, mark **a** as visited.



stack: b

Let's try using DFS:

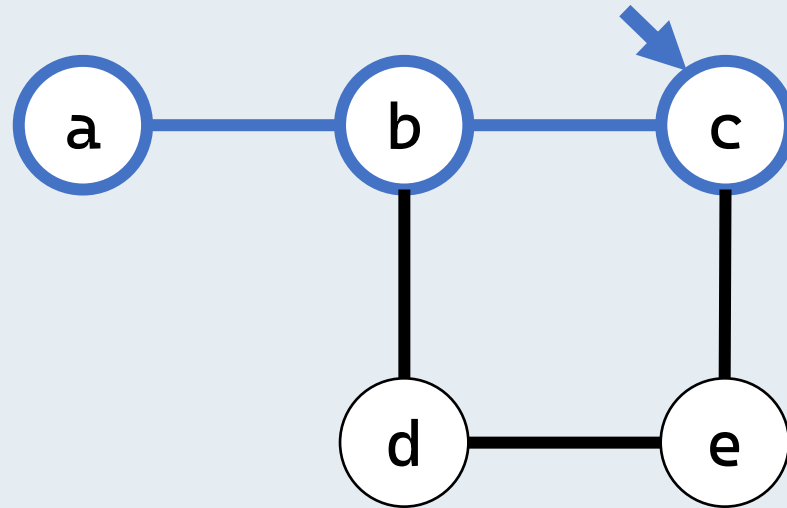
- Start from **a**, mark **a** as visited.



stack: d, c

Let's try using DFS:

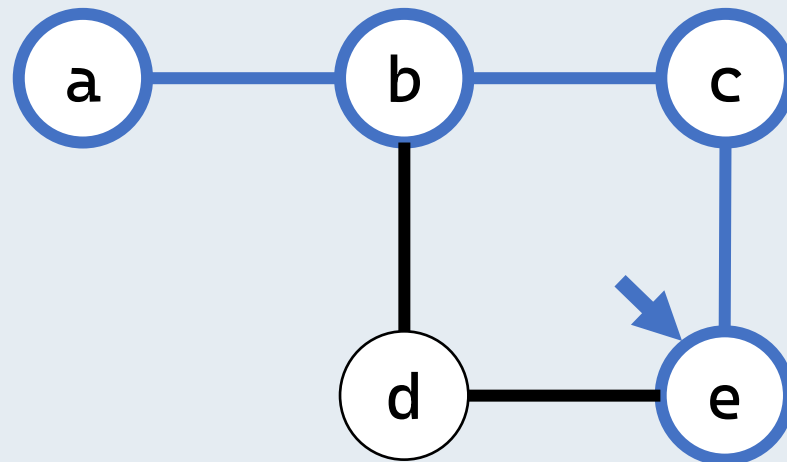
- Start from **a**, mark **a** as visited.



stack: d, e

Let's try using DFS:

- Start from **a**, mark **a** as visited.

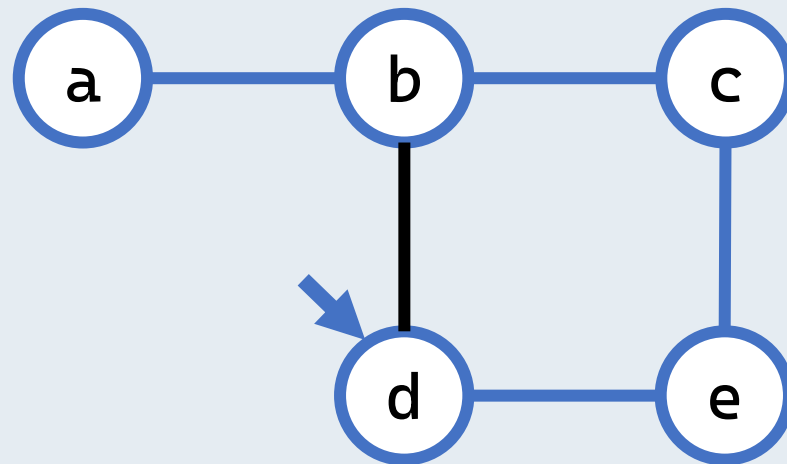


stack: d, d



Let's try using DFS:

- Start from **a**, mark **a** as visited.
- Nothing to push to the stack... **b** is already visited, and **e** is where we came from. **What does this imply?**



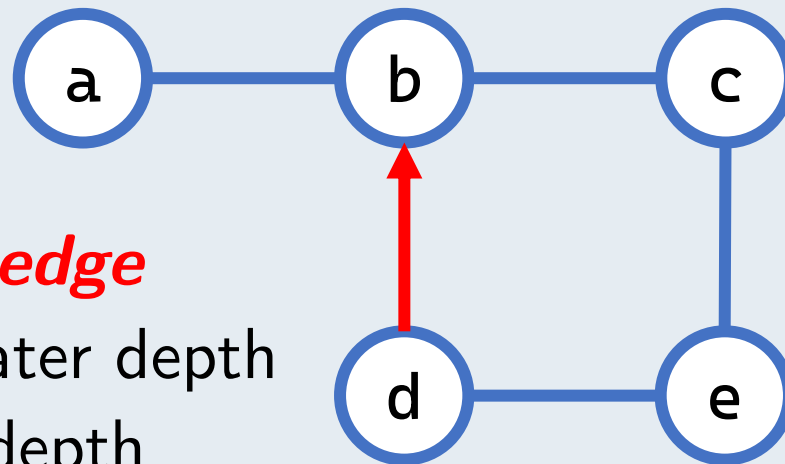
stack: d

There must be 2 paths from **b** to **d**... one passing through **e** and the other not!

**Idea:**

- Use DFS to traverse through the graph,
- If we find a neighbour is visited and it's not where we directly came from, claim that there's a cycle.

We call this a **back edge** from a vertex of greater depth to another at lower depth.



**Note:** DFS gives us a **spanning tree** connecting all vertices.

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**Algorithm 2** DFS for Cycle Detection in Undirected Graphs

---

```
1:  $visited[1 \dots v] \leftarrow false$ 
2:  $hasCycle \leftarrow false$ 
3: procedure DFS( $u, p$ )       $\triangleright u$  is the current vertex,  $p$  is the predecessor of  $u$  in the DFS tree
4:    $visited[u] \leftarrow true$ 
5:   for each neighbour  $v$  of  $u$  do
6:     if  $v \neq p$  and  $visited[v]$  then
7:        $hasCycle \leftarrow true$ 
8:     end if
9:     DFS( $v, u$ )
10:  end for
11: end procedure
```

---

**Note:** Need to run this on every connected component.

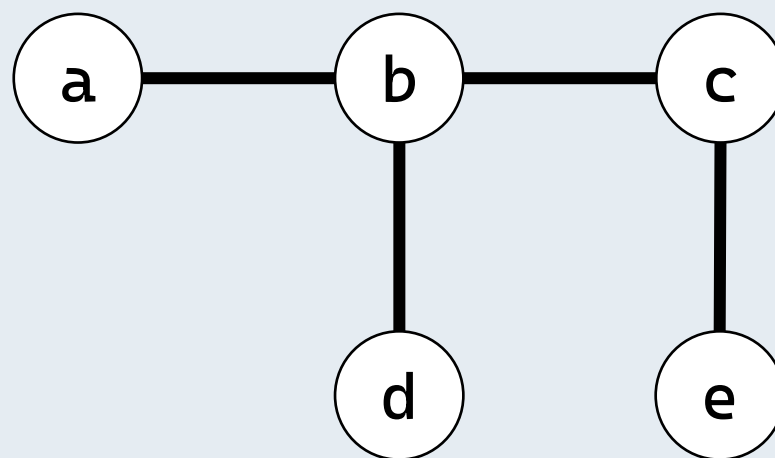
**Pause and ponder:** Can we use BFS instead of DFS?

## Problem 2.a: Another idea

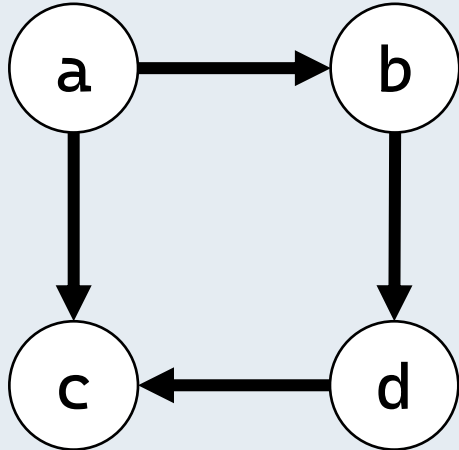
If an undirected graph has no cycles, then it must be a *forest* (graph containing one or several trees).

**How to check if a connected graph is a tree?**

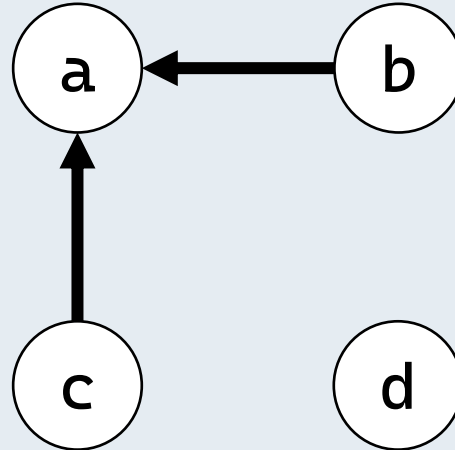
In trees,  $|E| = |V| - 1$ !



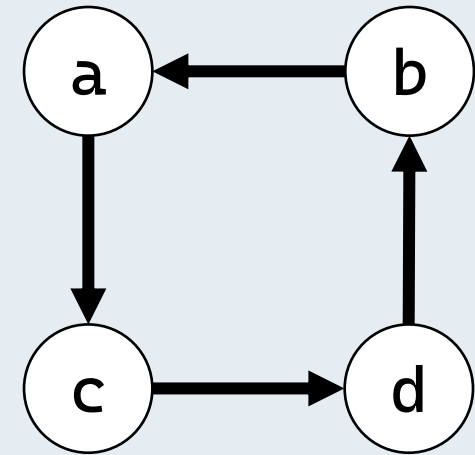
*Check if a directed graph contains cycles.*



**No cycle.**



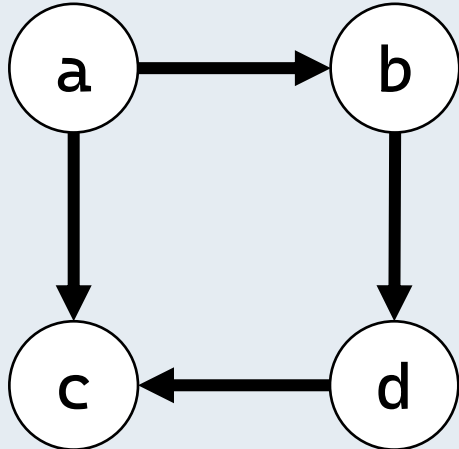
**No cycle.**



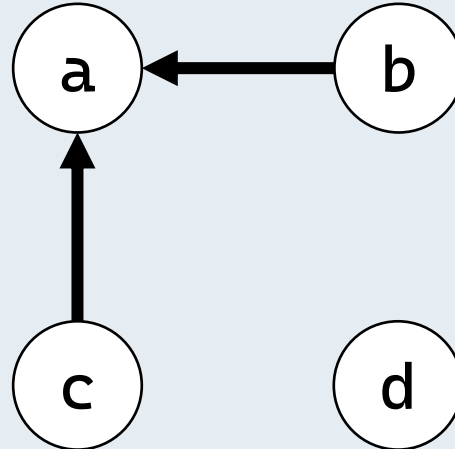
**Has cycle!**

**Question:** Can we simply apply the previous traversal algorithm?

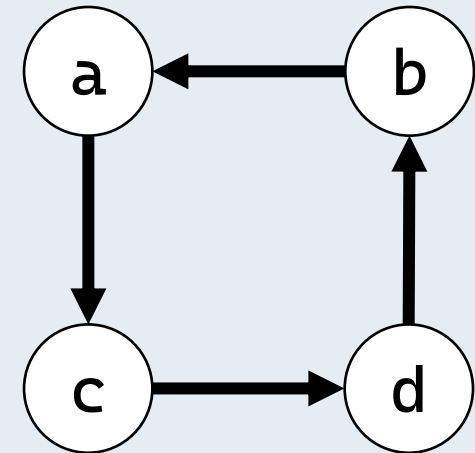
We have 2 paths from **a** to **c**... but this is not a cycle!



No cycle.



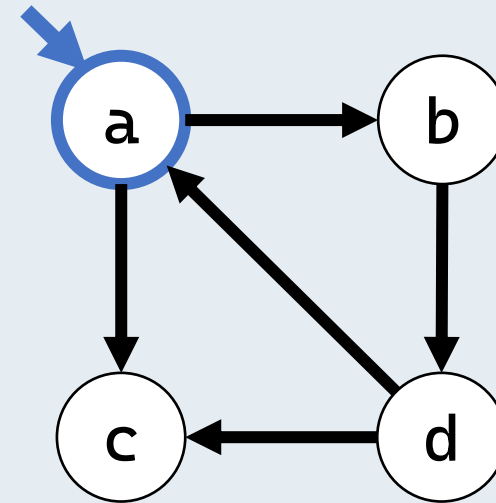
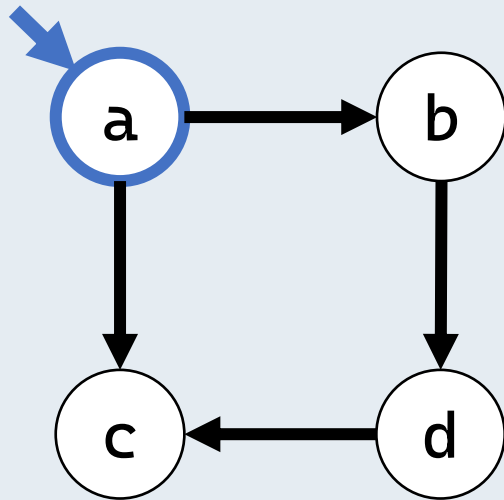
No cycle.



Has cycle!

**Idea:** Find a path that starts and ends on the same vertex!

Let's try DFS again...

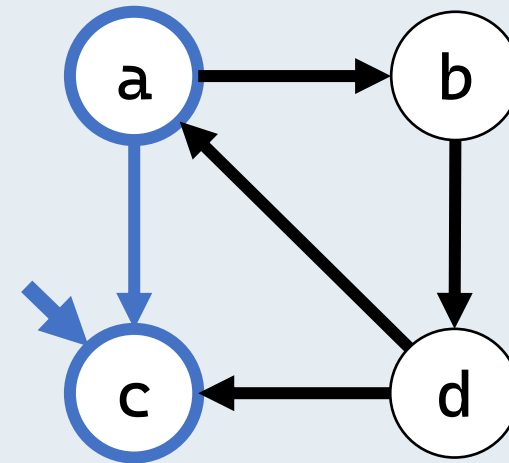
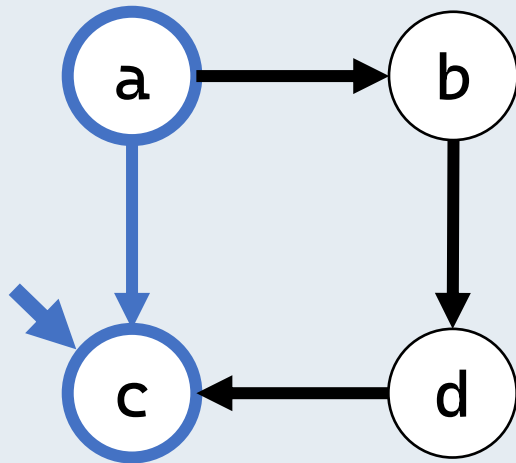


**Idea:** Find a path that starts and ends on the same vertex!

Let's try DFS again...

No more neighbors! **What does this imply?**

This path won't form a cycle!

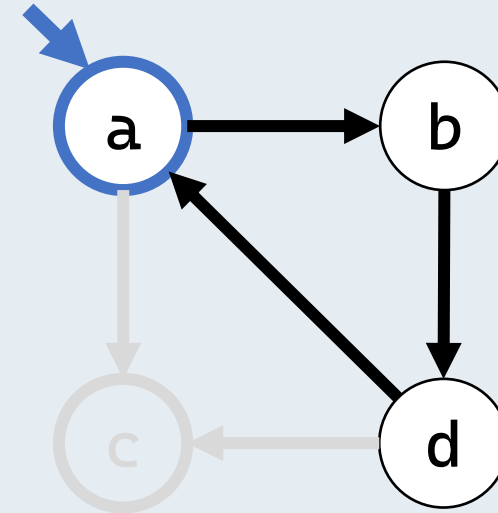
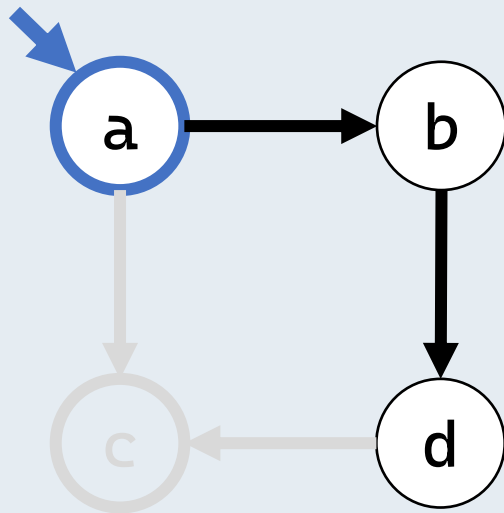




**Idea:** Find a path that starts and ends on the same vertex!

Let's try DFS again...

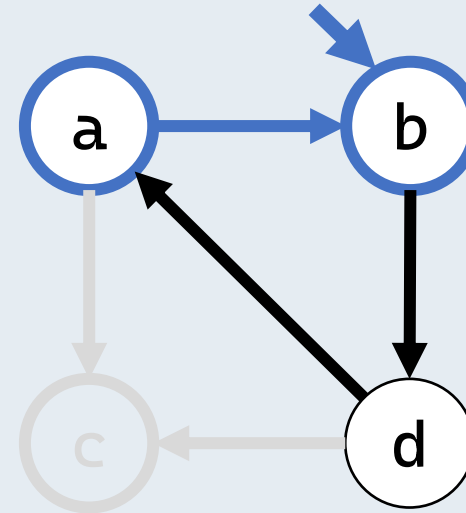
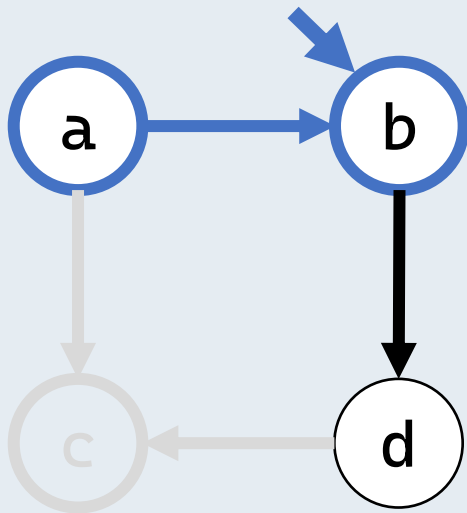
No more neighbors! **Might as well ignore the nodes on this path!**



**Idea:** Find a path that starts and ends on the same vertex!

Let's try DFS again...

No more neighbors! **Might as well ignore the nodes on this path!**

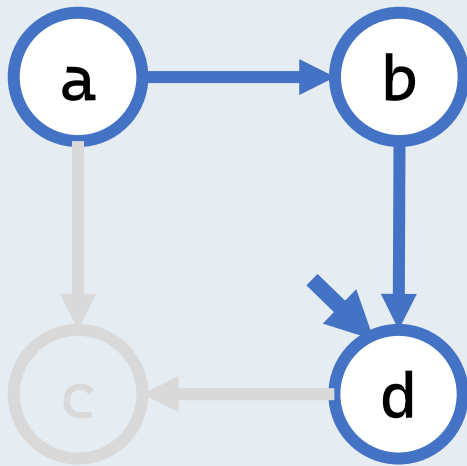


**Idea:** Find a path that starts and ends on the same vertex!

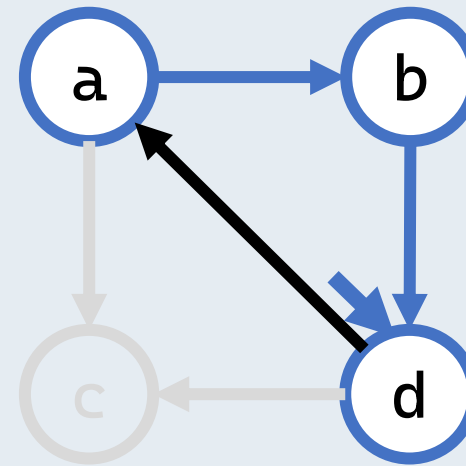
Let's try DFS again...

No more neighbors! **Might as well ignore the nodes on this path!**

Detect a visited neighbor **a**, cycle found!



**No neighbors.**



**A visited neighbor a!**

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**Algorithm 3** DFS for Cycle Detection in Directed Graphs

---

```
1:  $status[1 \dots v] \leftarrow NOT\_VISITED$ 
2:  $hasCycle \leftarrow false$ 
3: procedure DFS( $u, p$ )       $\triangleright u$  is the current vertex,  $p$  is the predecessor of  $u$  in the DFS tree
4:    $status[u] \leftarrow VISITING$ 
5:   for each neighbour  $v$  of  $u$  do
6:     if  $v \neq p$  and  $status[v] = VISITING$  then
7:        $hasCycle \leftarrow true$ 
8:     end if
9:     DFS( $v, u$ )
10:  end for
11:   $status[u] \leftarrow VISITED$ 
12: end procedure
```

---

**Note:** Need to ensure that in the end every node is visited.

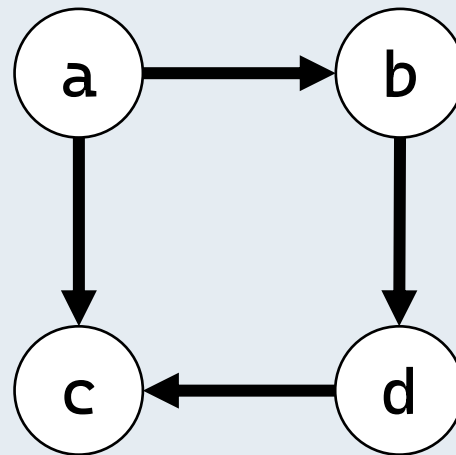
**Pause and ponder:** Can we use BFS instead of DFS?

## Problem 2.b: Another idea

If a directed graph has no cycles, then it must be a *directed acyclic graph (DAG)*.

How to check if graph is a DAG?

A DAG has a topological ordering!

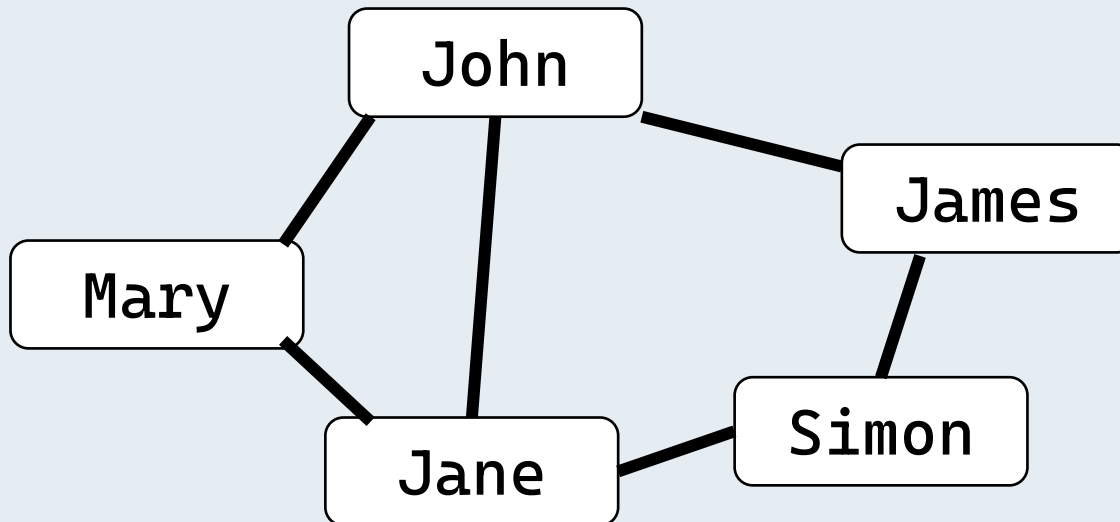


topological ordering: a, b, d, c

# Problem 3.a,b

- We have an undirected graph with  $n$  vertices and  $m$  edges.

**Goal:** to quickly check if vertex  $X$  is connected to vertex  $Y$ .

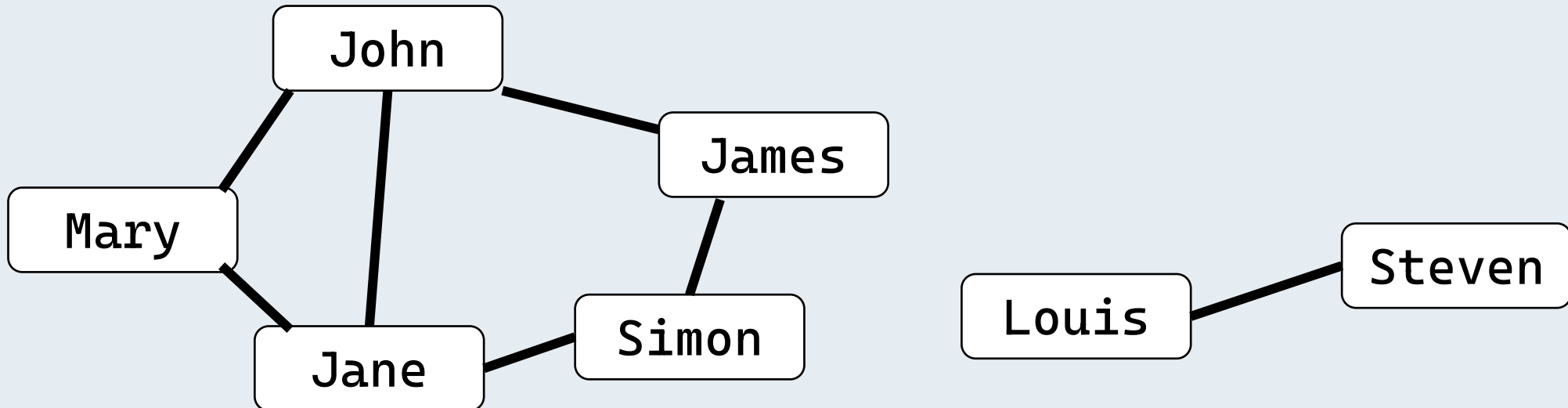


Use **adjacency matrix**  
for  $O(1)$  query of edges!

- We have an undirected graph with  $n$  vertices and  $m$  edges.

**Goal:** to quickly check **if there's a path** from vertex  $X$  to vertex  $Y$ .

**Idea:** start from  $X$ , do BFS/DFS and see if  $Y$  is reachable!



```
traversal(G, v):  
    D.push(v);  
    while D is not empty do  
        v = D.pop();  
        if v is not visited then  
            visit(v);  
            D.push(all unvisited neighbours of v);
```

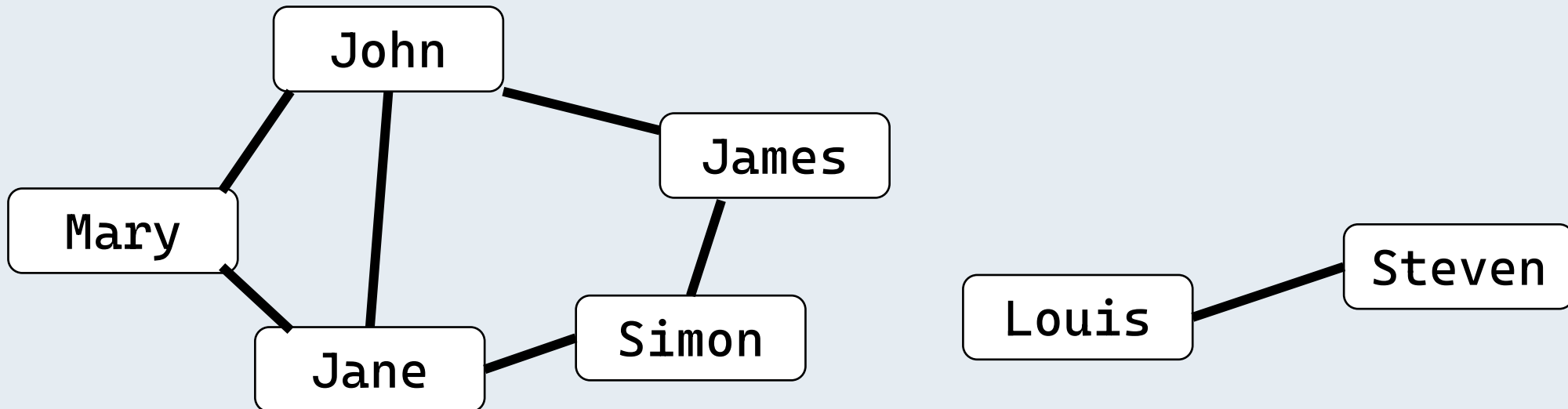
Use **adjacency list** to find the neighbors quickly!



- We have an undirected graph with  $n$  vertices and  $m$  edges.

**Goal:** answer  $k$  queries of whether there's a path from vertex  $X$  to vertex  $Y$ .

**Observation:** If 2 vertices are in the same connected component, then there's a path between the two!



- We have an undirected graph with  $n$  vertices and  $m$  edges.

**Goal:** answer  $k$  queries of whether there's a path from vertex  $X$  to vertex  $Y$ .

**Observation:** If 2 vertices are in the same connected component, then there's a path between the two!

**Idea:** use UFDS, store each connected component in a set.

{John, James, Mary, Jane, Simon}, {Louis, Steven}

**Pre-processing:**  $O(m\alpha(n))$  time, **Query:**  $O(K\alpha(n))$  time.

- We have an undirected graph with  $n$  vertices and  $m$  edges.

**Goal:** answer  $k$  queries of whether there's a path from vertex  $X$  to vertex  $Y$ .

**Observation:** If 2 vertices are in the same connected component, then there's a path between the two!

**Another Idea:** Give vertices in a connected component the same label.

John:1, James:1, Mary:1, Jane:1, Simon:1, Louis:2, Steven:2

**Pre-processing:**  $O(m + n)$  time, **Query:**  $O(K)$  time.

# End of File

Thank you very much for your attention :-)