

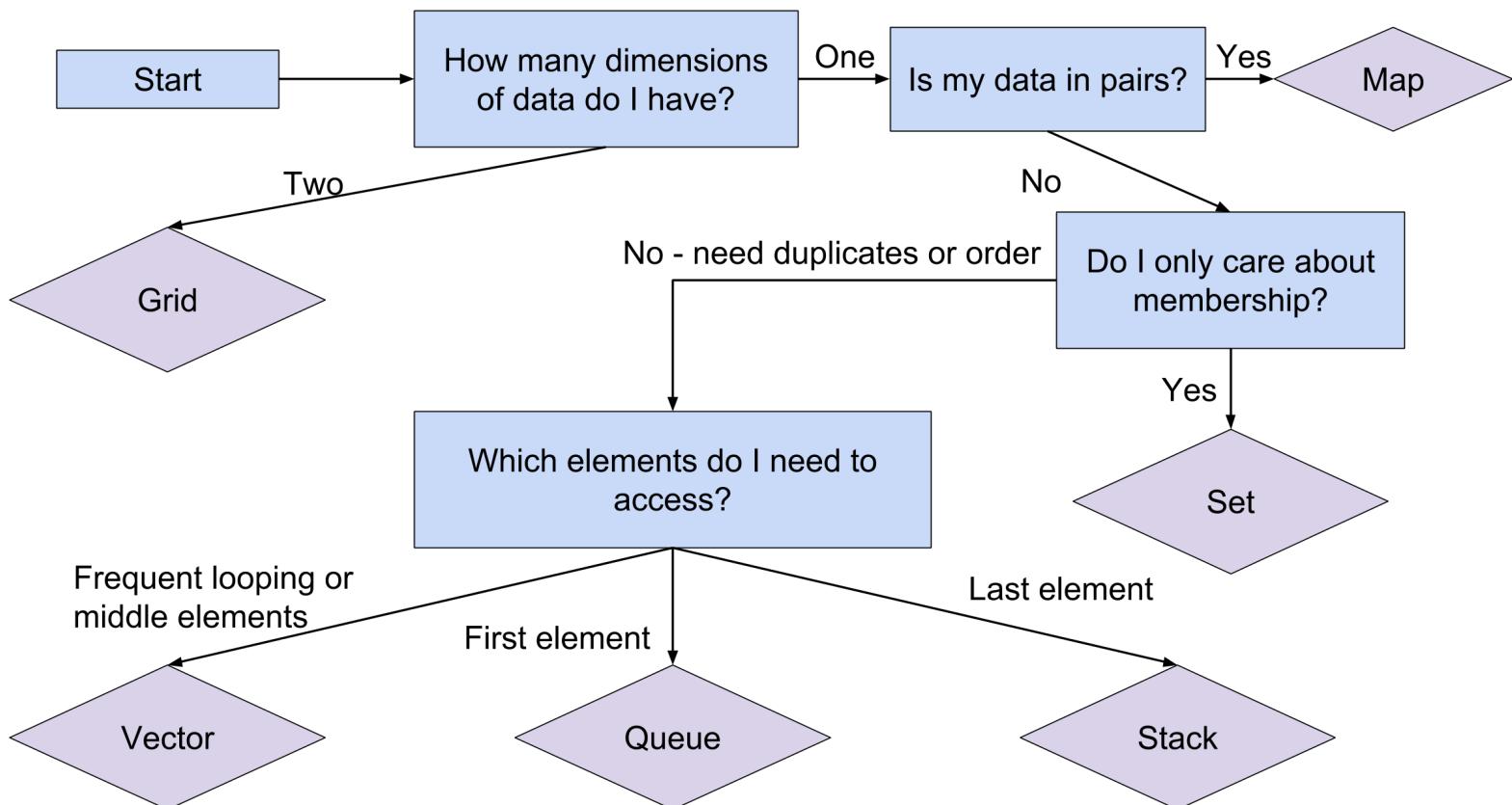
# **CS 106B, Lecture 23**

## **Graphs**

# Plan for Today

- Graphs!
  - How to model problems using a graph

# ADT Flowchart



# Google Maps

University of California, Berkeley

Stanford University

Add destination

Leave now ▾

OPTIONS

Send directions to your phone

via I-880 S **1 h 16 min**  
Fastest route now, avoids slowdown on the Bay Bridge  
 This route has tolls.

**DETAILS**

via I-280 S **1 h 19 min**  
Heavy traffic, as usual

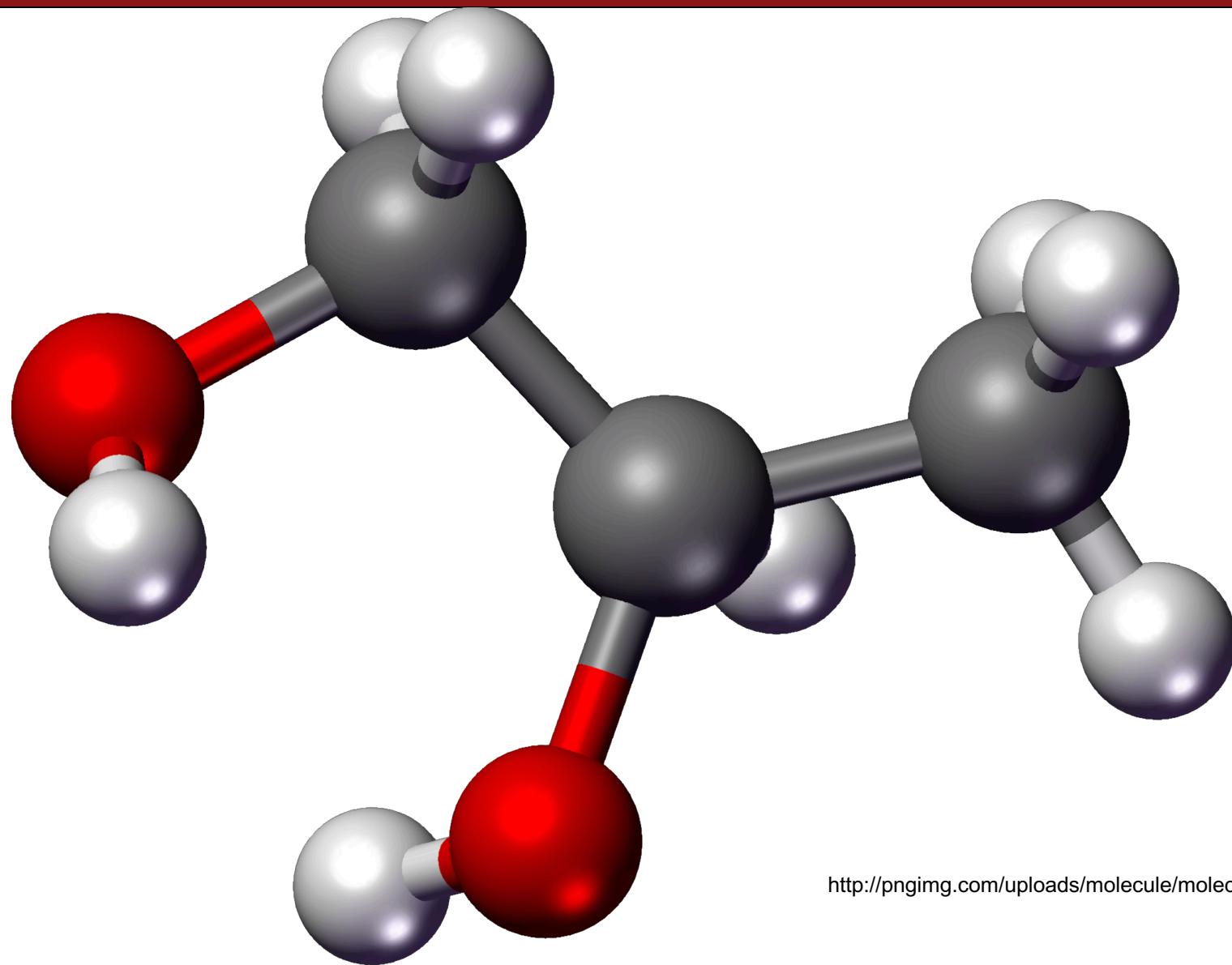
via US-101 S **1 h 32 min**  
Heavy traffic, as usual

The map displays three driving routes originating from the University of California, Berkeley (indicated by a red dot) and ending at various locations in San Francisco. The routes are color-coded and labeled with travel time and distance:

- Top Route (Blue):** 1 h 16 min, 38.8 miles. This route follows I-880 South, avoiding the Bay Bridge slowdown. It passes through Alameda and Castro Valley before reaching San Francisco.
- Middle Route (Red):** 1 h 32 min, 46.2 miles. This route follows I-280 South, which is experiencing heavy traffic. It passes through Daly City, South San Francisco, and San Bruno before reaching San Francisco.
- Bottom Route (Yellow):** 1 h 19 min, 47.5 miles. This route follows US-101 South, also experiencing heavy traffic. It passes through Mill Valley, Larkspur, and Sausalito before reaching San Francisco.

Key locations labeled on the map include: San Rafael, Stinson Beach, Mill Valley, Golden Gate National Recreation Area, San Pablo, Richmond, El Cerrito, Lafayette, Walnut Creek, Pleasant Hill, San Leandro, Castro Valley, Hayward, Daly City, South San Francisco, San Bruno, Pacifica, El Granada, Half Moon Bay, Redwood City, Don Edwards San Francisco Bay National Wildlife Refuge, Bair Island, Lobitos, San Gregorio, La L, Mountain View, Cupertino, and Concord. Major highways shown include 101, 580, 80, 280, 131, 13, 92, 84, and 1.

# Molecules



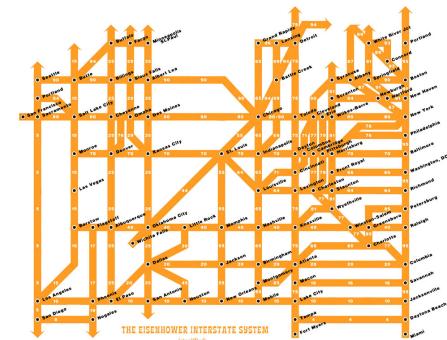
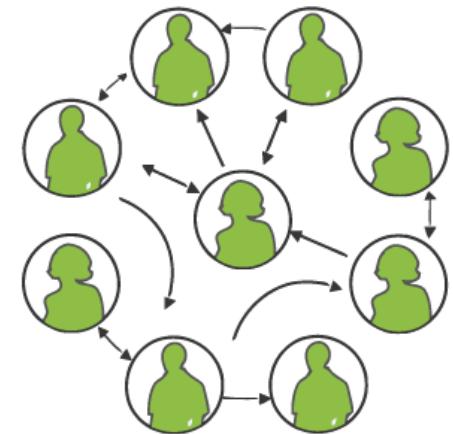
[http://pngimg.com/uploads/molecule/molecule\\_PNG50.png](http://pngimg.com/uploads/molecule/molecule_PNG50.png)

# Introducing: The Graph

- A **graph** is a mathematical structure for representing relationships
- Consists of **nodes** (aka vertices) and **edges** (aka arcs)
  - **edges** are the relationships, **nodes** are the items
- Examples:
  - Map: cities (nodes) are connected by roads (edges)
  - Molecules: atoms (nodes) are connected by bonds (edges)

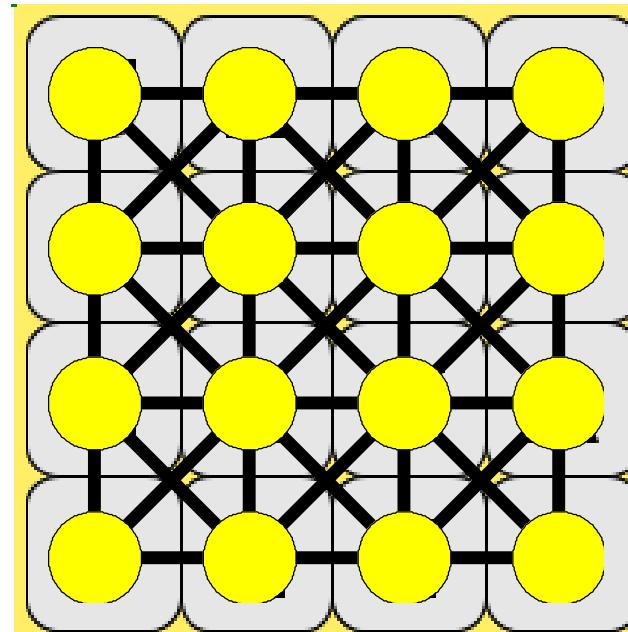
# Graph examples

- For each, what are the nodes and what are the edges?
  - Web pages with links
  - Functions in a program that call each other
  - Airline routes
  - Facebook friends
  - Course pre-requisites
  - Family trees
  - Paths through a maze



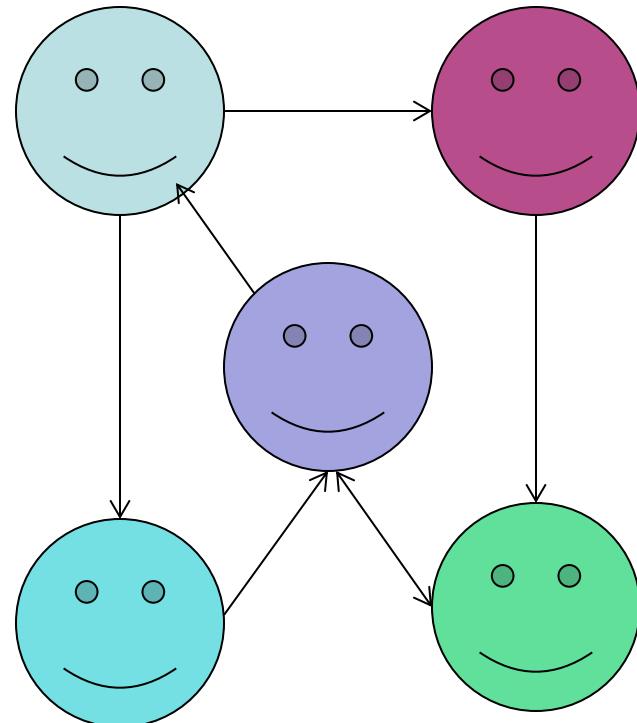
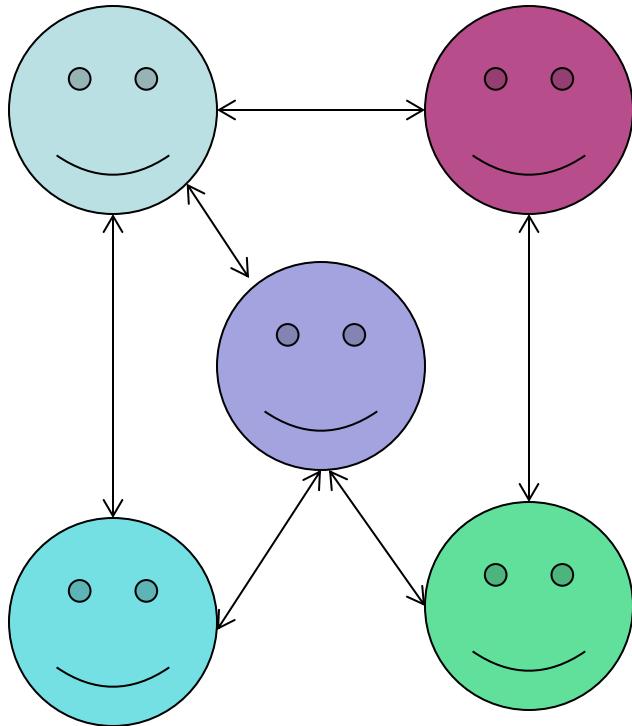
# Boggle as a graph

- Q: If a Boggle board is a graph, what is a node? What is an edge?
  - Node = letter cube, Edge = Dictionary (lexicon)
  - Node = dictionary word; Edge = letter cube
  - Node = letter; Edge = between each letter that is part of a word
  - Node = letter cube; Edge = connection to neighboring cube
  - None of the above



# Undirected vs. Directed

- Some relationships are mutual
  - Facebook
- Some are one-way
  - Twitter/Instagram
  - Doesn't mean that all relationships are non-mutual

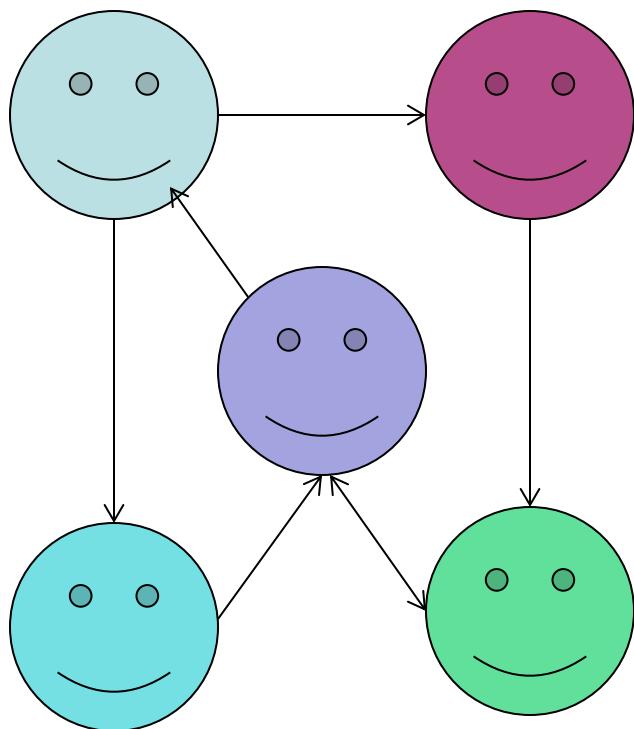


# Representing Graphs

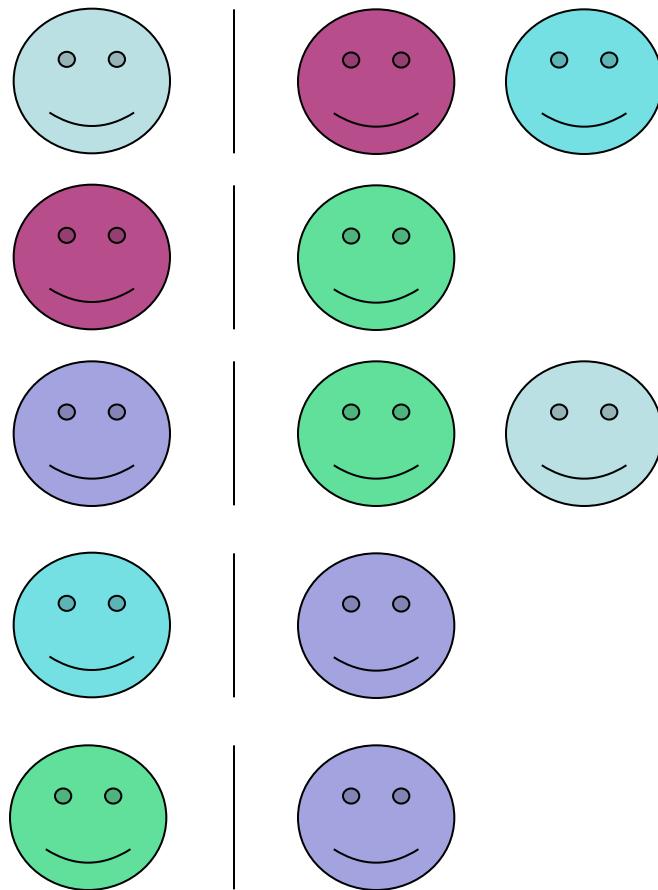
- Two main ways:
  - Have each node store the nodes it's connected to (**adjacency list**)
  - Have a list of all the edges (**edge list**)
- The choice depends on the problem you're trying to solve
- You can sometimes represent graphs implicitly instead of explicitly storing the edges and nodes
  - e.g. Boggle, WordLadder
  - draw a picture to see the graph more clearly!
- Was the backtracking (wiki links) problem on the midterm a graph problem? How did we represent the graph?

# Adjacency List

- Map<*Node*, Vector<*Node*>>
  - or Map<*Node*, Set<*Node*>>

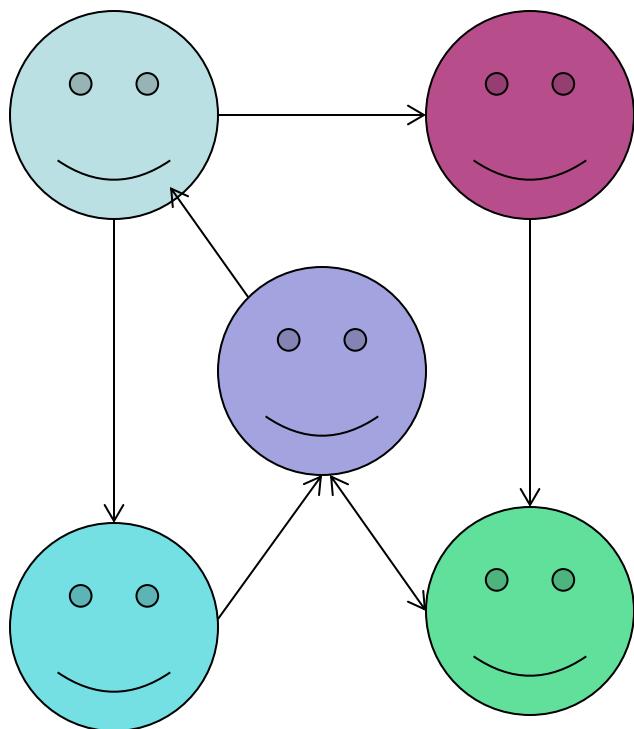


*Node*      Set<*Node*>



# Adjacency Matrix

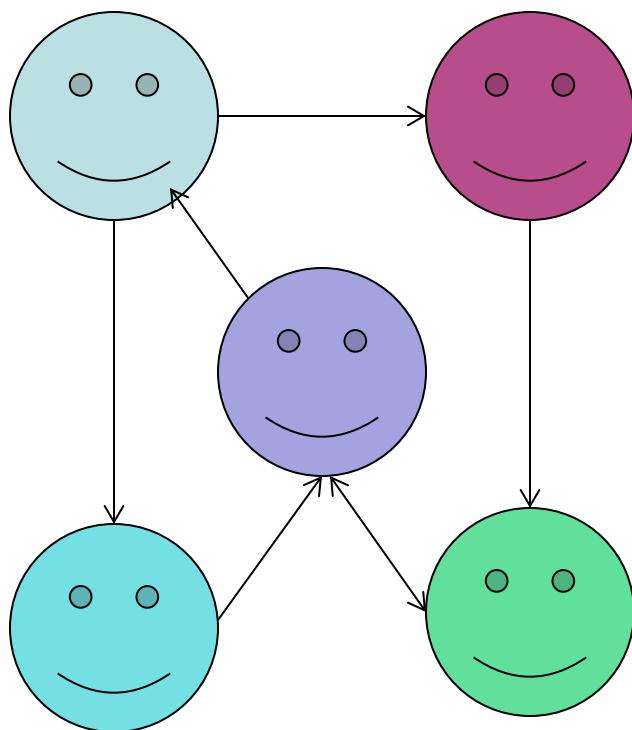
- Store a boolean grid, rows/columns correspond to nodes
  - Alternative to Adjacency List



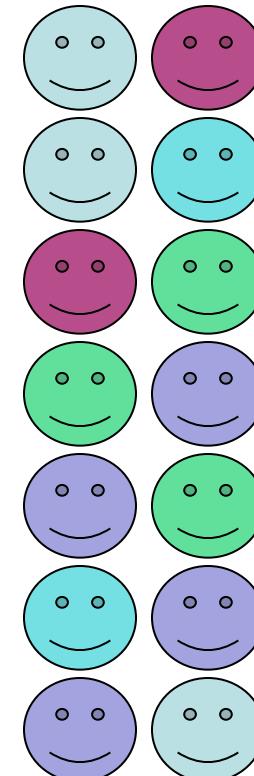
	F	T	F	T	F
	F	F	F	F	T
	T	F	F	F	T
	F	F	T	F	F
	F	F	T	F	F

# Edge List

- Store a Vector<*Edge*> (or Set<*Edge*>)
  - *Edge* struct would have the two nodes

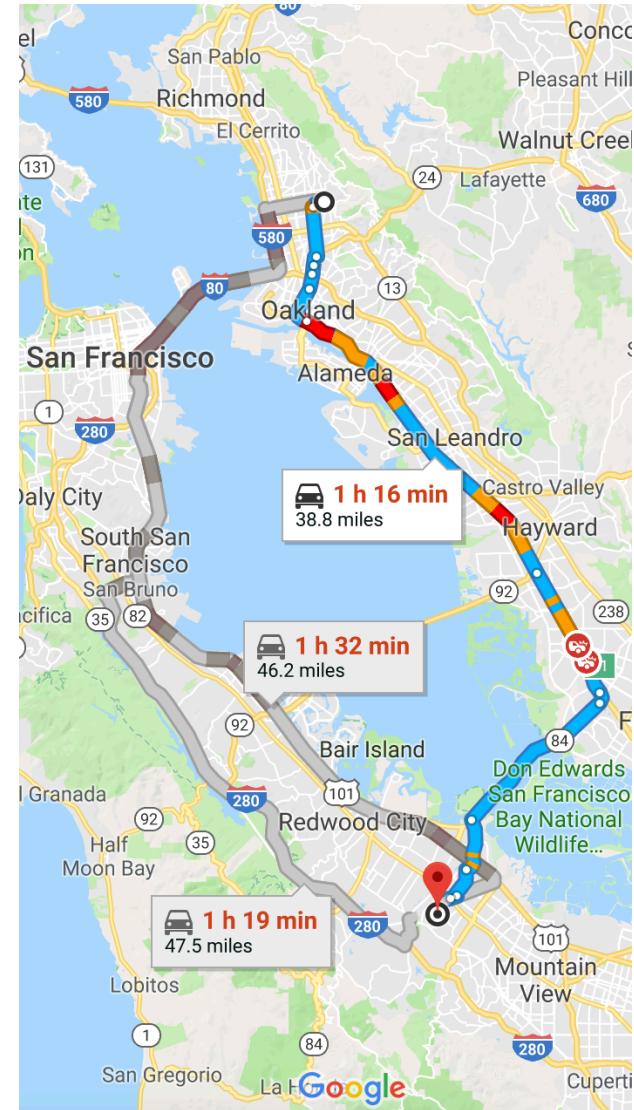


Vector<*Edge*>



# Edge Properties

- Not all edges are created equally
  - Some have greater **weight**
- Real life examples:
  - Flight costs
  - Miles on a road
  - Time spent on a road
- Store a number with each edge corresponding to its weight



Source: <https://www.google.com/maps>

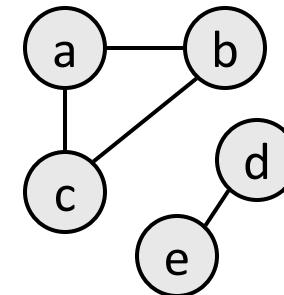
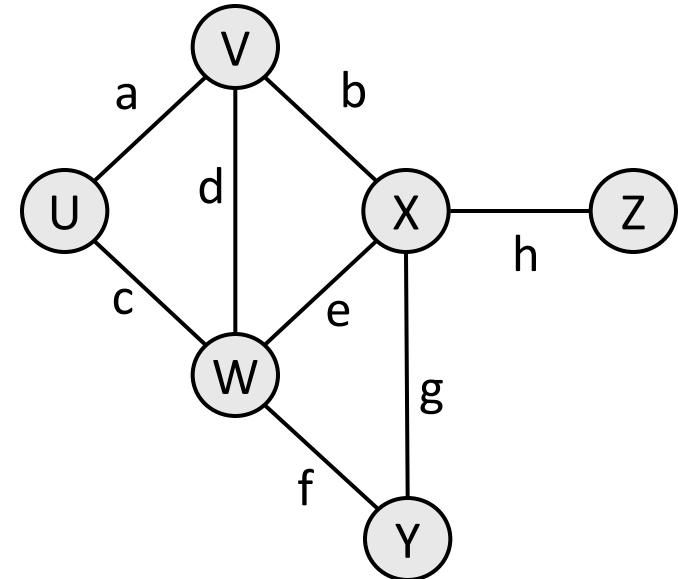
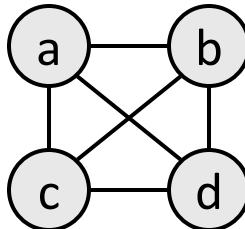
# Paths

- I want a job at Google. Do I know anyone who works there? What about someone who knows someone?
- I want to find this word on a board made of letters "next to" each other (Boggle)
- A **path** is a sequence of nodes with edges between them connecting two nodes
  - Could store edges instead of nodes (why?)
  - You know Jane. Jane knows Sally. Sally knows knows Sergey Brin, the founder of Google, so the path is:  
You->Jane->Sally->Sergey



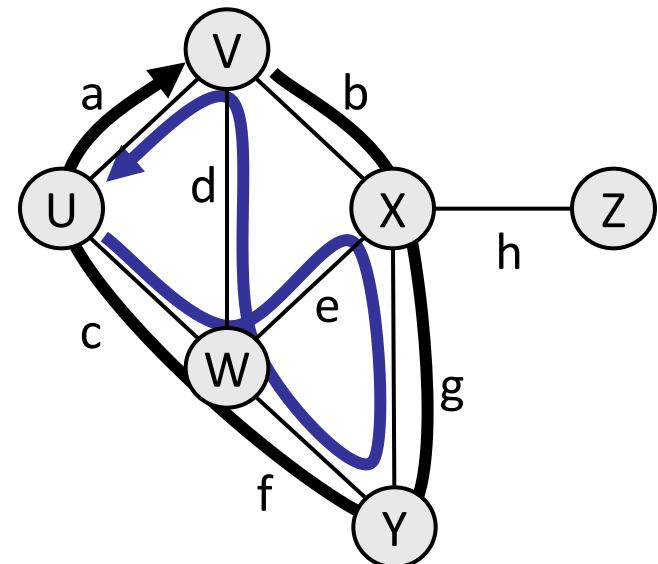
# Other graph properties

- **reachable**: Vertex  $u$  is *reachable* from  $v$  if a path exists from  $u$  to  $v$ .
- **connected**: A graph is *connected* if every vertex is reachable from every other.
- **complete**: If every vertex has a direct edge to every other.



# Loops and cycles

- **cycle:** A path that begins and ends at the same node.
  - example: {b, g, f, c, a} or {V, X, Y, W, U, V}.
  - example: {c, d, a} or {U, W, V, U}.
  - **acyclic graph:** One that does not contain any cycles.
- **loop:** An edge directly from a node to itself.
  - Many graphs don't allow loops.



# Types of Graphs

- Boggle?
  - undirected, unweighted, cyclic, connected
- A molecule?
  - undirected, weighted, potentially cyclic, connected
- A map of flights?
  - directed, weighted, cyclic, perhaps not connected
- A tree?
  - directed, acyclic graph, not connected

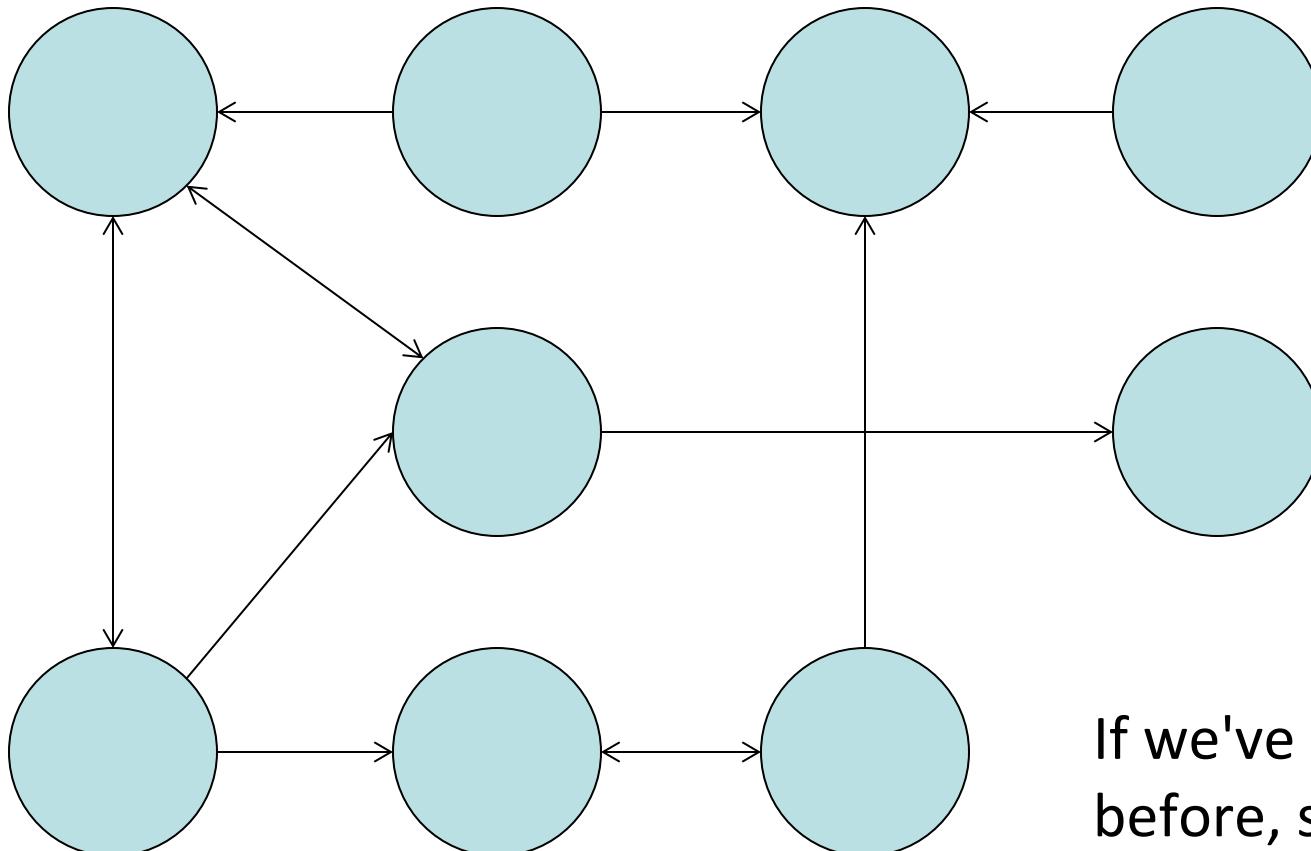
# Announcements

- Assn. 6 is due Thursday

# Finding Paths

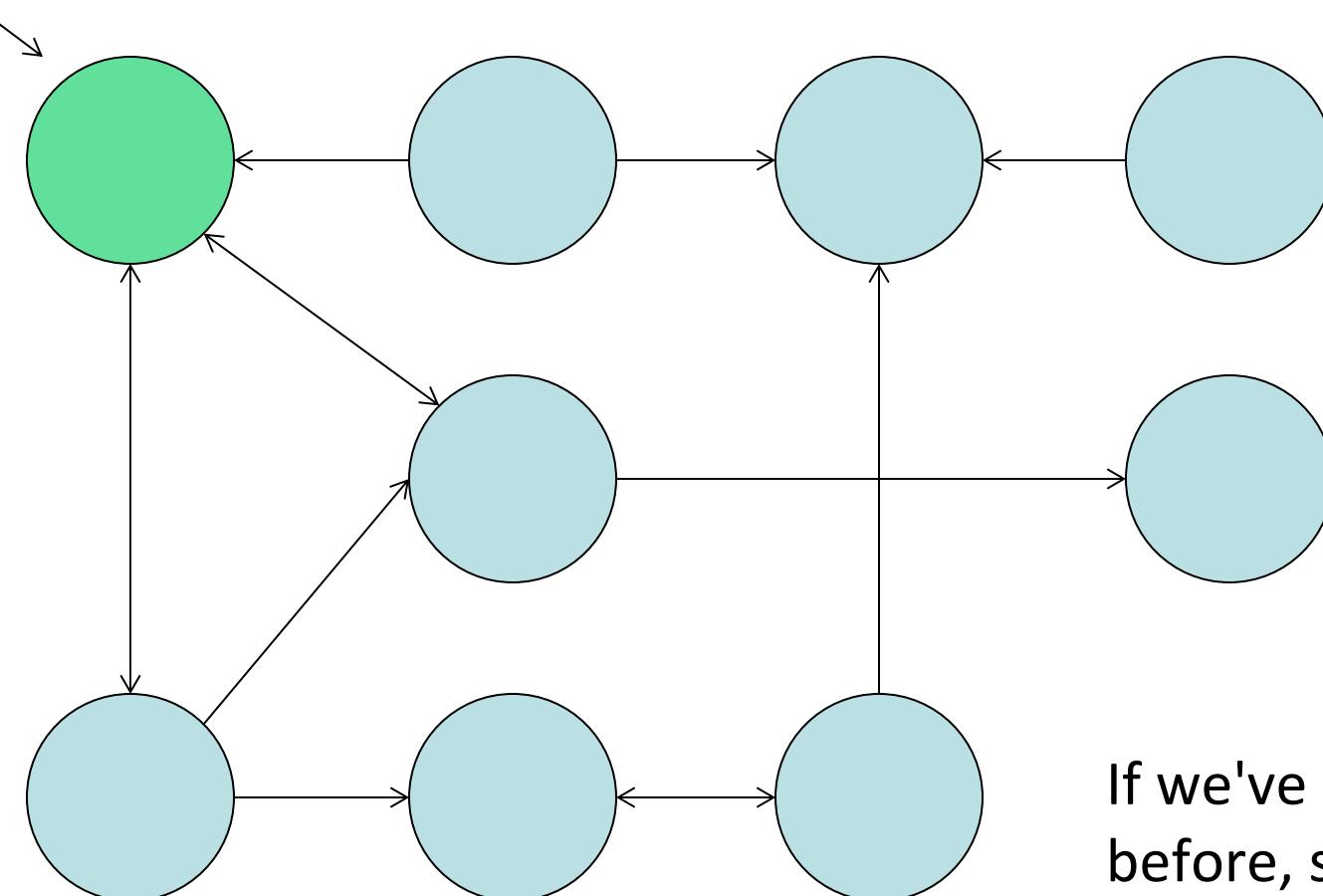
- Easiest way: Depth-First Search (DFS)
  - Recursive backtracking!
- Finds a path between two nodes if it exists
  - Or can find all the nodes **reachable** from a node
    - Where can I travel to starting in San Francisco?
    - If all my friends (and their friends, and so on) share my post, how many will eventually see it?

# DFS



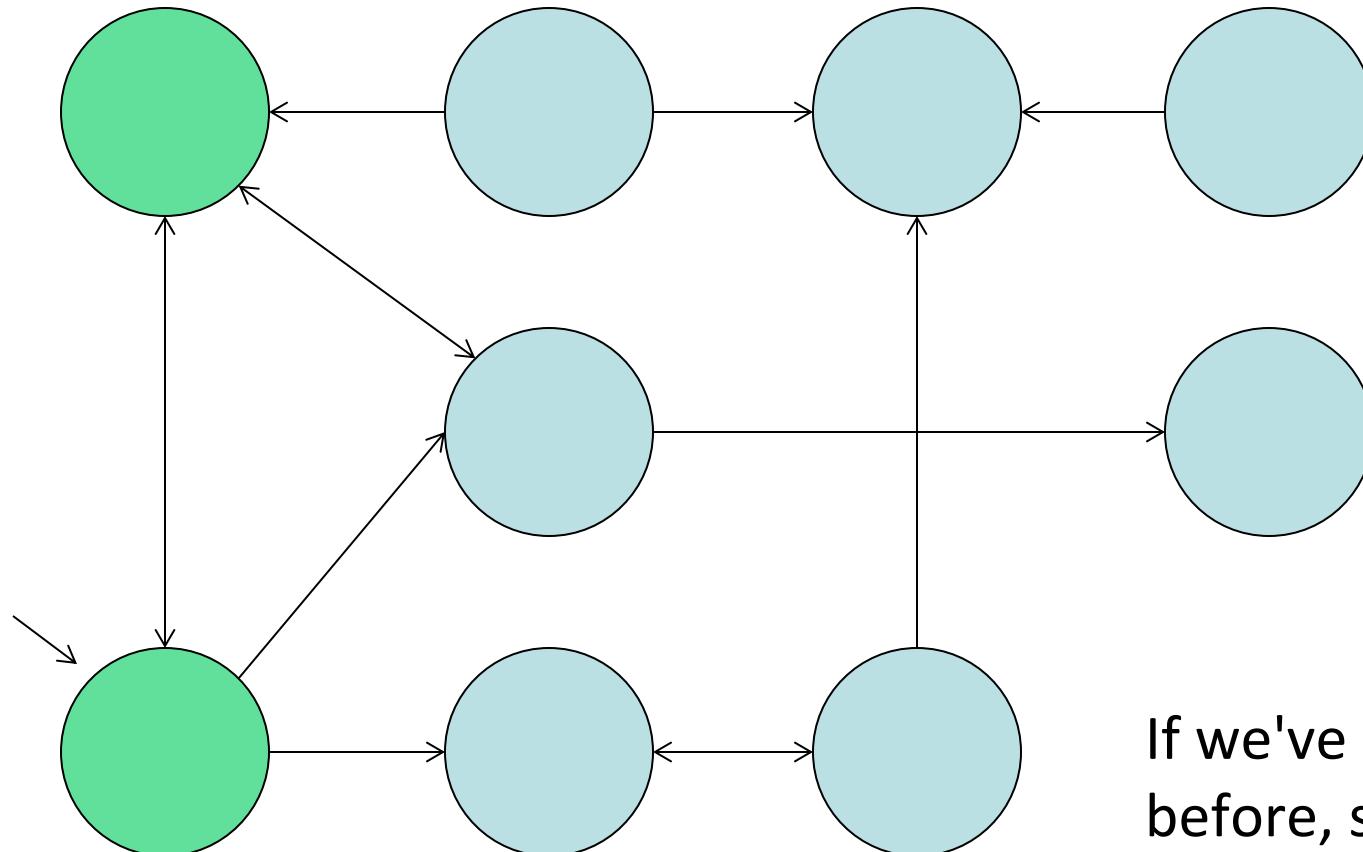
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



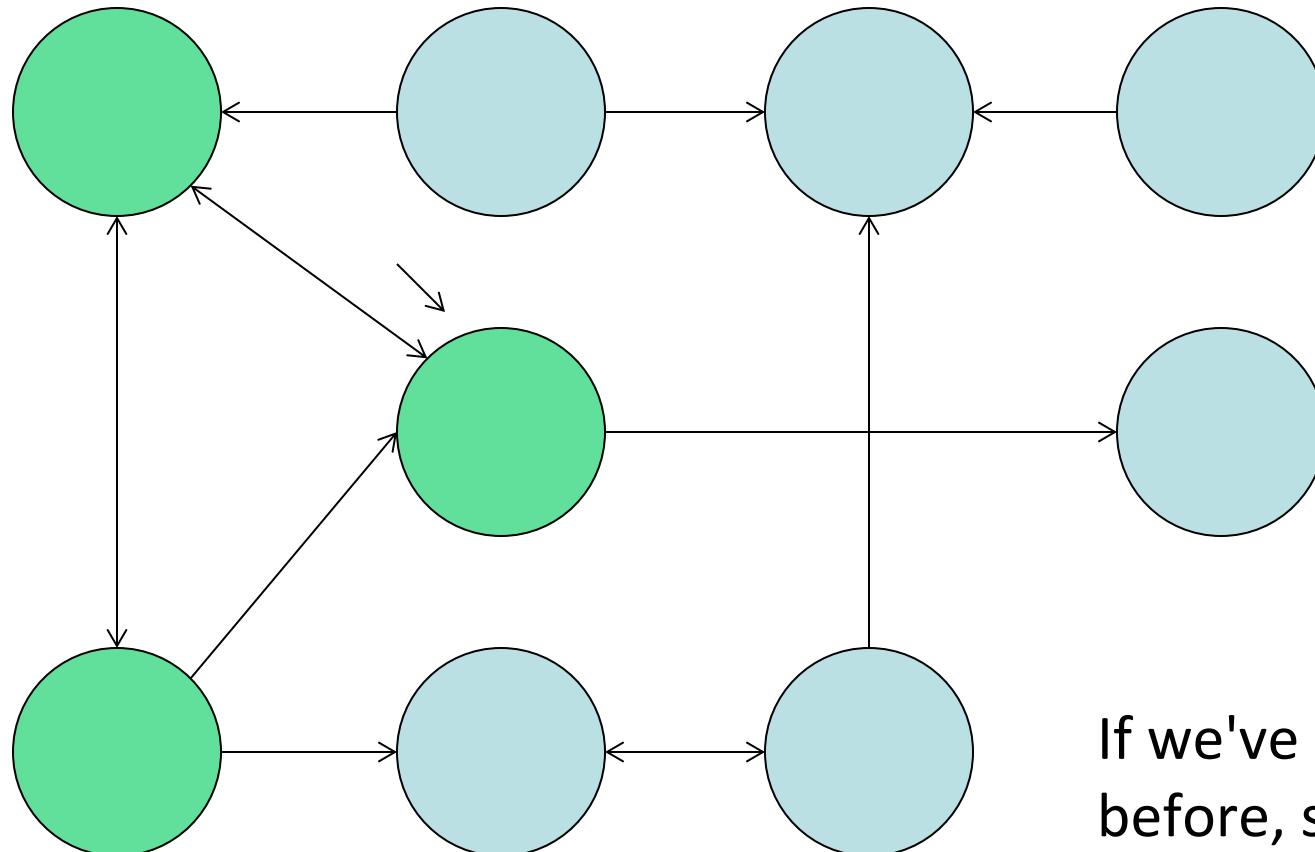
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

**DFS**



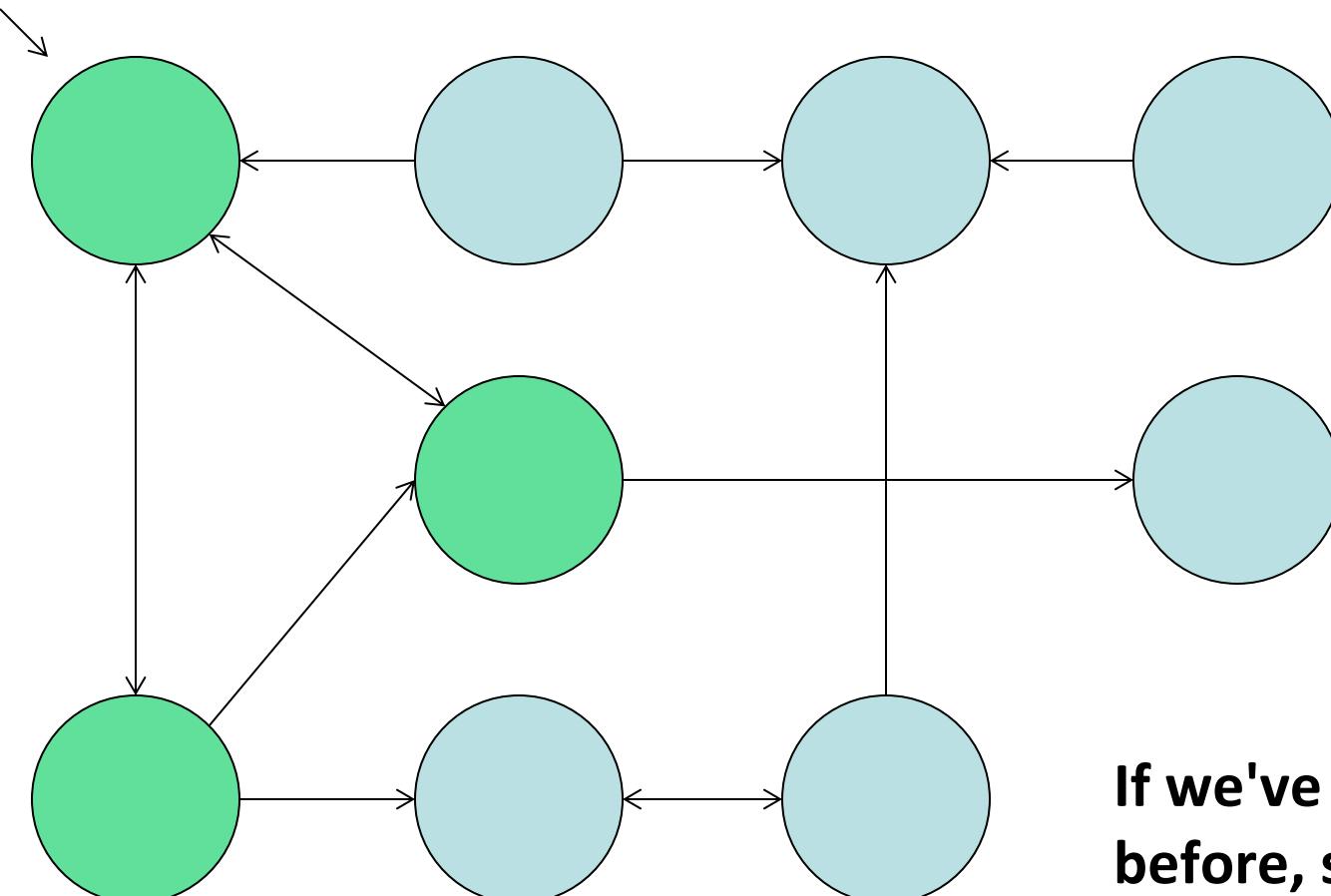
- If we've seen the node before, stop
- Otherwise, visit all the unvisited nodes from this node

# DFS



If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

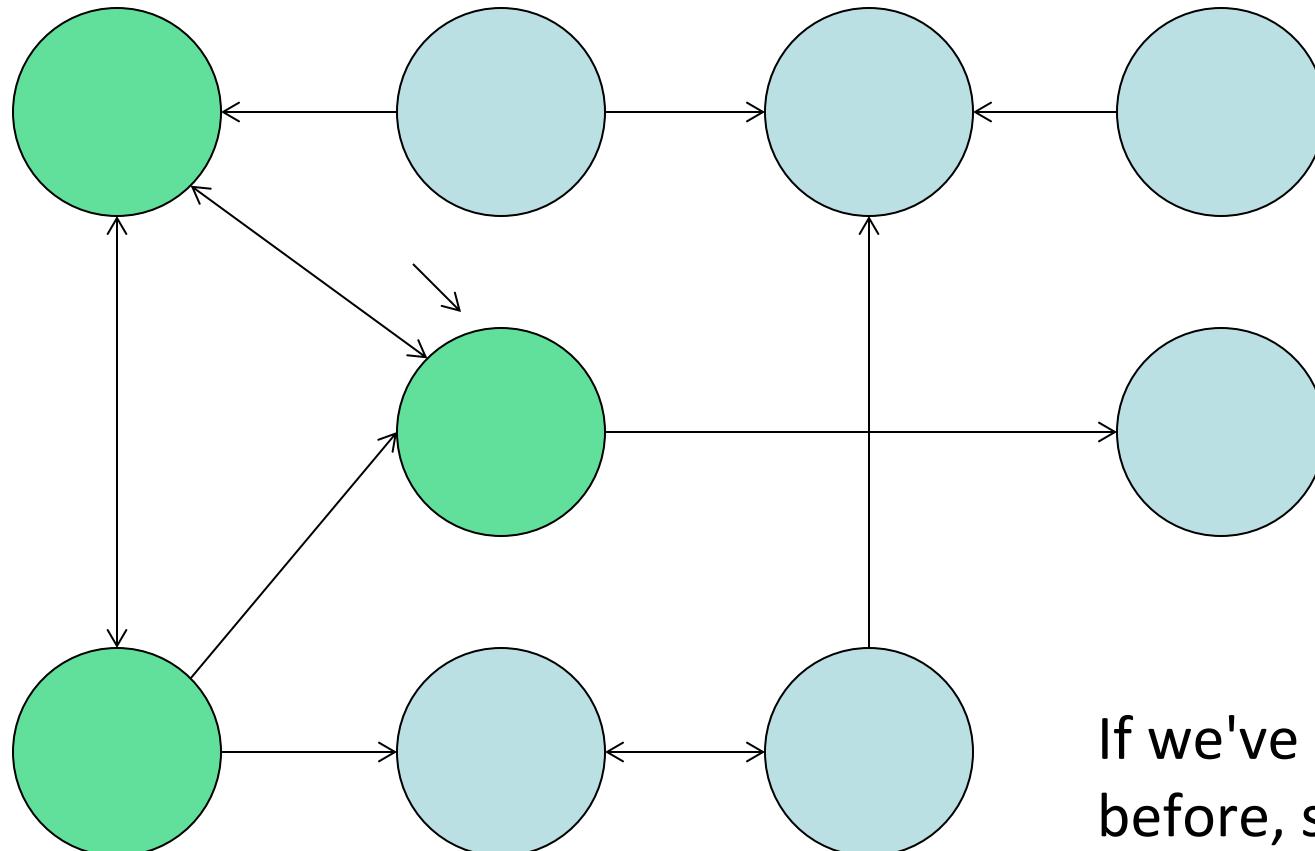
# DFS



**If we've seen the node before, stop**

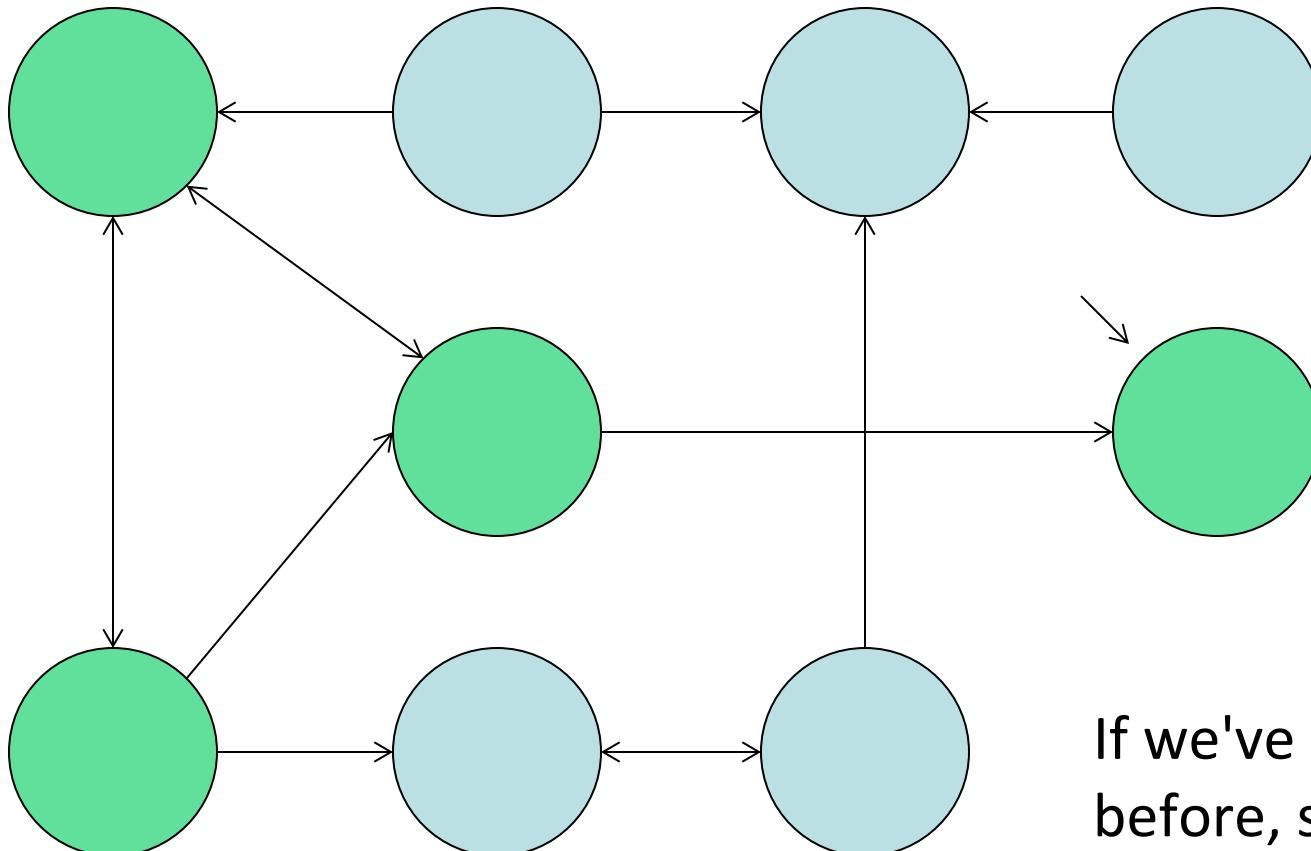
Otherwise, visit all the unvisited nodes from this node

**DFS**



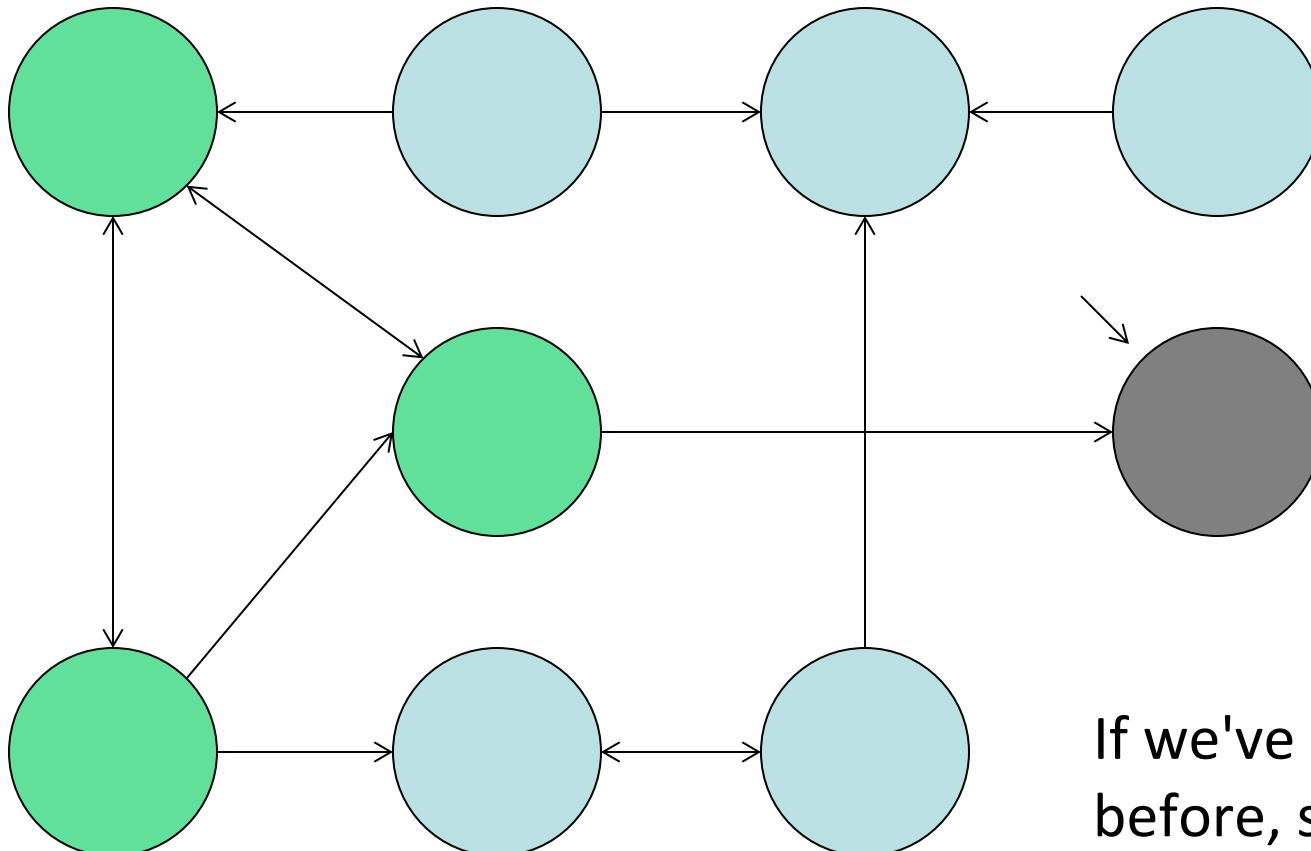
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



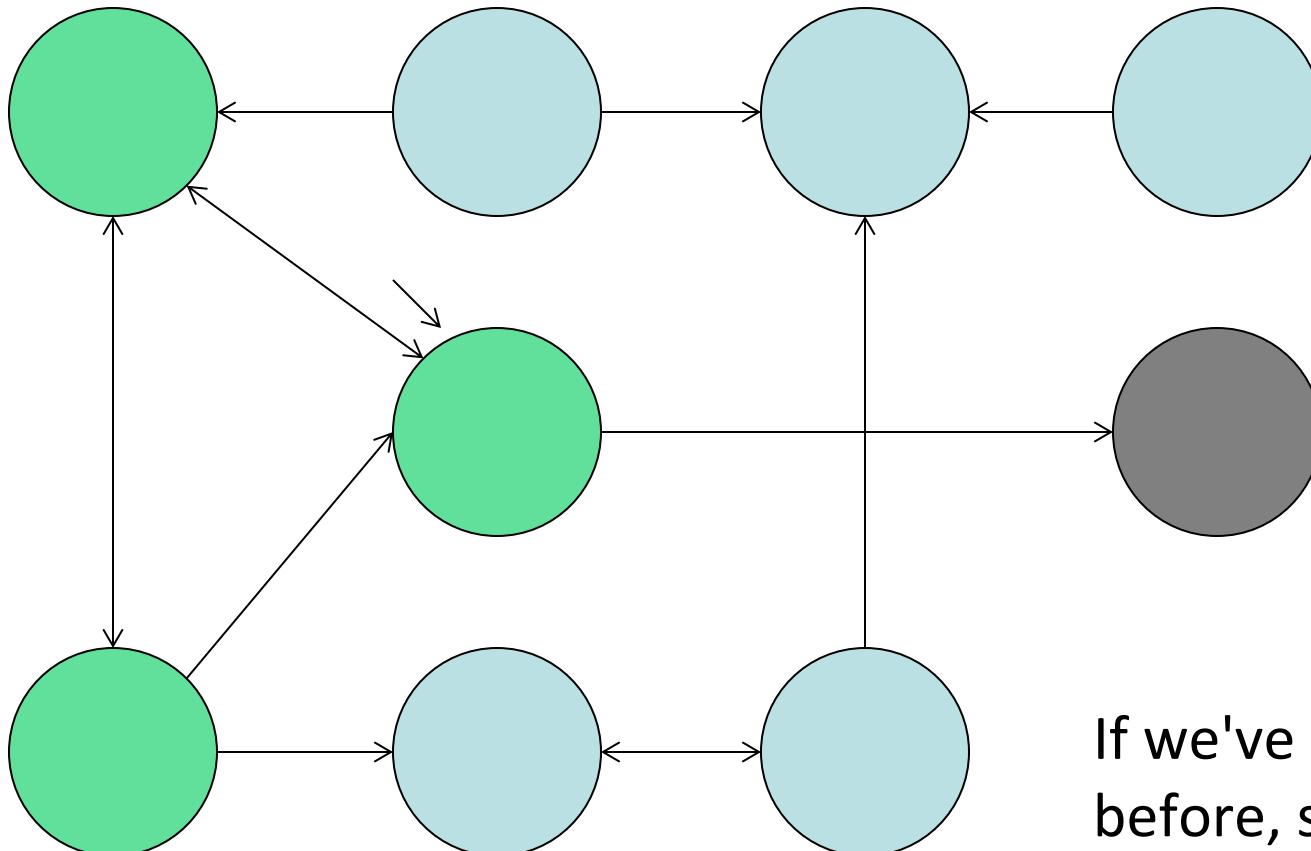
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



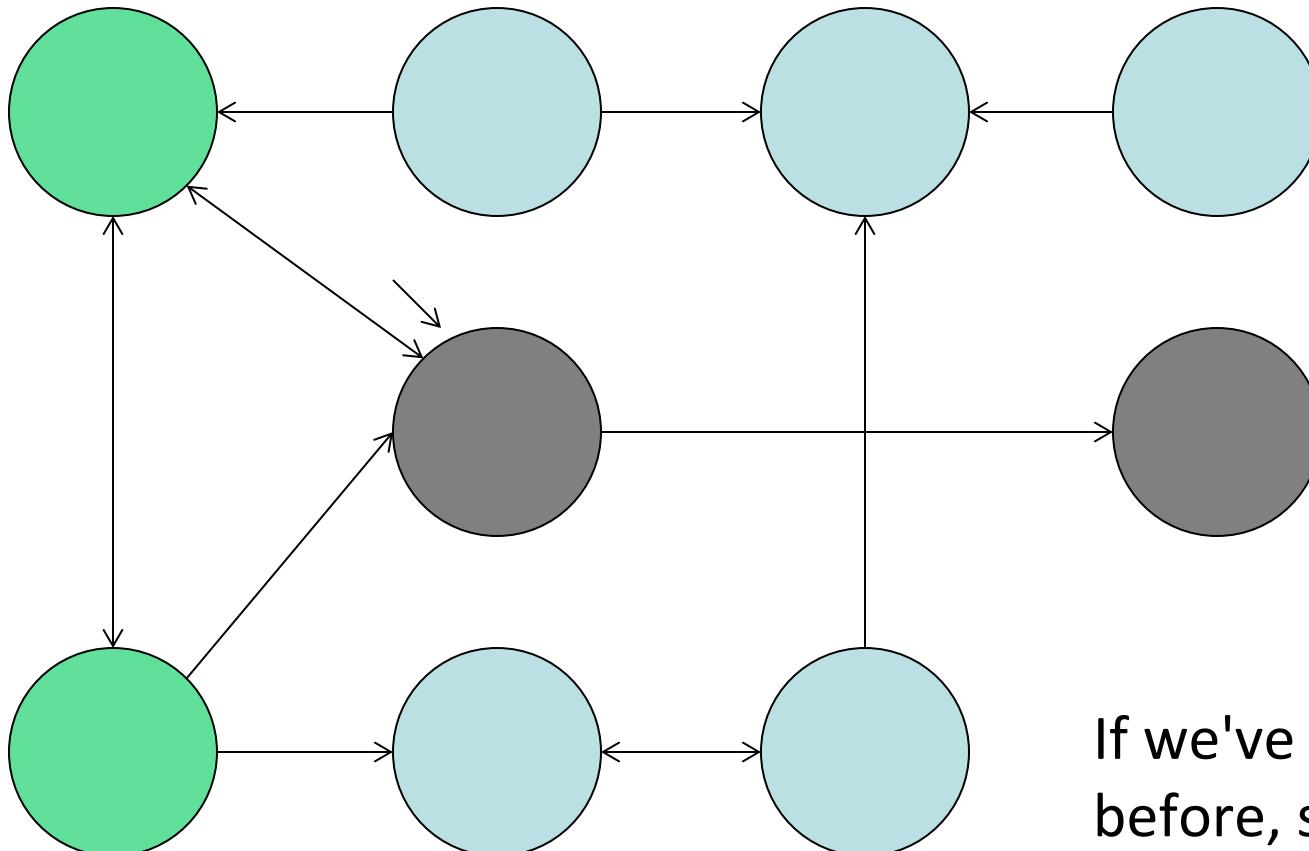
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



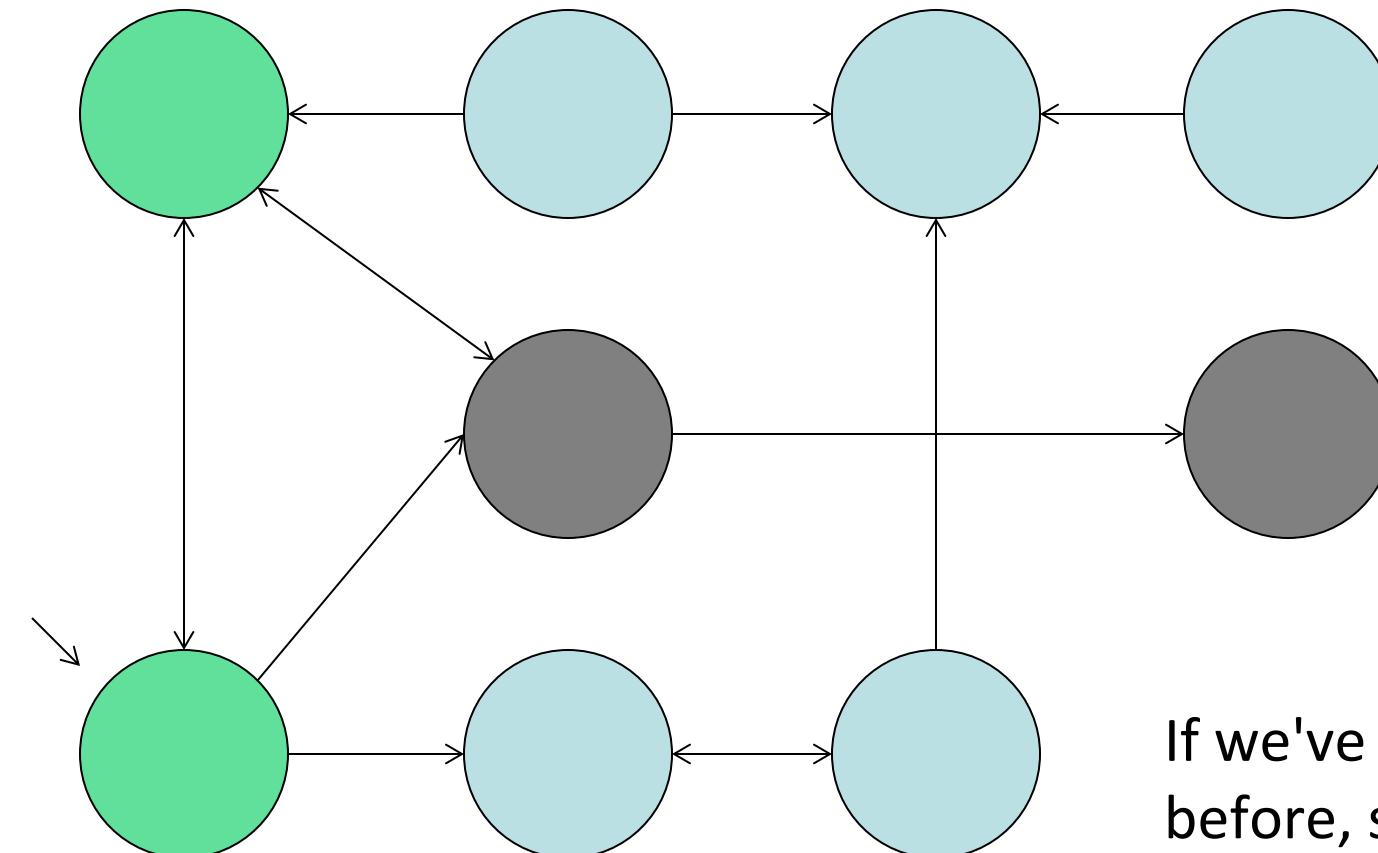
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



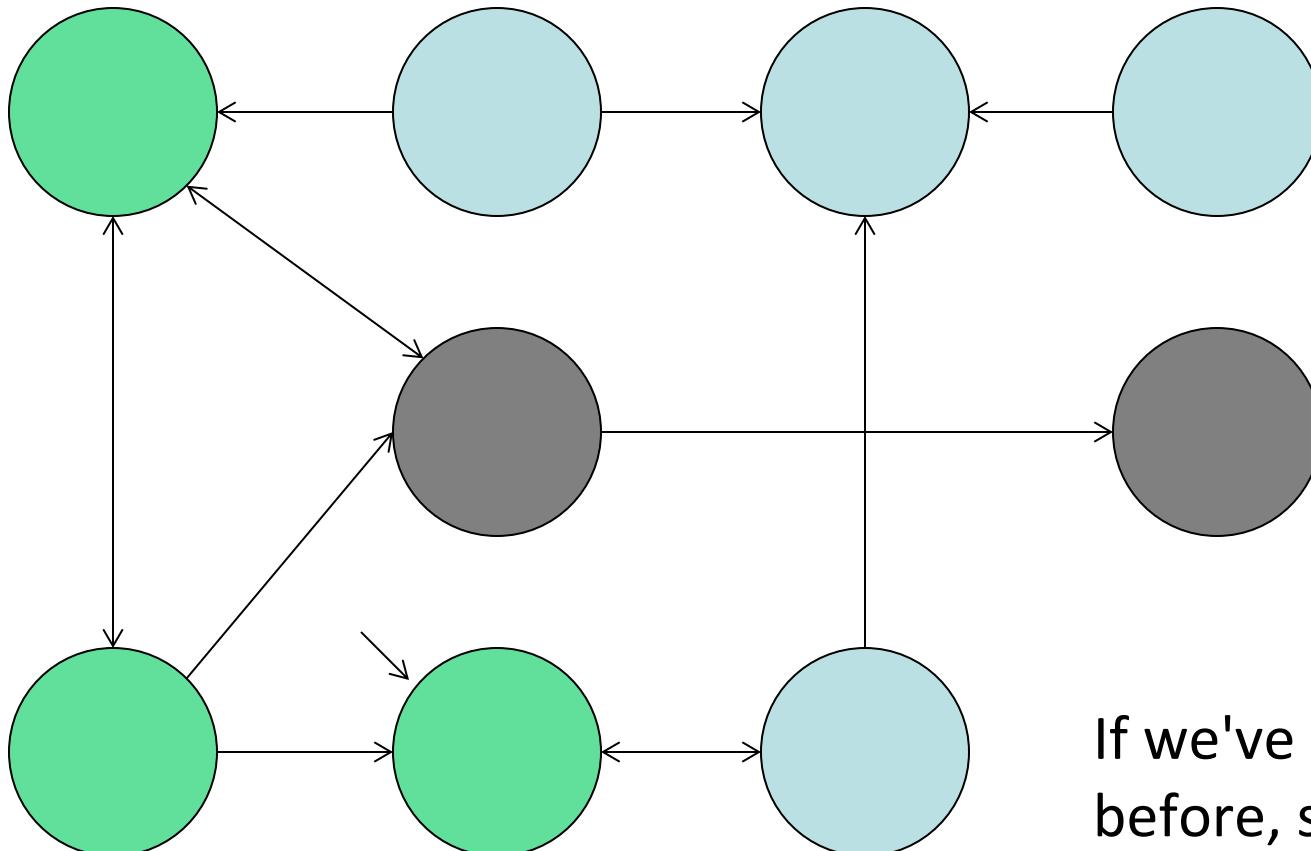
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



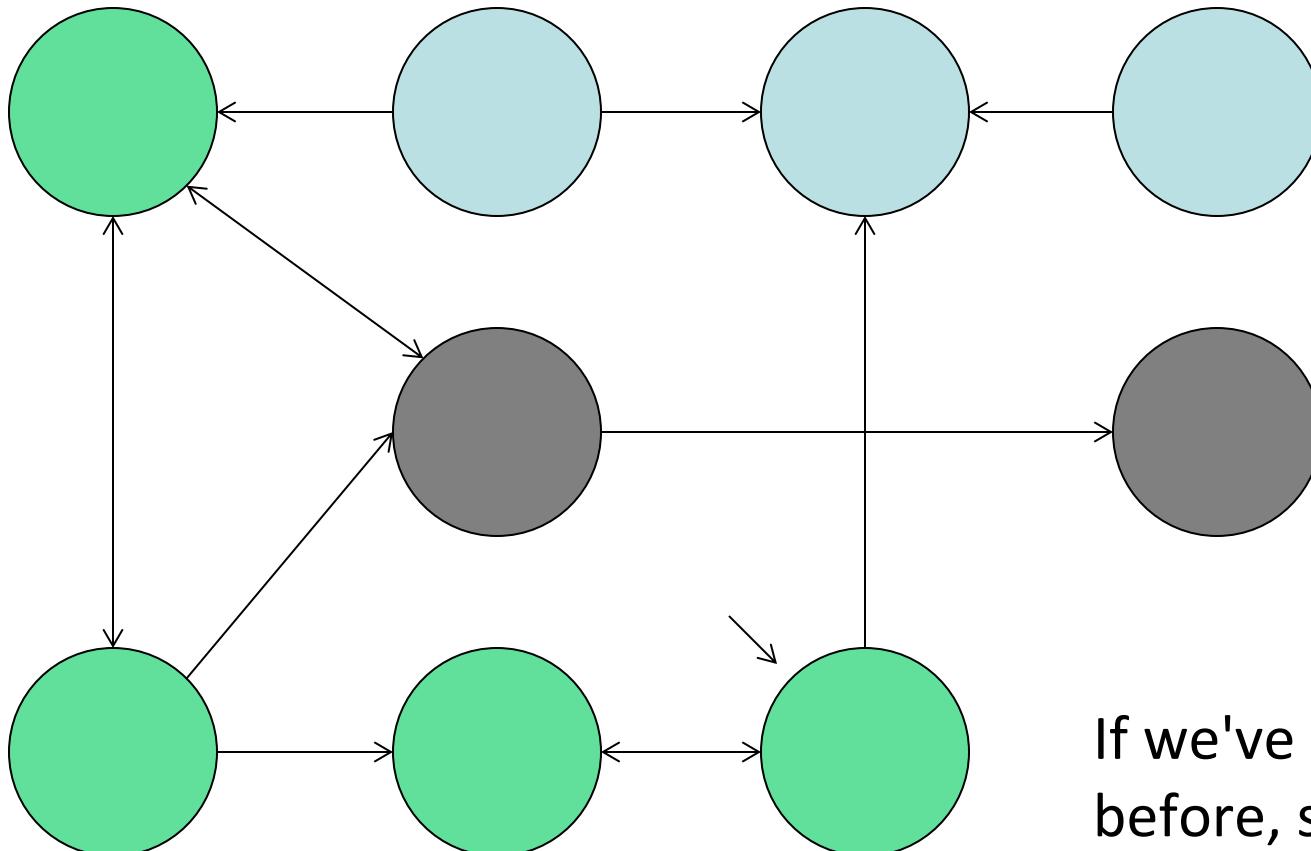
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



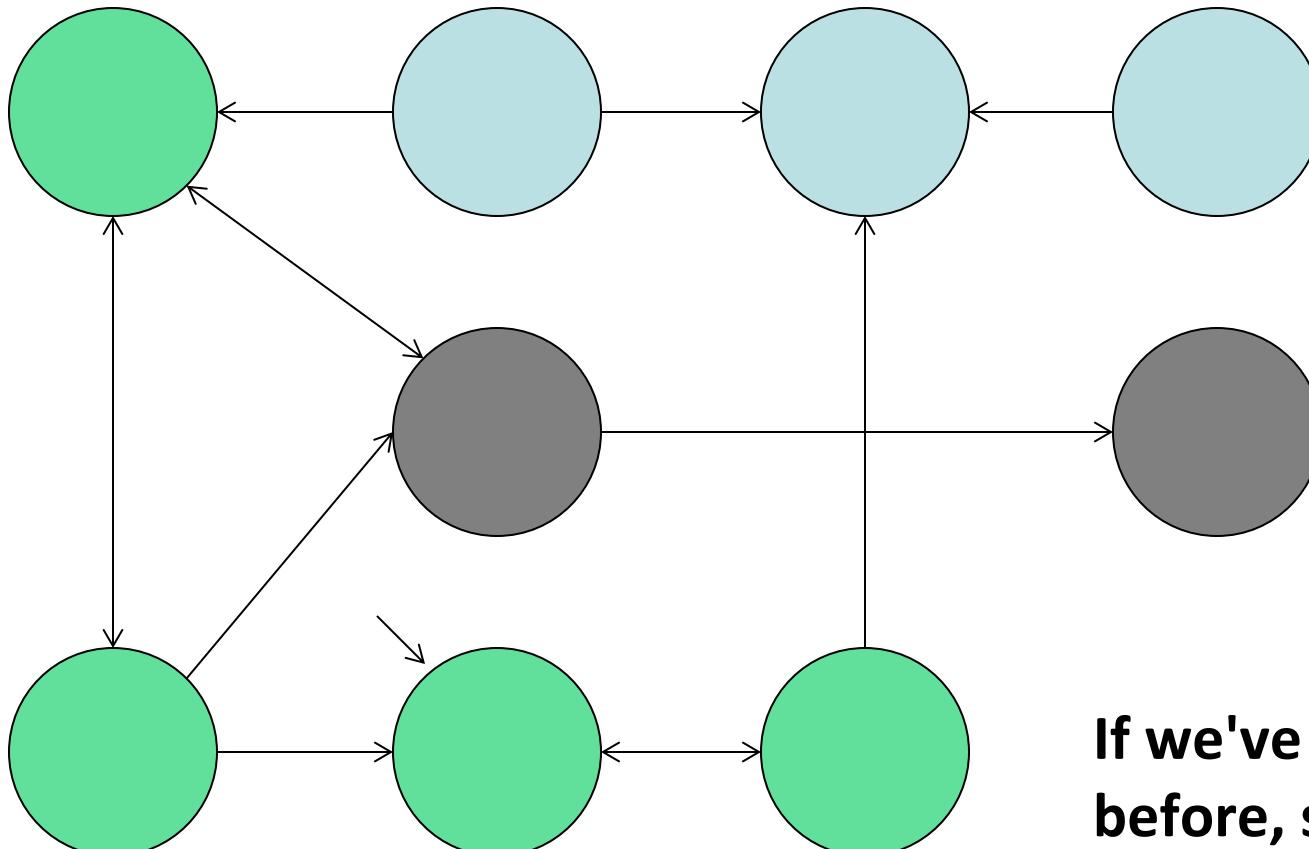
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

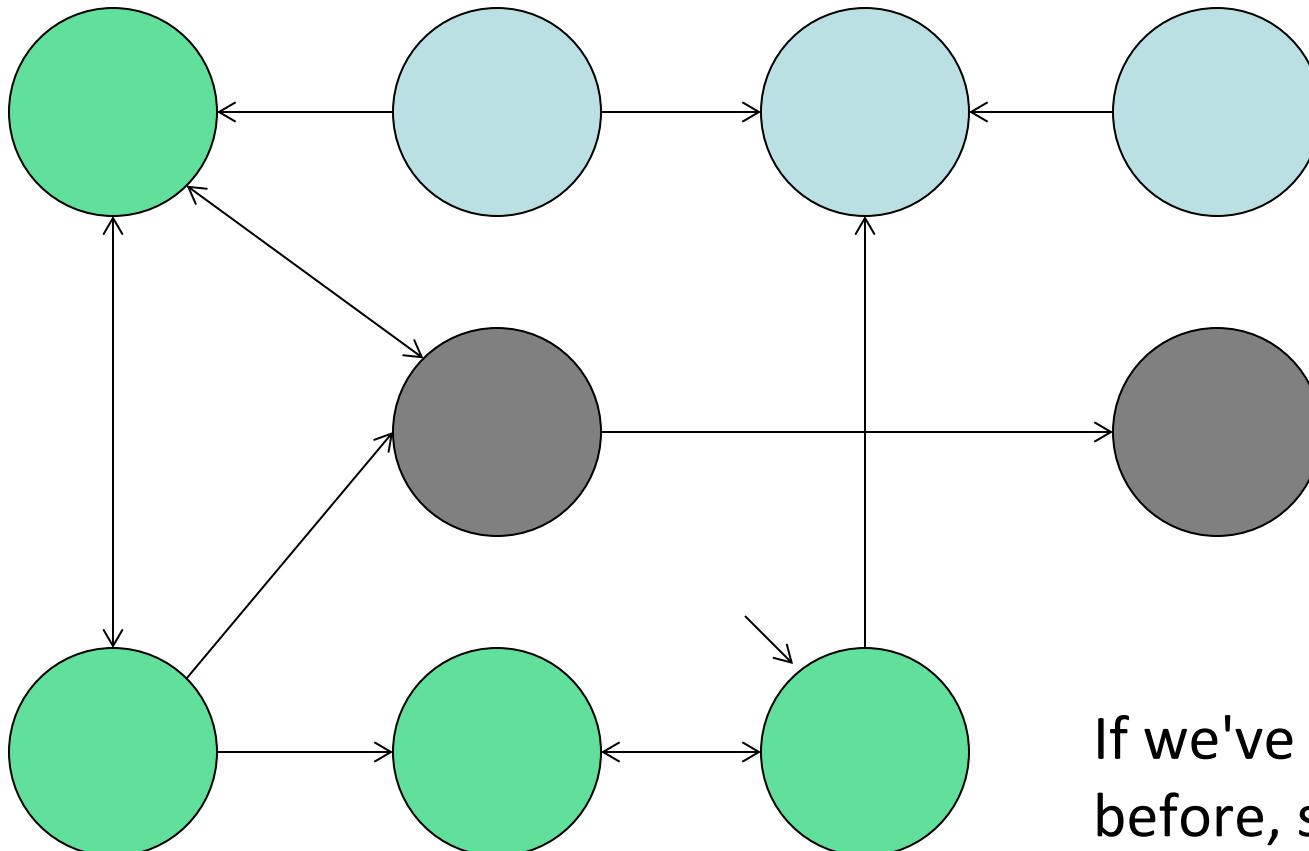
# DFS



**If we've seen the node before, stop**

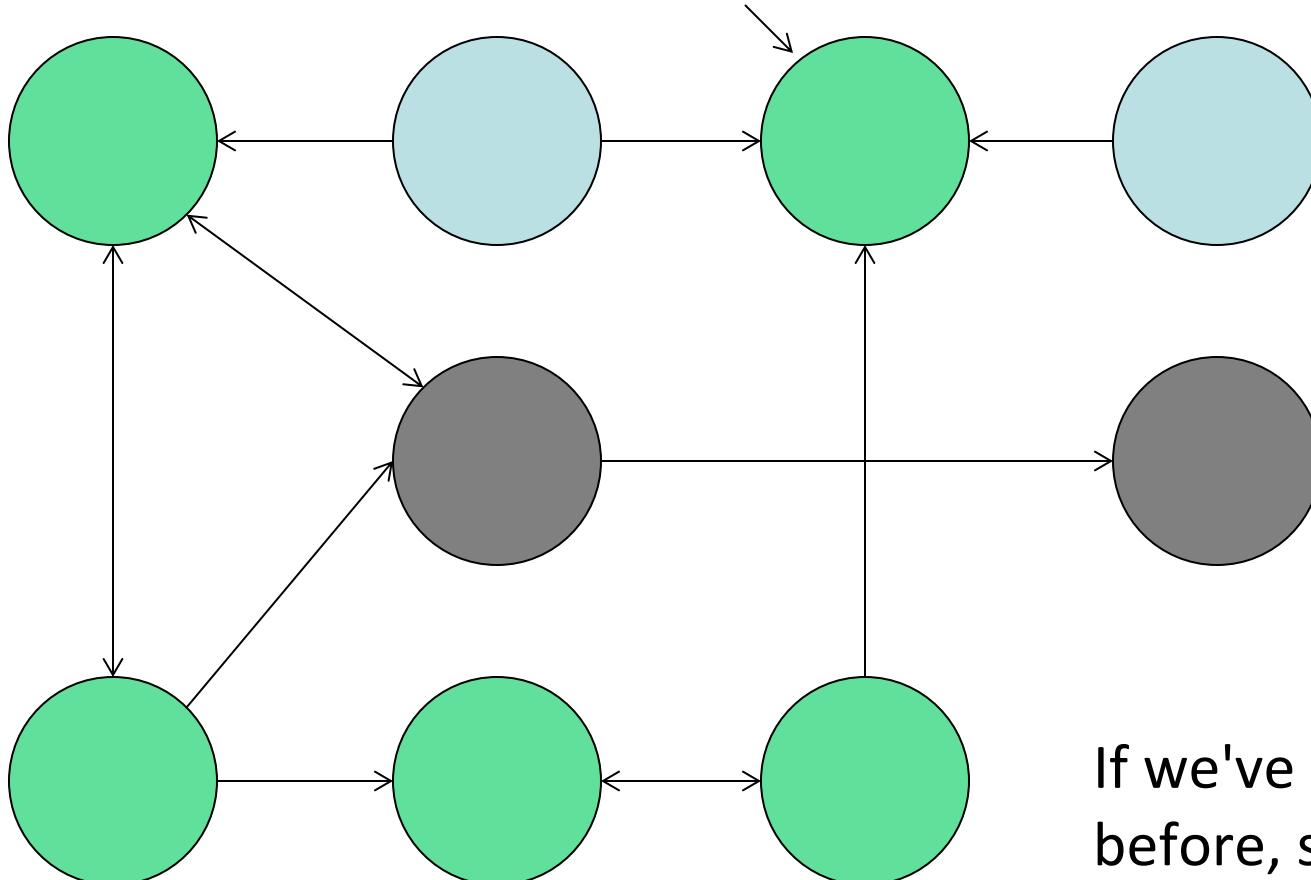
Otherwise, visit all the unvisited nodes from this node

# DFS



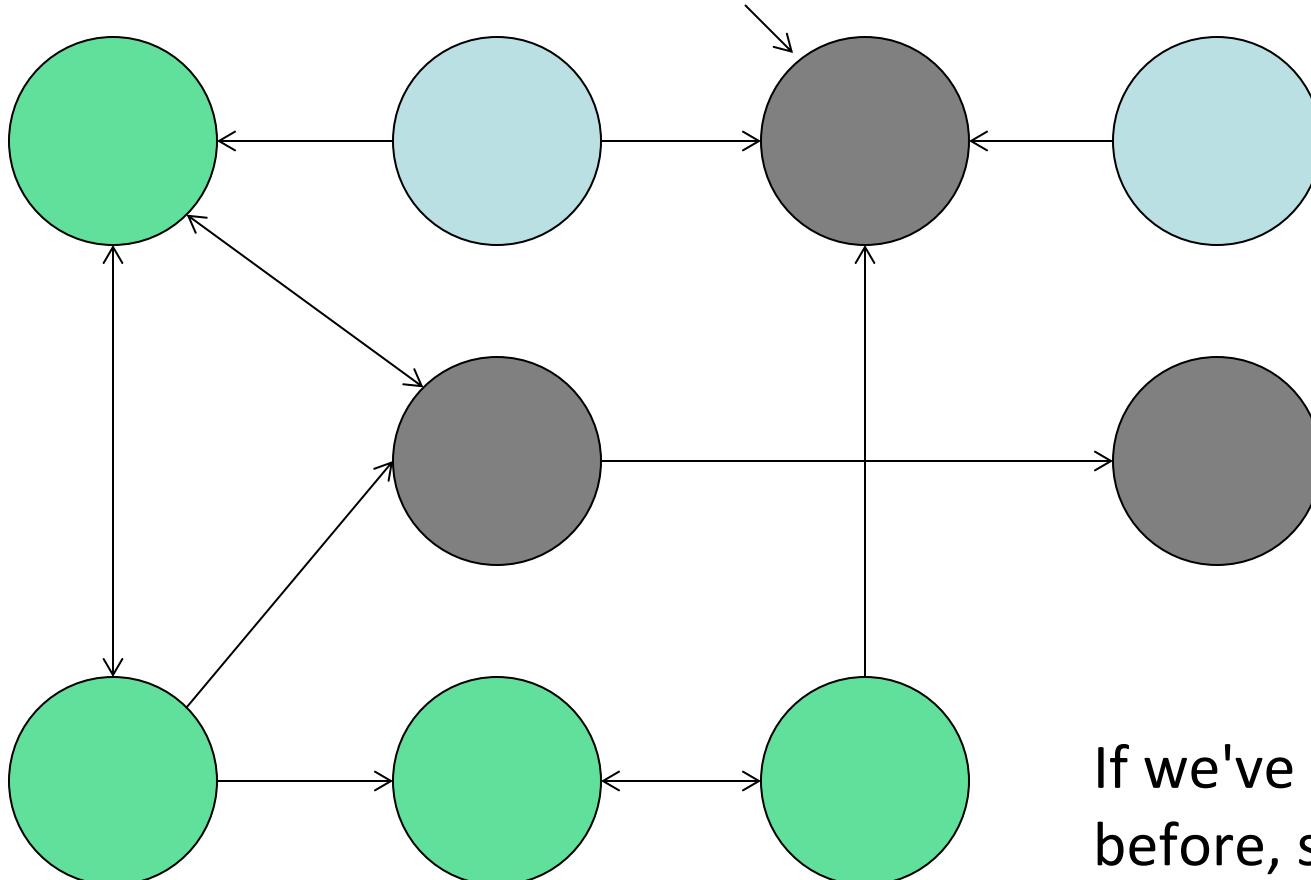
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



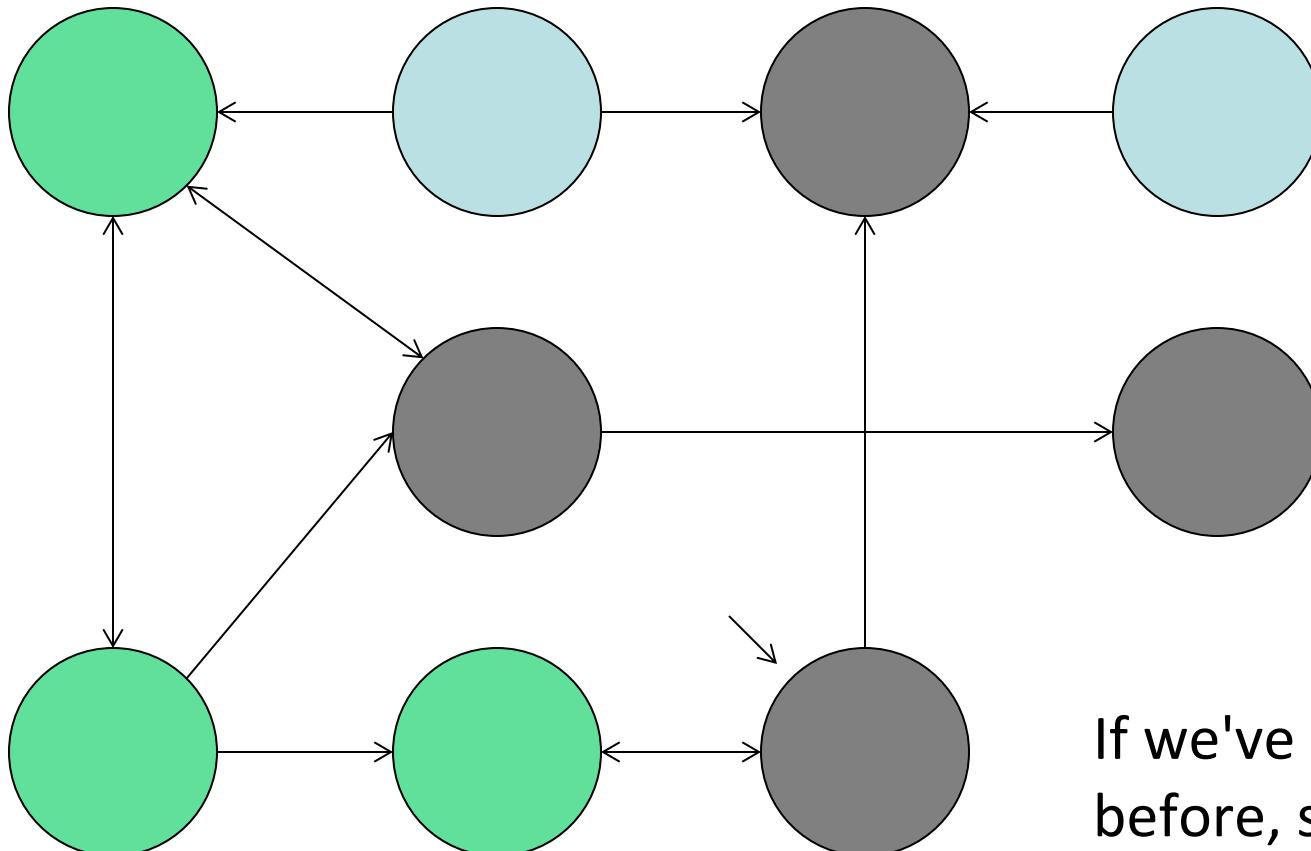
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



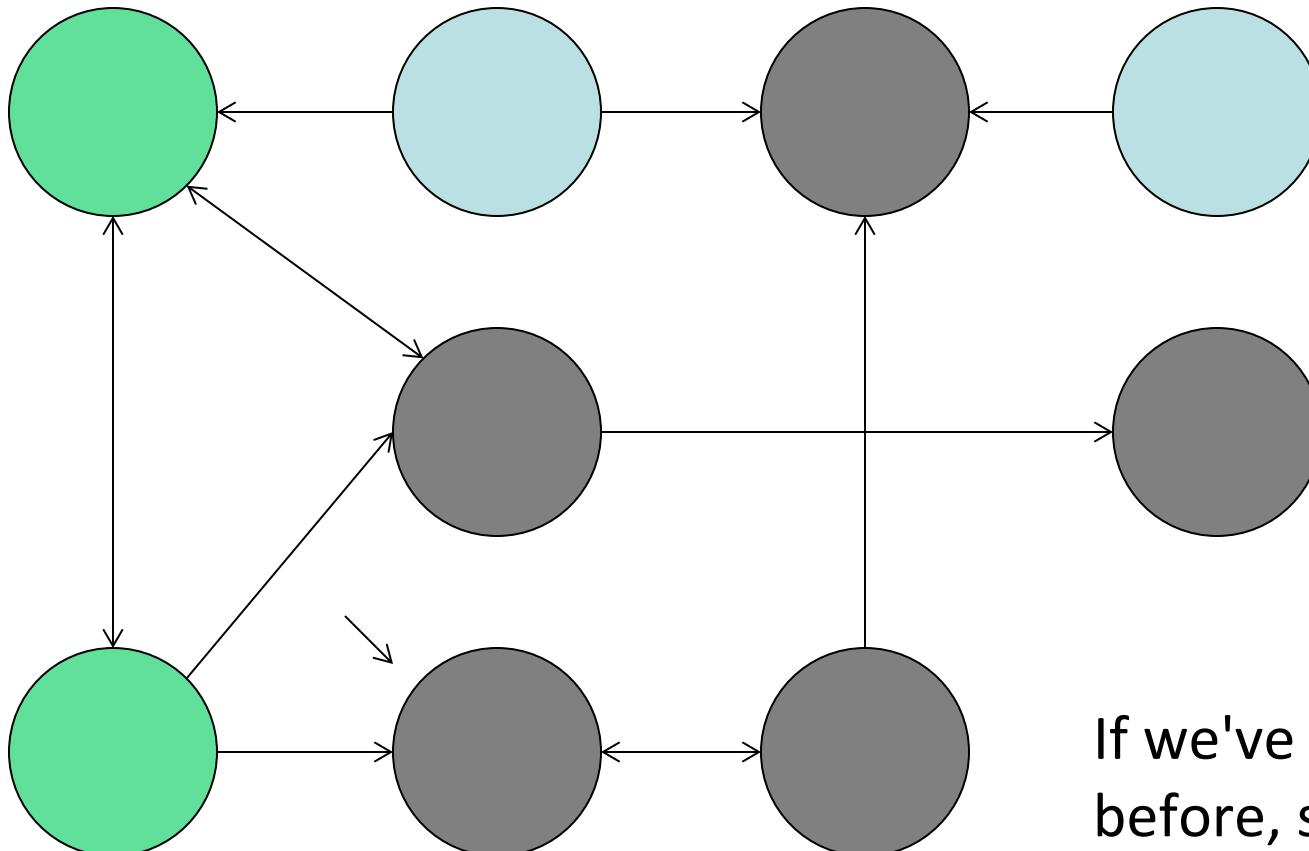
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



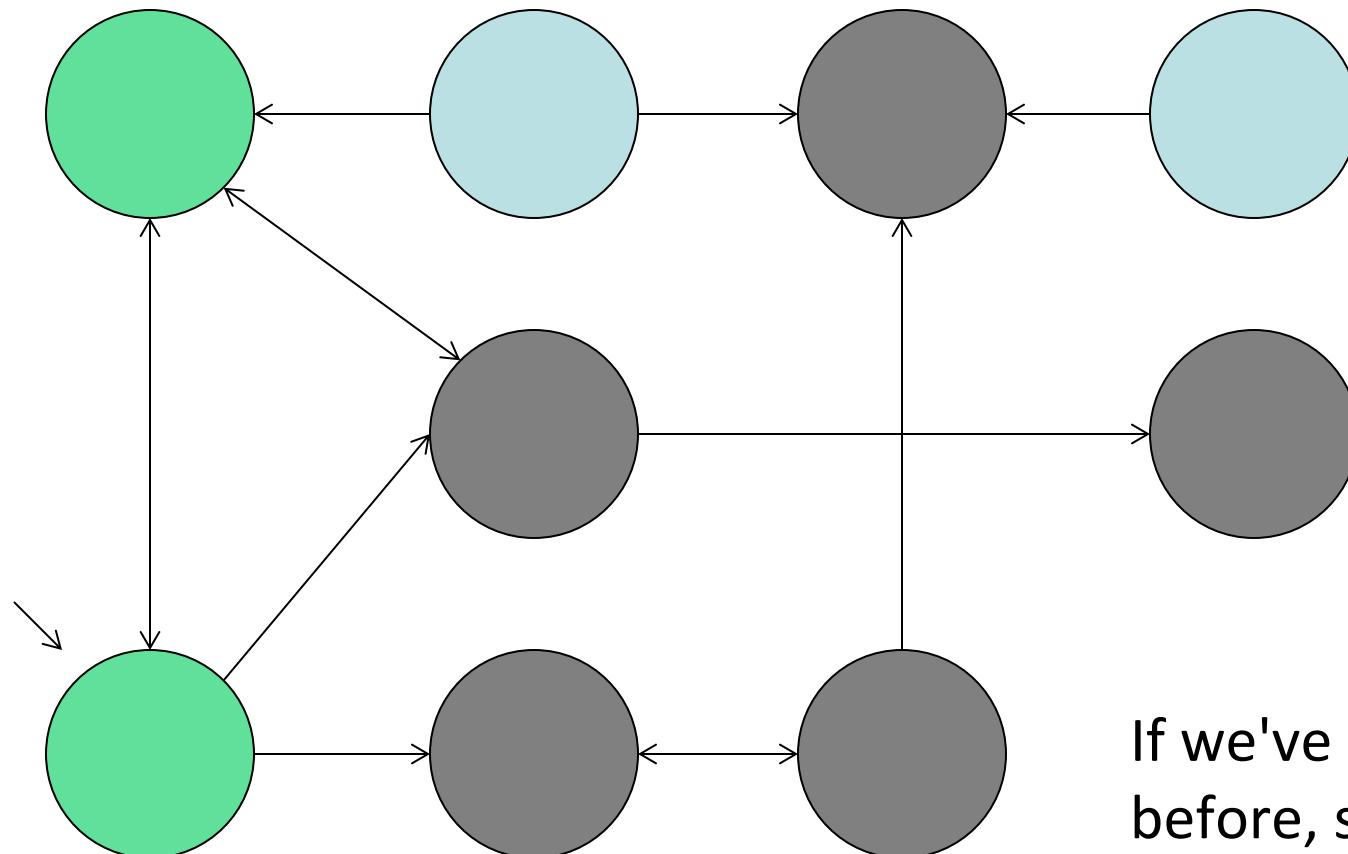
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



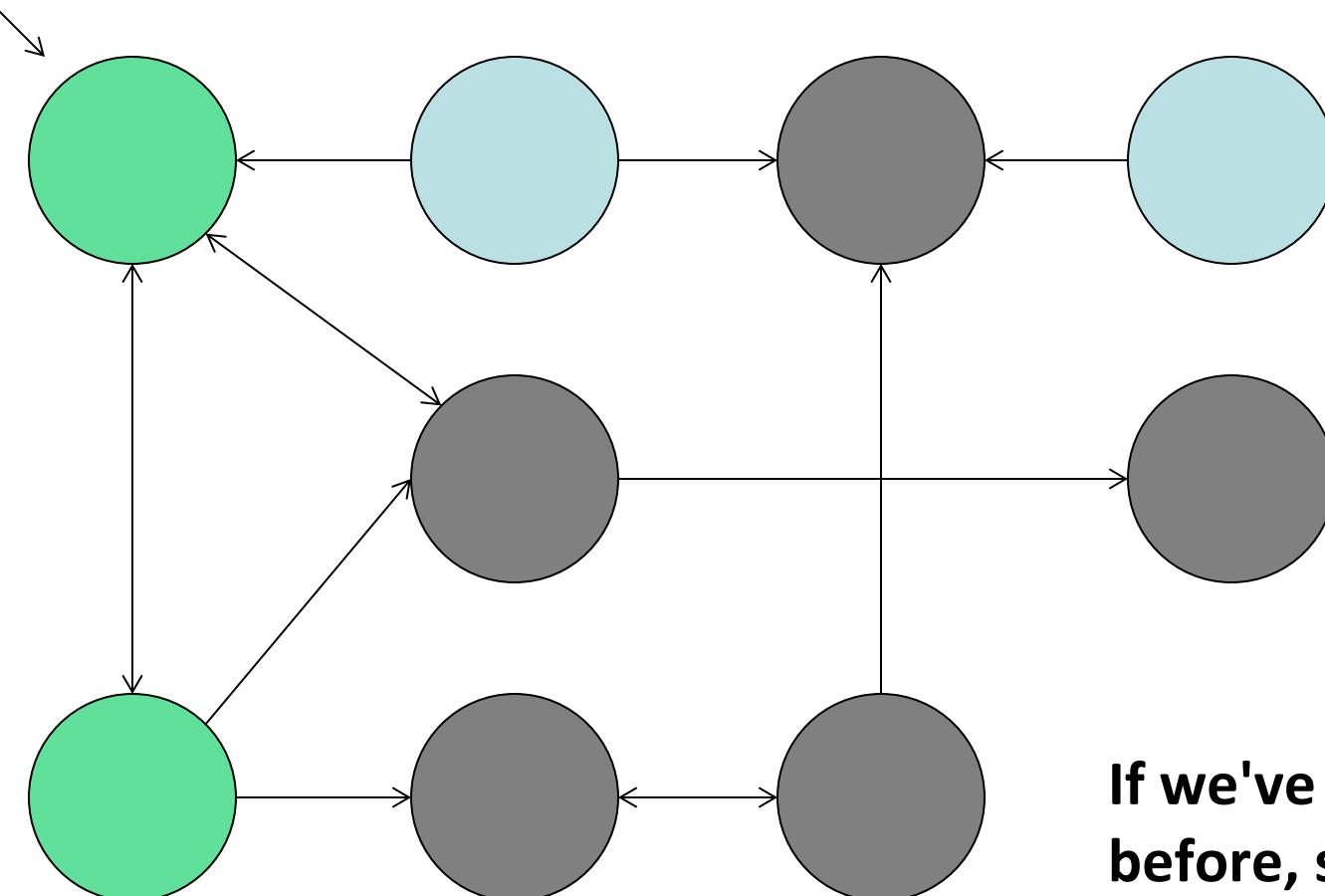
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

**DFS**



If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

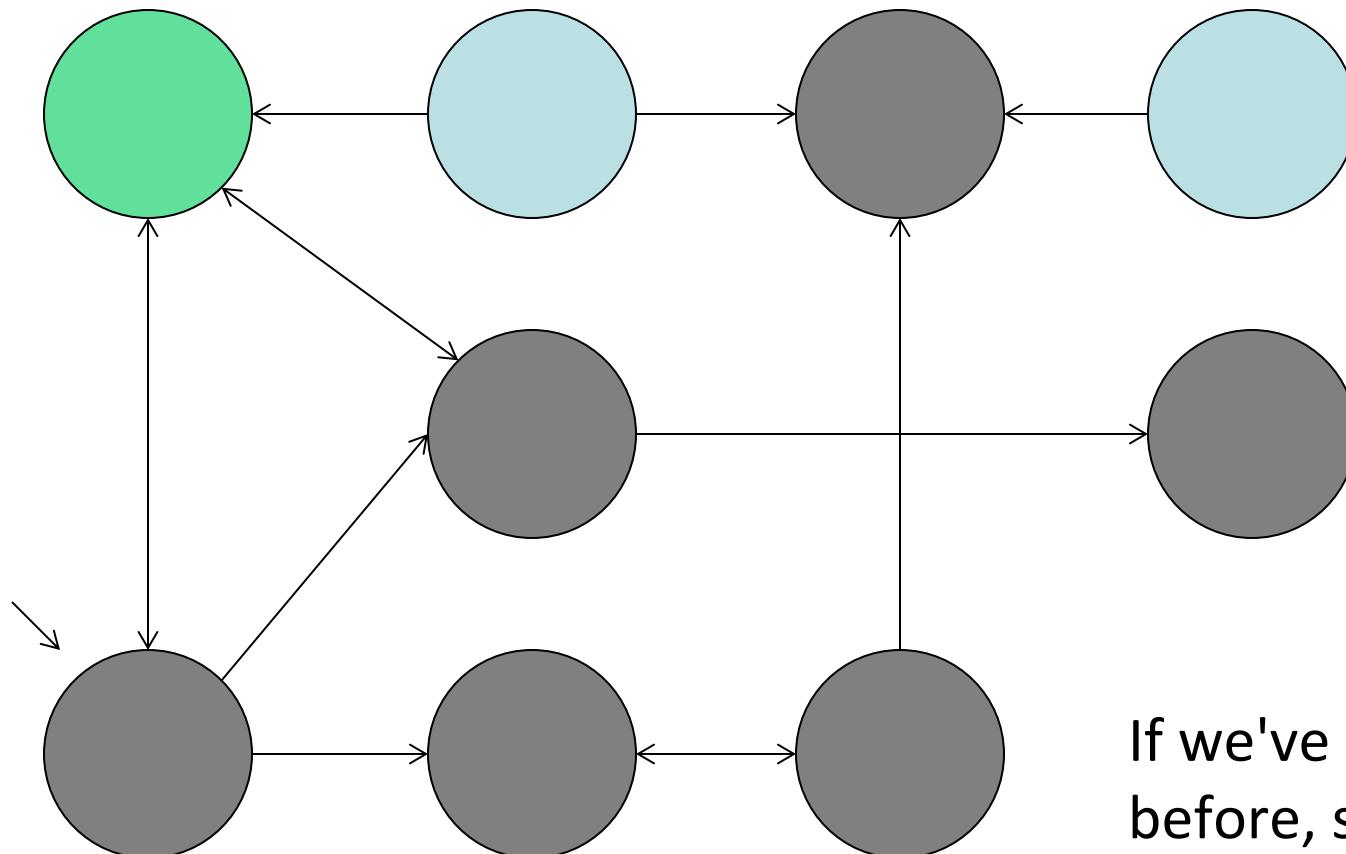
# DFS



**If we've seen the node before, stop**

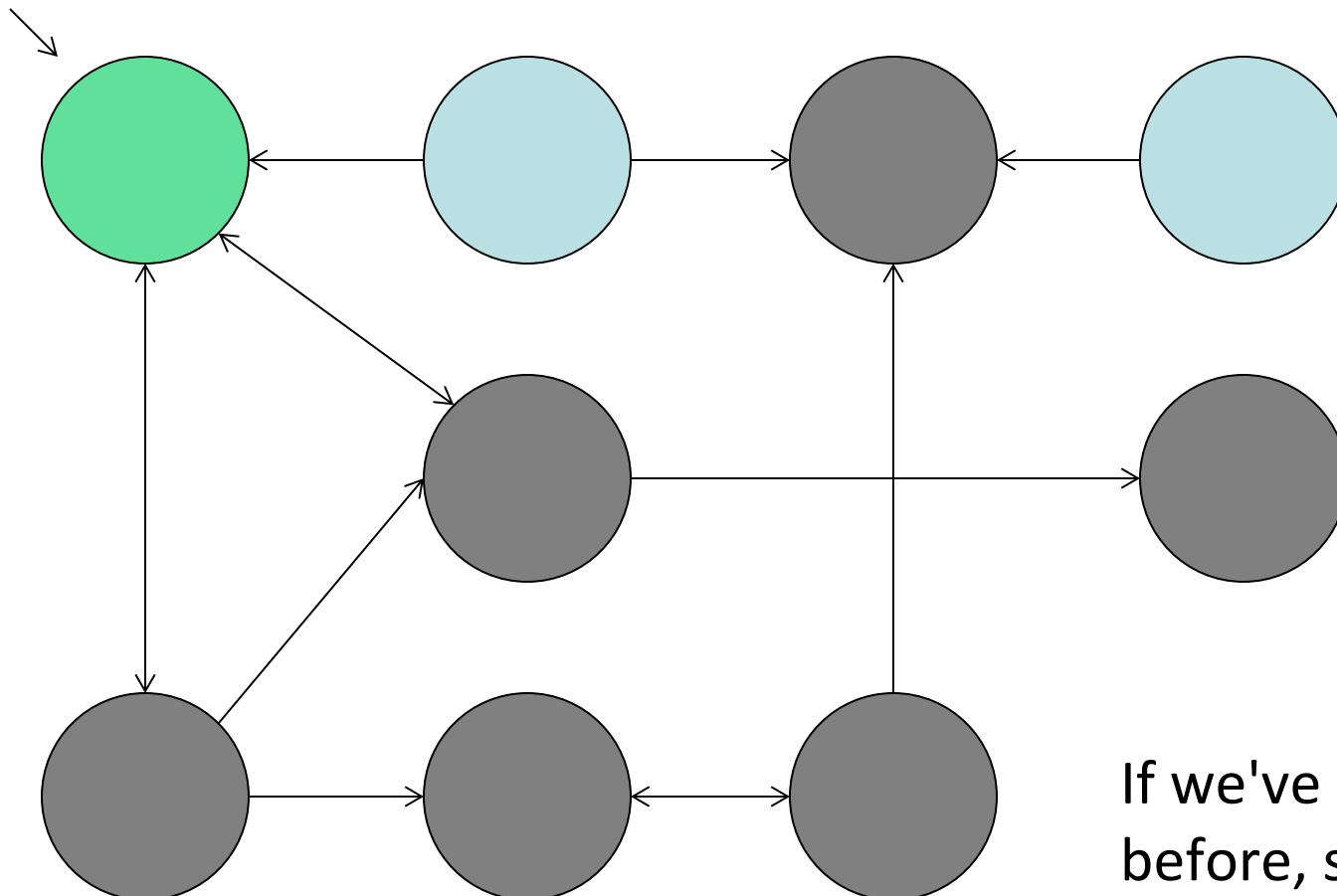
Otherwise, visit all the unvisited nodes from this node

# DFS



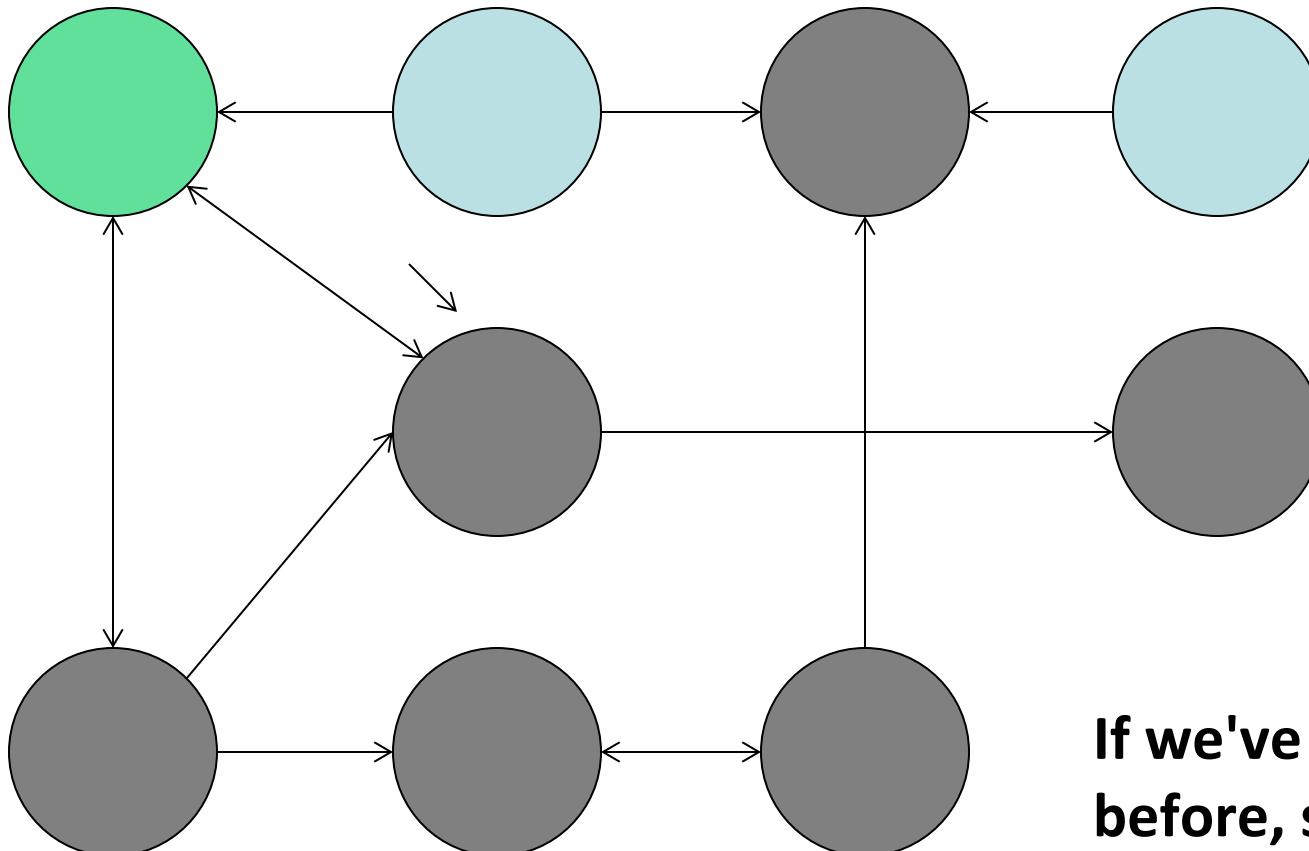
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

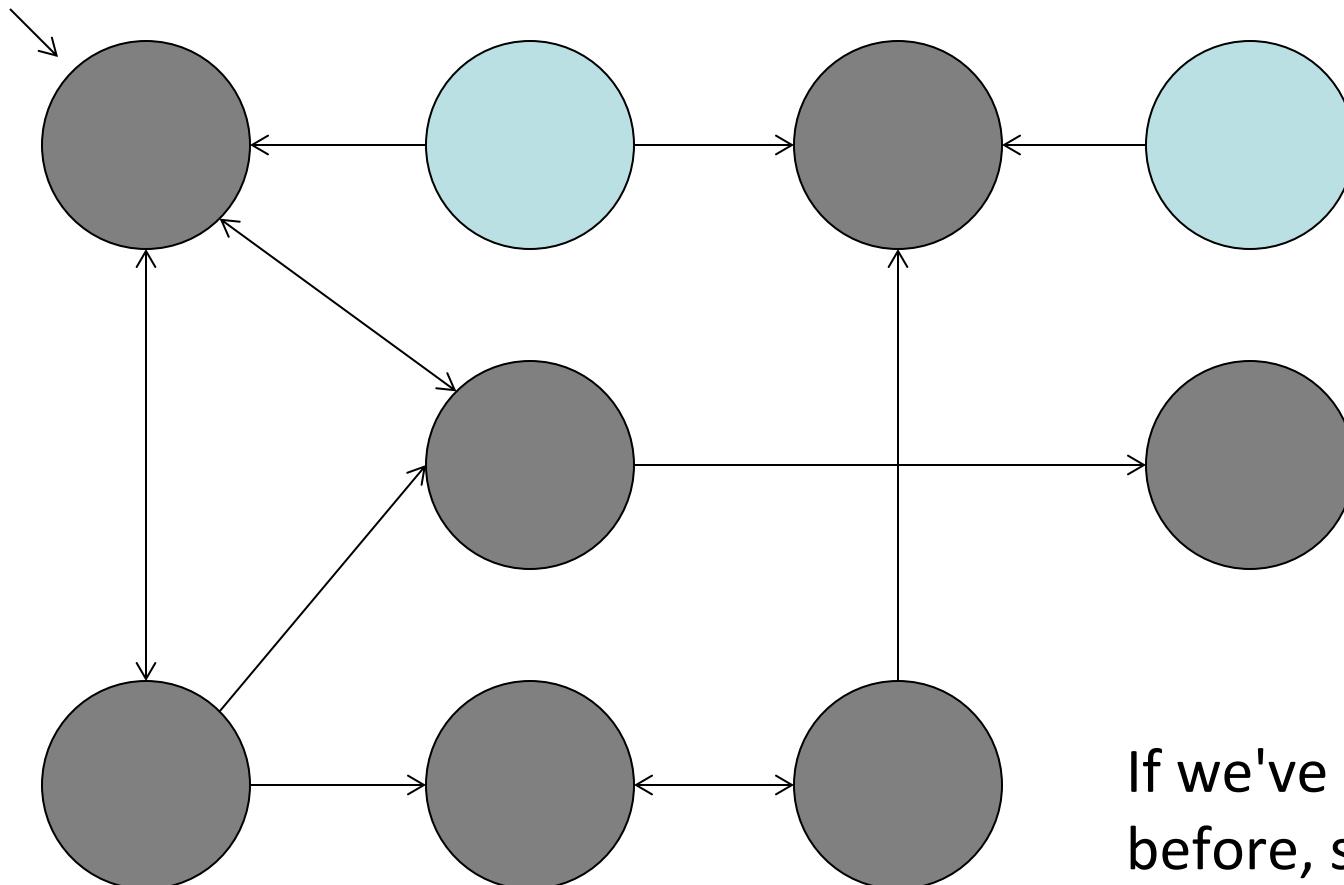
# DFS



**If we've seen the node before, stop**

Otherwise, visit all the unvisited nodes from this node

# DFS



If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS Details

- In an  $n$ -node,  $m$ -edge graph, takes  $O(m + n)$  time with an adjacency list
  - Visit each edge once, visit each node at most once
- Pseudocode:

```
dfs from  $v_1$ :  
    mark  $v_1$  as seen.  
    for each of  $v_1$ 's unvisited neighbors  $n$ :  
        dfs( $n$ )
```
- How could we modify the pseudocode to look for a specific path?
  - Recursive Backtracking
  - Look at maze example from earlier in the course

# Finding *Shortest* Paths

- We can find paths between two nodes, but how can we find the **shortest** path?
  - Fewest number of steps to complete a task?
  - Least amount of edits between two words?
- When have we solved this problem before?

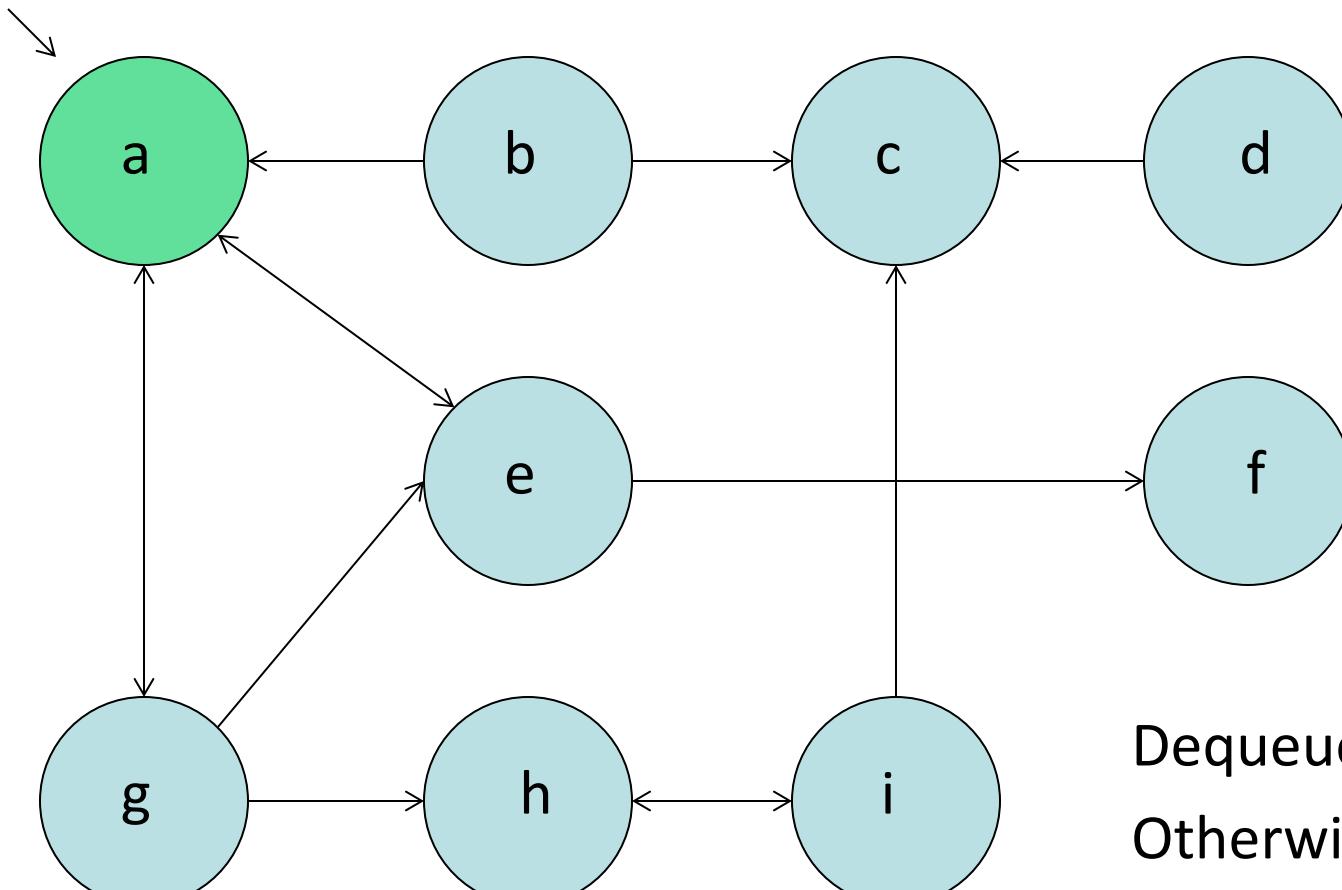
# Breadth-First Search (BFS)

- Idea: processing a node involves knowing we need to visit all its neighbors (just like DFS)
- Need to keep a TODO list of nodes to process
- Which node from our TODO list should we process first if we want the shortest path?
  - The first one we saw?
  - The last one we saw?
  - A random node?

# Breadth-First Search (BFS)

- Keep a Queue of nodes as our TODO list
- Idea: dequeue a node, enqueue all its neighbors
- Still will return the same nodes as reachable, just might have shorter paths

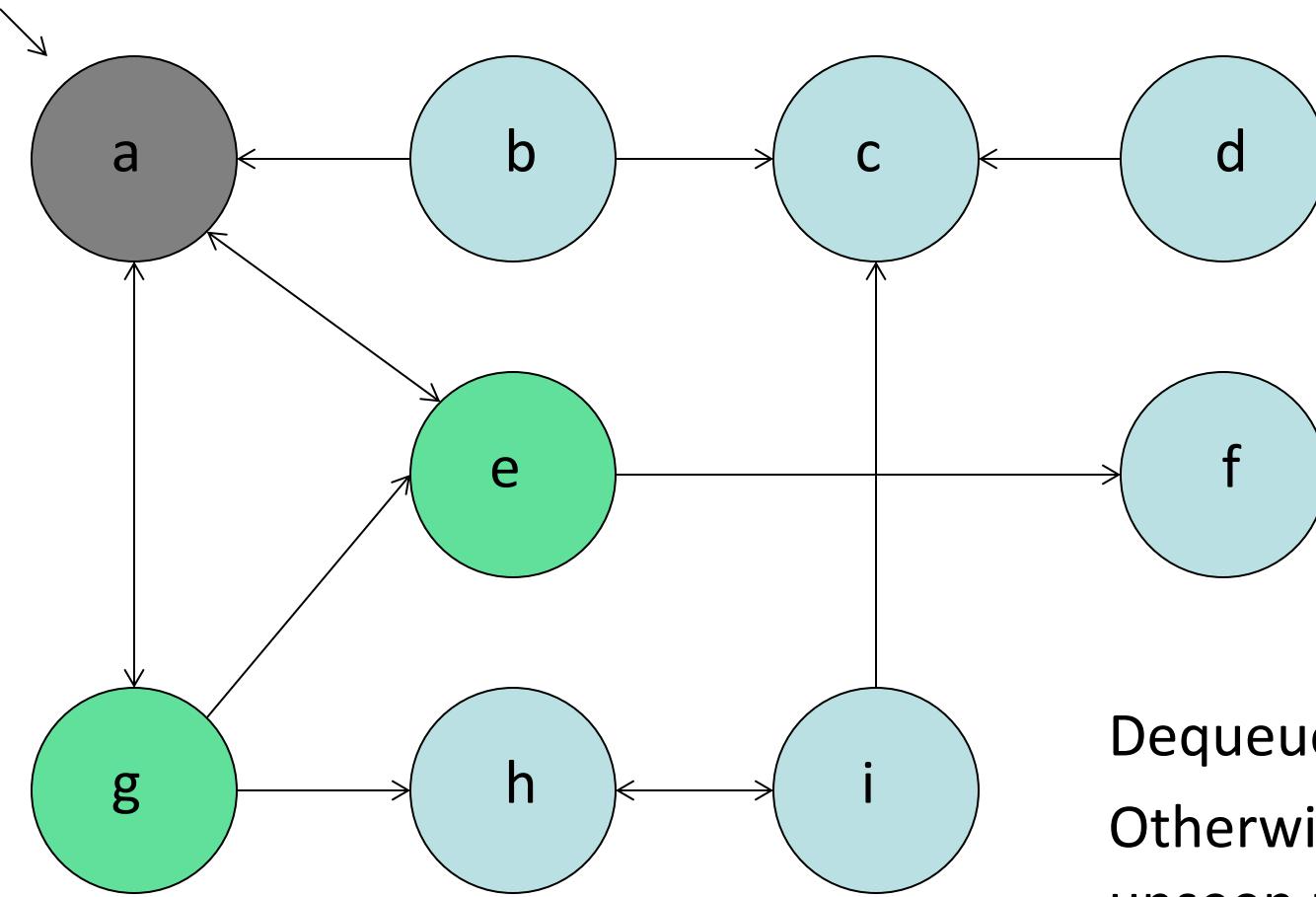
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: a

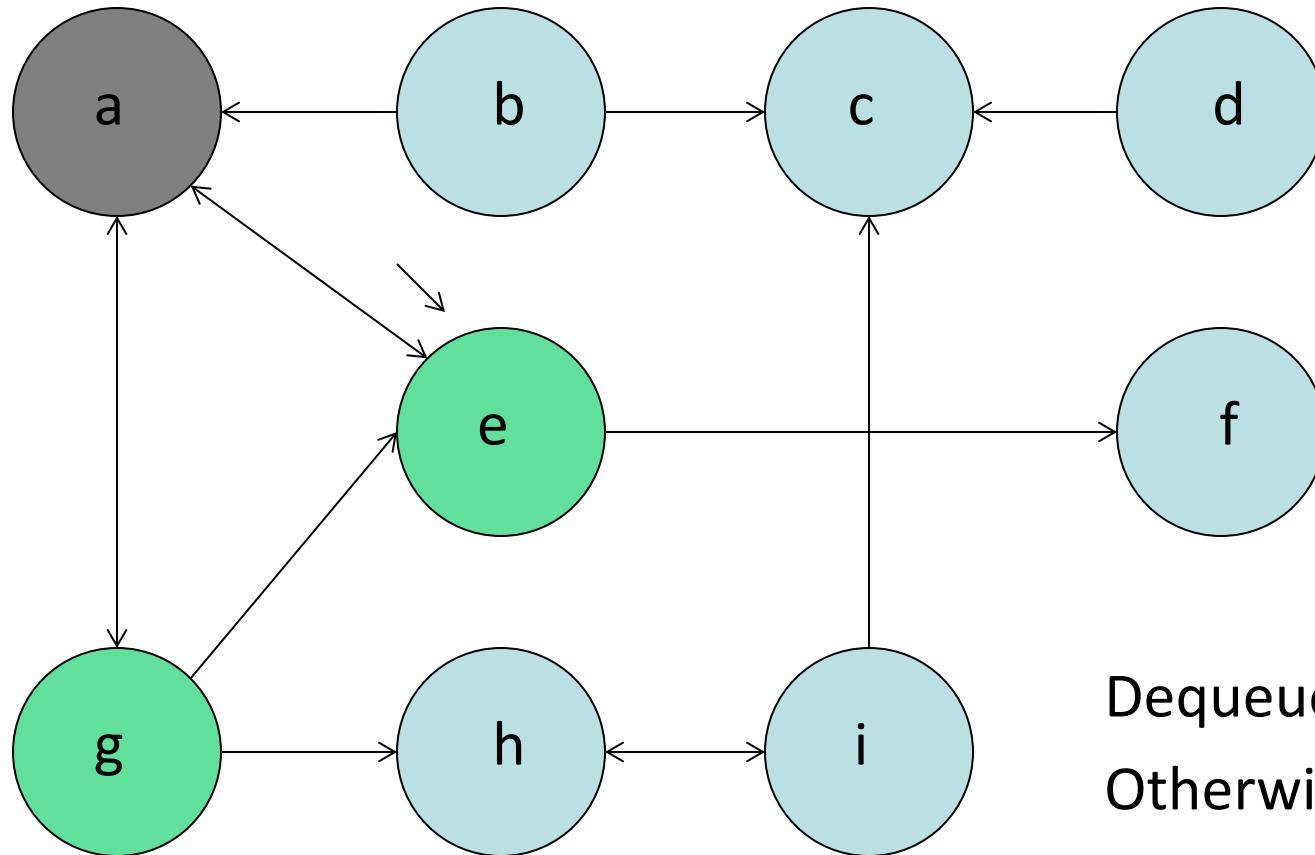
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: e, g

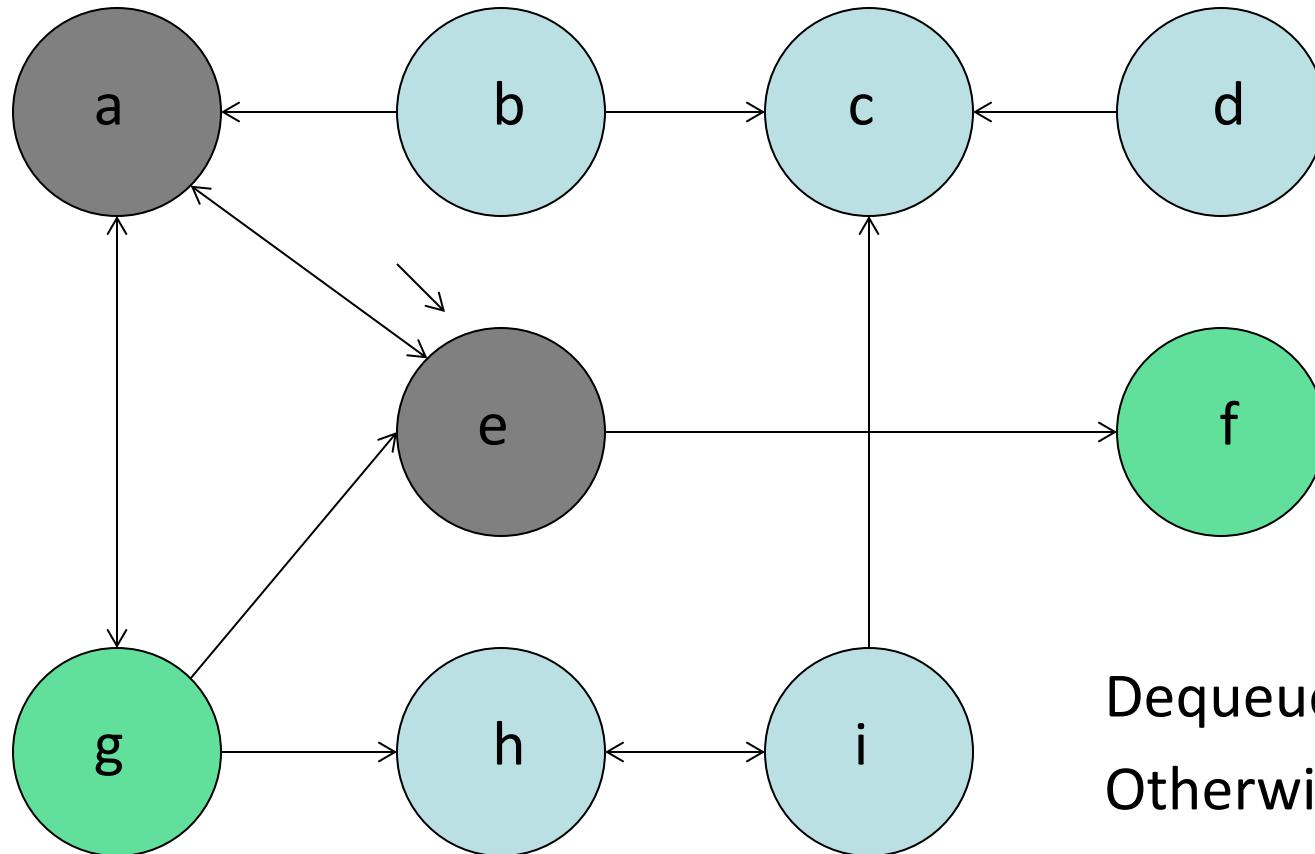
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: e, g

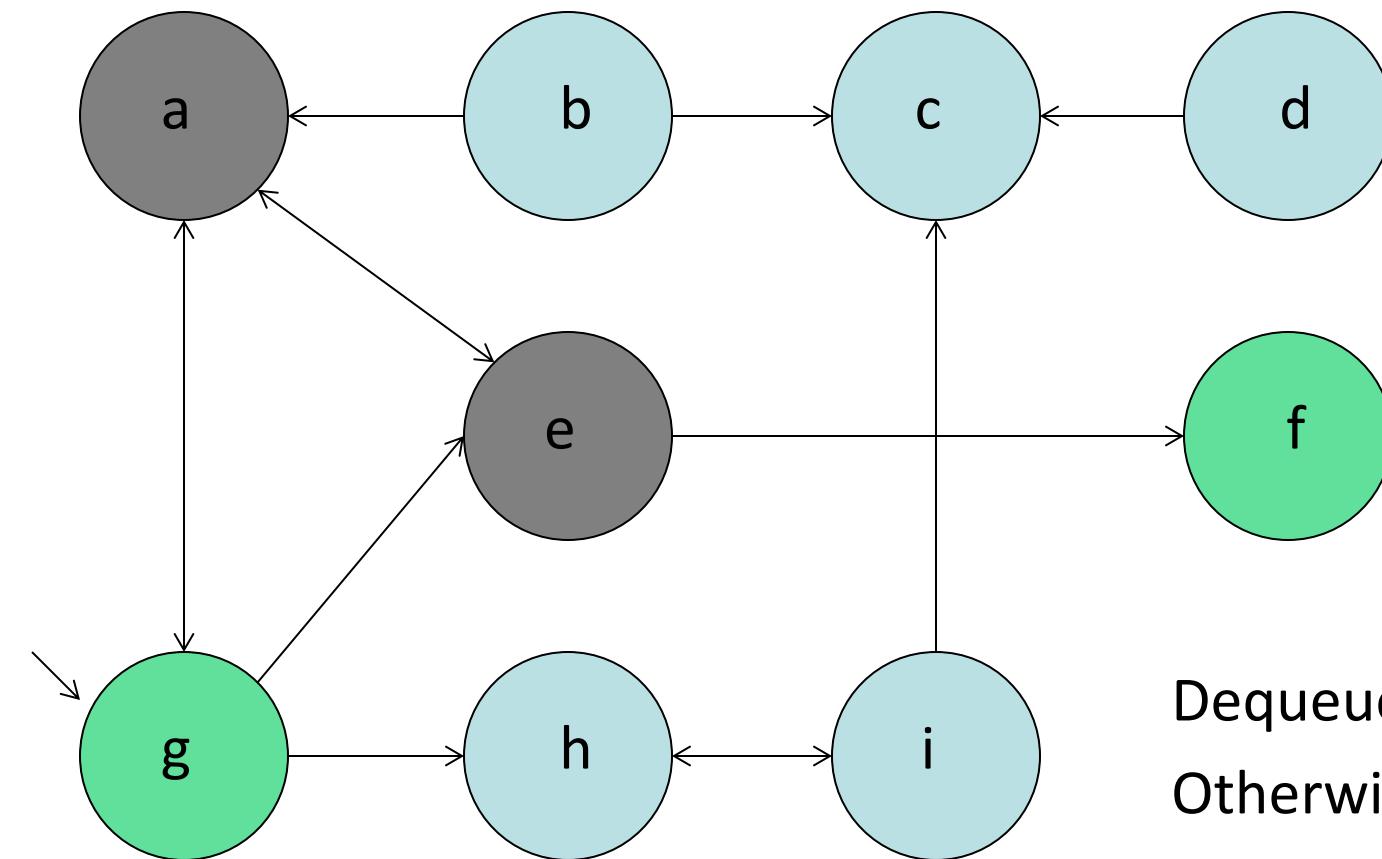
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: g, f

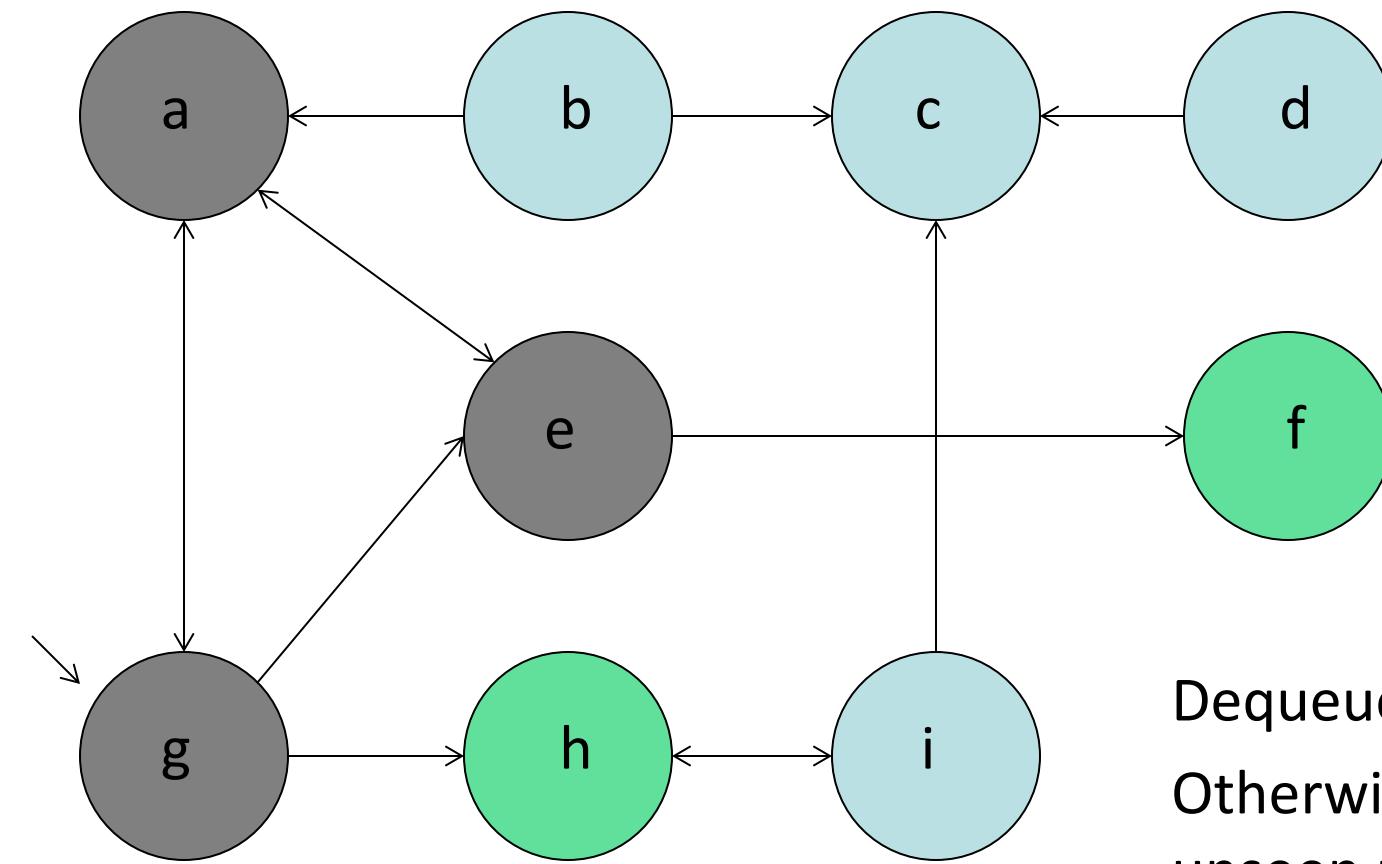
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: g, f

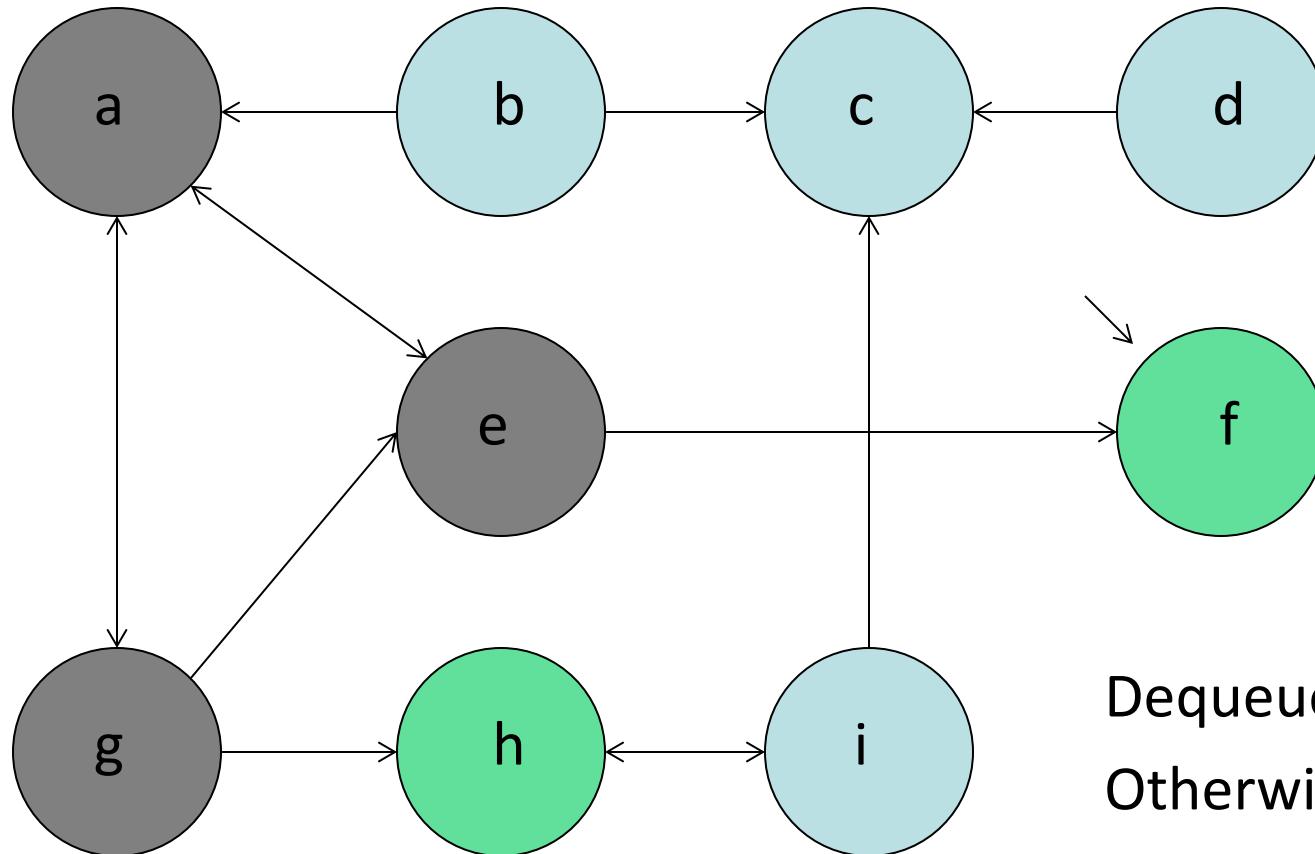
# BFS



queue: f, h

Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

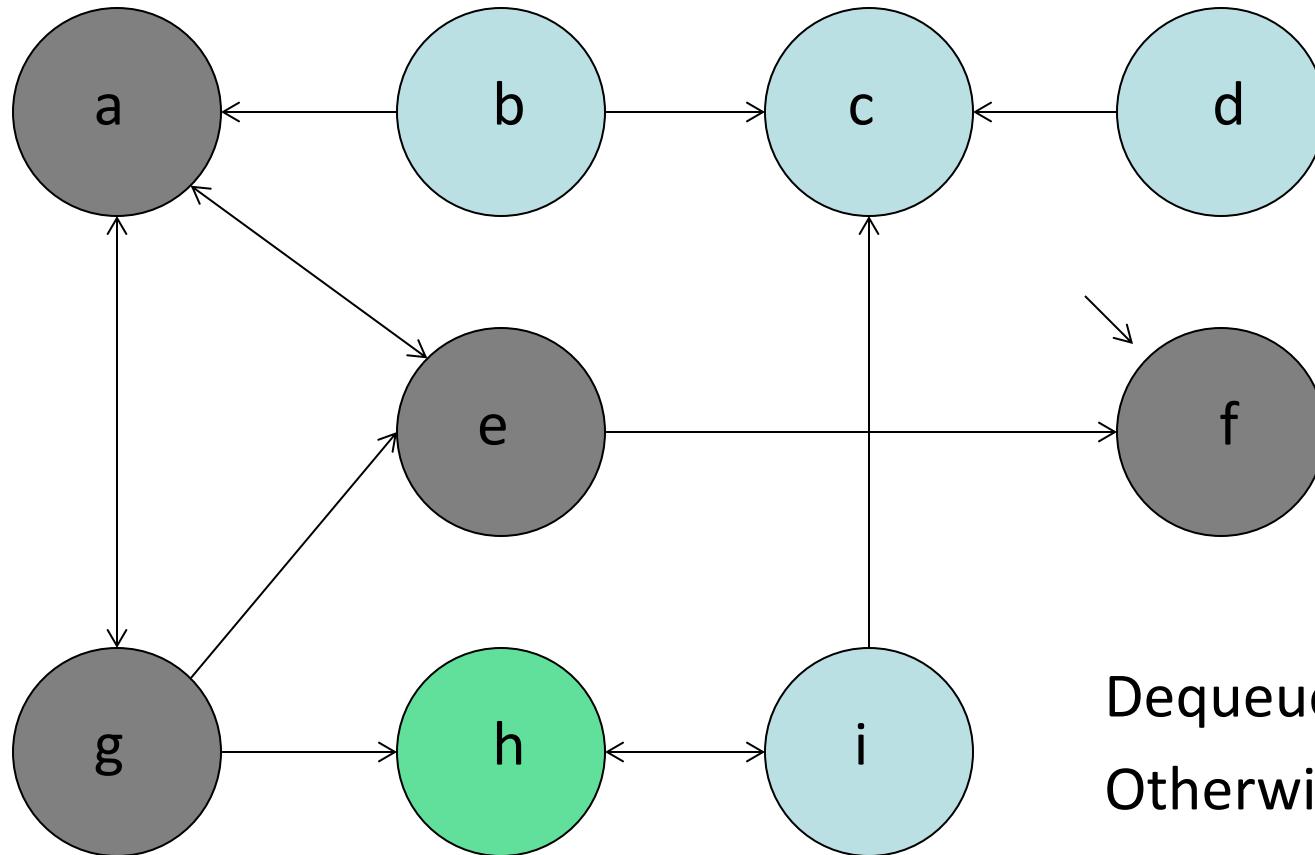
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: f, h

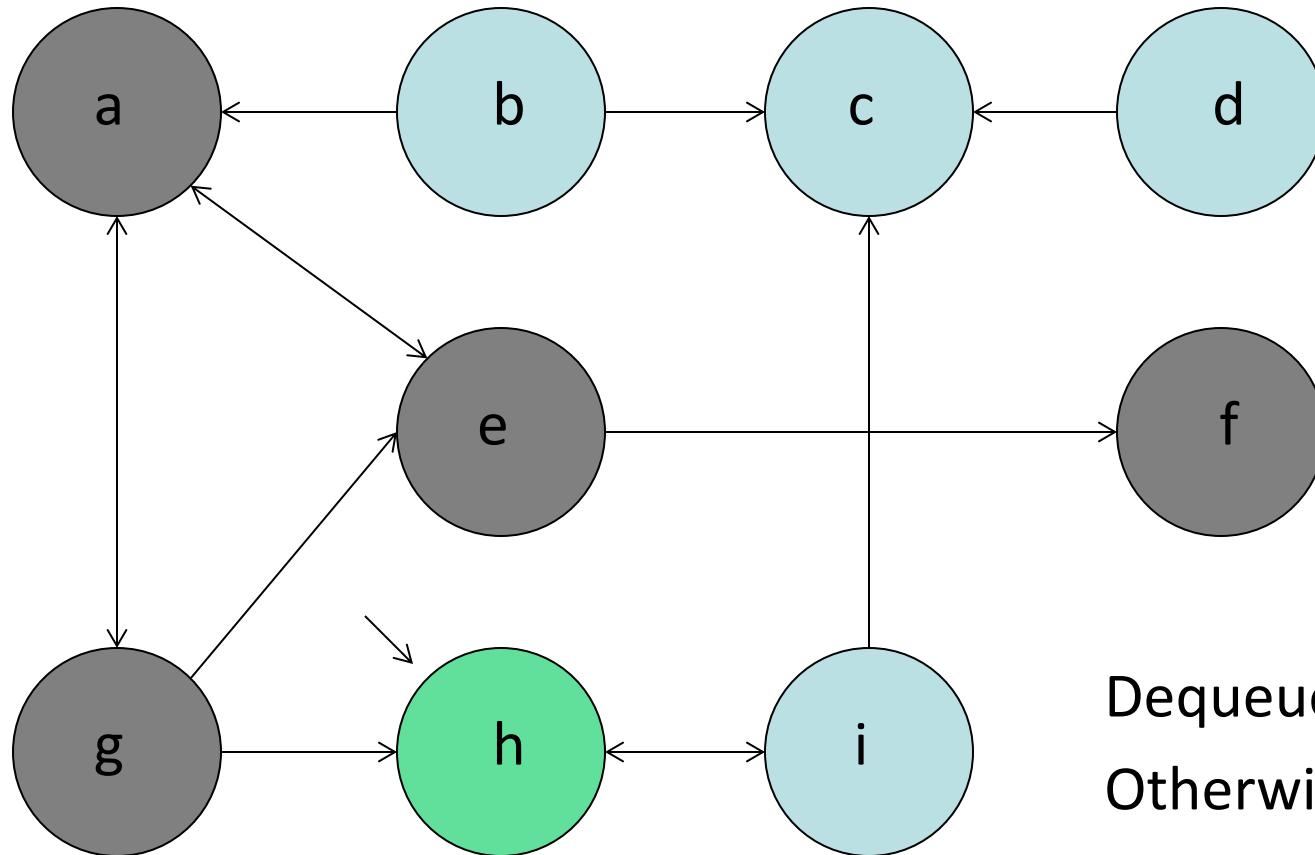
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: h

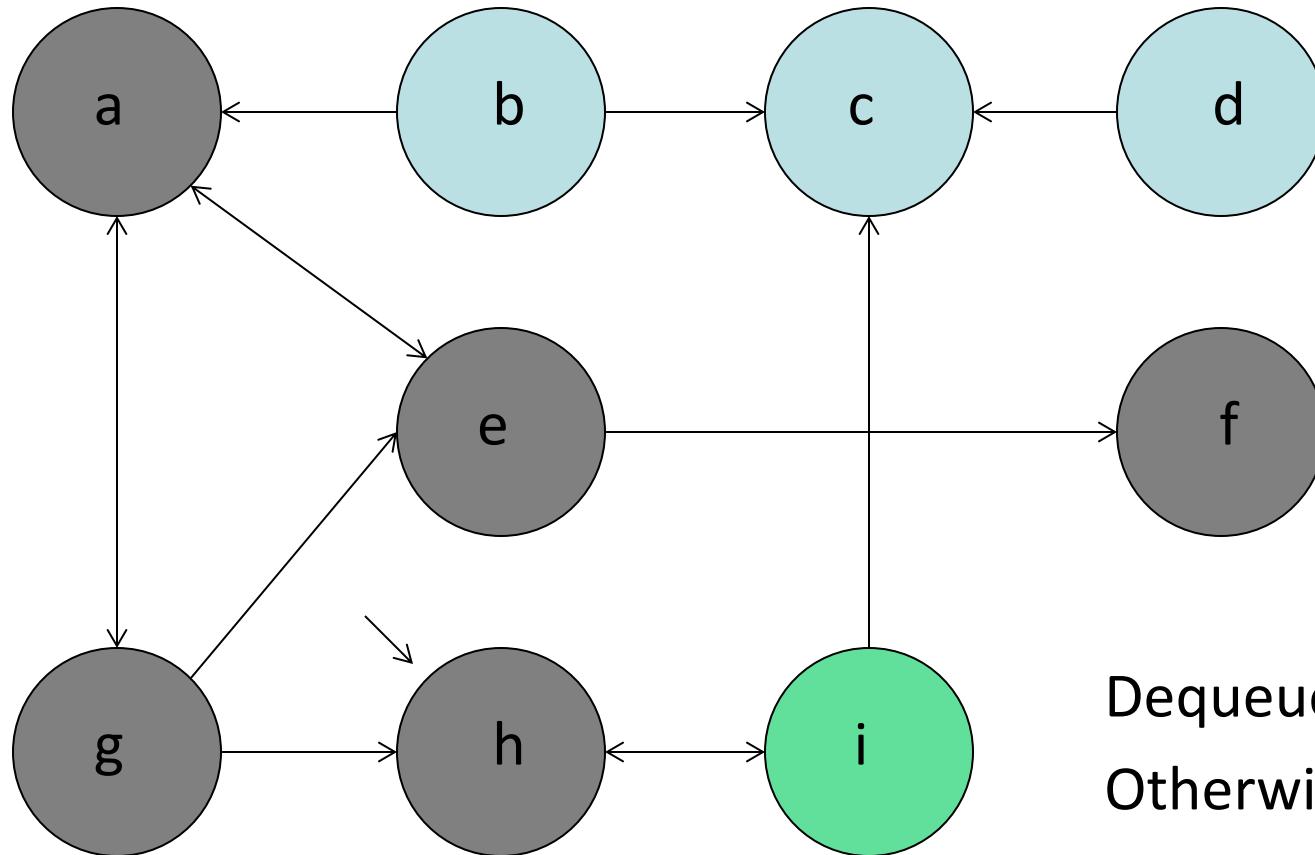
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: h

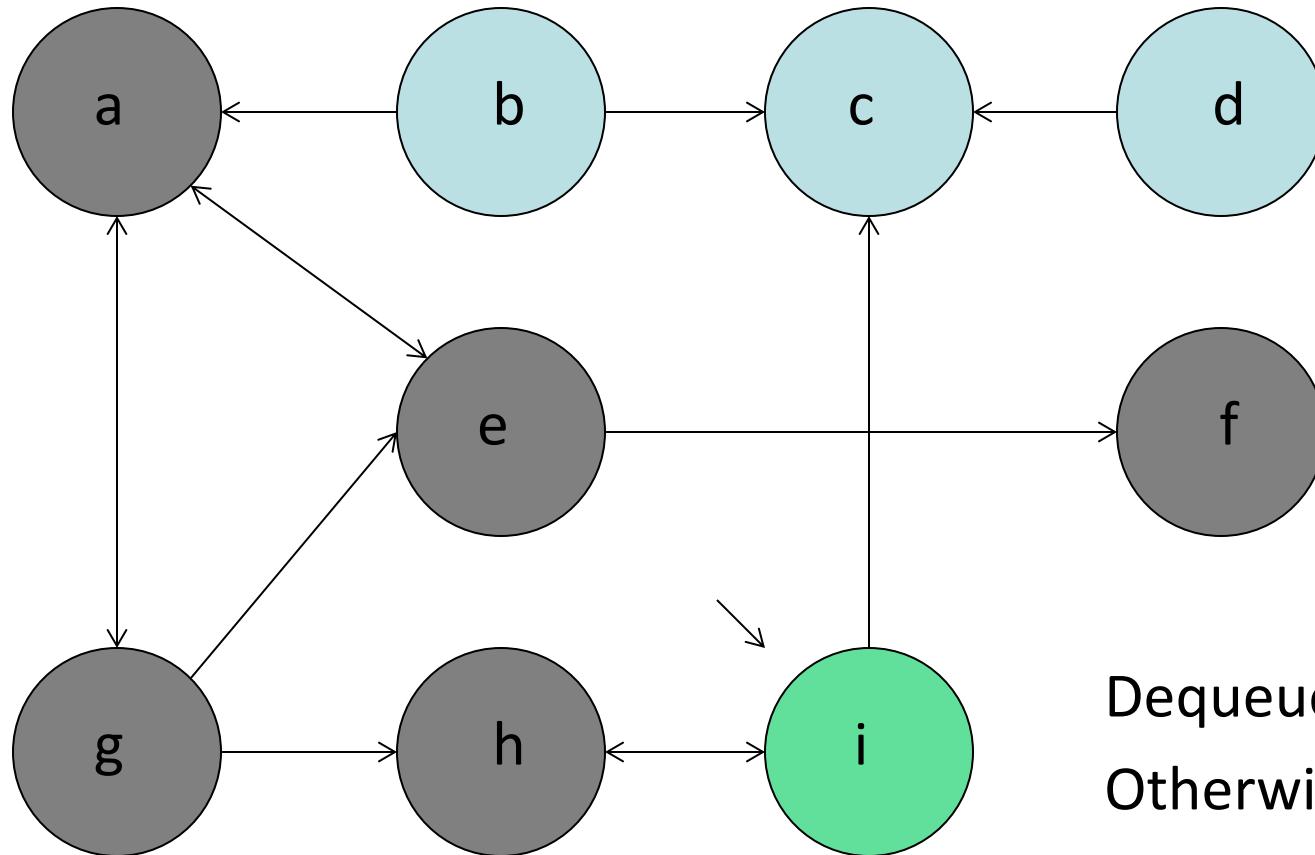
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: i

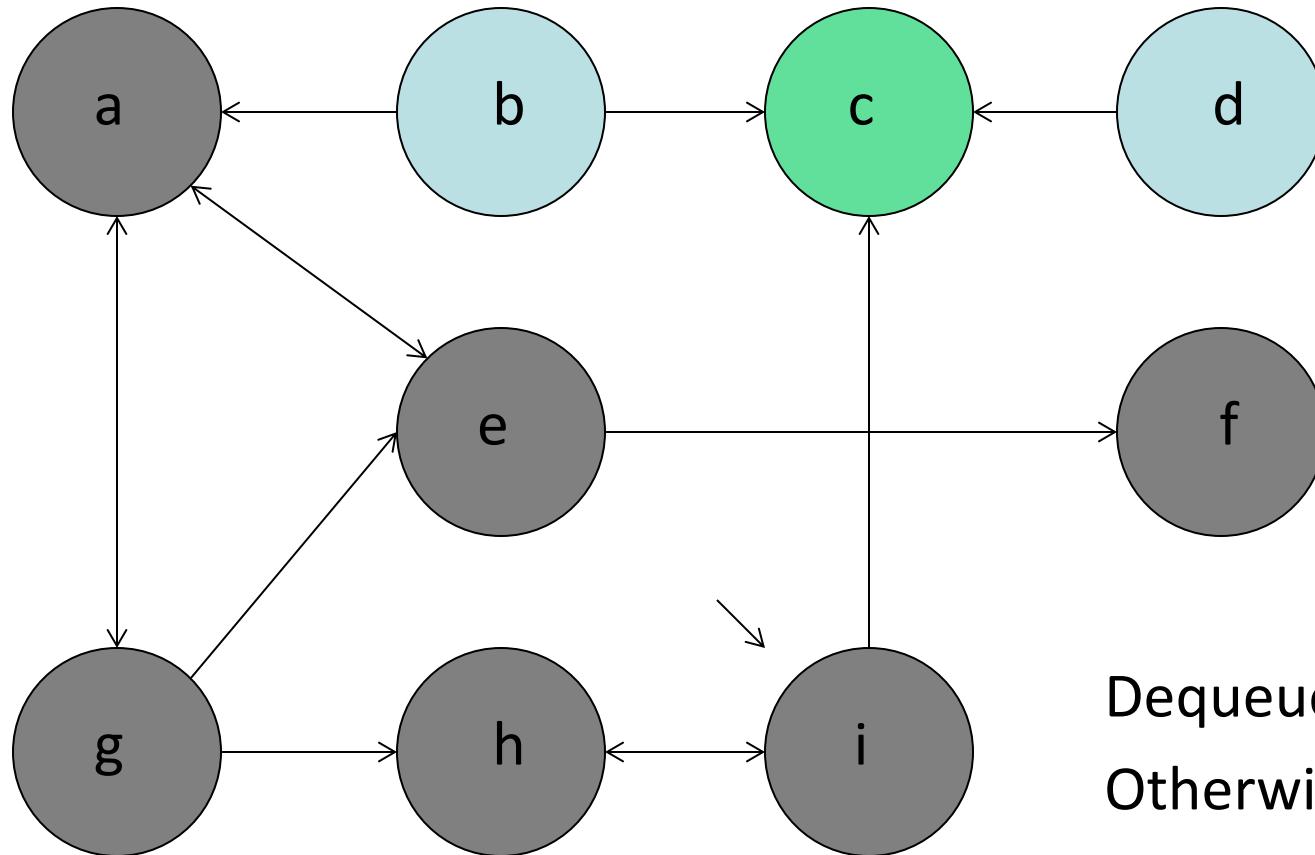
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: i

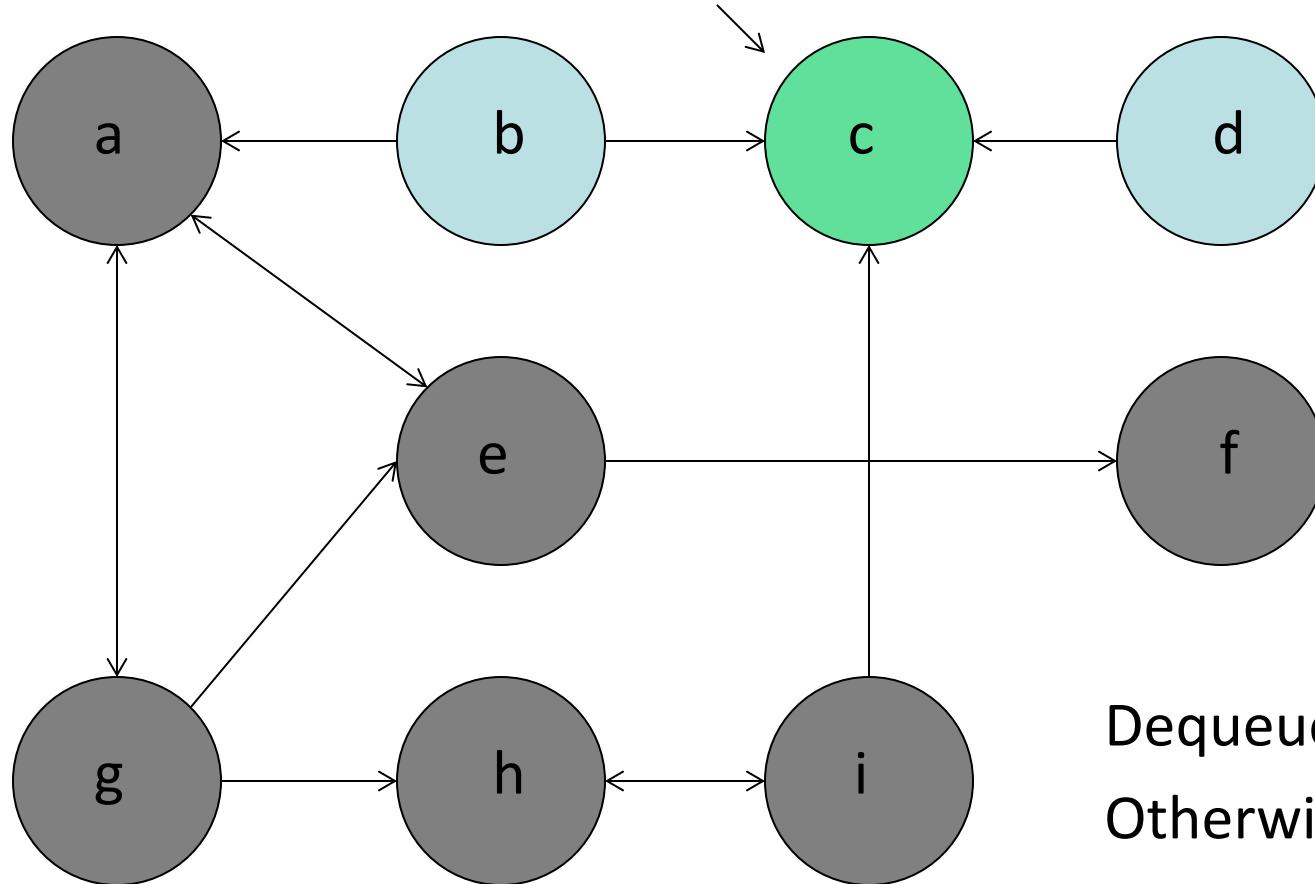
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: c

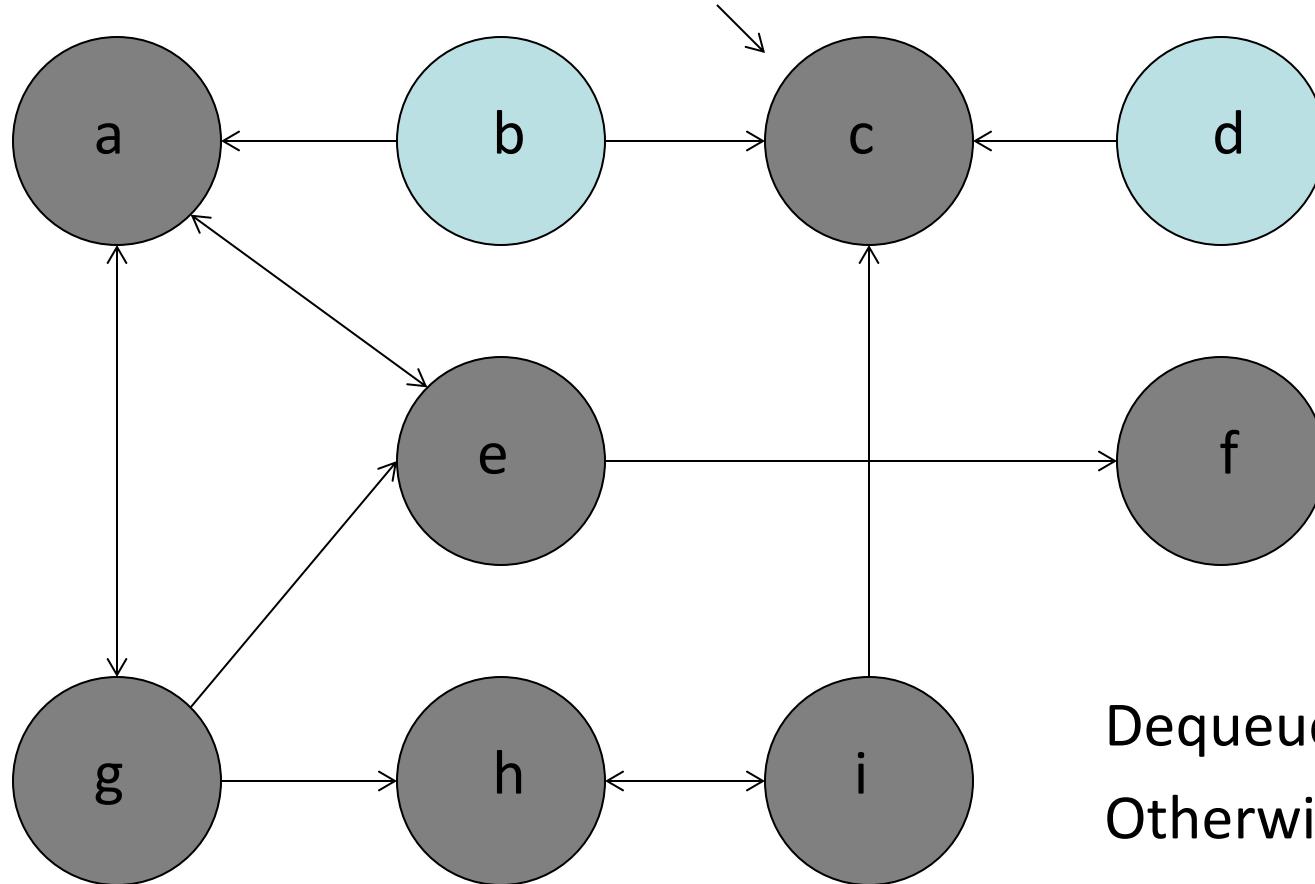
# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: c

# BFS



Dequeue a node  
Otherwise, add all its  
unseen neighbors to the  
queue

queue: c

# BFS Details

- In an  $n$ -node,  $m$ -edge graph, takes  $O(m + n)$  time with an adjacency list
  - Visit each edge once, visit each node at most once
- Pseudocode:

```
bfs from  $v_1$ :  
    add  $v_1$  to the queue.  
    while queue is not empty:  
        dequeue a node  $n$   
        enqueue  $n$ 's unseen neighbors
```
- How could we modify the pseudocode to look for a specific path?