

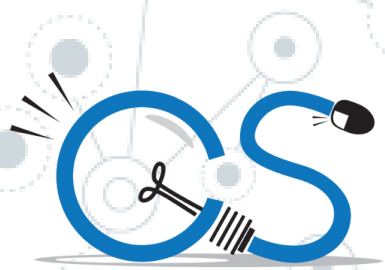


# **APPLICATION IN DESIGNING ALGORITHMS: GRAPH ALGORITHMS**

## **GROUP 12**

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# Part 1: OVERVIEW



## Part 1: OVERVIEW

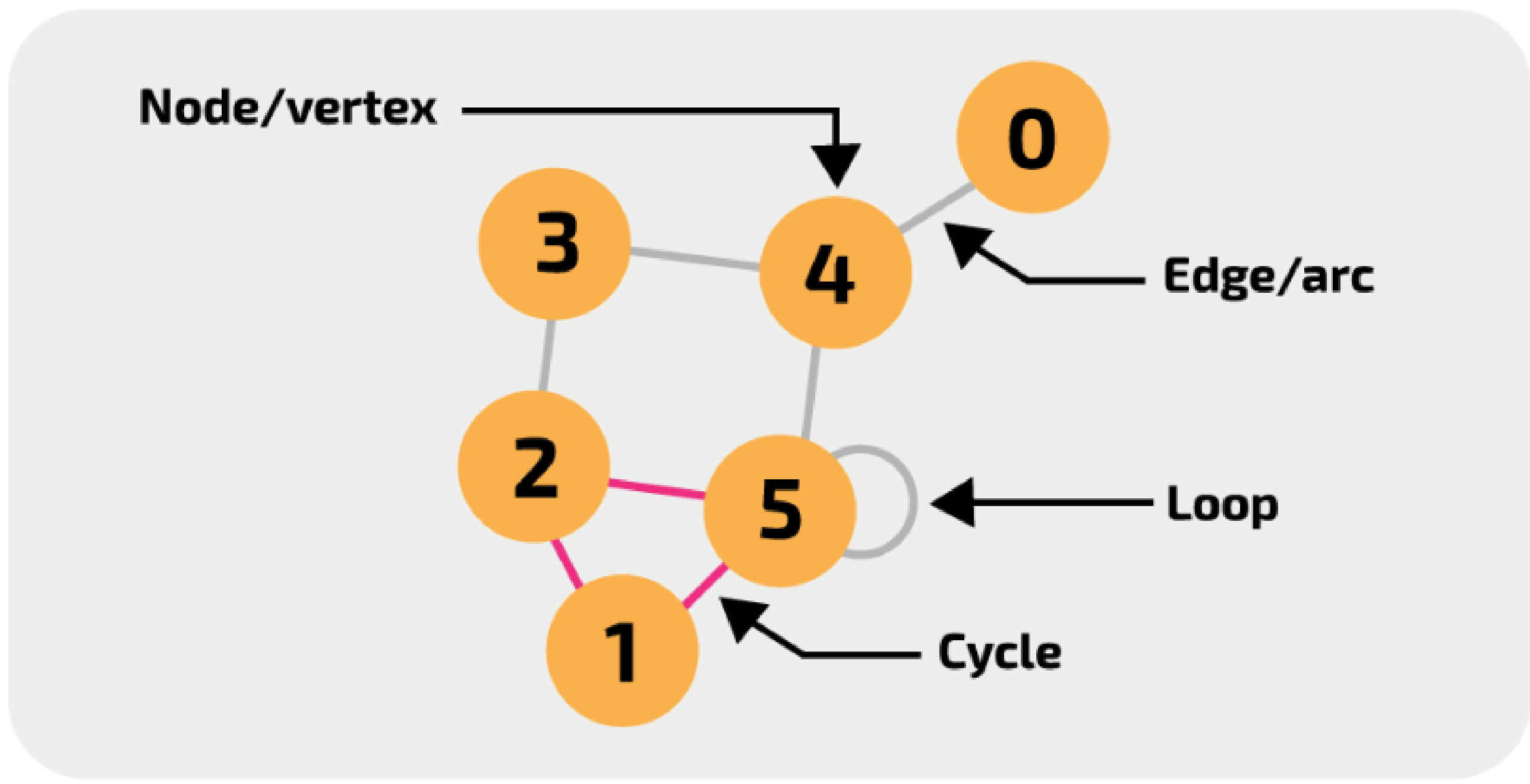


**What is a GRAPH?**



# Part 1: OVERVIEW

## What is a GRAPH?





## Part 1: OVERVIEW



**What are differences between  
geometry and graph?**



## Part 1: OVERVIEW

# Traversing Algorithm

**DFS**

**BFS**



# Part 1: OVERVIEW

## DFS

## BFS

disc

- explores as deeply as possible along a branch before backtracking
- processes from farther to nearer

- explores vertices level by level
- processes from nearer to farther

Approach

Backtracking

???

Data structure

stack

queue

Specific use cases

- ???

- finding shortest path (in a map, a network, a puzzle,...)

Common use cases

Better if the graph is wide

Better if solutions are shallow

Time complexity

$O(|V| + |E|)$   
 $|V|$ : numbers of vertices  
 $|E|$ : numbers of edges





## Part 2: GRAPH'S ALGORITHMS





## Part 2: GRAPH'S ALGORITHMS

### Topological Sort

**Problem Statement**

**Algorithm**

- Brute Force
- Backtracking
- Divide & Conquer
- Dynamic Programming
- Comparison

# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

## Problem Statement

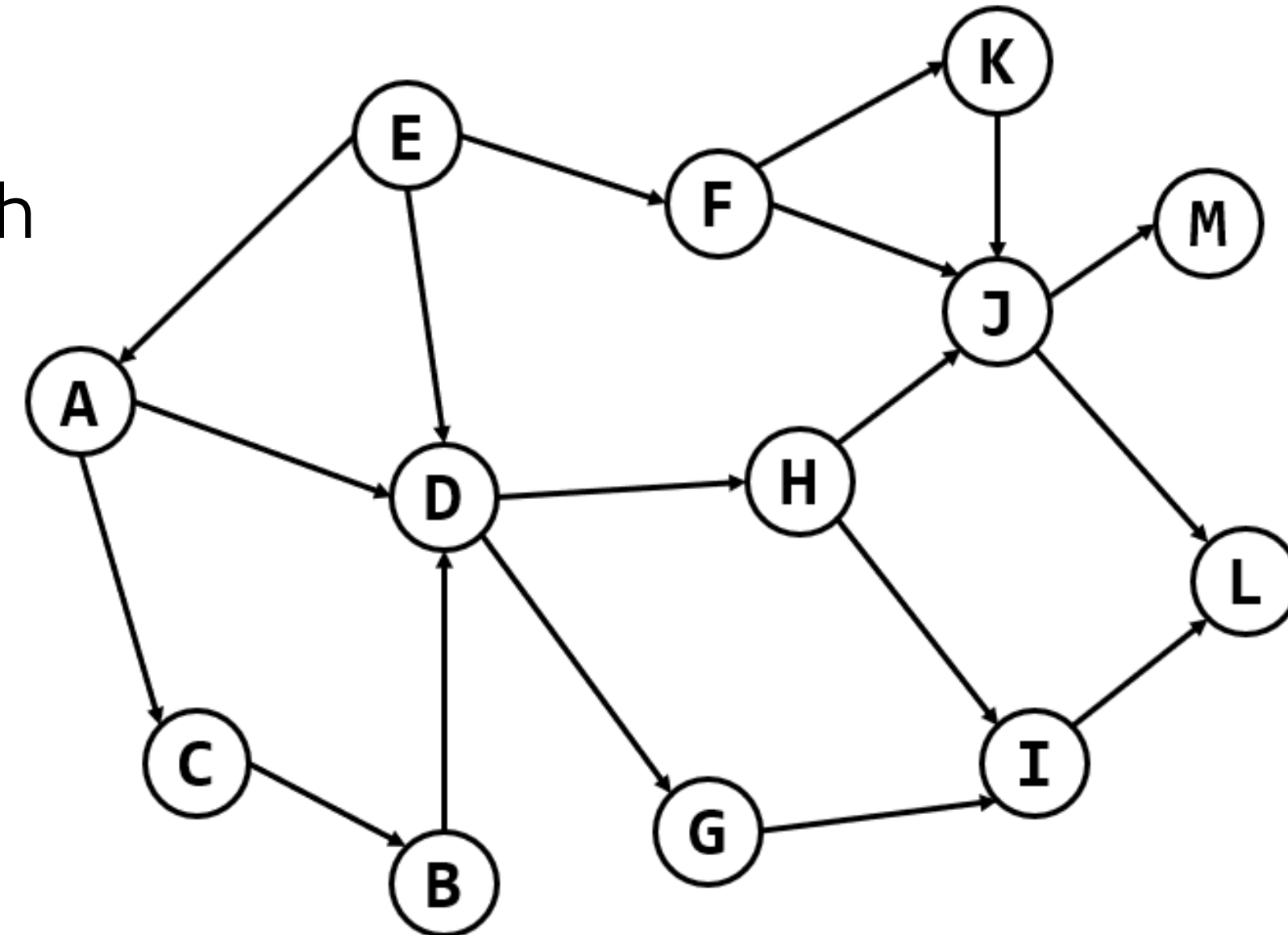
Given a directed acyclic graph, find an disc of vertices so that for every directed edge  $u-v$ , vertex  $u$  comes before vertex  $v$  (finding a topological disc).

Input: a directed acyclic graph

Output: a topological disc

Constraint:

$|V| \leq 3 \cdot 10^4$ ,  $|E| \leq 2 \cdot 10^5$



Problem  
Statement

Algorithm

# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

## Brute Force

- Let  $C$  be any order of the vertices.

→ The number of orders is  $|V|!$ .

→ To check if  $C$  is valid:  $O(|V|^2(|V| + |E|))$   
(check if all pairs are valid).

? **How about other approaches?**



Problem  
Statement

Algorithm

• Backtracking

• Divide & Conquer

• Dynamic Programming

• Comparison

# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

## Backtracking

Problem  
Statement

Algorithm

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• Divide & Conquer

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• Comparison

**Idea:** Iteratively insert vertices into a solution.

- If a newly added vertex can reach any vertices already in the solution, try another vertex.

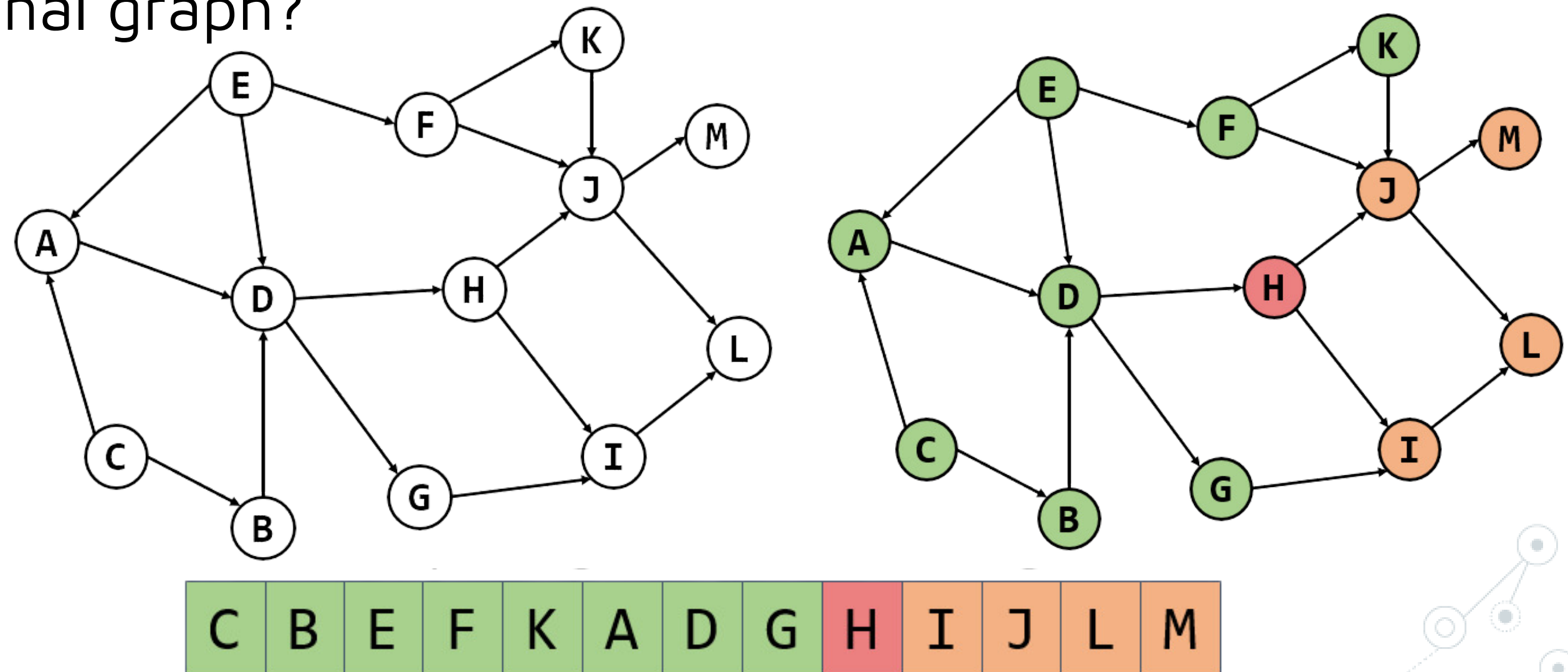
→ This will reduce some solution of brute force but have the same complexity.

# Part 2: GRAPH'S ALGORITHMS

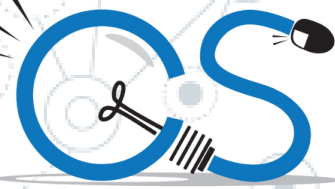
## Topological Sort

## Divide & Conquer

What happens if we remove a vertex, e.g H, from the original graph?



→ This will divide the graph into two independent parts: the orange part, which can be reached from H, and the green part, which cannot be reached from H.



Problem  
Statement

Algorithm

• Brute Force

• Backtracking

• Dynamic Programming

• Comparison

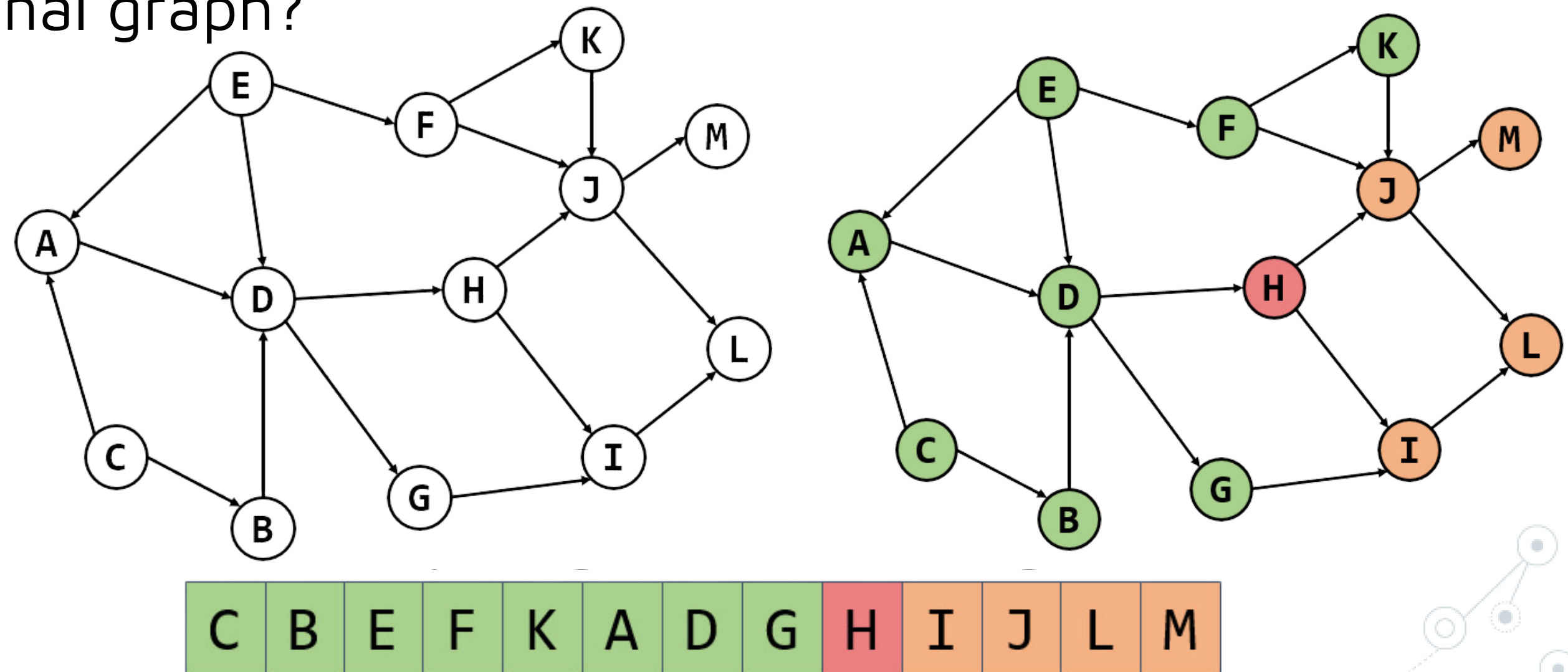


# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

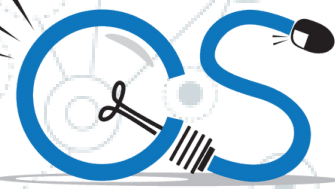
## Divide & Conquer

What happens if we remove a vertex, e.g H, from the original graph?



We can build the whole solution in a single container.

→ First, we build the orange part, then insert H, then build the green part. That can be done by using DFS.



Problem  
Statement

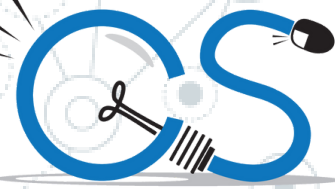
Algorithm

• Brute Force

• Backtracking

• Dynamic Programming

• Comparison

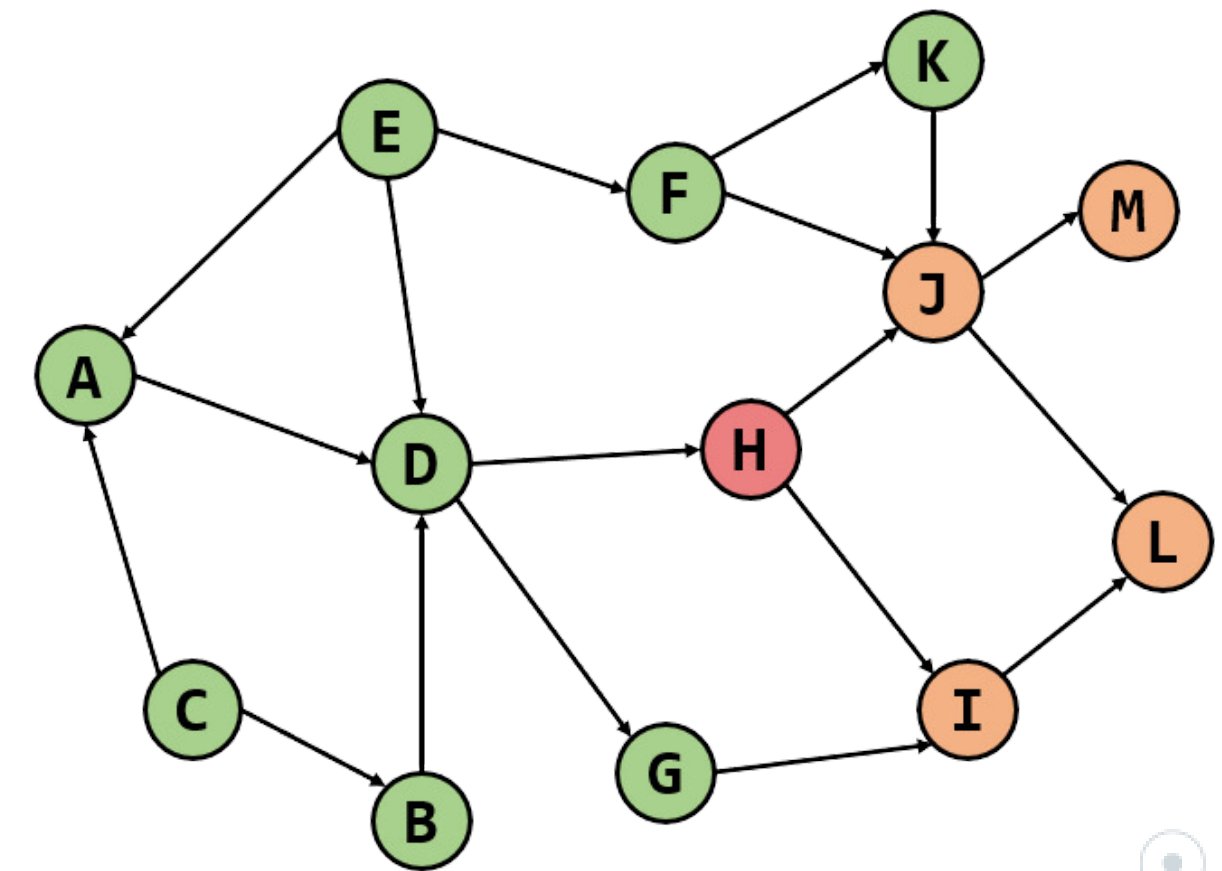
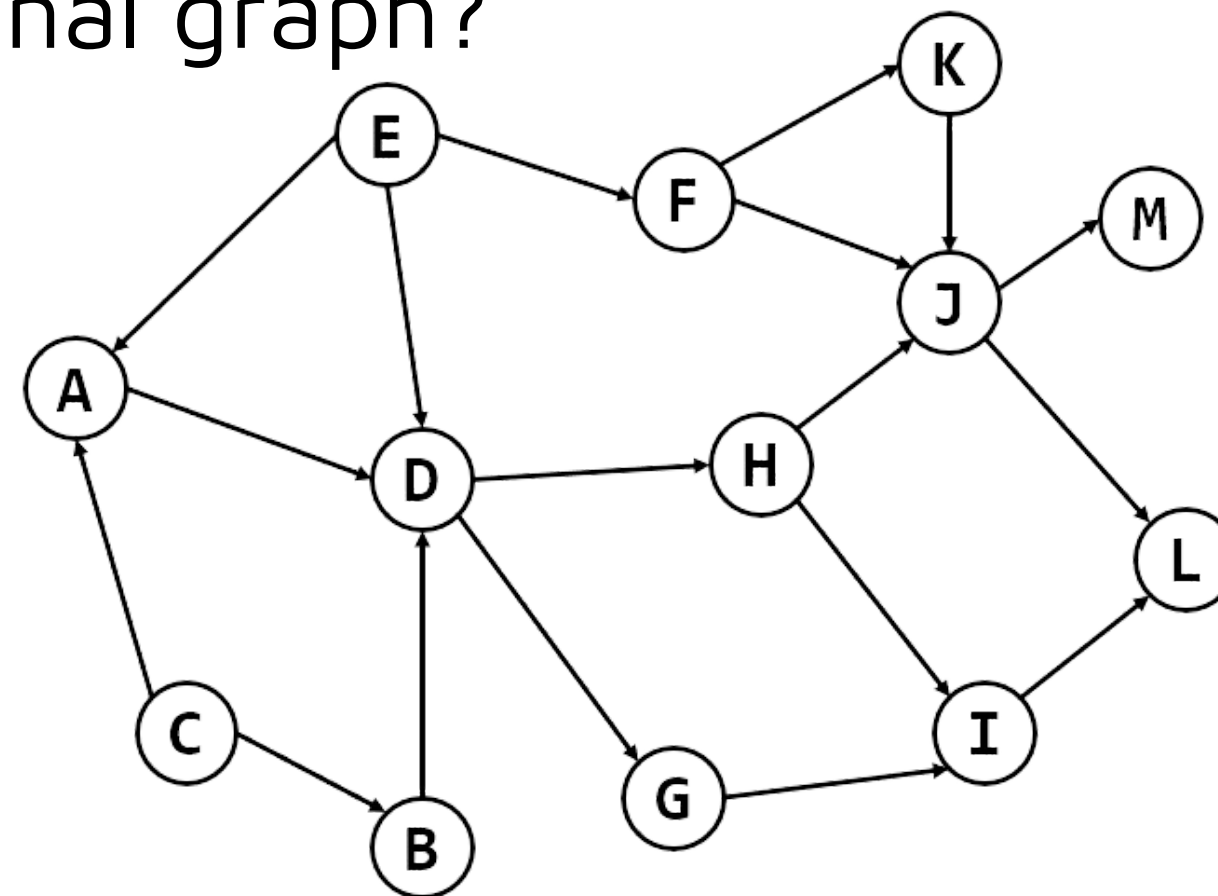


# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

## Divide & Conquer

What happens if we remove a vertex, e.g H, from the original graph?



→ Time Complexity:  $O(|V| + |E|)$

Problem  
Statement

Algorithm

• Brute Force

• Backtracking

• Dynamic Programming

• Comparison



# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

## Divide & Conquer

Problem  
Statement

Algorithm

- Brute Force
- Backtracking
- Dynamic Programming
- Comparison

Pseudocode:

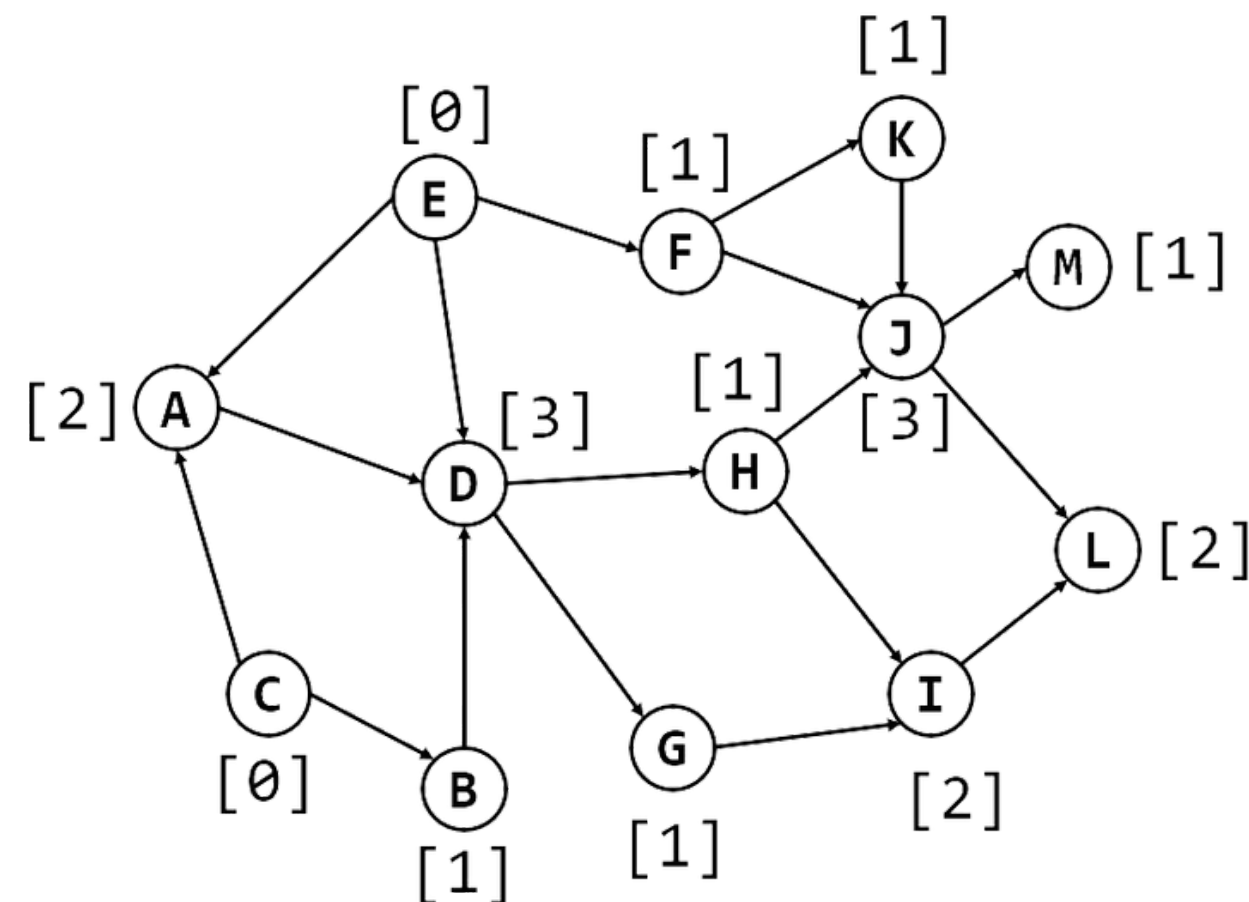
```
ts <- empty list
for each unvisited vertex u:
    topo_sort(u)
function topo_sort(root):
    visited[root] <- True
    for each adjacent vertex v of root:
        if not visited[v]:
            topo_sort(v)
    insert root at the beginning of ts
```

# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

## Dynamic Programming

- Noticing that a vertex can be put at the beginning of a topological order if and only if its in-degree is 0



Queue: **E** **C**

- In this case, both E and C can be put at the beginning of a topological order.



Problem  
Statement

Algorithm

• Brute Force

• Backtracking

• Divide & Conquer

• Comparison



# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

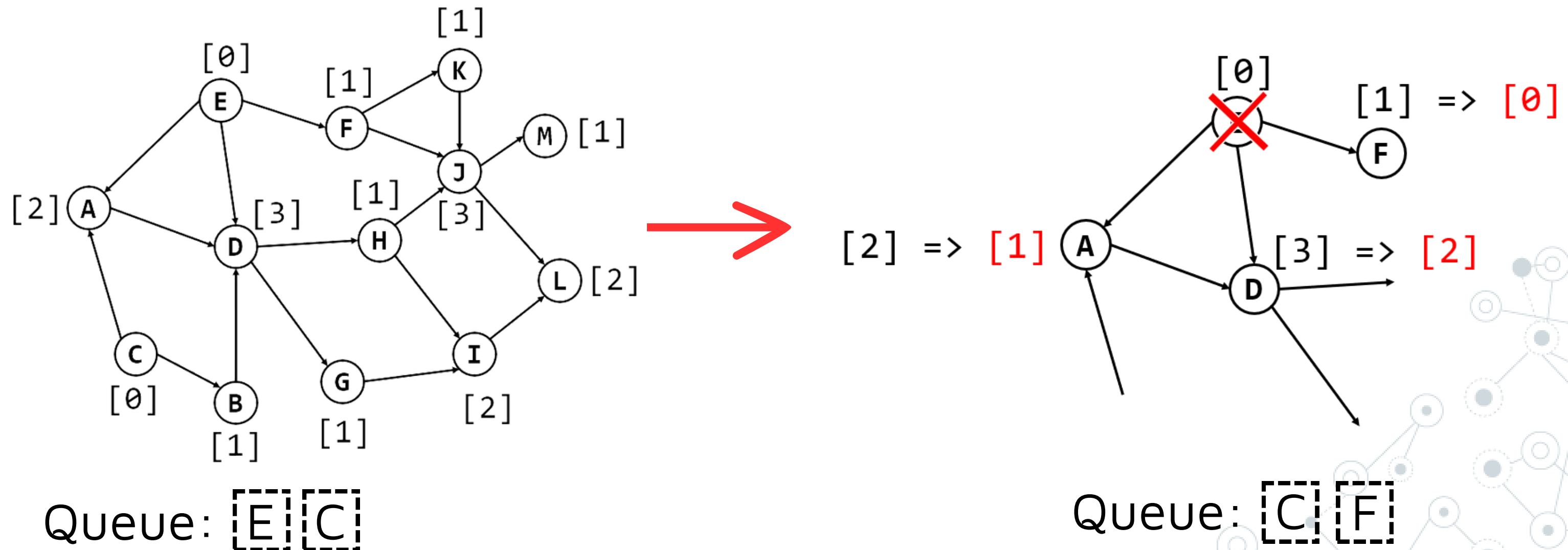
## Dynamic Programming

Problem Statement

Algorithm

- Brute Force
- Backtracking
- Divide & Conquer
- Comparison

Now if we remove E from the graph (insert it to the topological order), we can efficiently calculate the in-degrees of its neighbors.



- F now have in degree of 0. Both C and F can be put right after E



# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

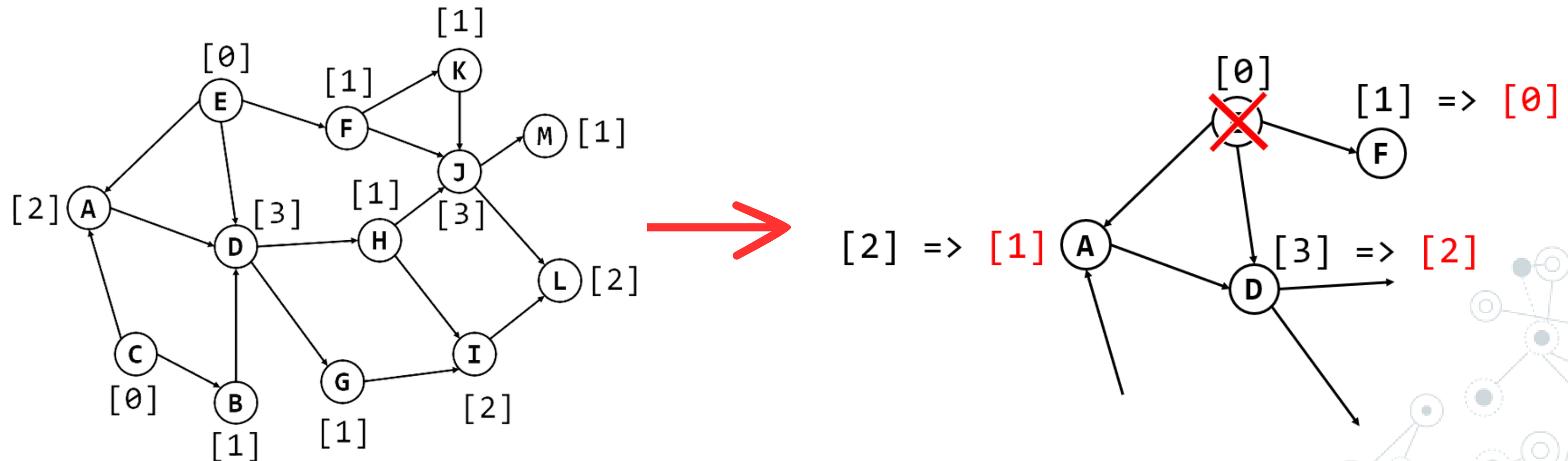
## Dynamic Programming

Problem Statement

Algorithm

- Brute Force
- Backtracking
- Divide & Conquer
- Comparison

Now if we remove E from the graph (insert it to the topological order), we can efficiently calculate the in-degrees of its neighbors.



Queue: [E][C]

Queue: [C][F]

→ The number of such calculations is the number of edges. Time Complexity:  $O(|V| + |E|)$

# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

## Dynamic Programming

Pseudocode:

```
in_deg <- a list of size |V| with all 0
ts <- empty list
zero_deg <- empty list
for each vertex u:
    for each child v of u:
        in_deg[v] <- in_deg[v]+1
for each vertex u:
    if in_deg[u]=0:
        insert u to zero_deg
while zero_deg is not empty:
    u <- any element of zero_deg
    insert u to ts
    for each child v of u:
        in_deg[v] <- in_deg[v]-1
        if in_deg[v]=0:
            insert v to zero_deg
```

Problem  
Statement

Algorithm

• Brute Force

• Backtracking

• Divide & Conquer

• Comparison

# Part 2: GRAPH'S ALGORITHMS

## Topological Sort

## Comparison

Problem  
Statement

Algorithm

- Brute Force
- Backtracking
- Divide & Conquer
- Dynamic Programming

**DAC**

- Run faster for large graphs
- May fail to detect cycles without further improvement

**DP**

- Run slow for large graphs
- Can always to detect cycles without further improvement





## Part 2: GRAPH'S ALGORITHMS

### Tarjan's Algorithm

**Problem Statement**

**Algorithm**

- **Problem Analysis**
- **Finding Bridges**
- **Finding Articulation points**

# Part 2: GRAPH'S ALGORITHMS

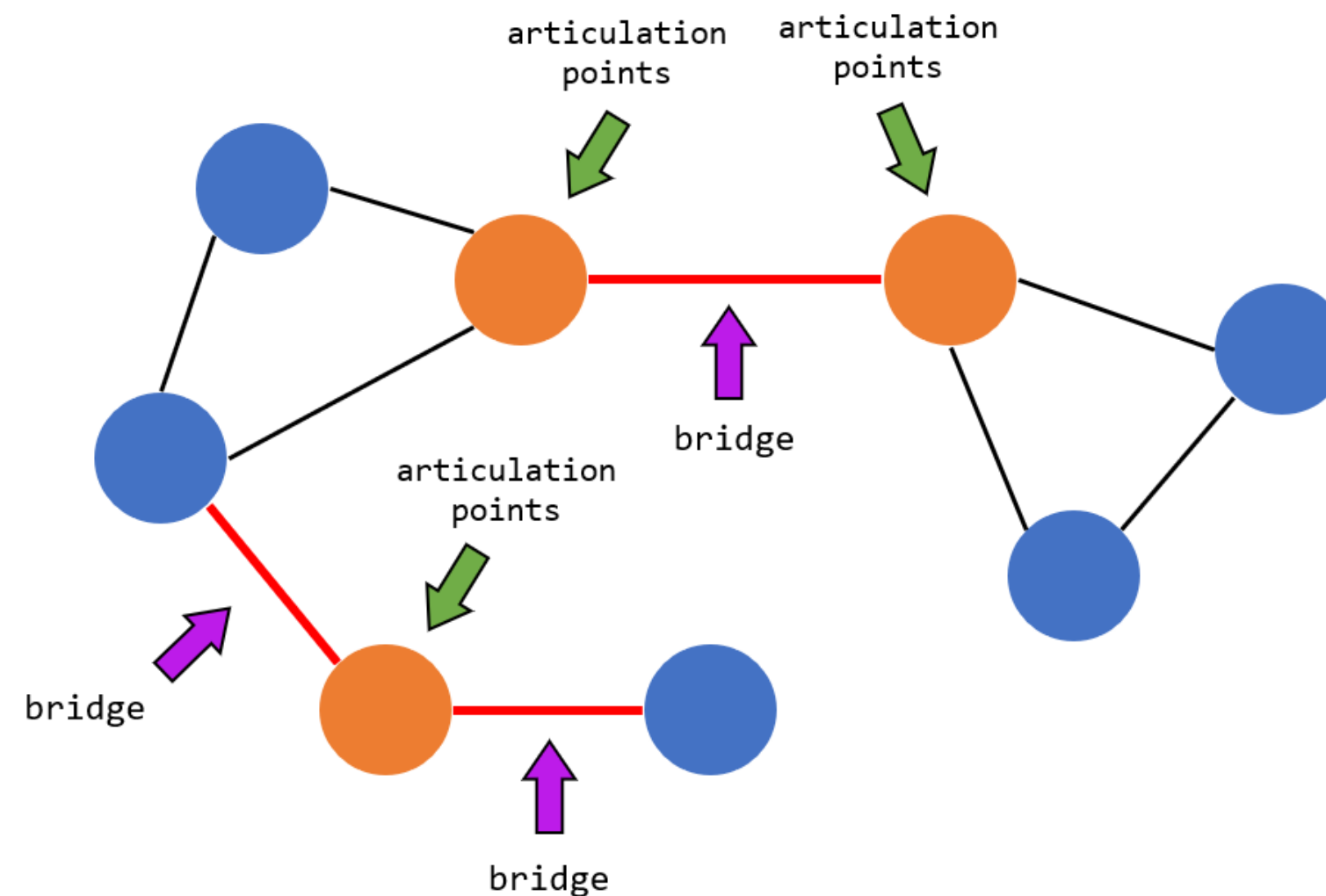
## Tarjan's Algorithm Problem Statement

Given an undirected graph, find all bridges and articulation points in the graph.

Input: an undirected graph

Output: a list of bridges, a list of articulation points

Constraint:  $|V| \leq 3 \cdot 10^4$ ,  $|E| \leq 2 \cdot 10^5$



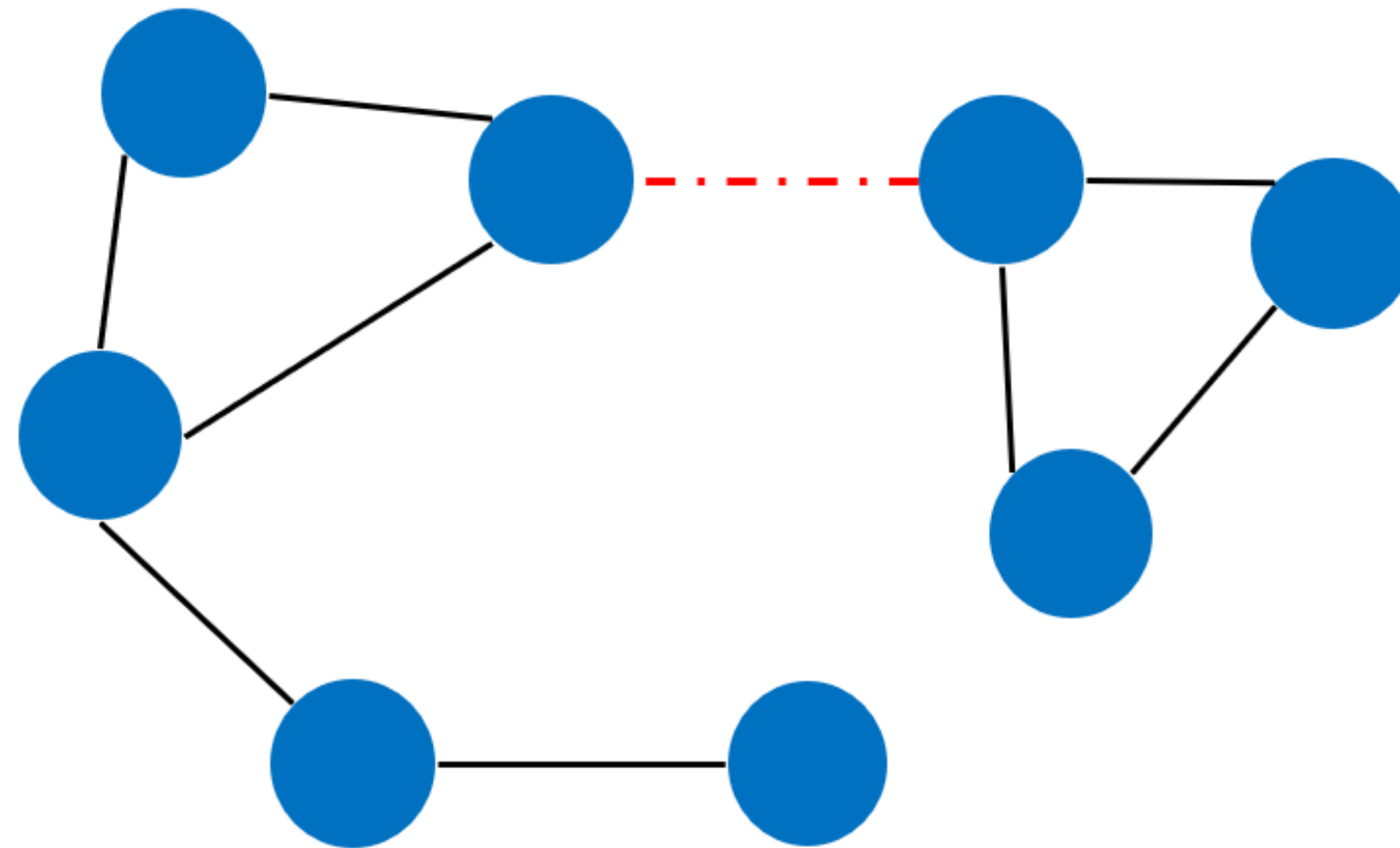


# Part 2: GRAPH'S ALGORITHMS

## Tarjan's Algorithm

## Problem Analysis

**Subproblem:** given an edge in the graph, determine if it is a bridge or not



Counting number of connected components before and after removing an edge  $\rightarrow O(|V| + |E|)$

All edges  $\rightarrow O(|E|(|V| + |E|))$

Problem  
Statement

Algorithm

Finding Bridges

Finding Articulation points

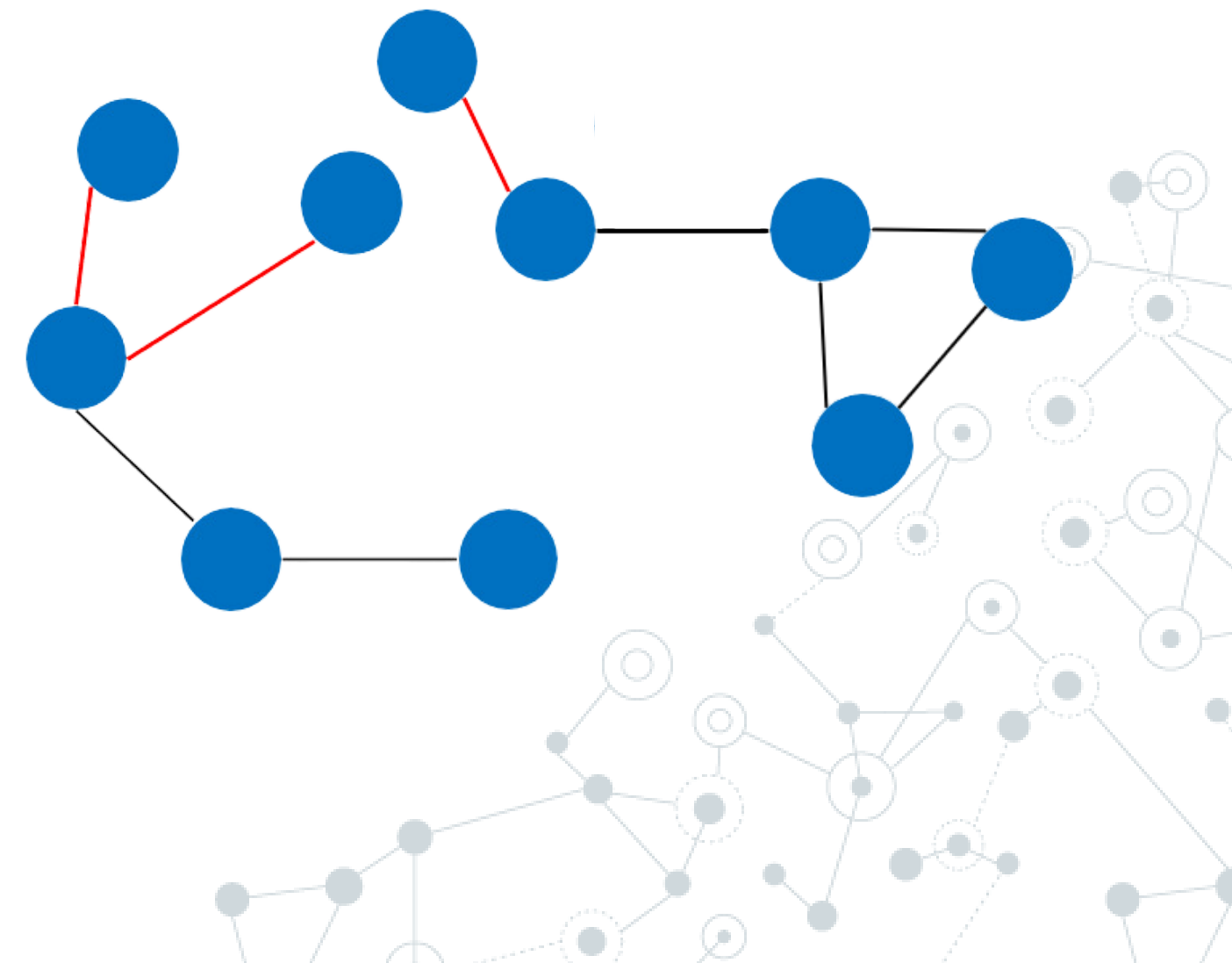
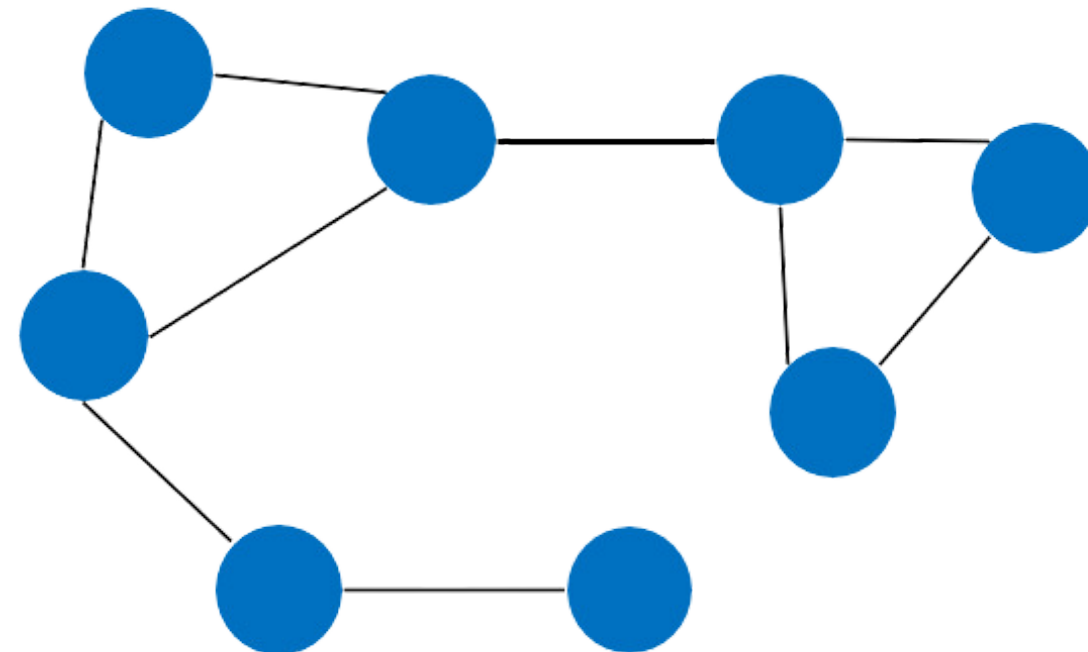
# Part 2: GRAPH'S ALGORITHMS

## Tarjan's Algorithm

## Problem Analysis

### Better approach?

- Optimization problem: Greedy Approach **X**
  - Independent subproblems: Backtracking
- ⇒ Non - bridges may becomes bridges.



→ Backtracking **X**

- Optimal Structures?

Problem  
Statement

Algorithm

Finding Bridges

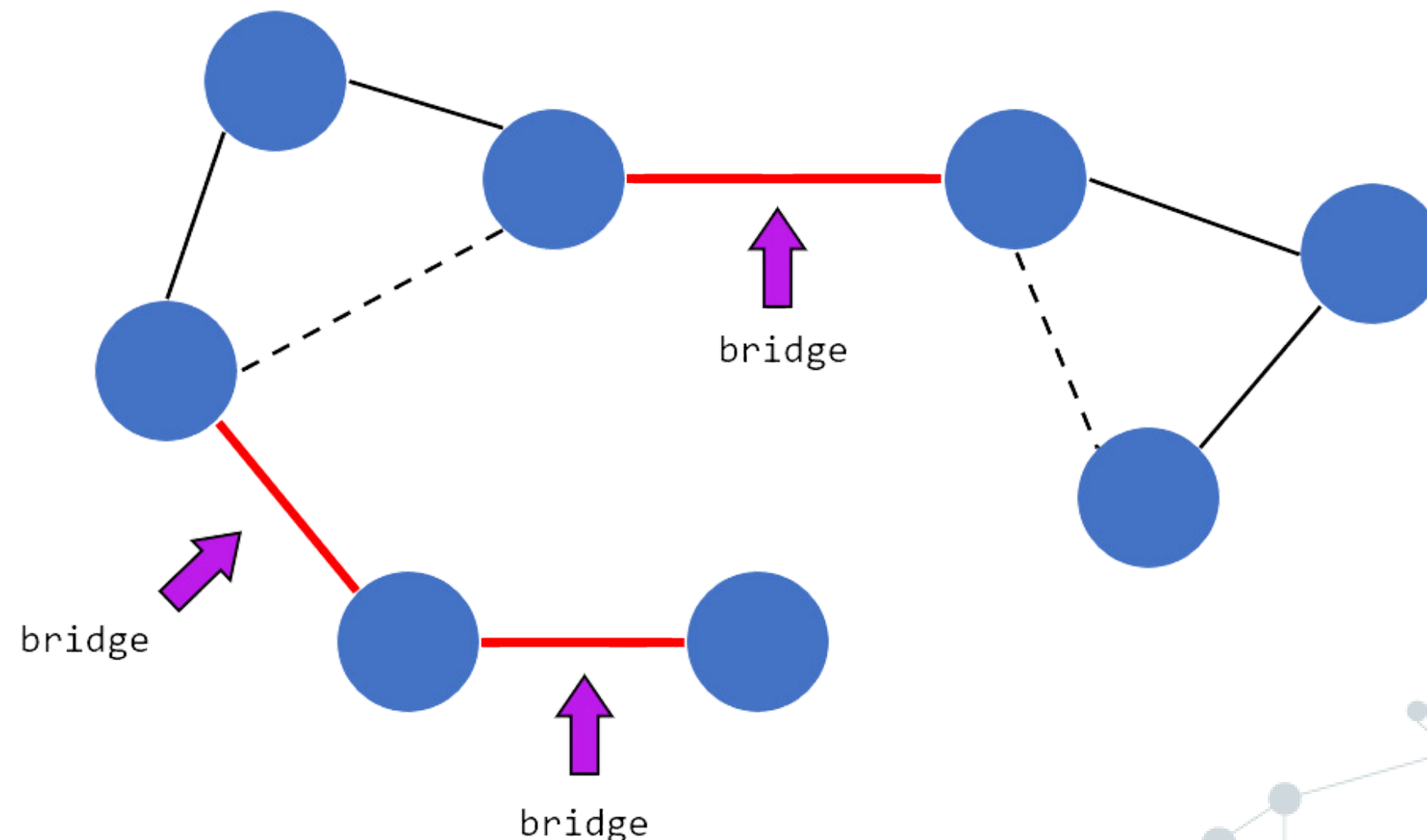
Finding Articulation points

# Part 2: GRAPH'S ALGORITHMS

## Tarjan's Algorithm

## Finding Bridges

On the DFS tree, vertex  $u$  is the parent of vertex  $v$ :  
 $\Rightarrow$  edge  $(u, v)$  is **a bridge** if and only if  $v$  **doesn't have any other links** to  $u$  or any ancestors of  $u$ .



Problem  
Statement

Algorithm

• Problem Analysis

• Finding Articulation points

# Part 2: GRAPH'S ALGORITHMS

## Tarjan's Algorithm

## Finding Bridges

Giving each vertex an id showing the time we have discovered it

⇒ we can find the earliest vertex that a certain vertex can link to using the following formulas:

$\text{lowlink}[u] = \text{disc}[u]$

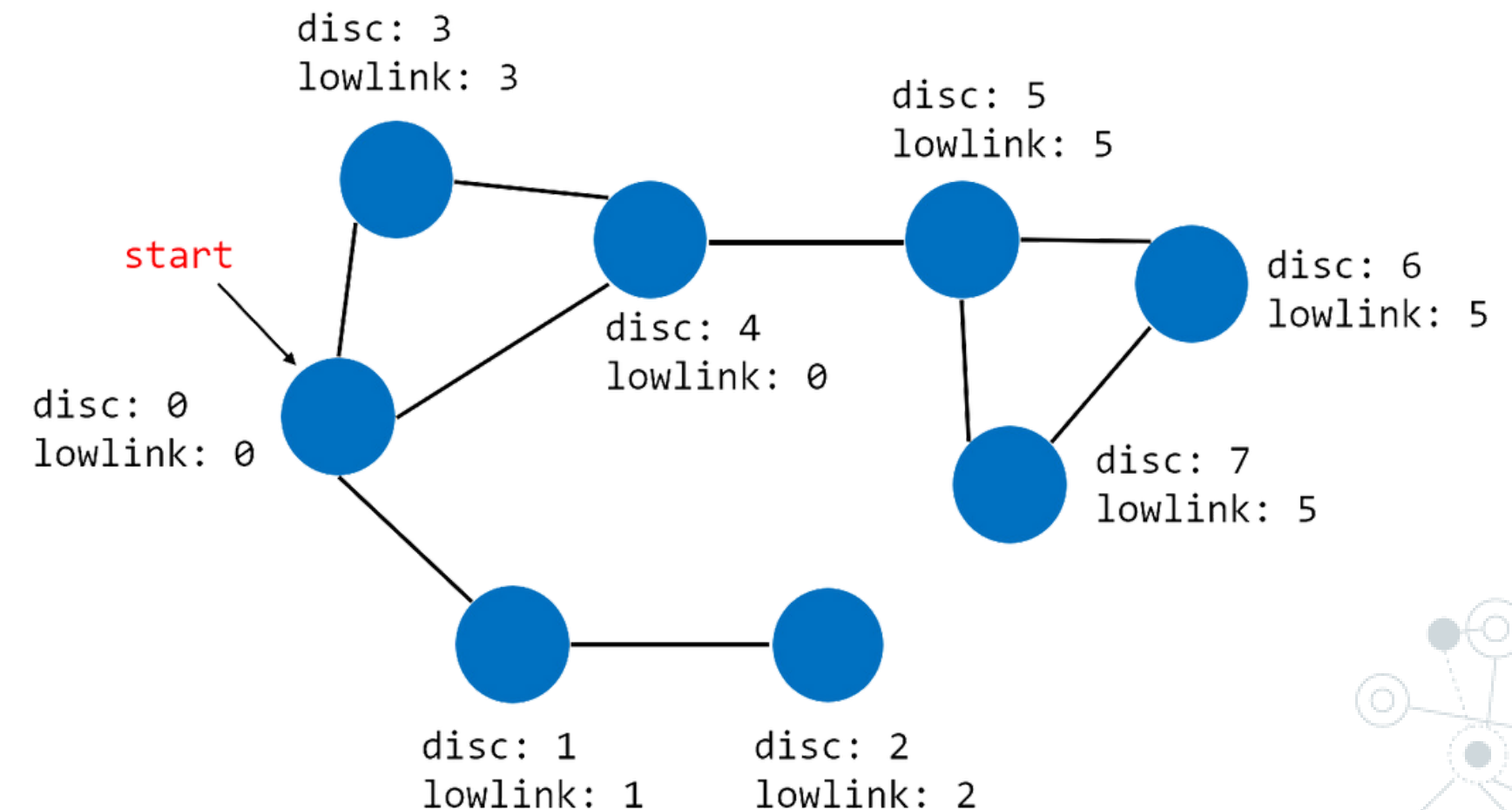
for each neighbor  $v$  of  $u$ :

$\text{lowlink}[u] = \min(\text{disc}[v], \text{lowlink}[u])$  if  $v$  is visited and not parent

$\text{lowlink}[u] = \min(\text{lowlink}[v], \text{lowlink}[u])$  if  $v$  is not visited

→ Dynamic programming

Time complexity:  **$O(|V| + |E|)$**



Problem Statement

Algorithm

• Problem Analysis

• Finding Articulation points

# Part 2: GRAPH'S ALGORITHMS

## Tarjan's Algorithm

## Finding Bridges

Pseudocode:

```
function bridges():  
    visited <- a list of size |V| with all 0  
    disc <- a list of size |V| with all -1  
    low_link <- a list of size |V| with all -1  
    parent <- a list of size |V| with all -1  
    current <- 0  
    bridge_count <- 0  
    for each vertex v in the graph:  
        if not visited[u]:  
            bridge_helper(u)  
    return bridge_count
```

Problem  
Statement

Algorithm

• Problem Analysis

• Finding Articulation points

# Part 2: GRAPH'S ALGORITHMS

## Tarjan's Algorithm

## Finding Bridges

Problem  
Statement

Algorithm

- Problem Analysis

- Finding Articulation points

```
function bridge_helper(u):
    visited[u] <- 1
    disc[u] <- current
    low_link[u] <- current
    current <- current + 1
    for each adjacent vertex v of u:
        if not visited[v]:
            parent[v] <- u
            bridge_helper(v)
            low_link[u] <- min(low_link[u], low_link[v])
            if low_link[v] > disc[u]:
                bridge_count <- bridge_count + 1
        else if parent[u] != v
            low_link[u] <- min(low_link[u], disc[v])
```



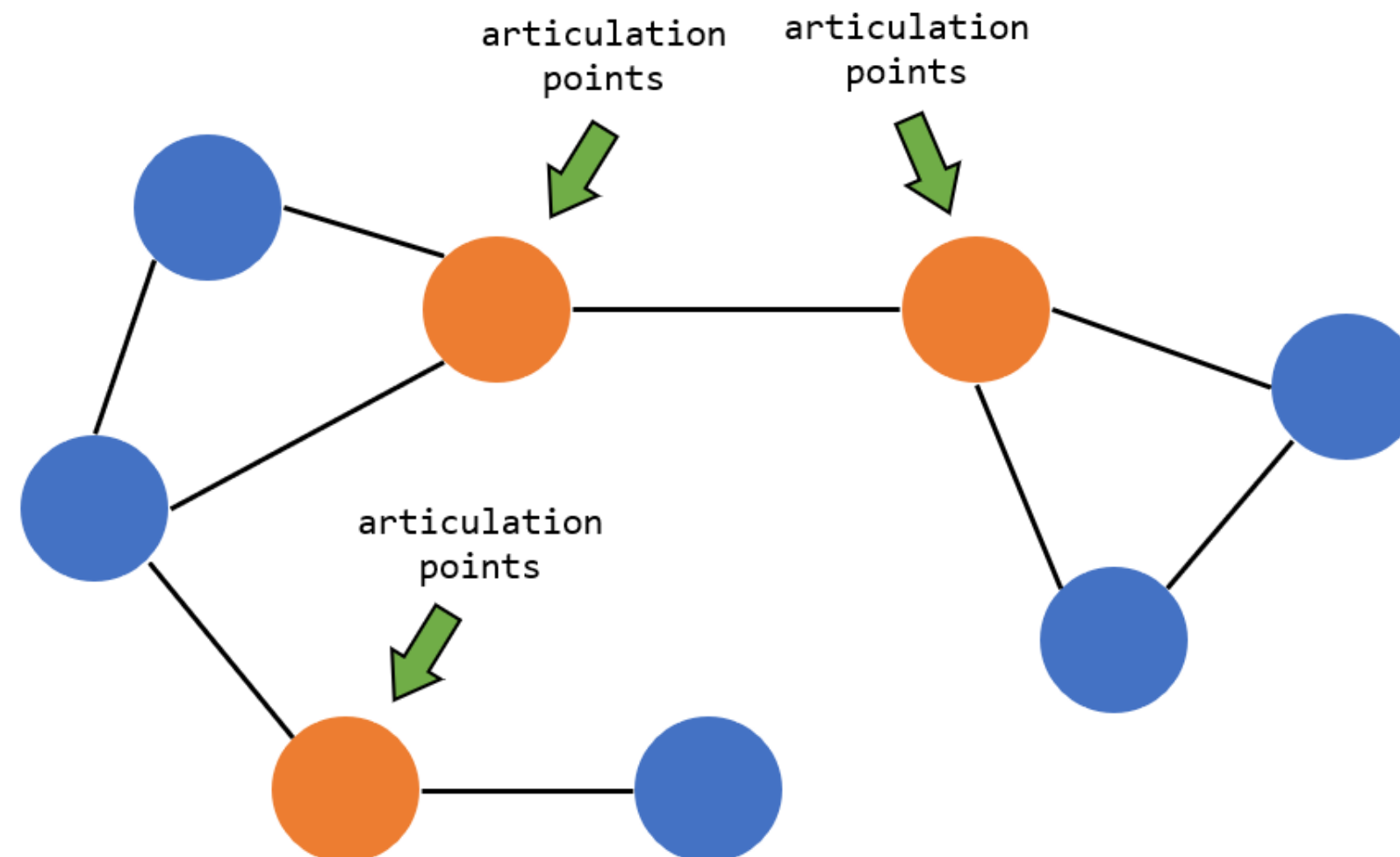
# Part 2: GRAPH'S ALGORITHMS

## Tarjan's Algorithm Finding Articulation points

Same idea as finding articulation points.

A vertex  $u$  is an articulation point if and only if:

- $u$  is the root and have more than 1 child
- $u$  is not the root and a child of  $u$  does not have any other links to any ancestors of  $u$



Problem  
Statement

Algorithm

Problem Analysis

Finding Bridges

# Part 2: GRAPH'S ALGORITHMS

## Tarjan's Algorithm Finding Articulation points

Pseudocode:

```
function ap():  
    visited <- a list of size |V| with all 0  
    disc <- a list of size |V| with all -1  
    low_link <- a list of size |V| with all -1  
    parent <- a list of size |V| with all -1  
    current <- 0  
    ap_count <- 0  
    branches <- 0  
    root <- -1  
    for each vertex u in the graph:  
        if not visited[u]:  
            branches <- 0  
            root <- u  
            ap_helper(u)  
    return ap_count
```

Problem  
Statement

Algorithm

• Problem Analysis

• Finding Bridges



# Part 2: GRAPH'S ALGORITHMS

## Tarjan's Algorithm Finding Articulation points

Problem  
Statement

Algorithm

• Problem Analysis

• Finding Bridges

```
function ap_helper(u):
    visited[u] <- 1
    disc[u] <- current
    low_link[u] <- current
    current <- current + 1
    is_ap <- 0
    for each adjacent vertex v of u:
        if not visited[v]:
            parent[v] <- u
            ap_helper(v)
            if u = root:
                branches <- branches + 1
                if branches > 1:
                    is_ap = 1
            else:
                low_link[u] <- min(low_link[u], low_link[v])
                if low_link[v] >= disc[u]:
                    is_ap = 1
            else if parent[u] != v
                low_link[u] <- min(low_link[u], disc[v])
    ap_count <- ap_count + is_ap
```



## Part 2: GRAPH'S ALGORITHMS

### Ford - Fulkerson's Algorithm

**Problem Statement**

**Algorithm**

- Problem Analysis
- Greedy Approach

# Part 2: GRAPH'S ALGORITHMS

## Ford - Fulkerson's Algorithm

## Problem Analysis

Problem  
Statement

Algorithm

Greedy Approach

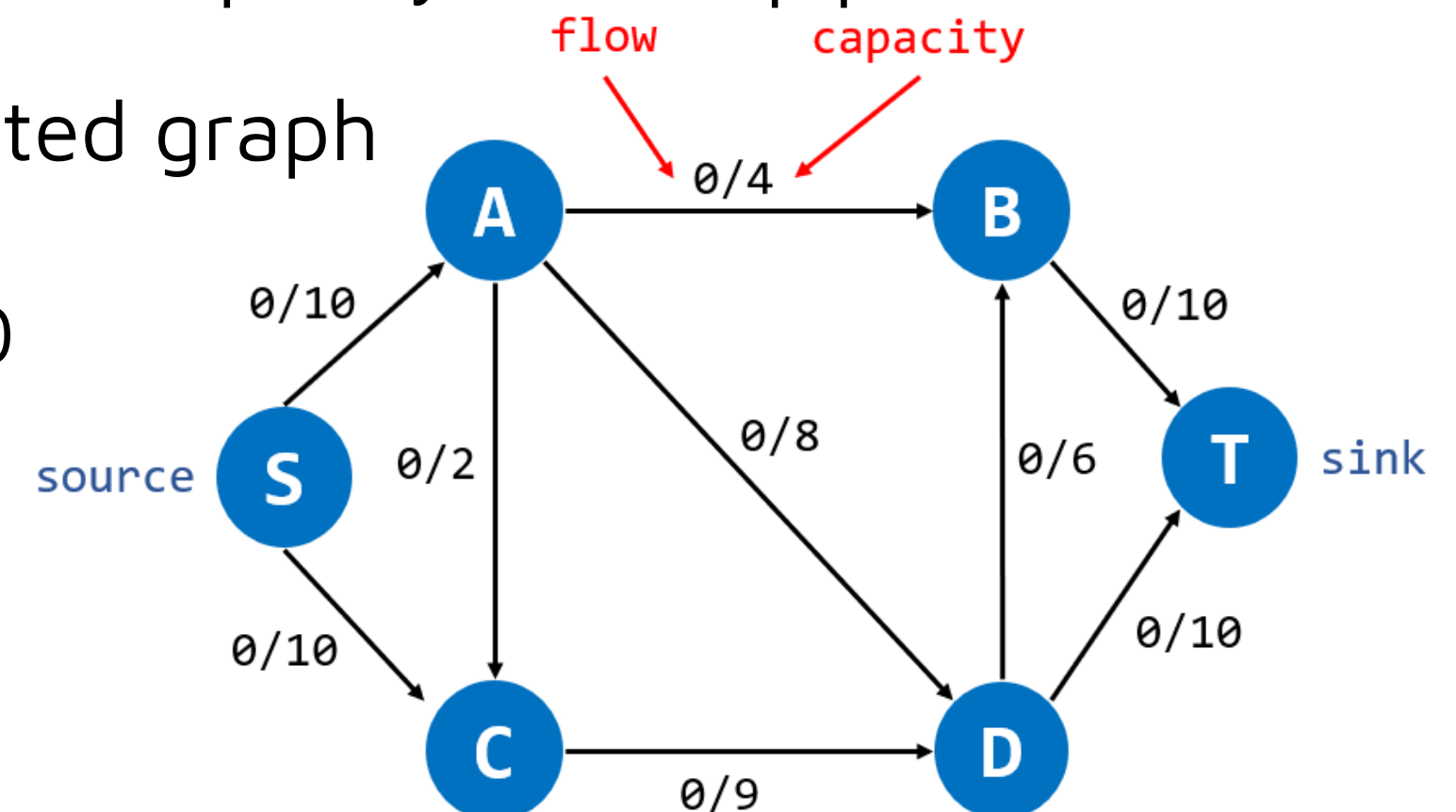
Given a pipe network with a source, a sink and capacities of each pipe. Find the maximum amount of water can be sent from source to sink so that:

- total water flowing from source = total water flowing to sink
- total water flowing to  $v$  = total water flowing from  $v$  ( $v$  is not source or sink)
- water flowing through a pipe  $\leq$  capacity of that pipe

Input: a positive-weighted directed graph

Output: max flow value (mfv)

Constraint:  $\text{mfv} \leq 500$ ,  $|V| \leq 500$



# Part 2: GRAPH'S ALGORITHMS

## Ford - Fulkerson's Algorithm Problem Analysis

Problem  
Statement

Algorithm

Greedy Approach

### Brute force approach

Let  $C$  be the combination of all possible flow value for each edges.

- The number of combinations is the product of all capacities.

To check if  $C$  is valid  $\Rightarrow O(|V| + |E|)$ .

→ The total complexity:  **$O((|V| + |E|) * \text{product of capacities})$**

### Backtracking approach

- We may not be able to check for validity after each insertion

# Part 2: GRAPH'S ALGORITHMS

## Ford - Fulkerson's Algorithm

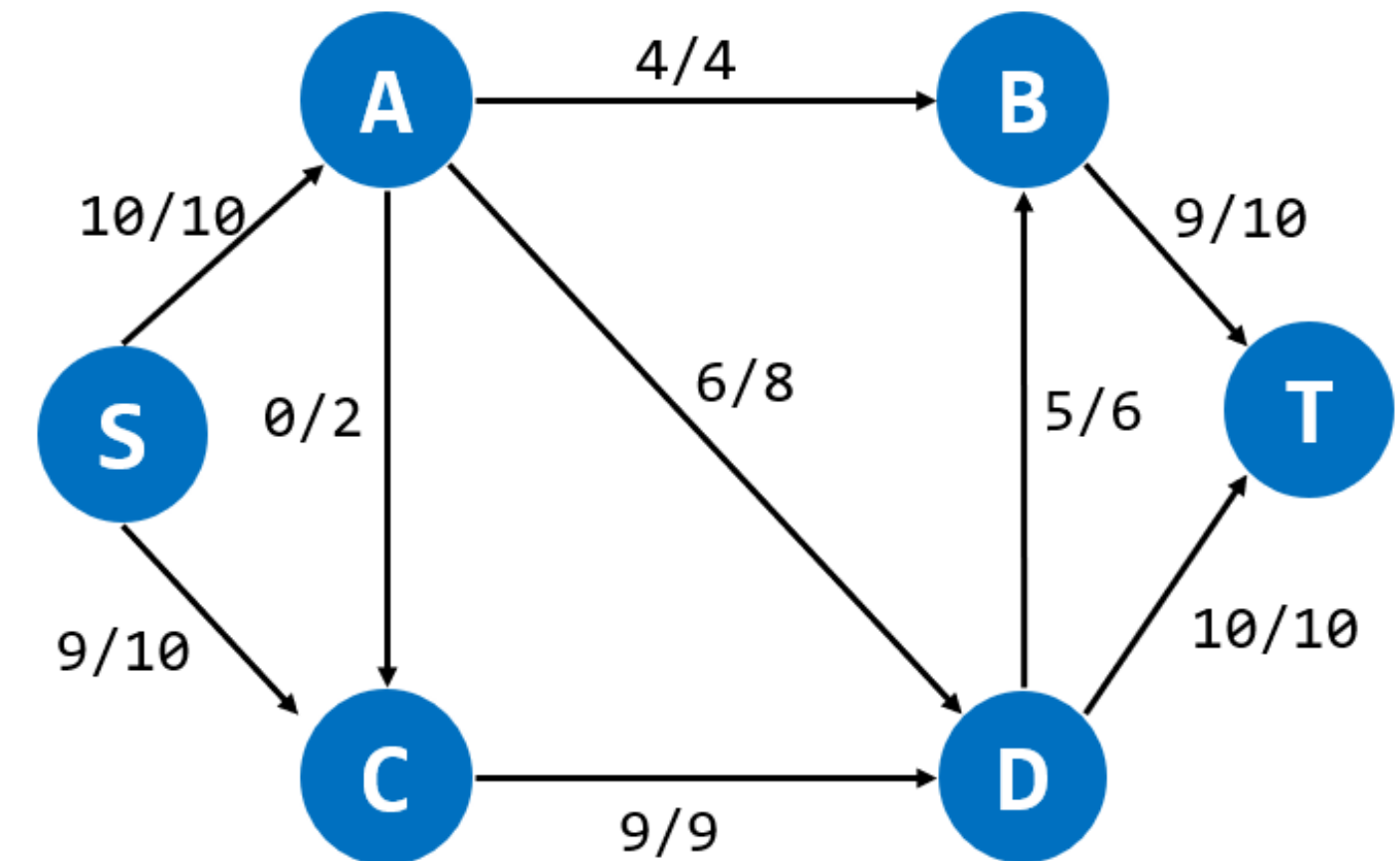
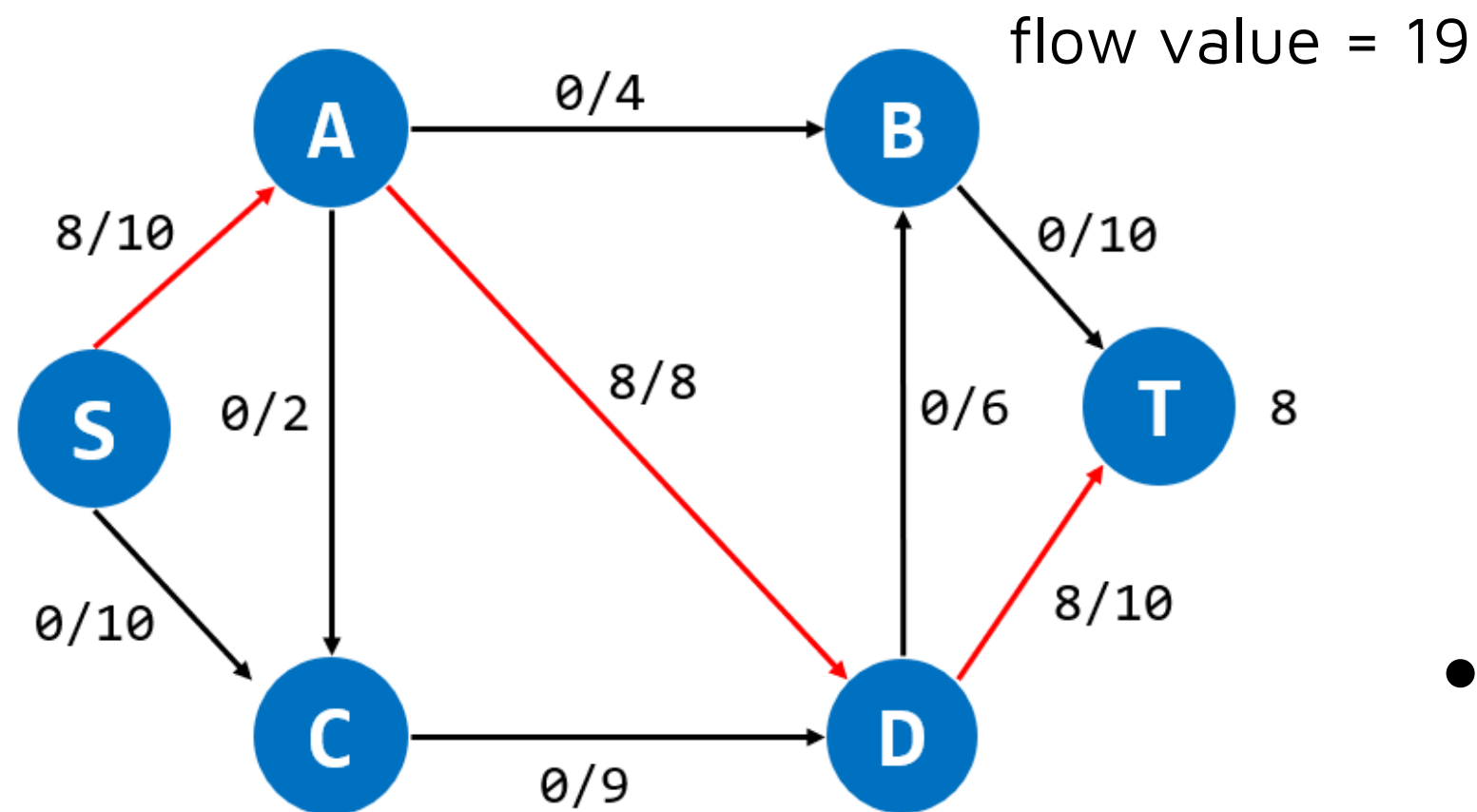
## Greedy Approach

### Problem Statement

### Algorithm

### Problem Analysis

- We can continually add water into the network until we cannot do so anymore.



- It is proved that at that point, a maximum flow is found.

→ At each iteration, we just need to find a way from source to sink and add the amount of water equal to the bottleneck. However, there is a problem...



## Part 2: GRAPH'S ALGORITHMS

### Ford - Fulkerson's Algorithm

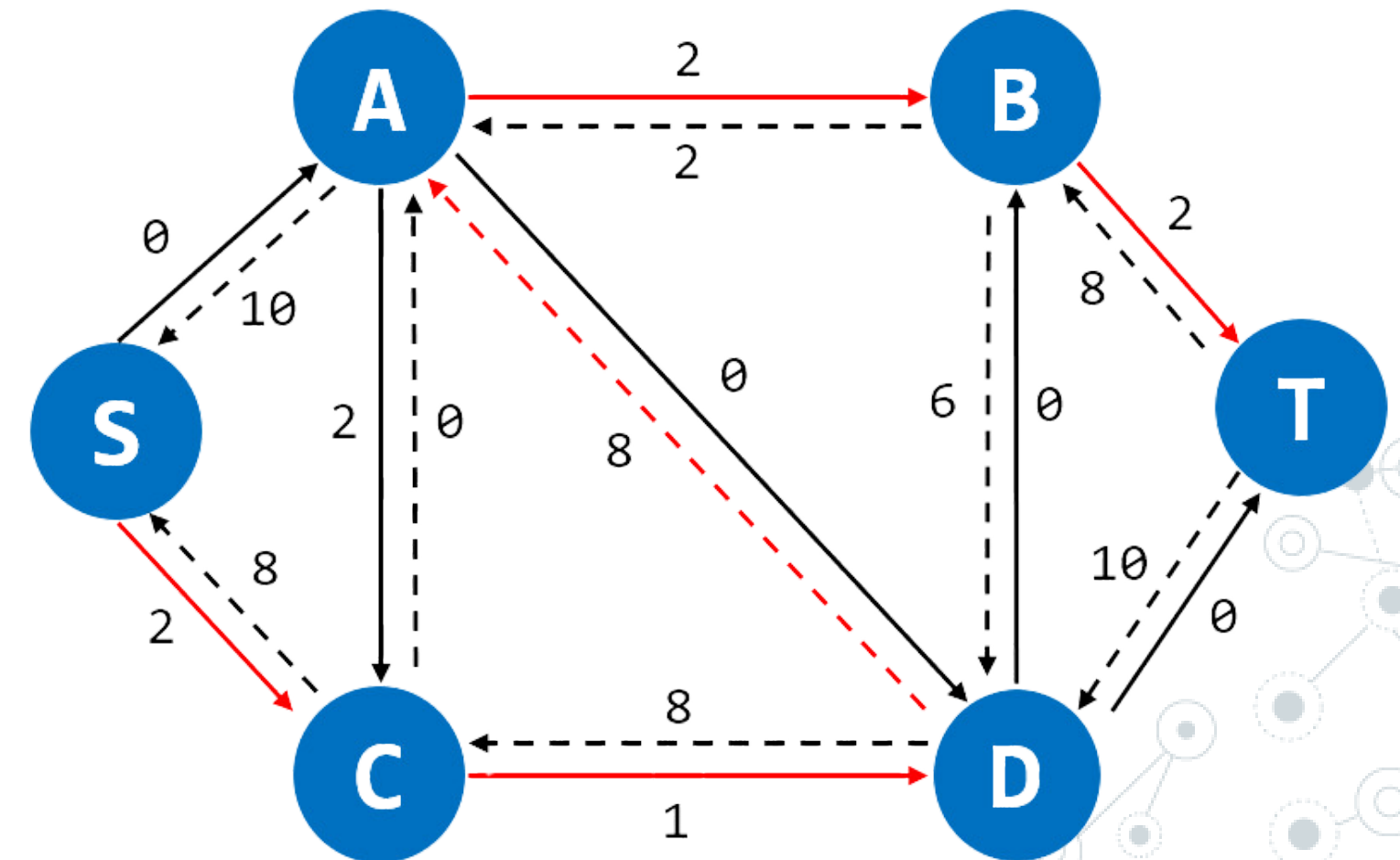
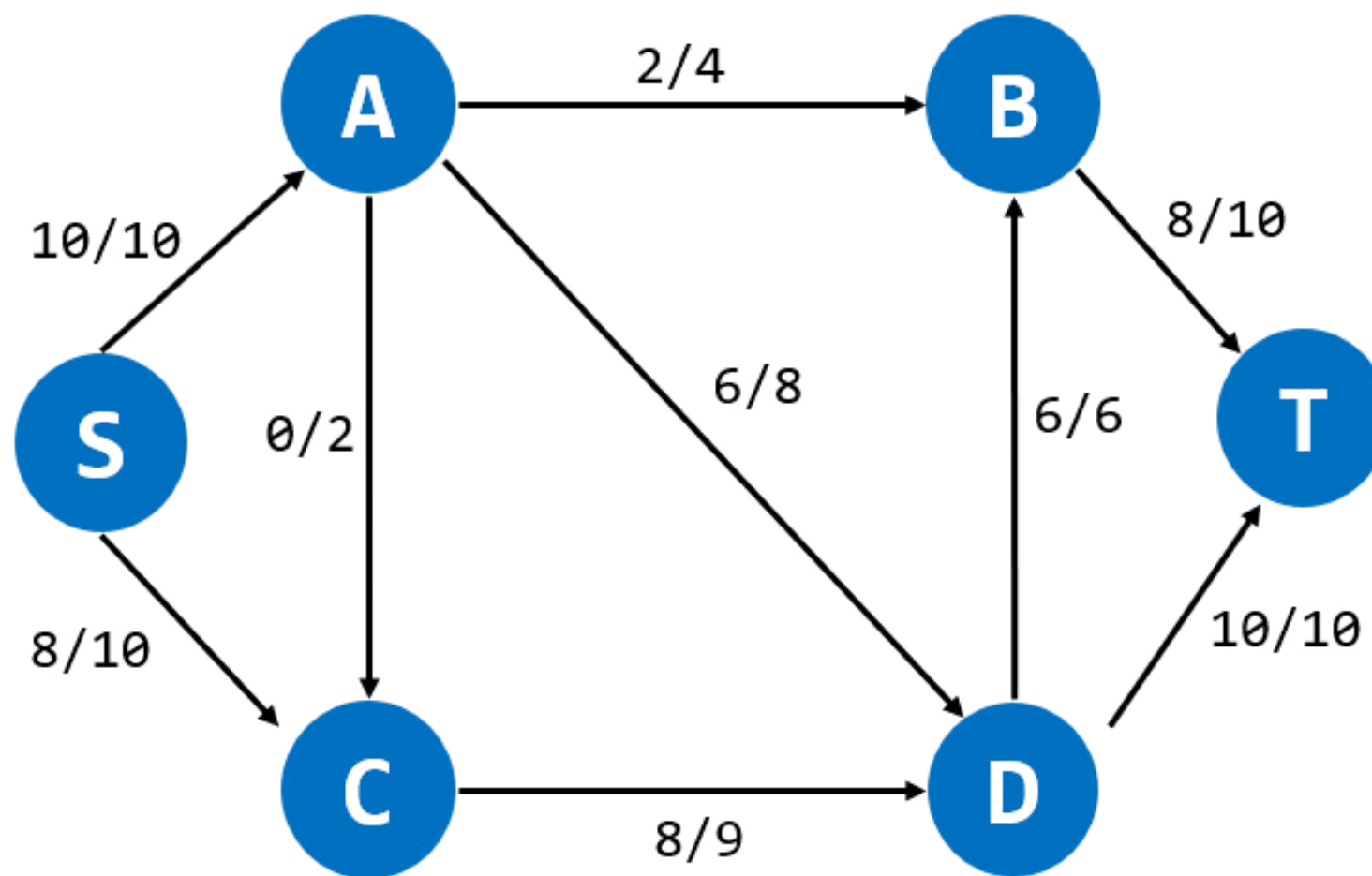
### Greedy Approach

Problem  
Statement

Algorithm

Problem Analysis

The current flow has “blocked” any water to be sent. How can we adjust it?



By introducing reverse edges (which tell us the number of substances currently in the original edges), we can let some water to flow into another pipe.



## Part 2: GRAPH'S ALGORITHMS

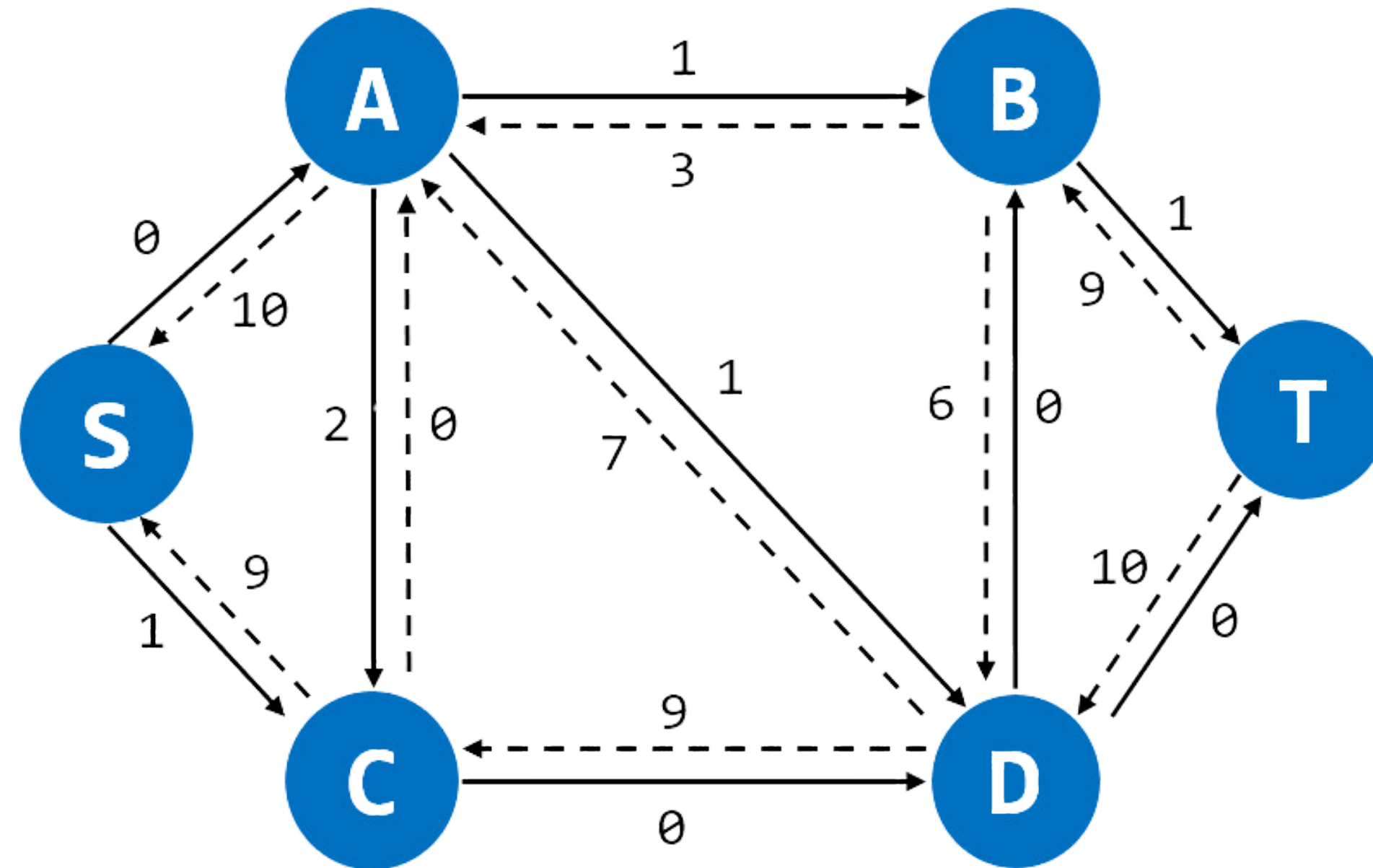
### Ford - Fulkerson's Algorithm

### Greedy Approach

Problem  
Statement

Algorithm

Problem Analysis



In the worst case: we have to traverse the whole network and can only add 1 more unit of water to the flow.

→ Time complexity:  **$O(mfv * (|V| + |E|))$**

# Part 2: GRAPH'S ALGORITHMS

## Ford - Fulkerson's Algorithm Greedy Approach

Problem  
Statement

Algorithm

• Problem Analysis

```
for each edge (u, v) of the graph:
    add edge (v, u) of capacity 0 to the graph
function ford_fulkerson():
    flow_value <- 0
    visited <- a list of size |V| with all 0
    parent <- a list of size |V| with all -1
    bottleneck <- infinity
    while find_aug_path(source): # find a way from source to sink
        s <- sink
        while s != source:
            graph[parent[s]][s] <- graph[parent[s]][s] - bottleneck
            graph[s][parent[s]] <- graph[s][parent[s]] + bottleneck
            s <- parent[s]
        flow_value += bottleneck
        visited <- a list of size |V| with all 0
        parent <- a list of size |V| with all -1
    return max_flow
```

Pseudocode:





**THANK YOU FOR LISTENING!**

