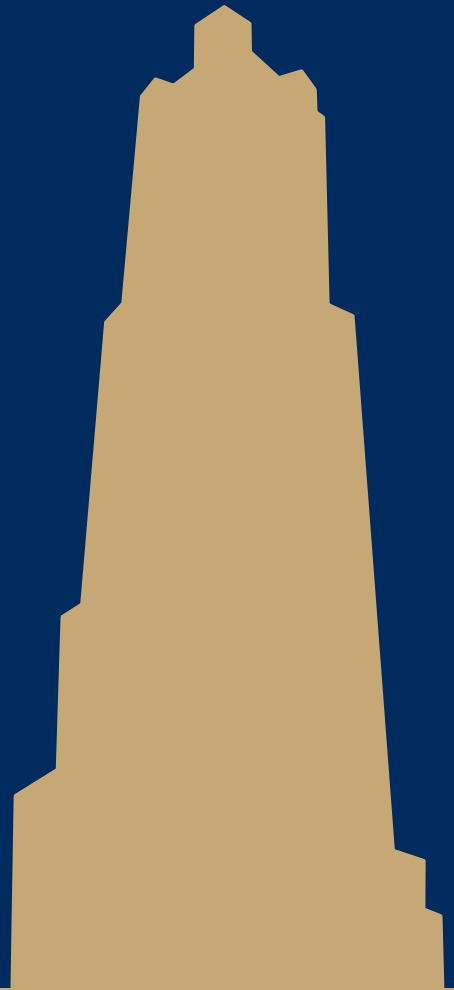
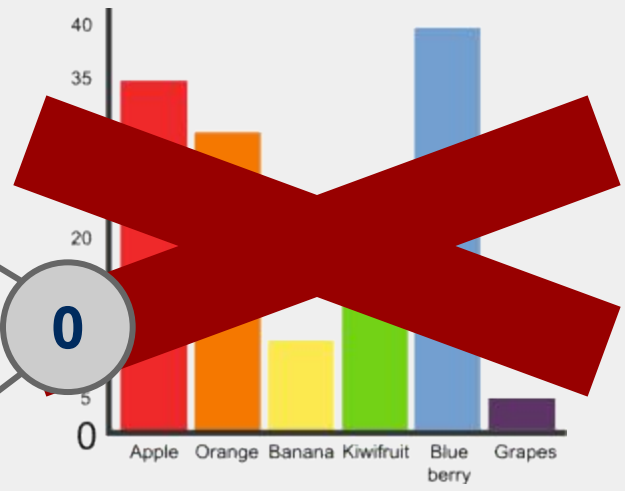
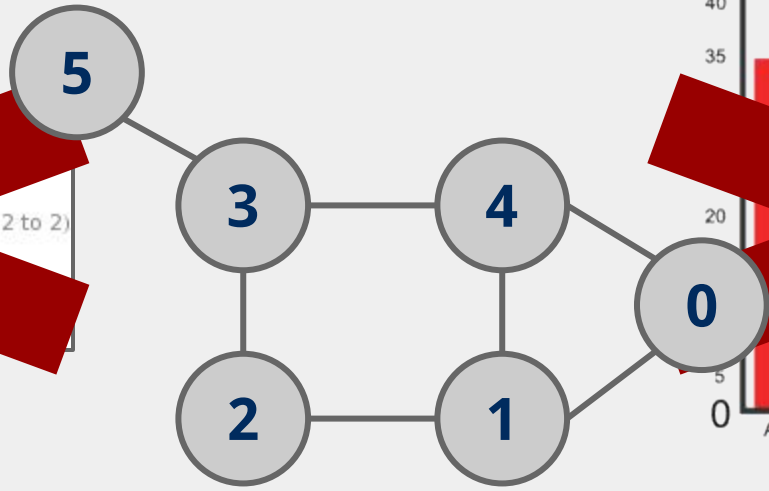
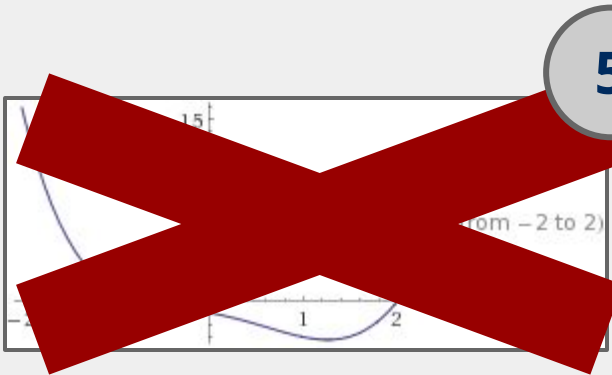


# CS/COE 1501

[www.cs.pitt.edu/~lipschultz/cs1501/](http://www.cs.pitt.edu/~lipschultz/cs1501/)

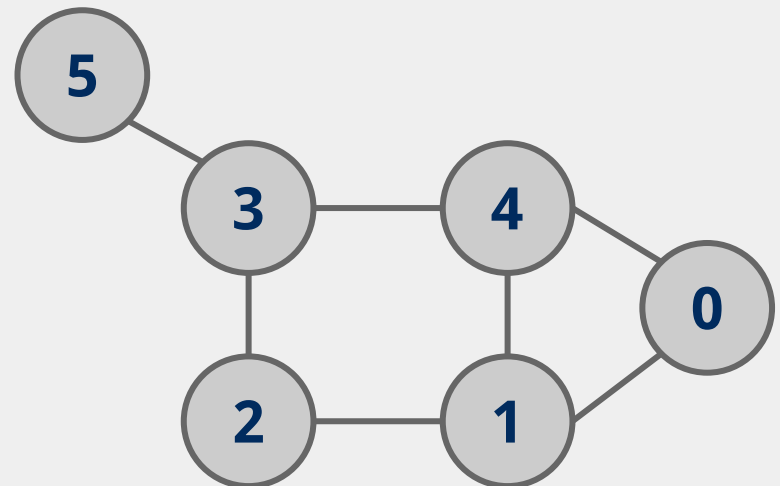
## Graphs





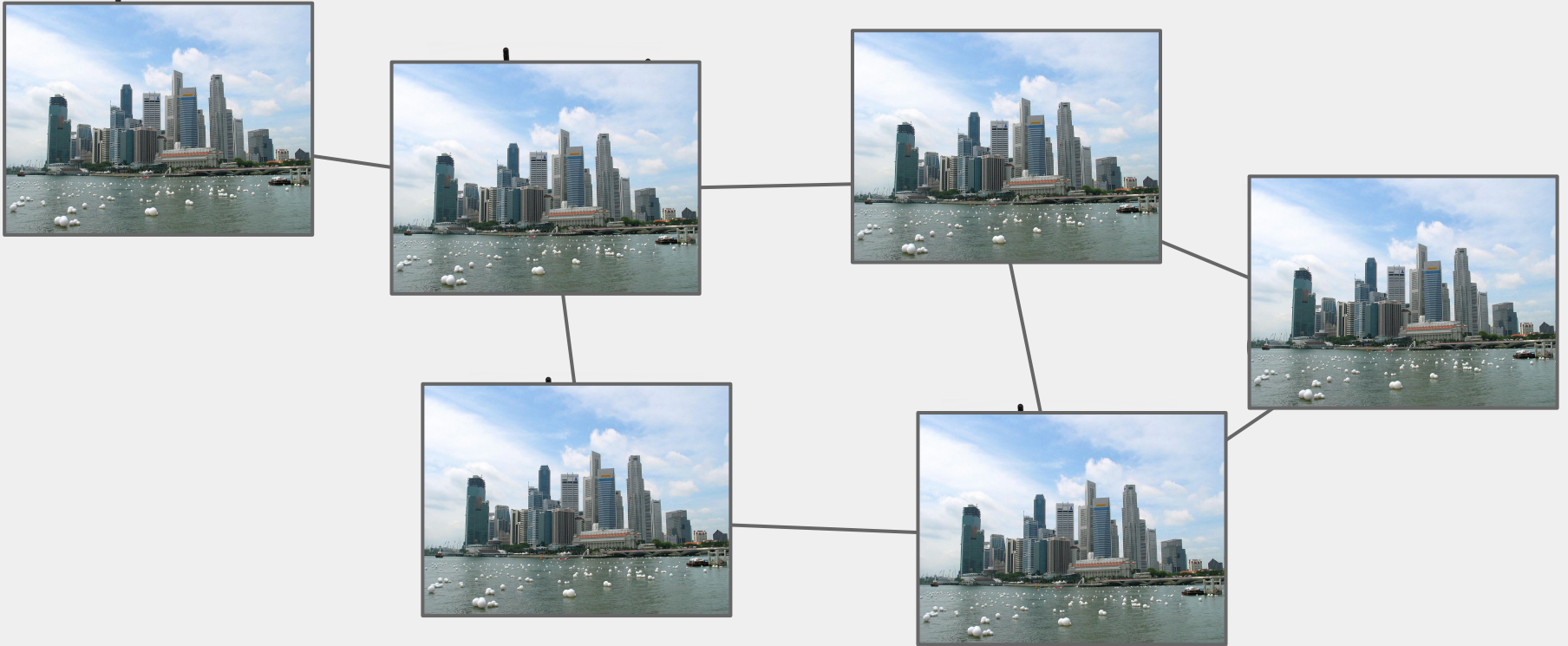
# Graphs

- A graph  $G = (V, E)$ 
  - Where  $V$  is a set of vertices
  - $E$  is a set of edges connecting vertex pairs
- Example:
  - $V = \{0, 1, 2, 3, 4, 5\}$
  - $E = \{(0, 1), (0, 4), (1, 2), (1, 4), (2, 3), (3, 4), (3, 5)\}$



# Why?

- Can be used to model many different scenarios



# Some definitions

- Undirected graph
  - Edges are unordered pairs:  $(A, B) == (B, A)$
- Directed graph
  - Edges are ordered pairs:  $(A, B) != (B, A)$
- Adjacent vertices, also called “neighbors”
  - Vertices connected by an edge

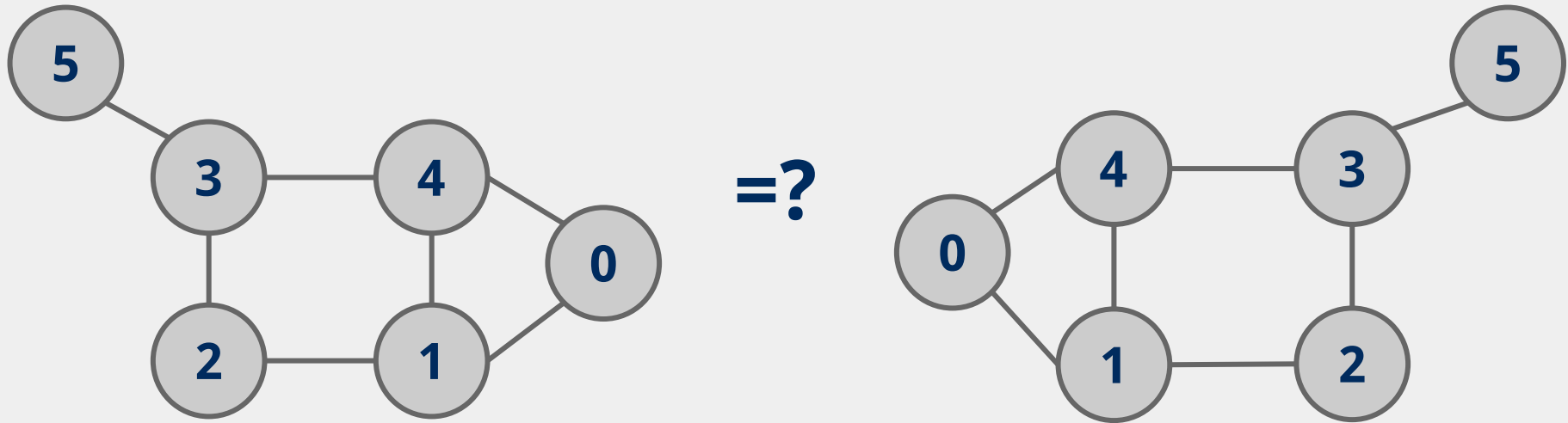
# Graph sizes

- Let  $v = |V|$ , and  $e = |E|$
- Given  $v$ , what are the minimum/maximum sizes of  $e$ ?
  - Minimum value of  $e$ ?
    - Definition doesn't necessitate that there are any edges...
    - So, 0
  - Maximum of  $e$ ?
    - Are self edges allowed?
    - Directed graph? (We'll assume self edges)
      - $v$  vertices each with edges to  $v$  vertices
      - $v^2$
    - Undirected graph? (We'll assume NO self edges)
      - $v$  vertices with edges to  $v-1$  vertices
        - BUT remember for undirected,  $(1, 2) == (2, 1)$
      - $v(v - 1) / 2$ 
        - $(v^2 - v) / 2$

# More definitions

- A graph is considered *sparse* if:
  - $e \leq v \lg v$
- A graph is considered *dense* as it approaches the maximum number of edges
  - $e = v^2 - \epsilon$  for directed
  - $e = ((v^2 - v) / 2) - \epsilon$  for undirected
- A *complete* graph has the maximum number of edges

# Representing graphs



- Typically, yes. Different spatial representations of the same vertices/edges are considered the same graph.
- Trivially, graphs can be represented as:
  - List of vertices
  - List of edges
  - What operations would we want to perform on these lists?



# Using an adjacency matrix

- Rows/columns are vertex labels
  - $M[i][j] = 1$  if  $(i, j) \in E$
  - $M[i][j] = 0$  if  $(i, j) \notin E$

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

# Adjacency matrix analysis

- Pros?
  - Easy to use/intuitive
  - Runtime for checking edge existence?
- Cons?
  - Memory
  - Time to initialize
  - Time to find neighbors of a vertex

# Adjacency lists

- Array of neighbor lists
  - $A[i]$  contains neighbors of vertex  $i$
- See example
- Pros?
  - Memory
  - Time to find the neighbors of a node
- Cons?
  - Memory
  - Time to check edge existence

# In general...

- Adjacency matrix is better for dense graphs
- Adjacency list is better for sparse graphs

# Even more definitions

- Path
  - A sequence of adjacent vertices
- Simple Path
  - A path in which no vertices are repeated
- Simple Cycle
  - A simple path with the same first and last vertex
- Connected Graph
  - A graph in which a path exists between all vertex pairs
- Connected Component
  - Connected subgraph of a graph
- Acyclic Graph
  - A graph with no cycles
- Tree
  - ?
  - A connected, acyclic graph
    - Has exactly  $v-1$  edges

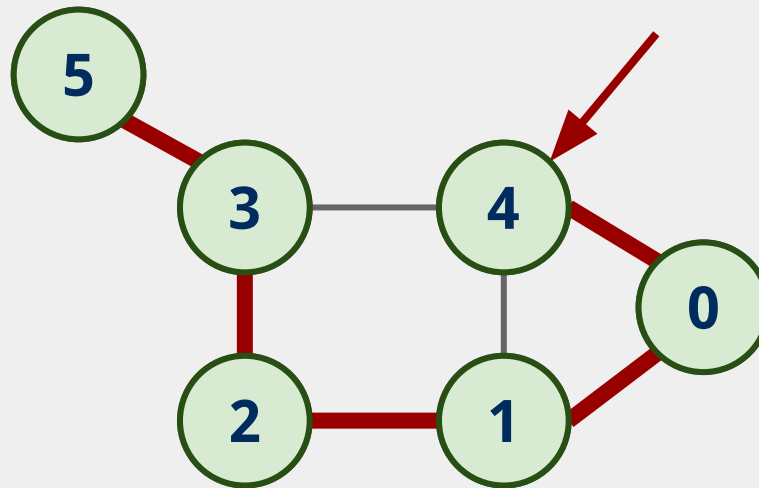
# Graph traversal

- What is the best order to traverse a graph?
- Two primary approaches:
  - Depth-first search (DFS)
    - “Dive” as deep as possible into the graph first
    - Branch when necessary
  - Breadth-first search (BFS)
    - Search all directions evenly
      - I.e., from  $i$ , visit all of  $i$ 's neighbors, then all of their neighbors, etc.

# DFS

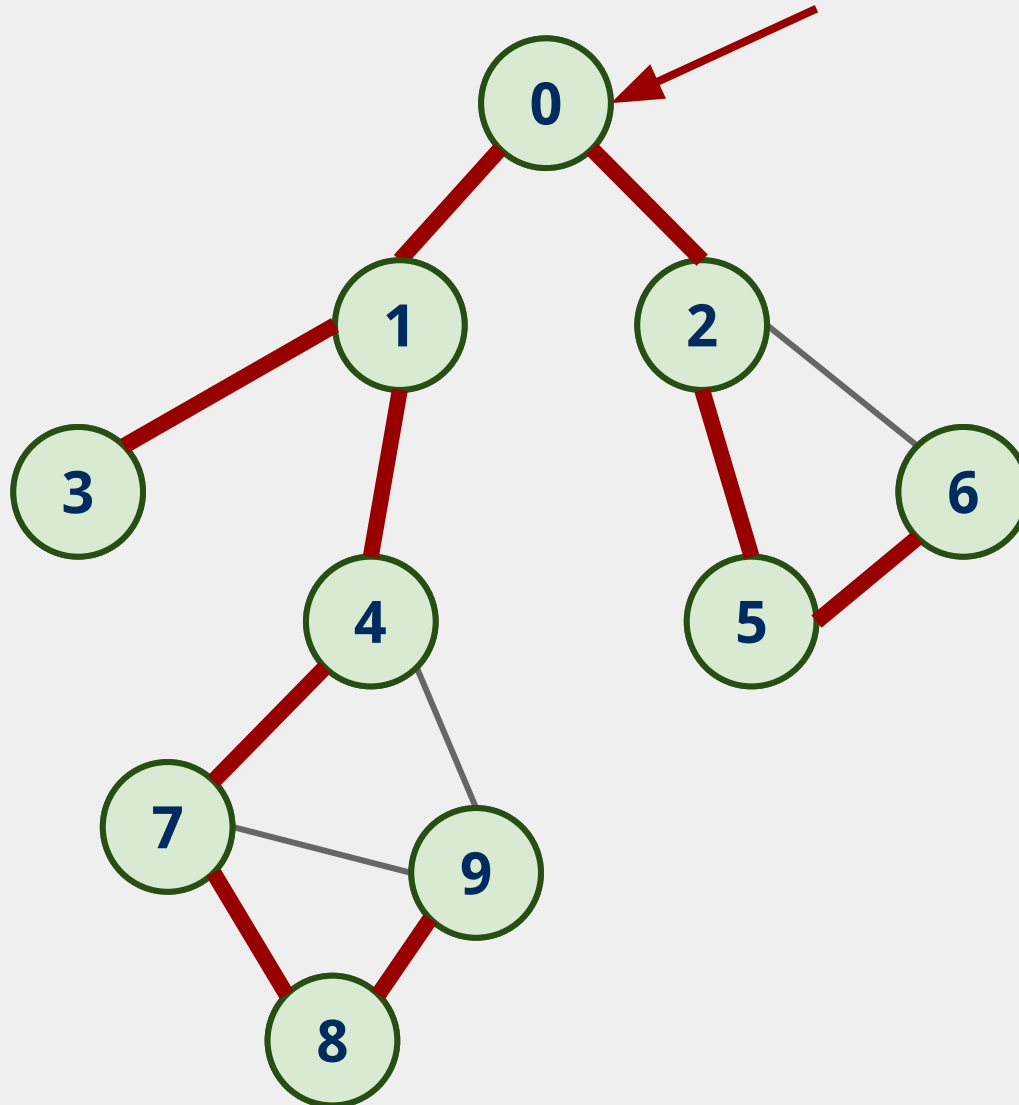
- Already seen and used this throughout the term
  - For tries...
  - For Huffman encoding...
- Can be easily implemented recursively
  - For each node, visit first unseen neighbor
  - Backtrack at dead ends (i.e., nodes with no unseen neighbors)
    - Try next unseen neighbor after backtracking

# DFS example





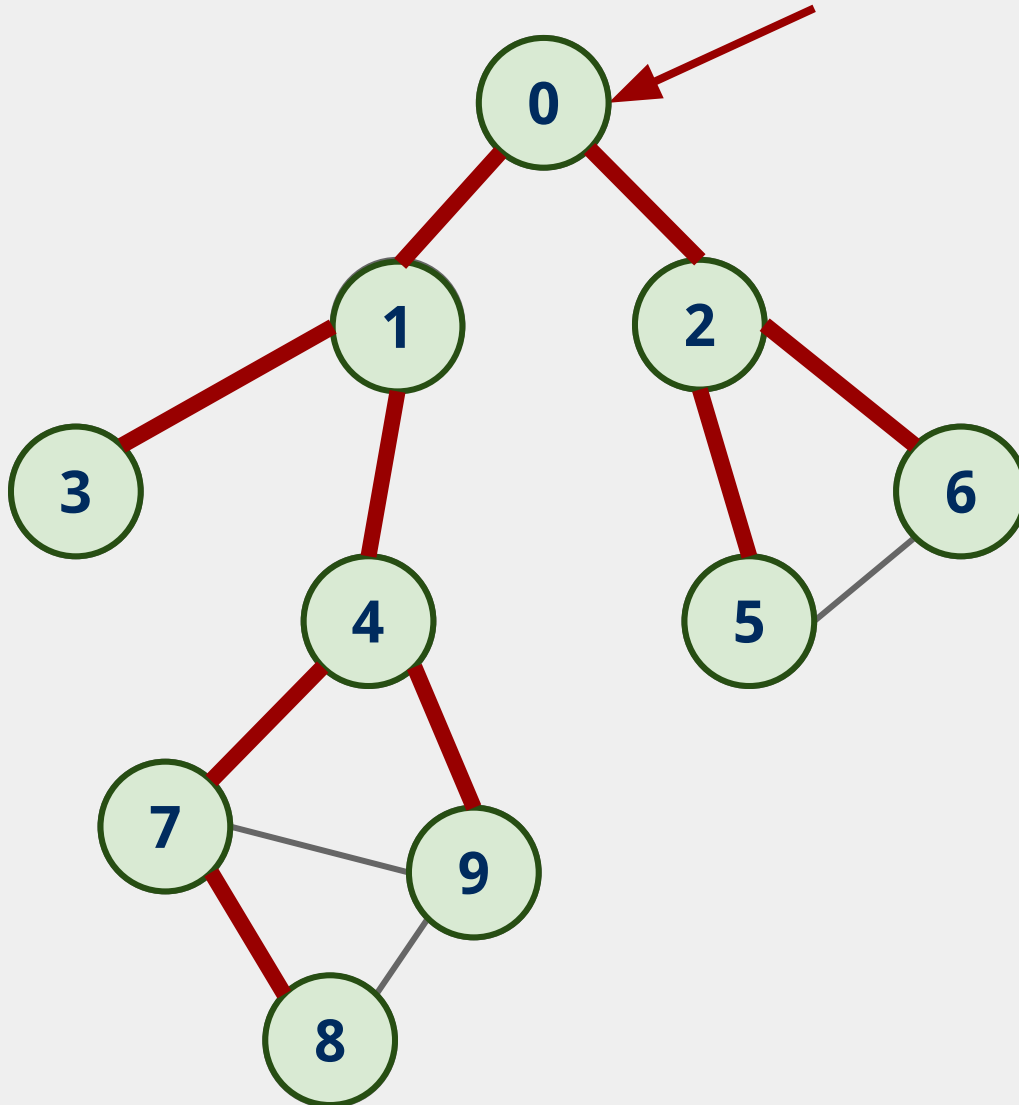
# DFS example 2



# BFS

- Can be easily implemented using a queue
  - For each node visited, add all of its neighbors to the queue
    - Vertices that have been seen but not yet visited are said to be the *fringe*
  - Pop head of the queue to be the next visited vertex
- See example

# BFS example



# DFS and BFS would be called from a wrapper function

- If the graph is connected:
  - `dfs()/bfs()` is called only once and returns a *spanning tree*
- Else:
  - A loop in the wrapper function will have to continually call `dfs()/bfs()` while there are still unseen vertices
  - Each call will yield a spanning tree for a connected component of the graph

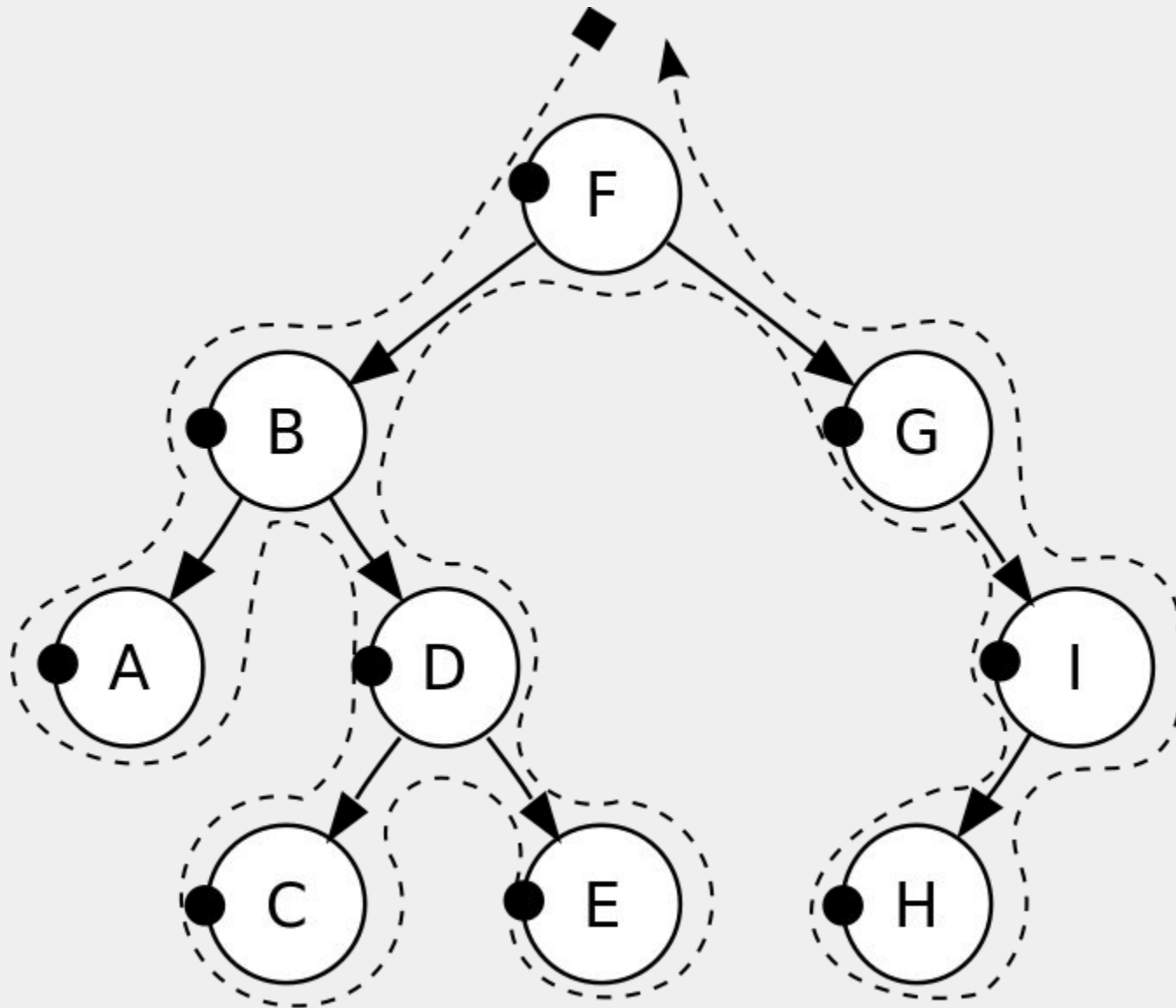
# Shortest paths

- BFS traversals can further be used to determine the *shortest path* between two vertices

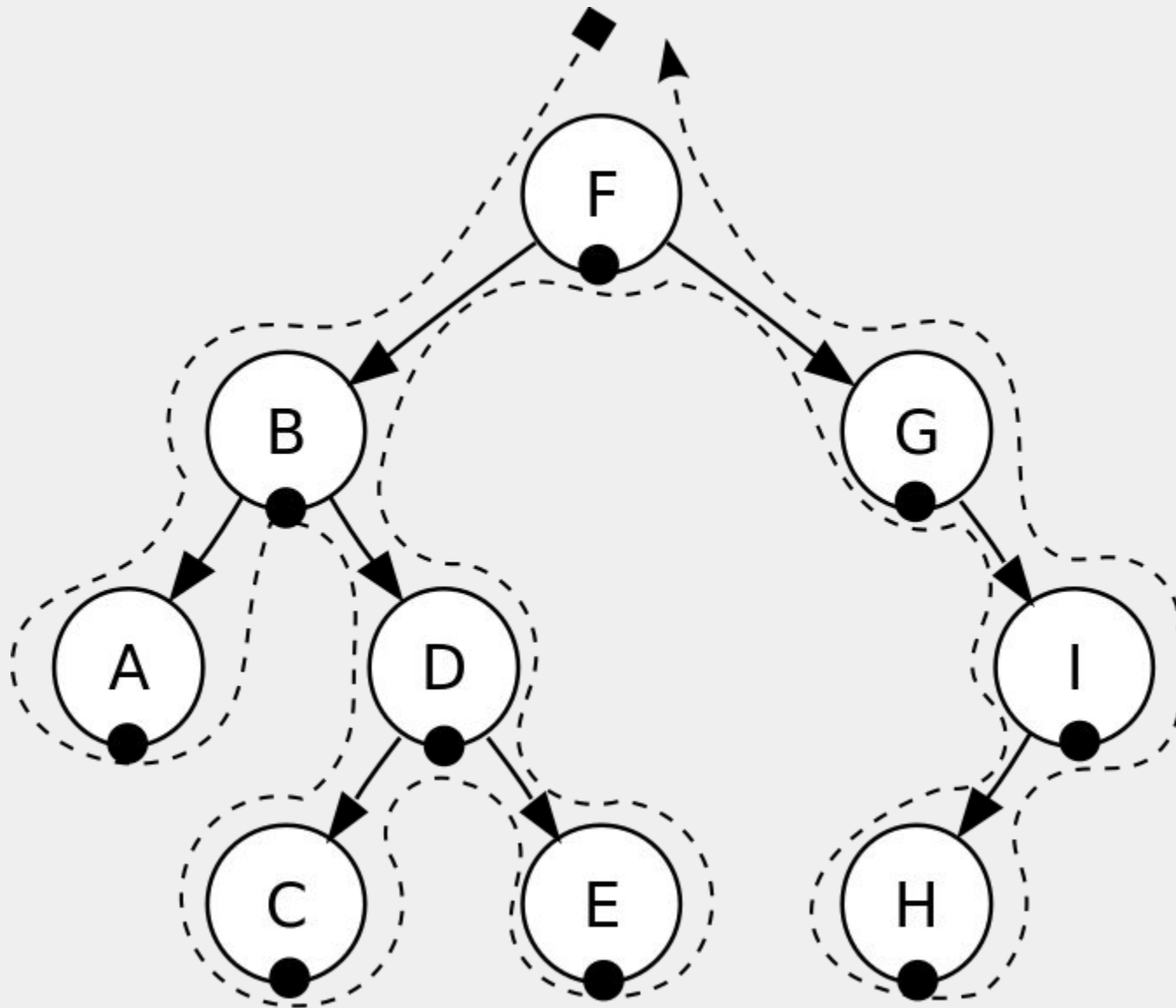
# Analysis of graph traversals

- At a high level, DFS and BFS have the same runtime
  - Each node must be seen and then visited, but the order will differ between the two approaches
- Adjacency matrix
  - $\Theta(v)$  to consider all neighbors
    - To traverse a row/column of the matrix
    - Doing this for each of  $v$  vertices leads to  $\Theta(v^2)$  runtime
- Adjacency list
  - Must consider the neighbor list of each node in the array
    - So, we must visit every node in the whole adjacency list
      - $\Theta(v + e)$ 
        - Why not just  $e$ ?

# DFS pre-order traversal

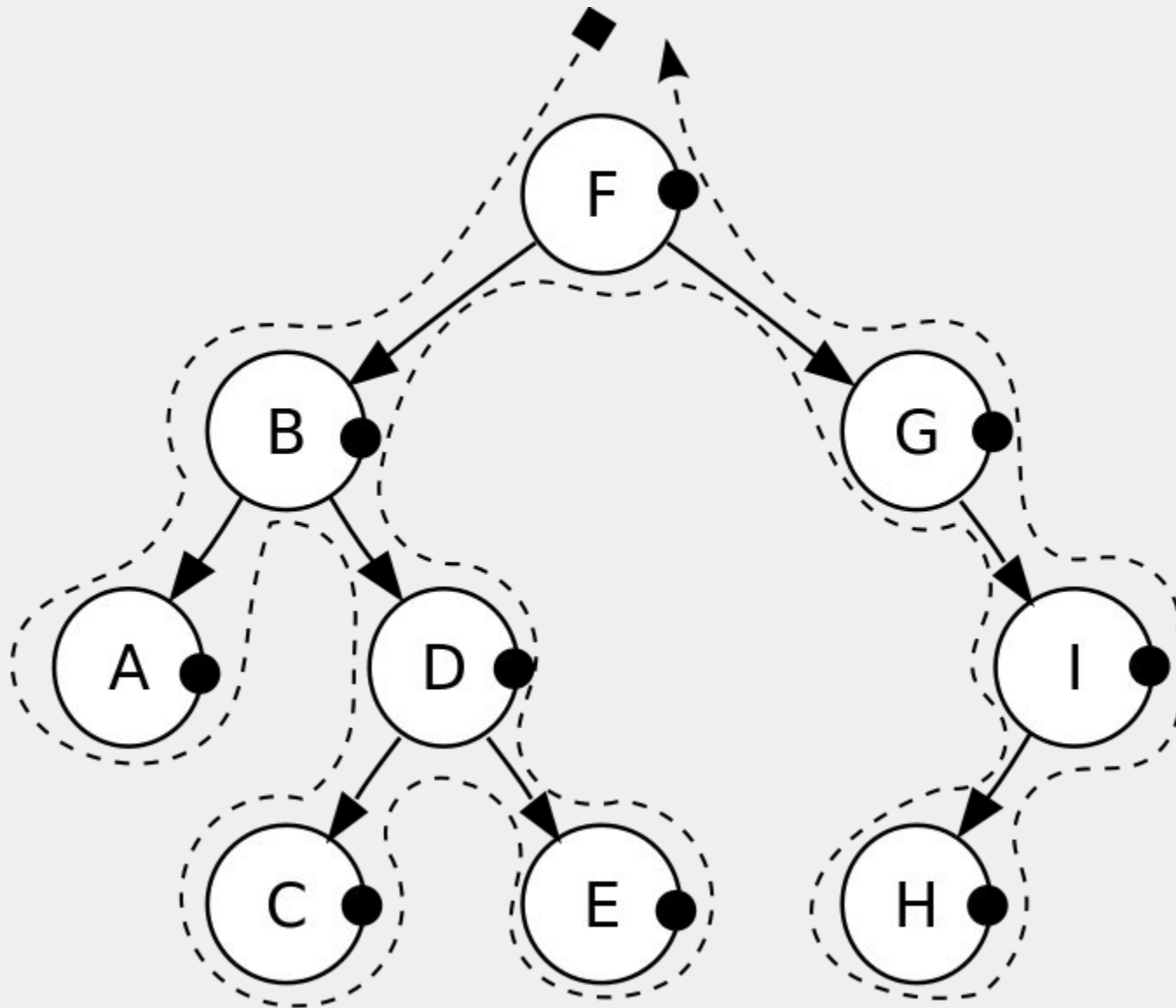


# DFS in-order traversal





# DFS post-order traversal



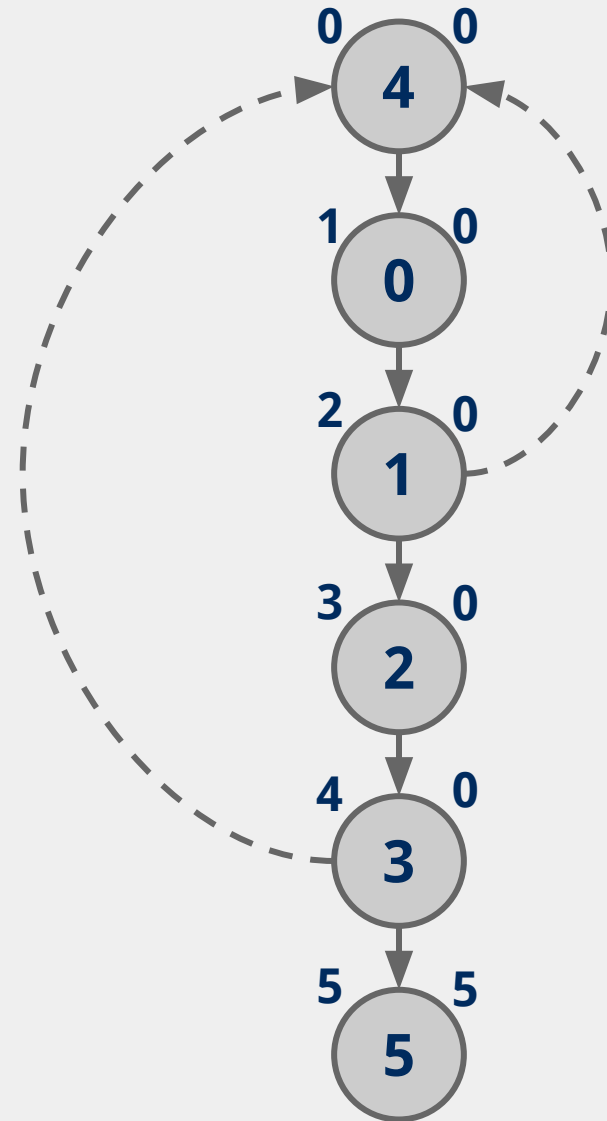
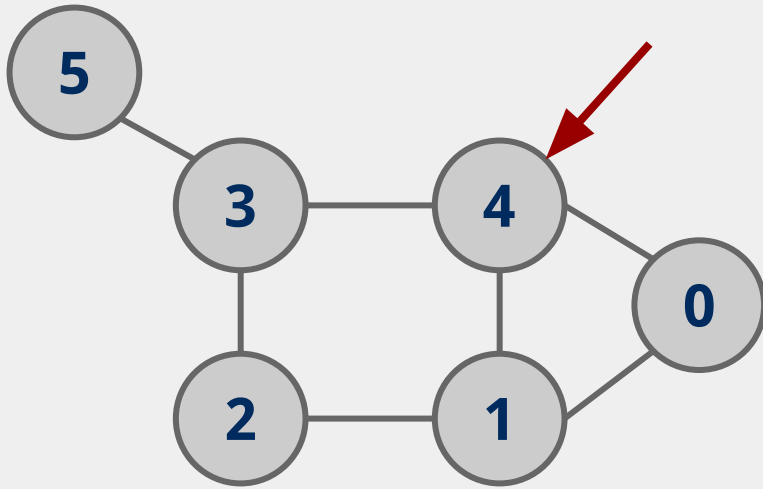
# Biconnected graphs

- A *biconnected graph* has at least 2 distinct paths (no common edges or vertices) between all vertex pairs
- Any graph that is not biconnected has one or more *articulation points*
  - Vertices, that, if removed, will separate the graph
- Any graph that has no articulation points is biconnected
  - Thus we can determine that a graph is biconnected if we look for, but do not find, any articulation points

# Finding articulation points

- Variation on DFS
- Consider building up the spanning tree
  - Have it be directed
  - Create “back edges” when considering a node that has already been visited in constructing the spanning tree
  - Label each vertex  $v$  with with two numbers:
    - $\text{num}(v)$  = pre-order traversal order
    - $\text{low}(v)$  = lowest-numbered vertex reachable from  $v$  using 0 or more spanning tree edges and then at most one back edge
      - Min of:
        - $\text{num}(v)$
        - Lowest  $\text{num}(w)$  of all back edges  $(v, w)$
        - Lowest  $\text{low}(w)$  of all spanning tree edges  $(v, w)$

# Finding articulation points example



# So where are the articulation points?

- If any (non-root) vertex  $v$  has some child  $w$  such that  $\text{low}(w) \geq \text{num}(v)$ ,  $v$  is an articulation point
- What about if we start at an articulation point?
  - If the root of the spanning tree has more than one child, it is an articulation point