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# CS483 Analysis of Algorithms

## Lecture 04 – Graph \*

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\*this lecture note is based on *Algorithms* by S. Dasgupta, C.H. Papadimitriou, and U.V. Vazirani and *Introduction to the Design and Analysis of Algorithms* by Anany Levitin.

▷ Introduction

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What can be represented as graph?

What are the problems that can be solved using graphs?

Graph Representation

Explore graphs

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Topological sort

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Strong connected components

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# Introduction

# What can be represented as graph?

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## Introduction

What can be represented as graph?

What are the problems that can be solved using graphs?

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Internet

# What are the problems that can be solved using graphs?

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What are the problems that can be solved using graphs?

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Network routing

# Graph Representation

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What can be represented as graph?

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Adjacency matrix

– Space

Adjacency list

– Space

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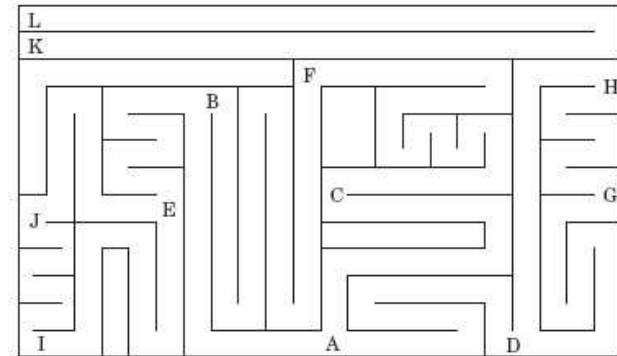
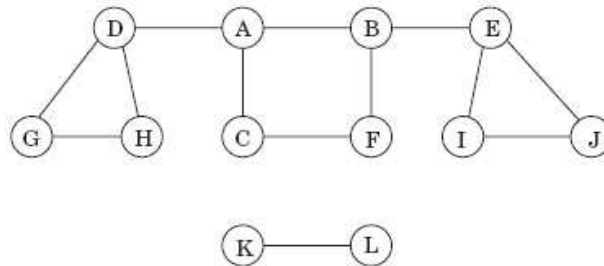
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- What parts of the graph are reachable from a given vertex? (i.e., connected components)
- Many problems require processing all graph vertices (and edges) in systematic fashion
- Basic tools to safely explore an unknown environment
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# Graph Search

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- Basic exploration algorithm

**Algorithm 0.1:** EXPLORE( $G = \{V, E\}, v \in V$ )

- Can the algorithm always work?

– *proof*



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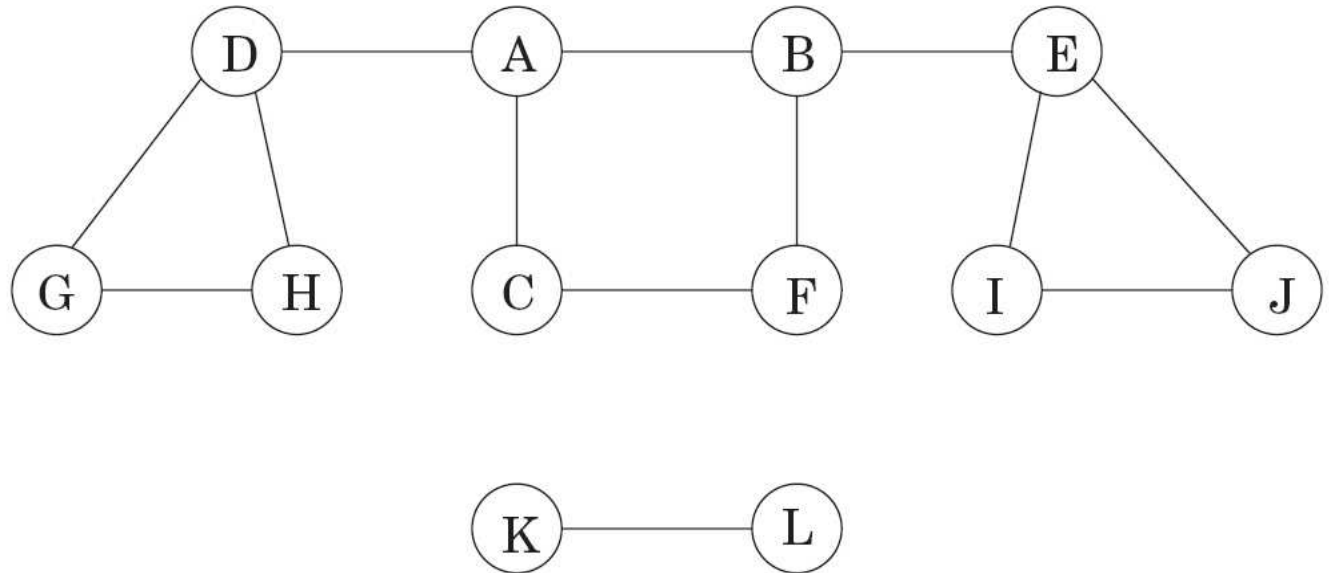
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□ Example: EXPLORE(B)



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## □ DFS

**Algorithm 0.2:**  $\text{DFS}(G = \{V, E\}, v \in V)$

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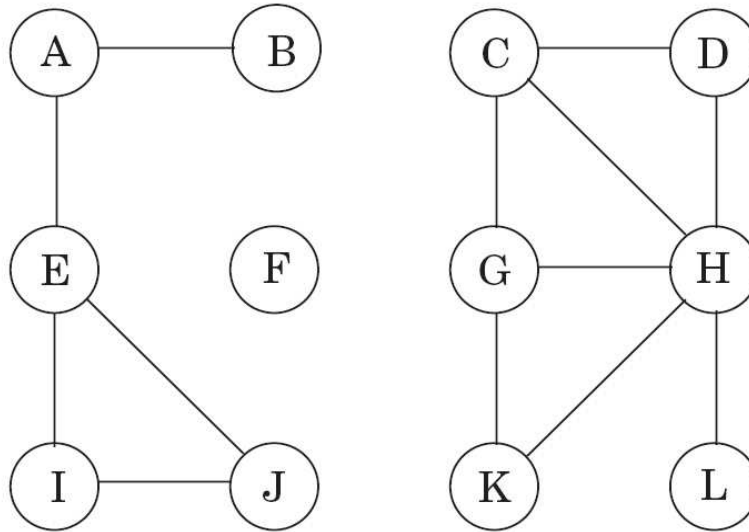
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□ Example:



□ Time complexity:

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□ Connect component

– Given a graph  $G$ , report the number of connect components in  $G$ .

– Given a graph  $G$ , can you preprocess  $G$  so that you can check if two nodes  $u$  and  $v$  from  $G$  are from the same connect component?

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- Ancestor/Descendant relationship of tree
  - Given a tree  $T$ , can you preprocess  $T$  so that you can answer if  $u$  is the ancestor of  $v$  in *constant time*, where  $u$  and  $v$  are two nodes from  $T$ .

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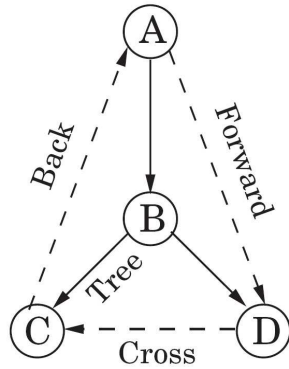
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- Given a *directed* graph  $G$ , convert  $G$  to a tree whose nodes and edge are the vertices and edges of  $G$

# DFS Application

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- Types of edges  
DFS tree



- To identify the type of an edge: pre/post ordering

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DAG and Topological Sort

Topological Sort: Using  
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Topological Sort: Using  
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# Topological sort



# Directed acyclic graphs

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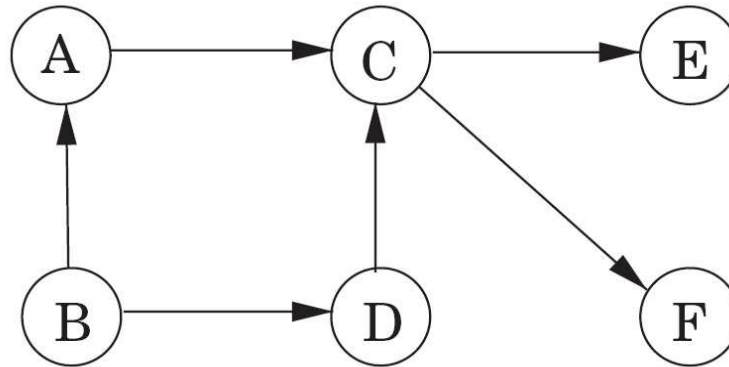
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- A graph  $G$  without (directed) cycle is a *directed acyclic graphs* (DAG)
- DAG can be found in modeling many problems that involve prerequisite constraints (construction projects, document version



control)

- Given a *directed* graph  $G$ , identify *cycles* in  $G$

– *proof*

# DAG and Topological Sort

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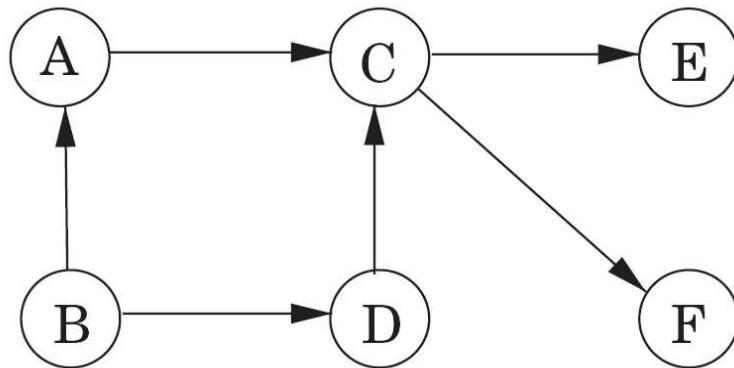
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- **Topological sorting or Linearization:** Vertices of a DAG can be linearly ordered so that:
  - Every edge its starting vertex is listed before its ending vertex
  - Being a DAG is also a necessary condition for topological sorting be possible
- **Example:**



# Topological Sort: Using DSF

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- Compute DSF and reverse the visit order

**Algorithm 0.3:**  $TS(G = \{V, E\})$

- Why does it work?
- Time complexity?

# Topological Sort: Using Source Removal

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- Identify and remove sources iteratively.
  - A source is a vertex without incoming edges.

**Algorithm 0.4:**  $TS(G = \{V, E\})$

- Why does it work?
- Time complexity?

# Example

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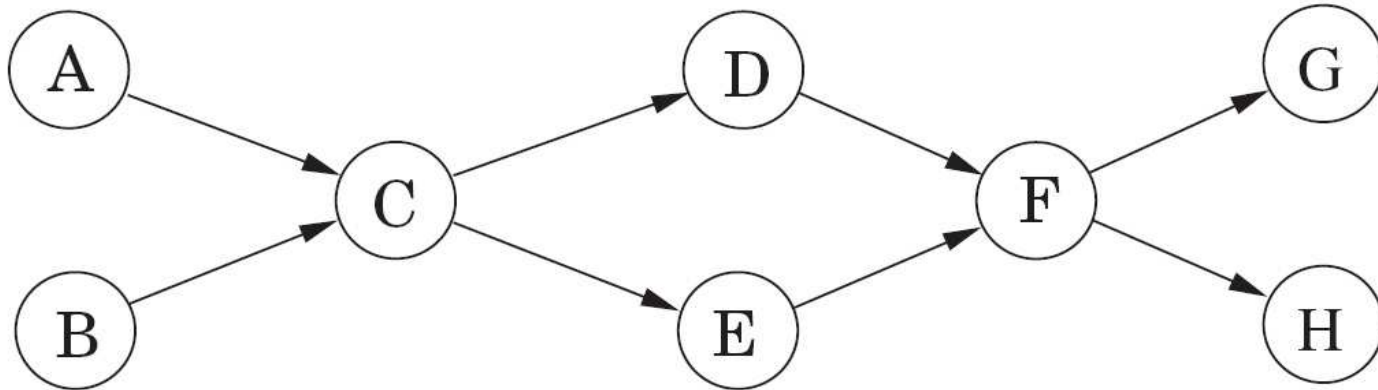
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# Strong connected components

# Strongly connected components

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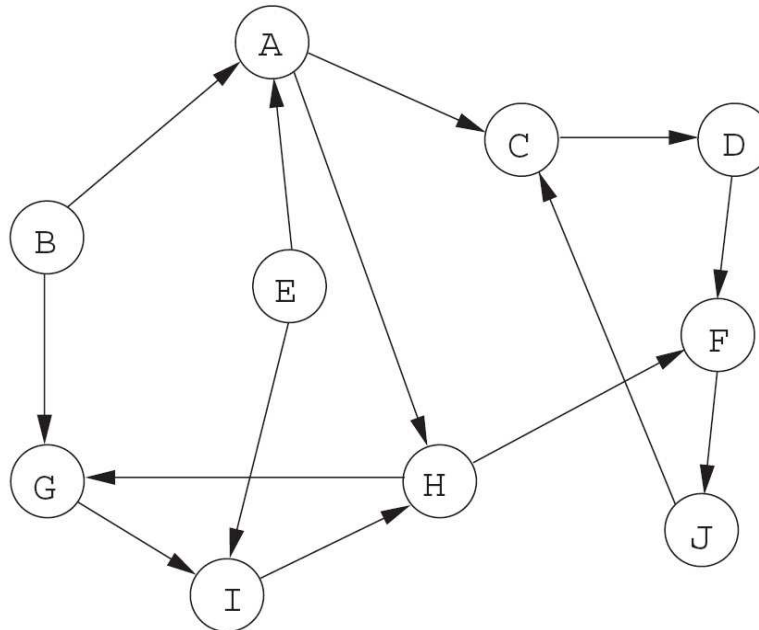
Strongly connected components and DAG

Strongly connected components and DAG

Strongly connected components and DAG

Conclusion

- **Definition:** Two nodes  $u$  and  $v$  are from the connected if and only if there is a path from  $u$  to  $v$  and a path from  $v$  to  $u$ .
- **Definition:** A set of vertices form a strongly connected component (SCC) iff any pairs of vertices are connected.



# Strongly connected components

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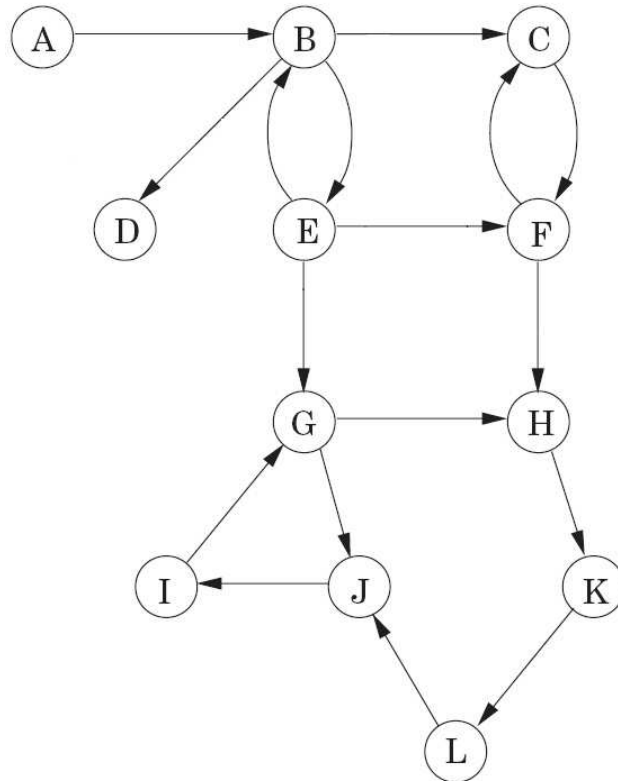
Strongly connected components and DAG

Strongly connected components and DAG

Strongly connected components and DAG

Conclusion

- Connected components in directed graph is less intuitive than that of undirected graph.
  - How many connected components are there in the graph below?



- How to compute SCCs from a directed graph?



# Strongly connected components and DAG

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- Observation 1:**
- Observation 2:**

- Our strategy to find all SCC:**

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Conclusion

- Task:** Find a vertex  $u$  in DAG sink node
- Fact:** It is easier to find a source node.

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▷ *proof:*

- How to find a vertex  $u$  in DAG sink node?

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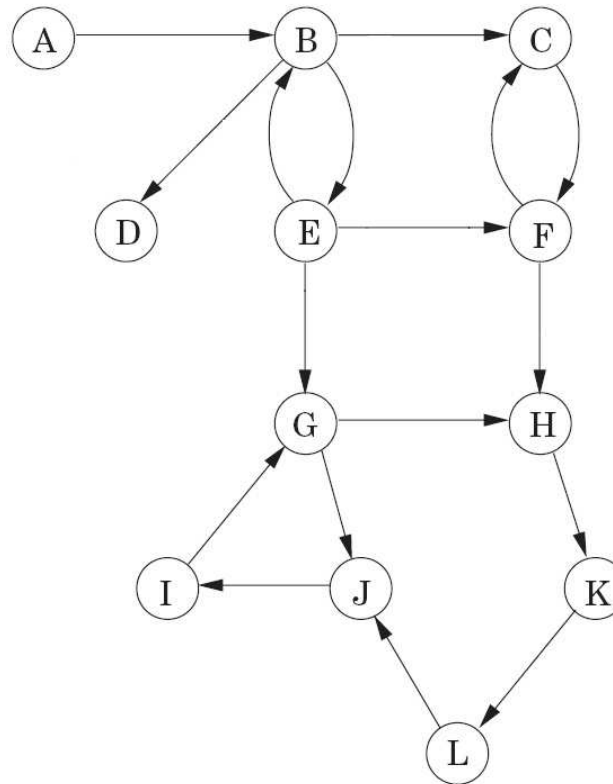
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- **Task:** Remove all nodes from the previous SCC and identify a new sink node

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- **Example:**



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Summary

More graph algorithms

# Conclusion

# Summary

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▷ Summary

More graph algorithms

- Graphs can be very useful for many problems.
- DFS can be used for
  - Explore the graph
  - Reveal relationship between the graph nodes and types of edges
  - Linearization for DAG
  - Identify cycles, connected components, strongly connected components
- Assignment
  -

# More graph algorithms

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Summary

▷ More graph algorithms

- Next week we will discuss problems related to paths in graph
  - shortest path in undirected and directed graphs
  - shortest path in weighted graphs
  - shortest path in graphs with negative edges
  - shortest path in DAG