

# CS 106B, Lecture 22

## Graphs

# Plan for Today

- Arguably the single most useful abstraction computer science: the graph
  - How to model problems using a graph
- Today and some of next week is algorithms to answer common graph questions
  - Learning these algorithms will help you solve very different problems more quickly

# Google Maps

University of California, Berkeley

Stanford University

Add destination

Leave now ▾

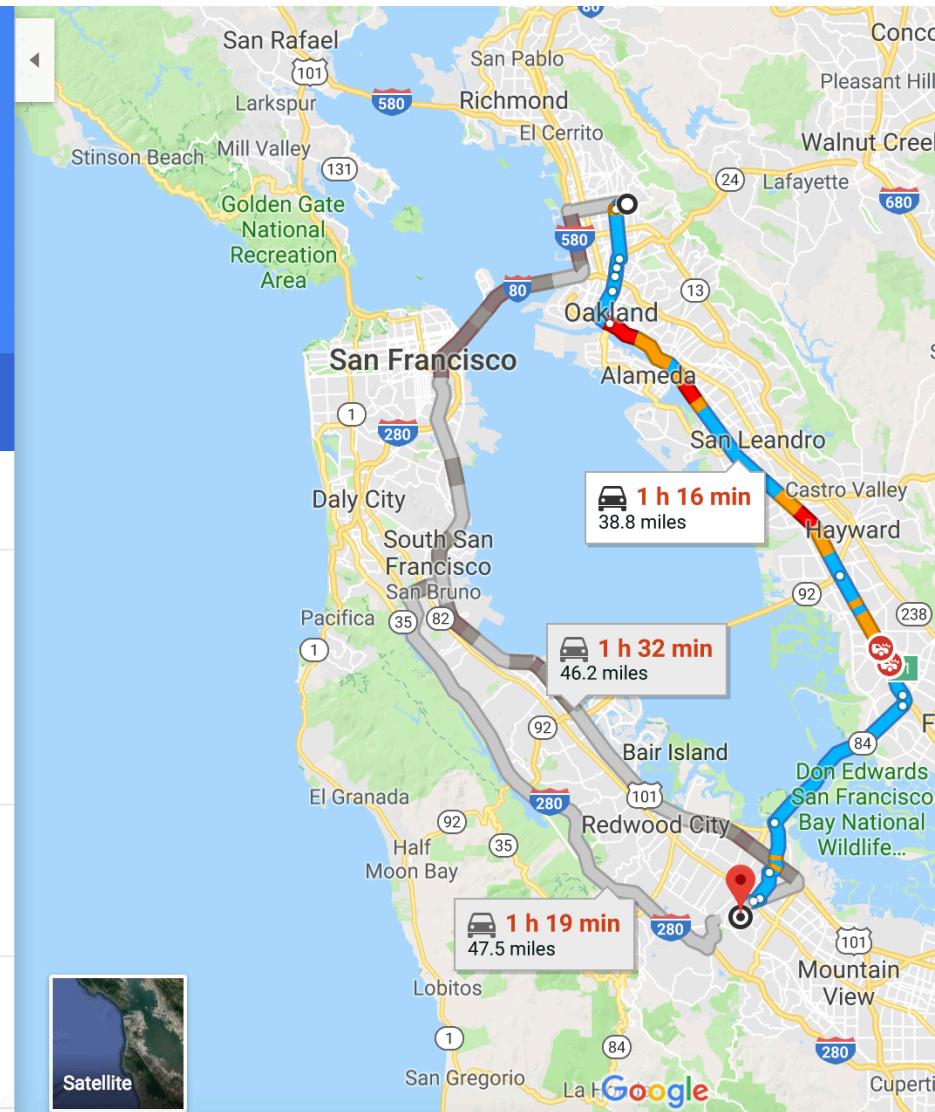
OPTIONS

 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.

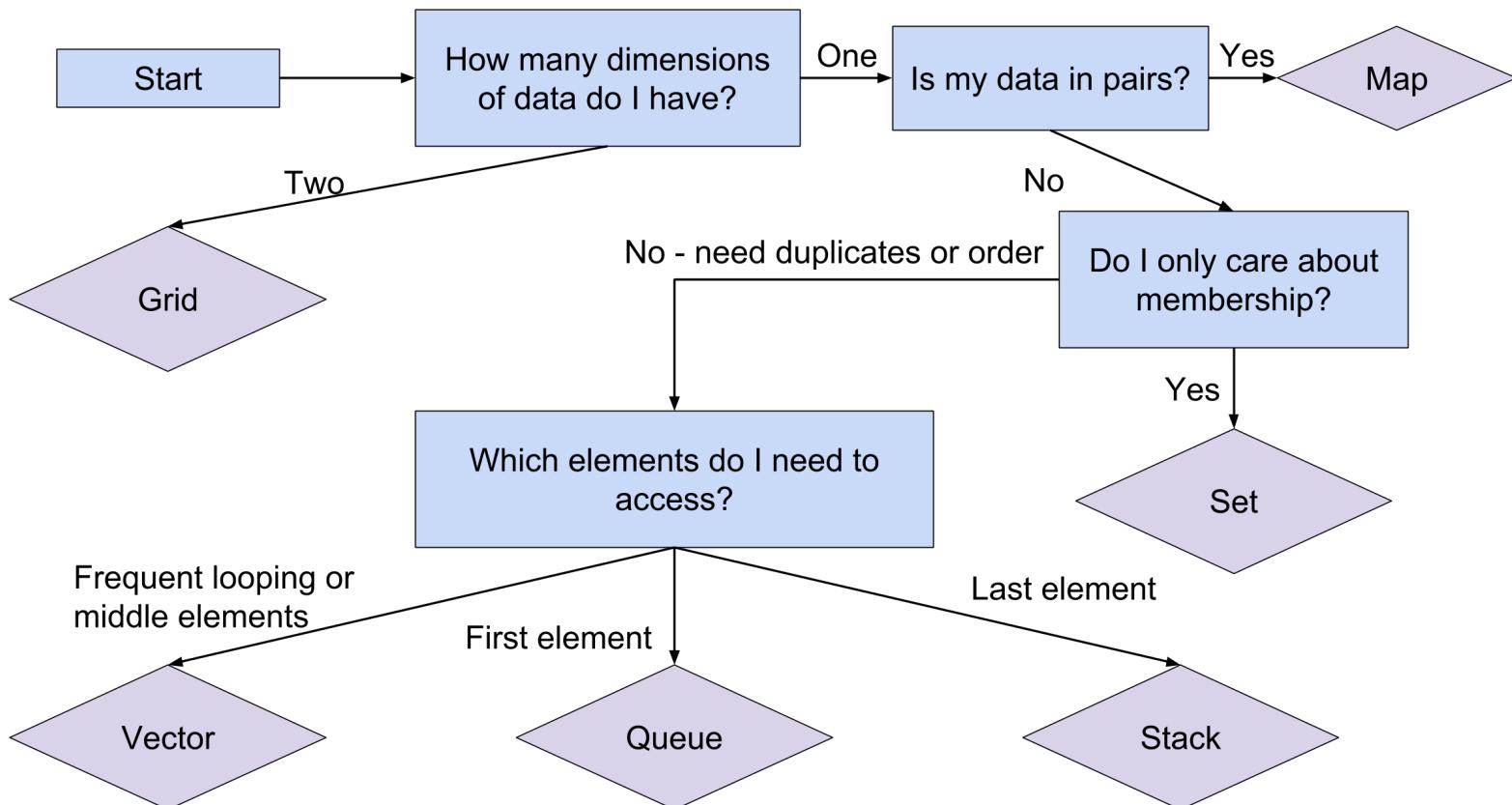
 via I-280 S **1 h 19 min**  
Heavy traffic, as usual

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

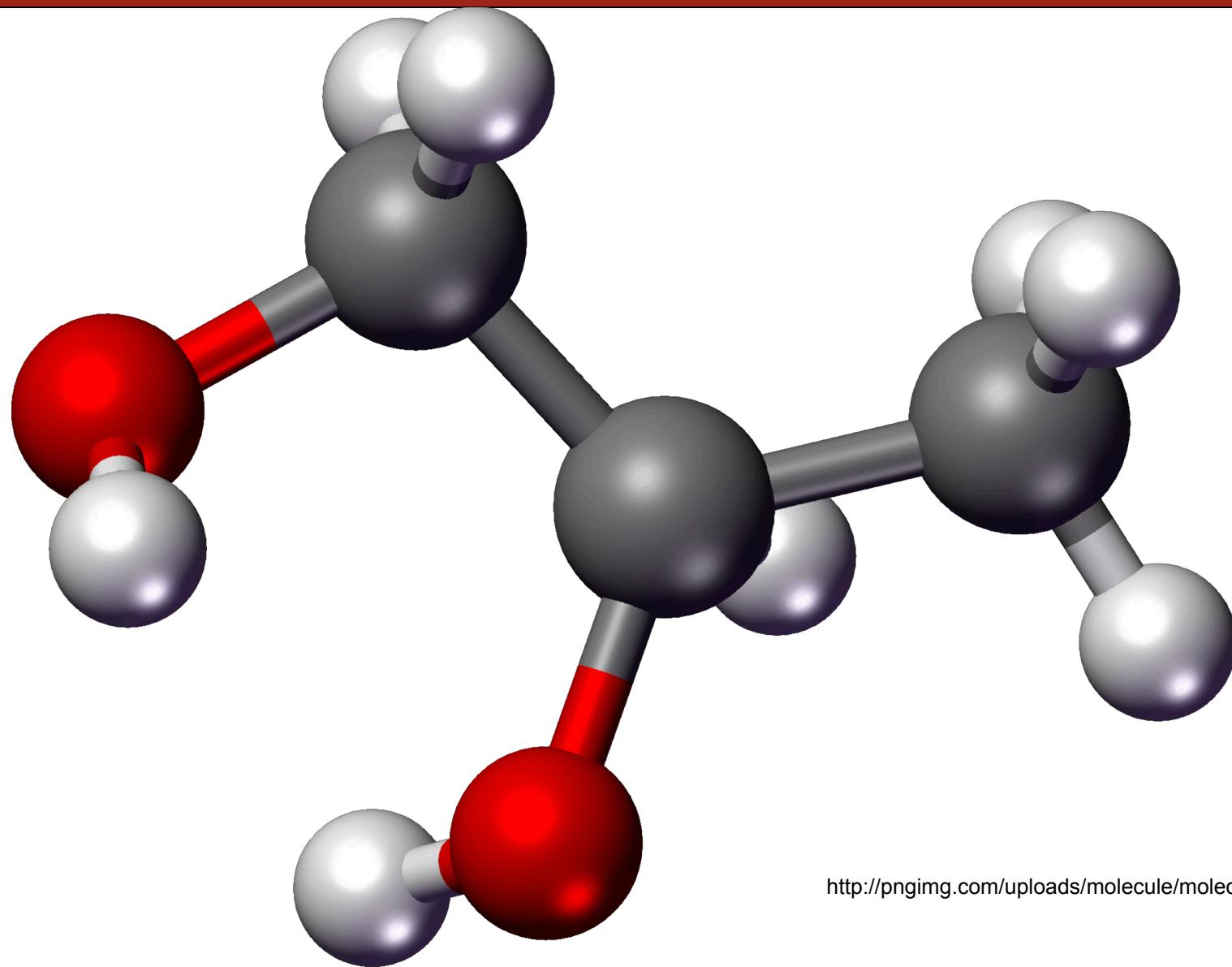


The map shows the San Francisco Bay Area with major roads and landmarks. Three routes are highlighted: 1) I-880 S (blue line) from Berkeley to San Francisco, taking 1 h 16 min and 38.8 miles. 2) I-280 S (grey line) from Berkeley to San Francisco, taking 1 h 19 min and 47.5 miles. 3) US-101 S (yellow line) from Berkeley to San Francisco, taking 1 h 32 min and 46.2 miles. The map also shows the Golden Gate National Recreation Area, the Bay Bridge, and various cities like San Francisco, Oakland, and San Jose.

# ADT Flowchart



# Molecules



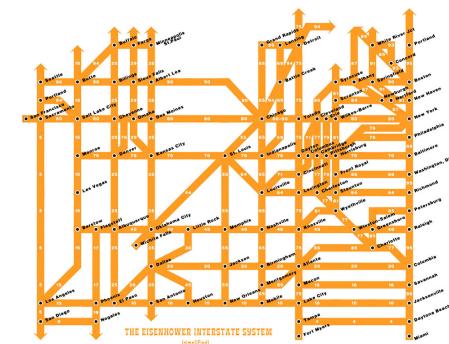
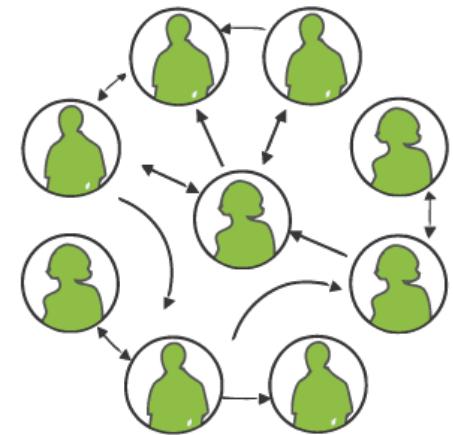
[http://pngimg.com/uploads/molecule/molecule\\_PNG50.png](http://pngimg.com/uploads/molecule/molecule_PNG50.png)

# 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 that have the relationship
- Examples:
  - Map: cities (nodes) are connected by roads (edges)
  - Flowchart: questions and recommendations (nodes) are connected by answers (edges)
  - Molecules: atoms (nodes) are connected by bonds (edges)

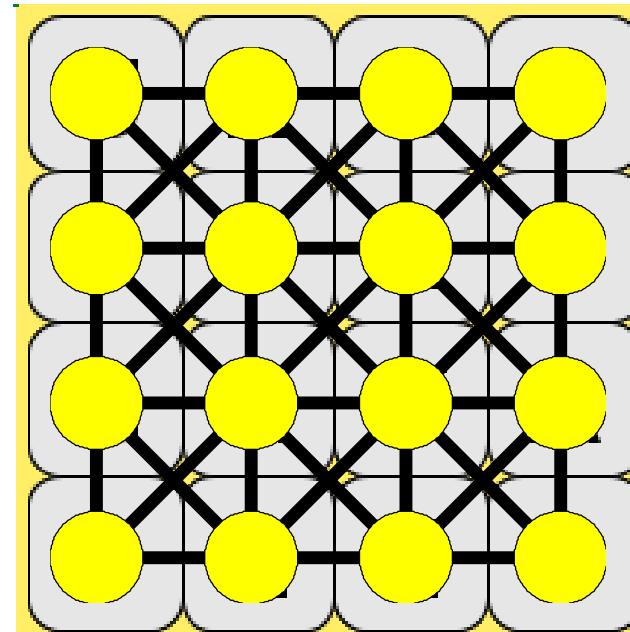
# Graph examples

- 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



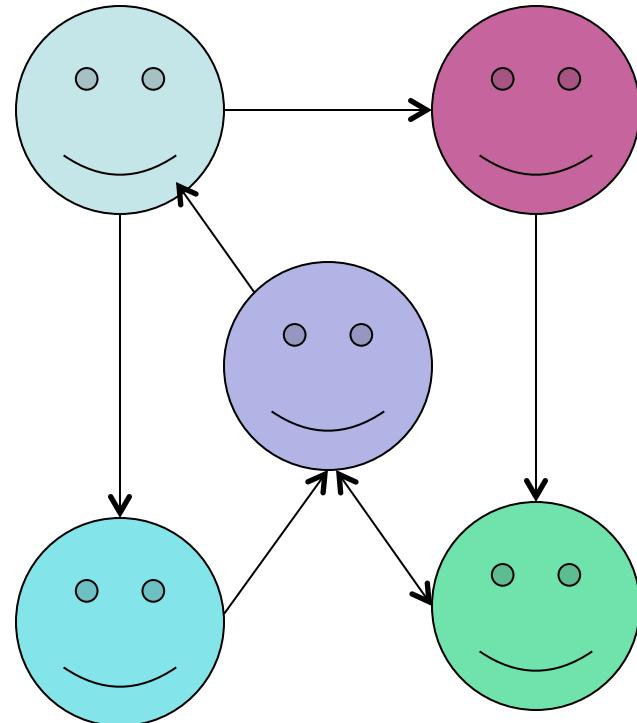
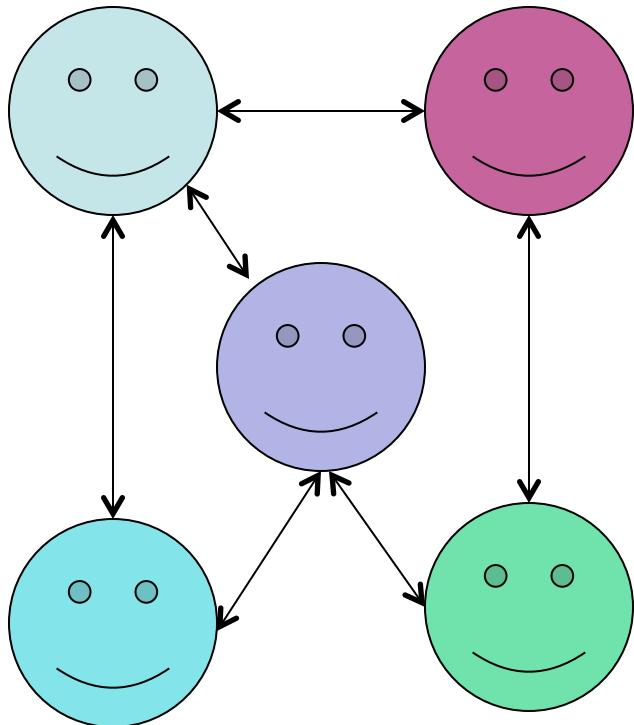
# Boggle as a graph

- 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
  - Doesn't mean that all relationships are non-mutual

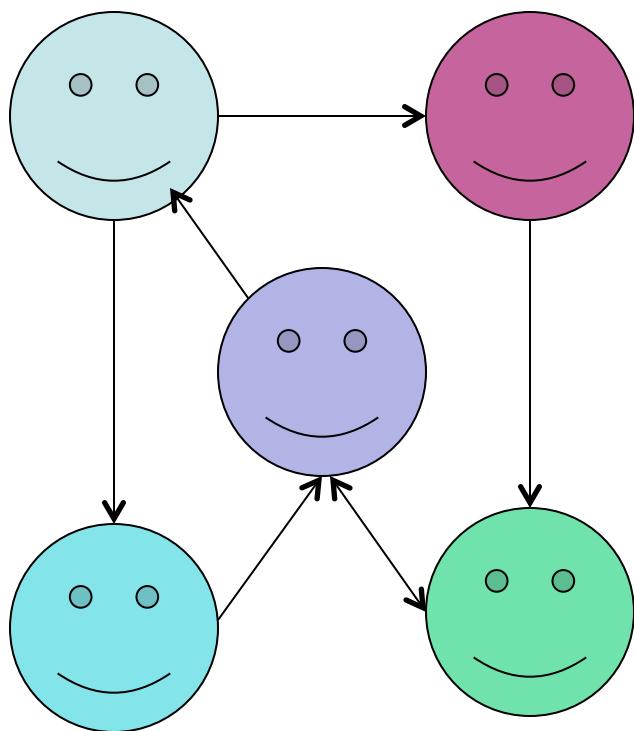


# Representing Graphs

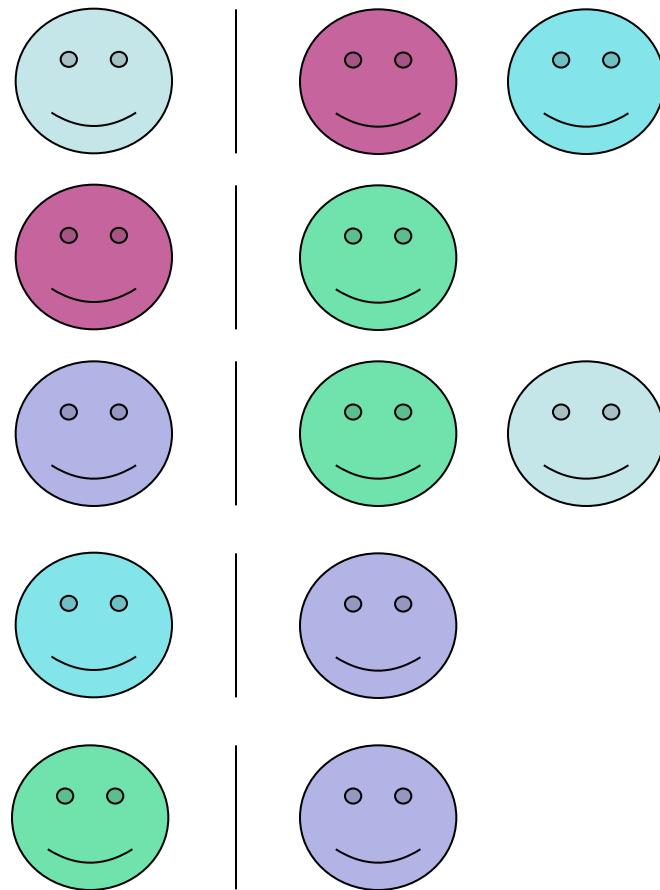
- Two main ways:
  - Have each node store the nodes it's connected to (**adjacency list**)
    - Enemies in problem 4 of the midterm
    - NGrams
    - Doctors without Orders
  - Have a list of all the edges/edges (**edge list**)
    - Similar to Marbles
- The choice depends on the problem you're trying 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!

# Adjacency List

- $\text{Map} < \text{Node}, \text{Vector} < \text{Node} > >$ 
  - or  $\text{Map} < \text{Node}, \text{Set} < \text{Node} > >$

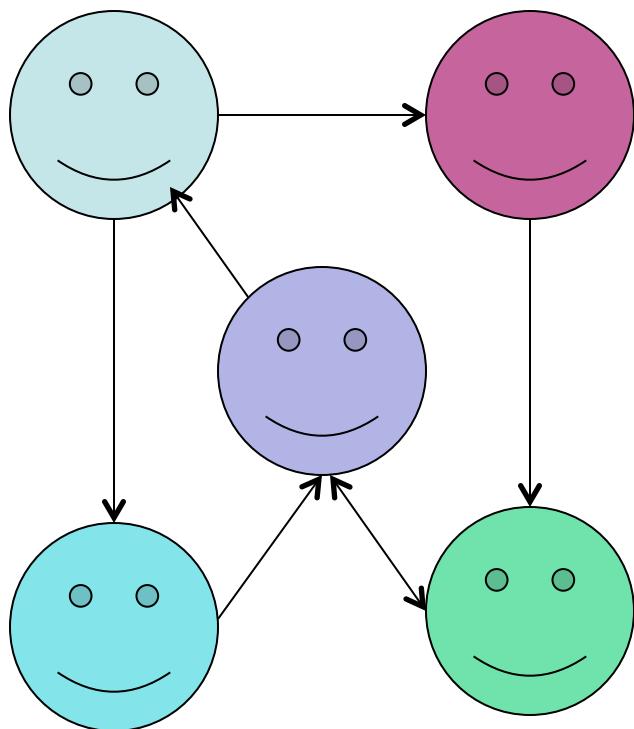


*Node*      *Set<Node>*



# Adjacency Matrix

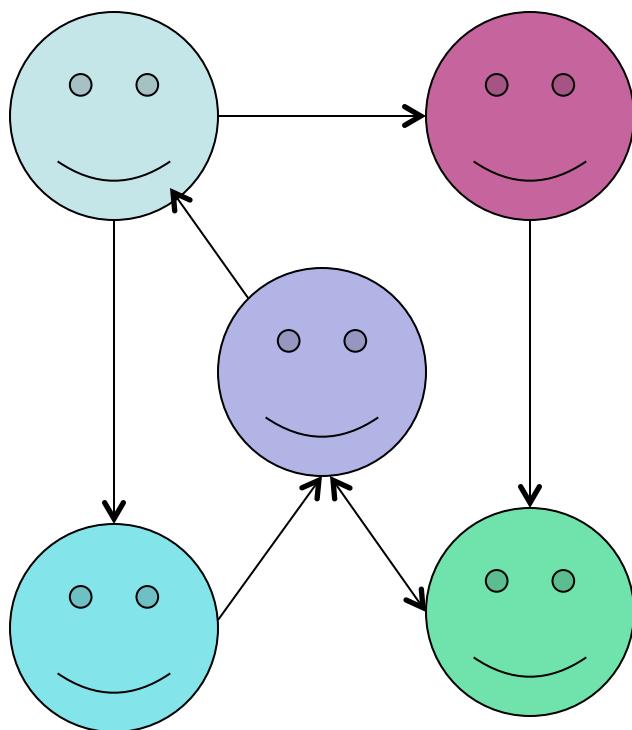
- Store a boolean grid, rows/columns correspond to nodes
  - Alternative to Adjacency List



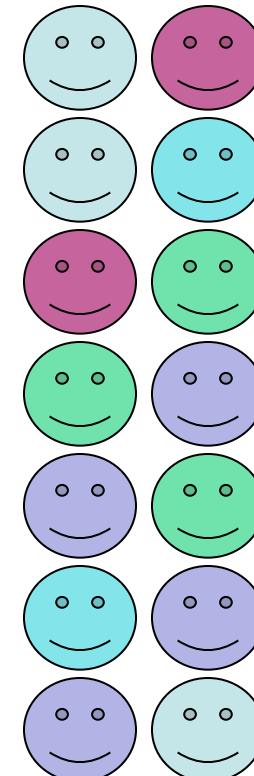
	F	T	F	T	F
	F	F	F	F	T
	T	F	F	F	T
	F	F	T	F	F
	F	F	T	F	F

# Edge List

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

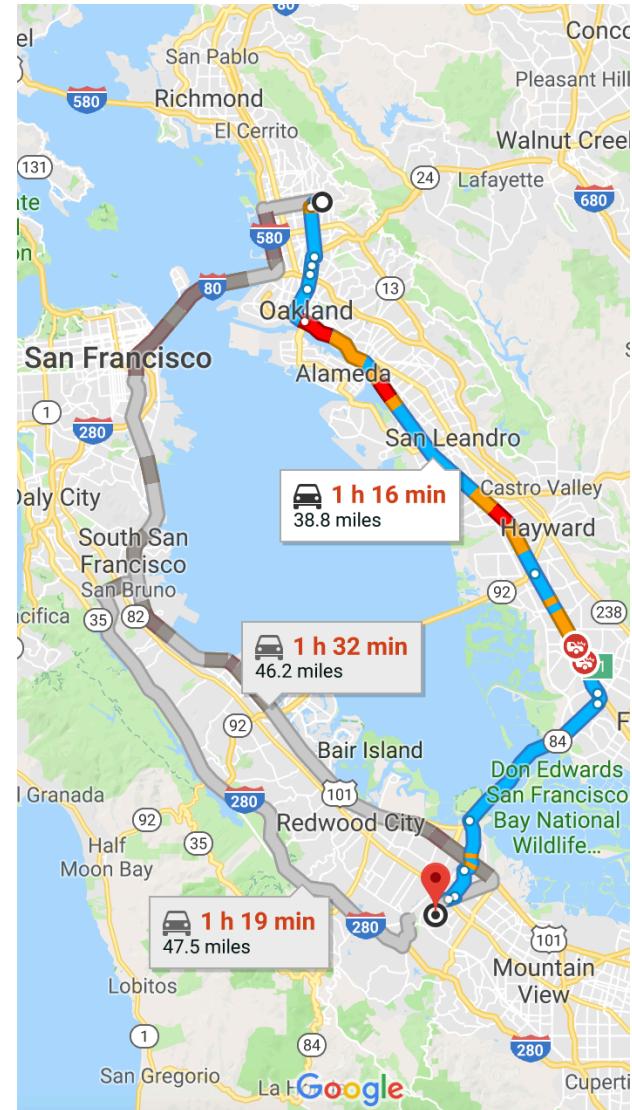


`Vector<Edge>`



# 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>

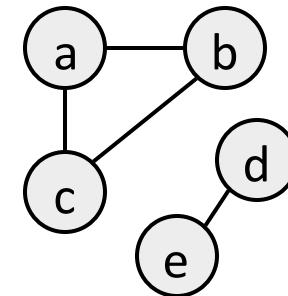
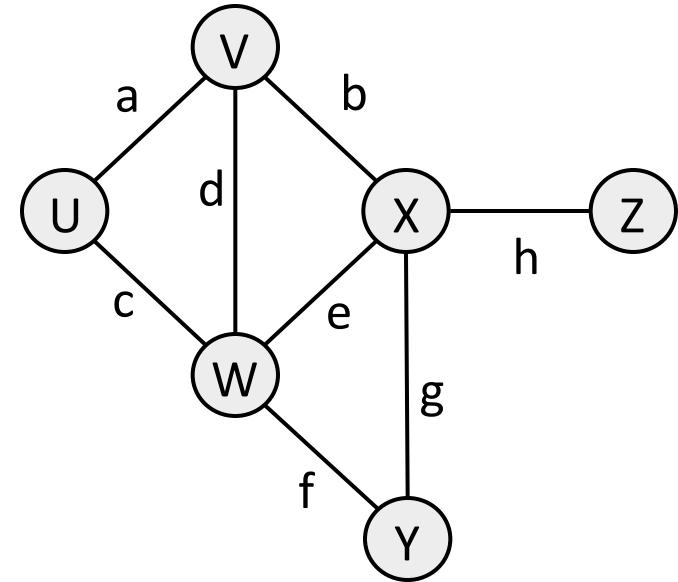
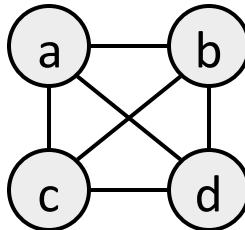
# Paths

- 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



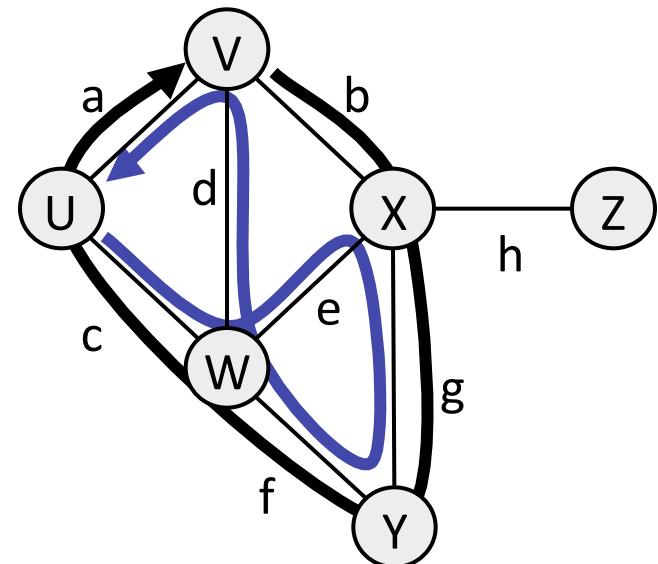
# Other graph properties

- **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

- NGrams?
  - directed, weighted, cyclic, connected
- 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)
  - DAGs are especially important because of **topological sort**. More on that later!

# Announcements

- You should be starting LineManager – it's hard.
- Please give us feedback! [cs198.stanford.edu](mailto:cs198.stanford.edu)
- Feel free to use [seepluspl.us](http://seepluspl.us) to help you understand trees or pointers. It's still in development, so be patient with quirks
- Notes on course feedback:
  - If you have a question outside the scope of the class, please post on Piazza or come talk to me during OH! I don't want to stop your questions, but I sometimes have to make choices to ensure that I don't confuse other students or run out of time for material we need to cover.

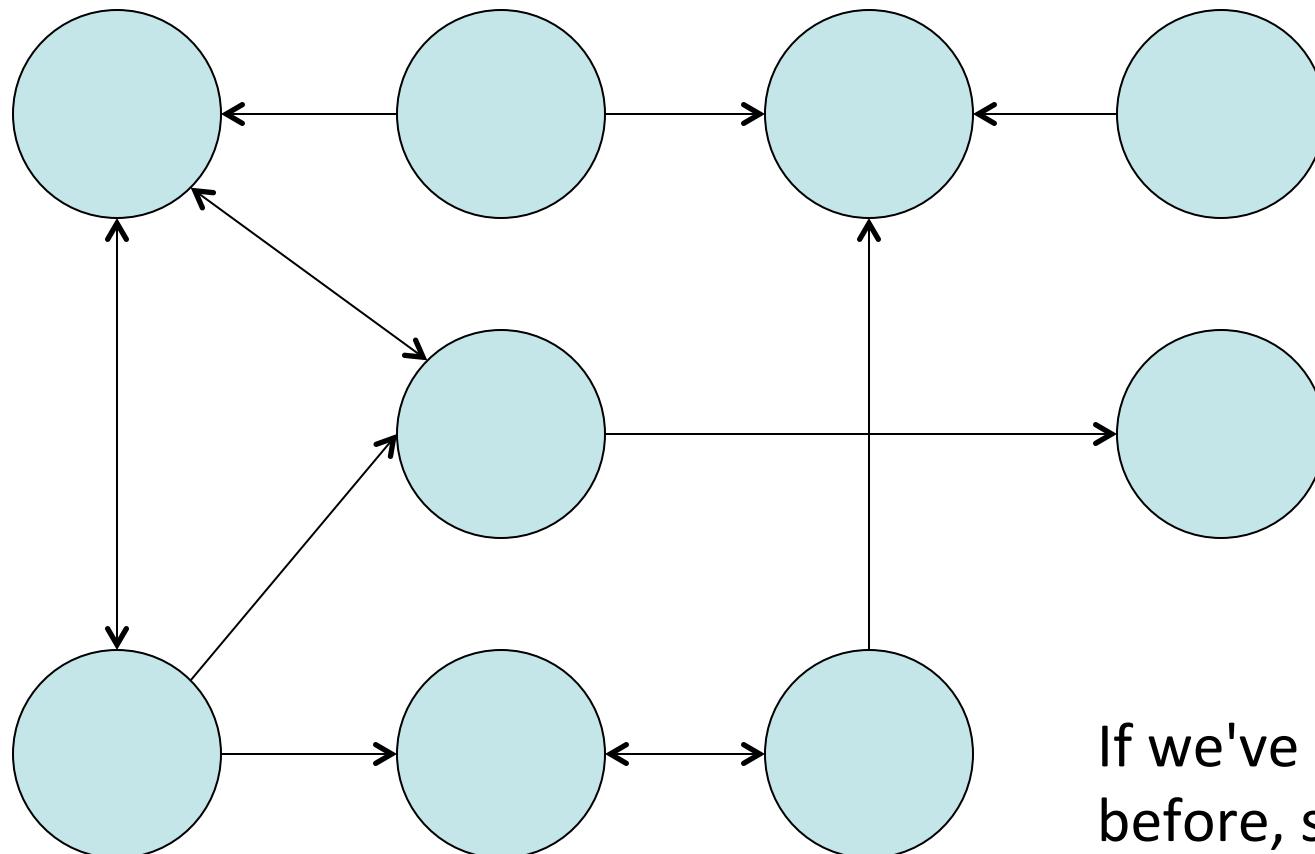
# Working with Graphs

- We've seen how to model data with a graph
- There are lots of cool graph algorithms that make it easy to solve certain problems
  - Goal: know how to apply a model a problem as a graph and apply the relevant graph algorithm to it
- We'll spend most of the rest of this unit learning about graph algorithms

# Finding Paths

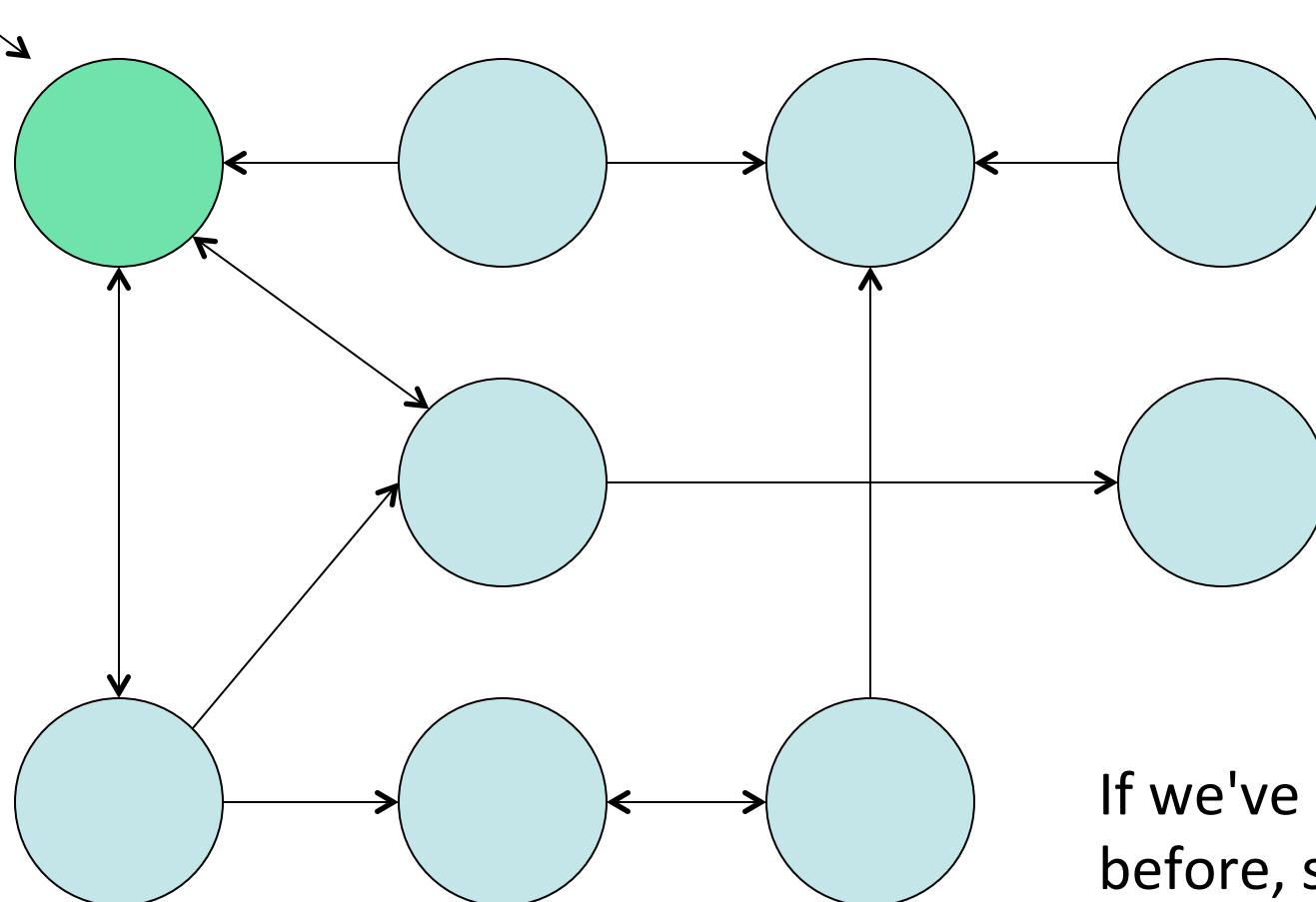
- Easiest way: Depth-First Search (DFS)
  - Recursive backtracking!
- Finds a path between two nodes if it exists
  - Or can find all the nodes **reachable** from a node
    - Where can I travel to starting in San Francisco?
    - If all my friends (and their friends, and so on) share my post, how many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

# DFS



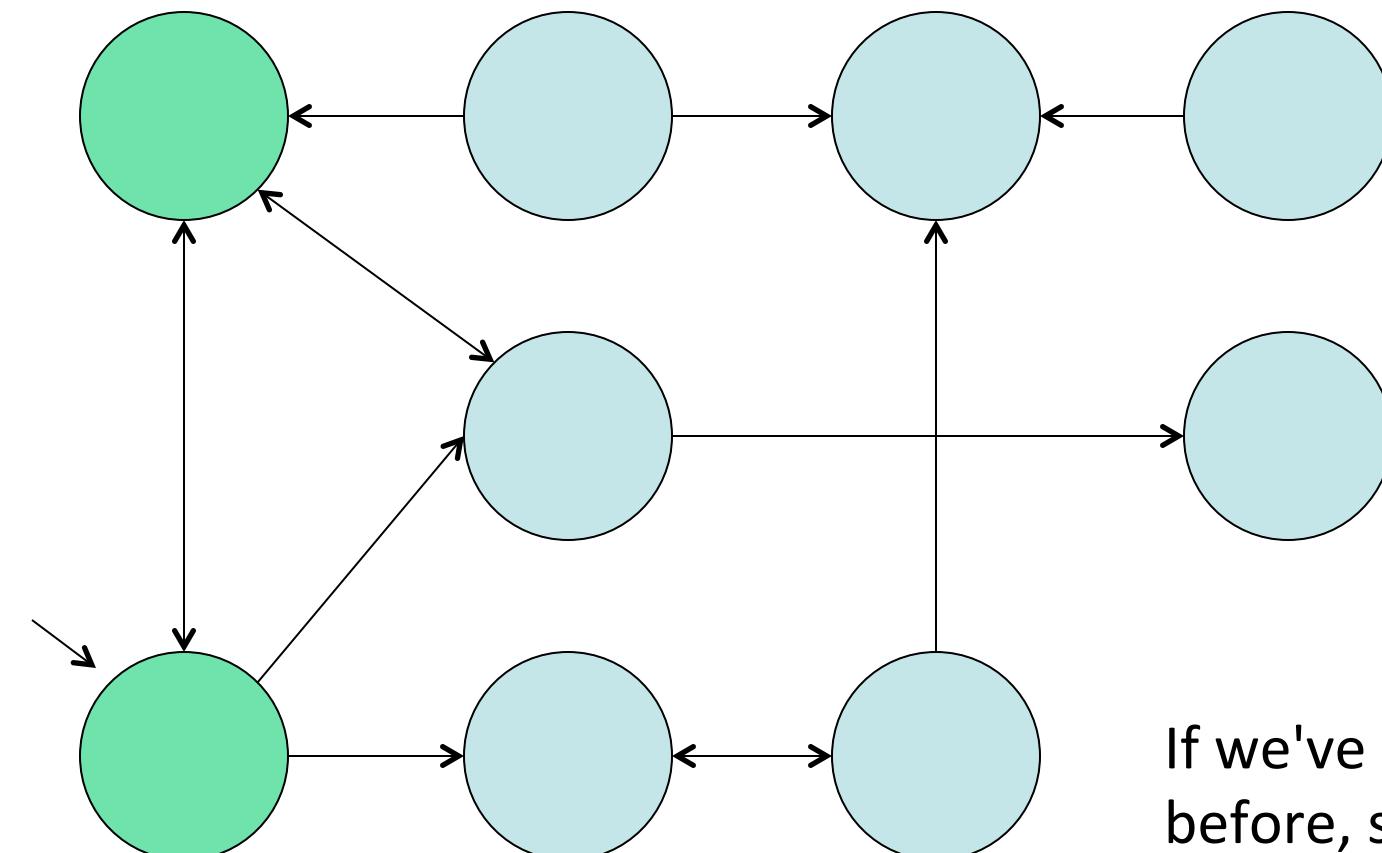
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



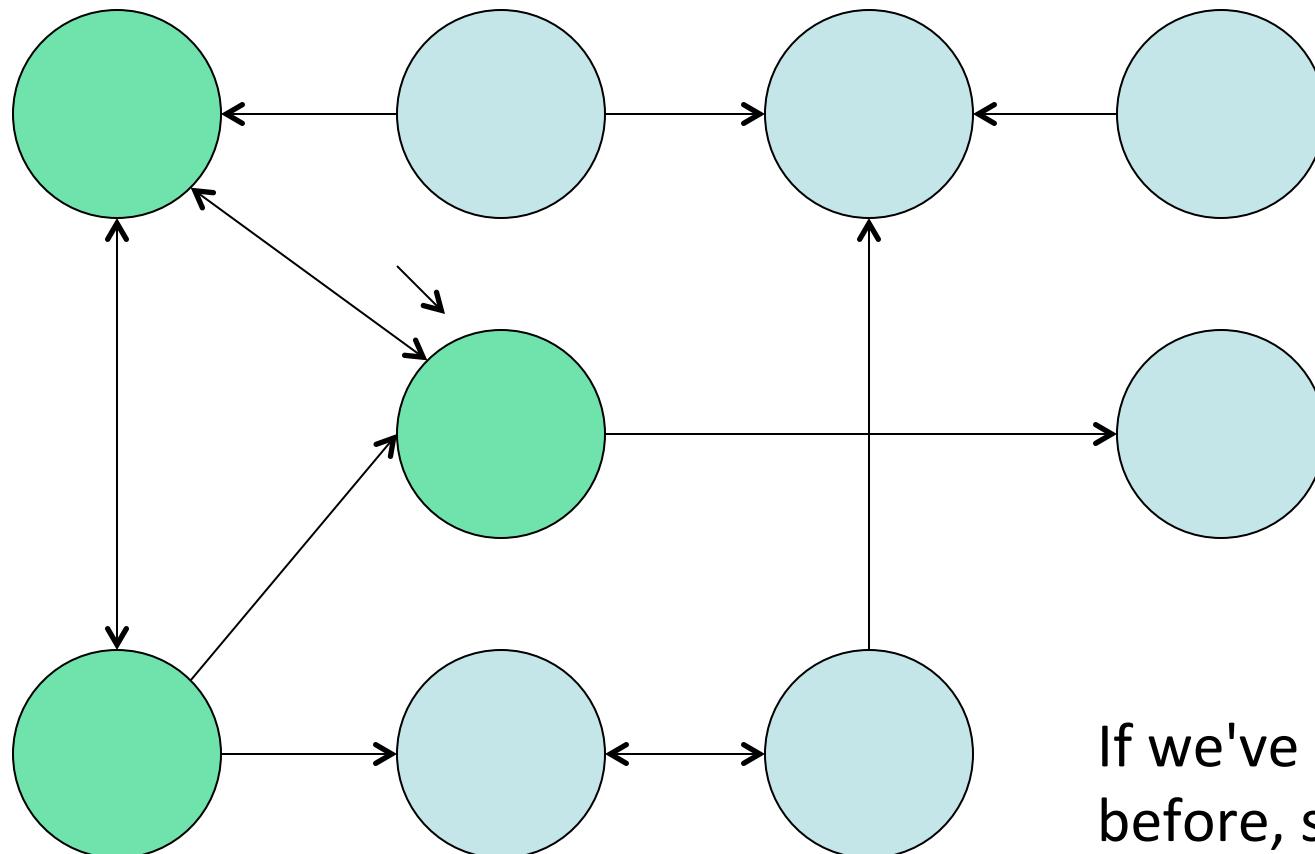
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



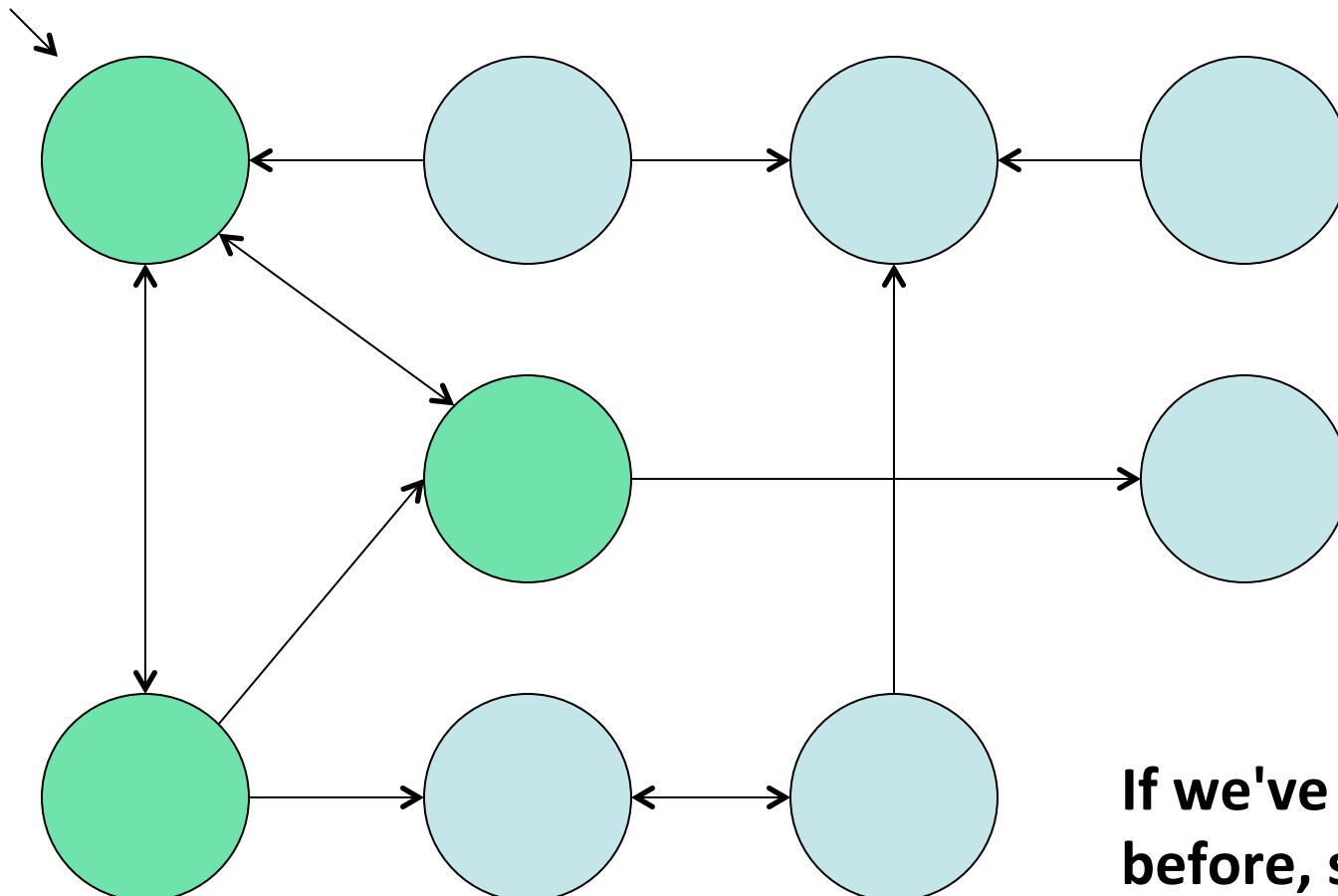
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



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

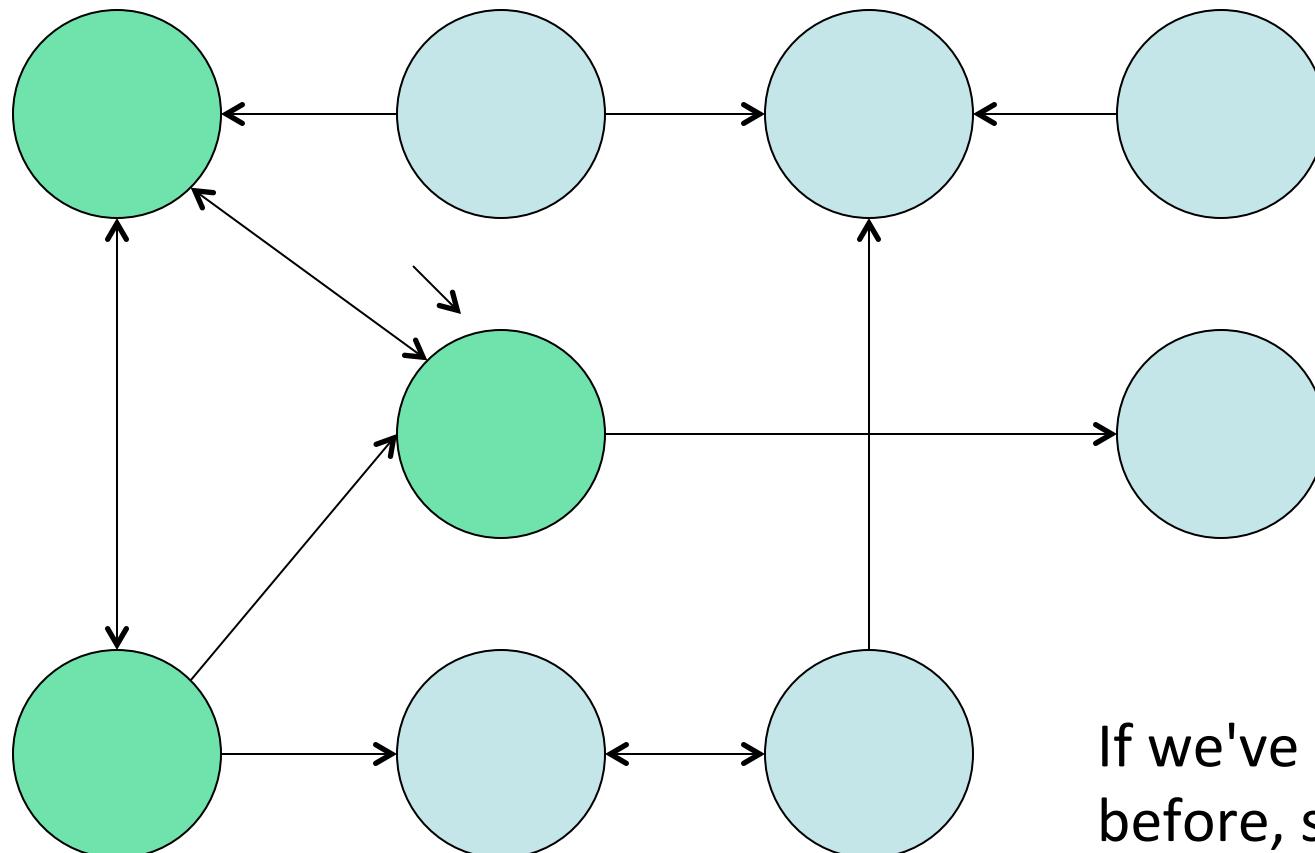
# DFS



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

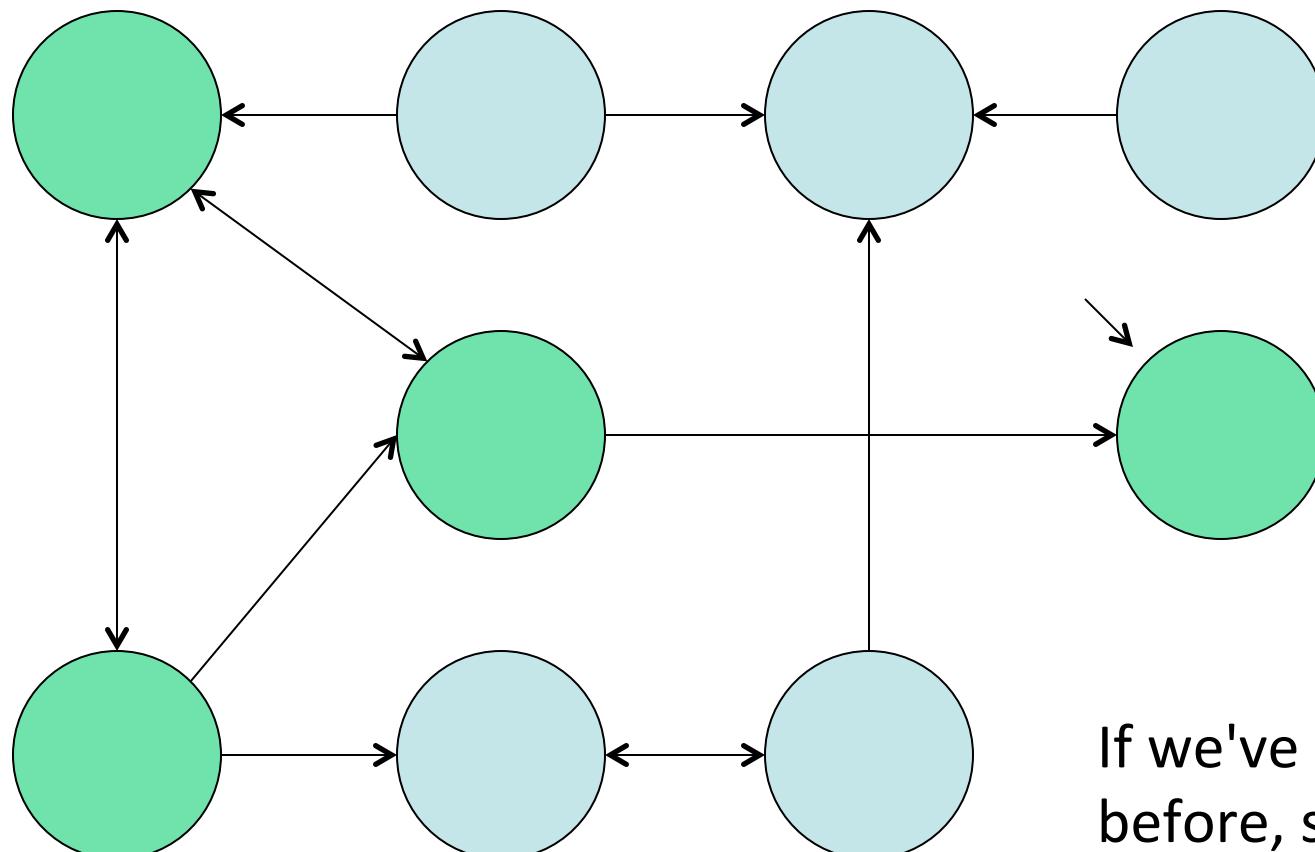
Otherwise, visit all the unvisited nodes from this node

# DFS



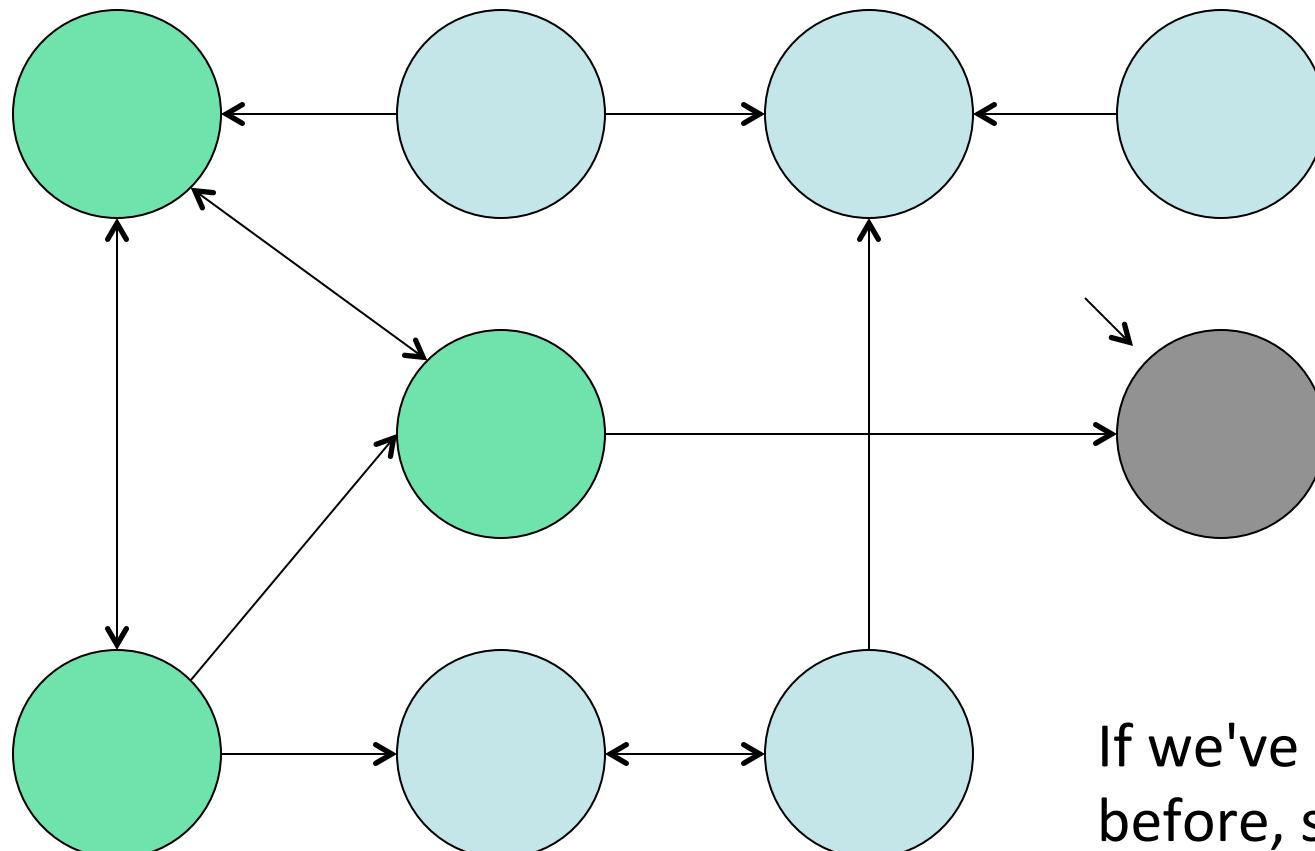
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



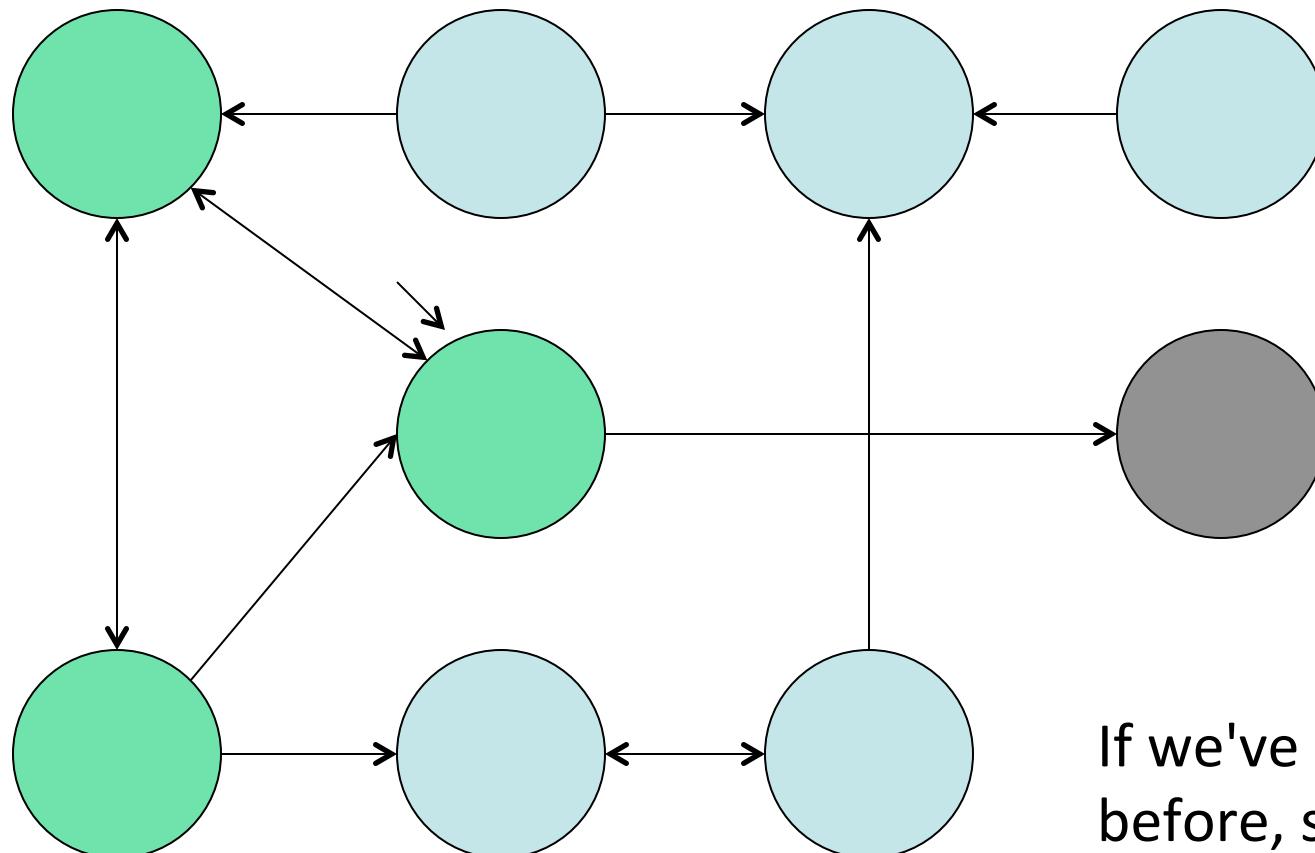
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



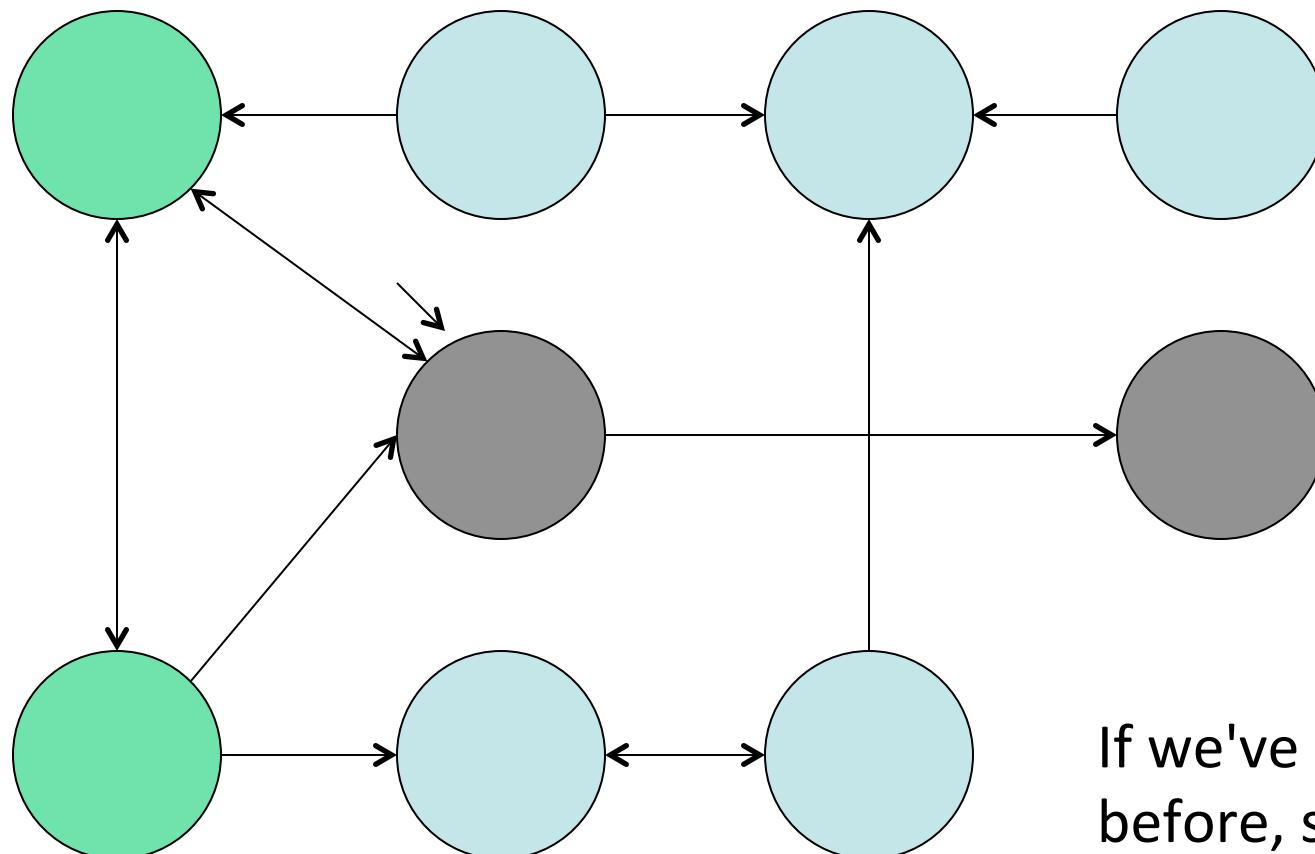
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



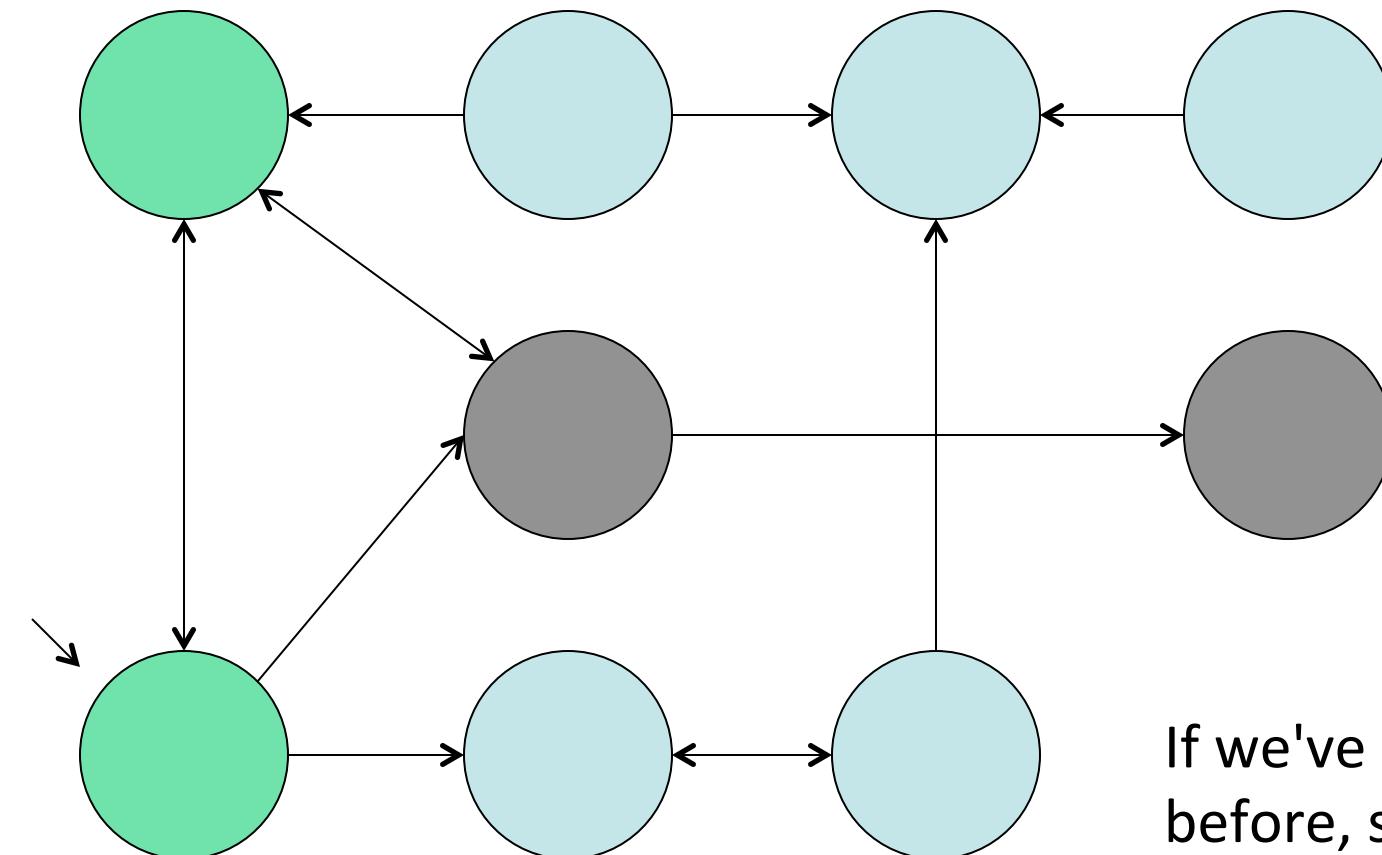
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



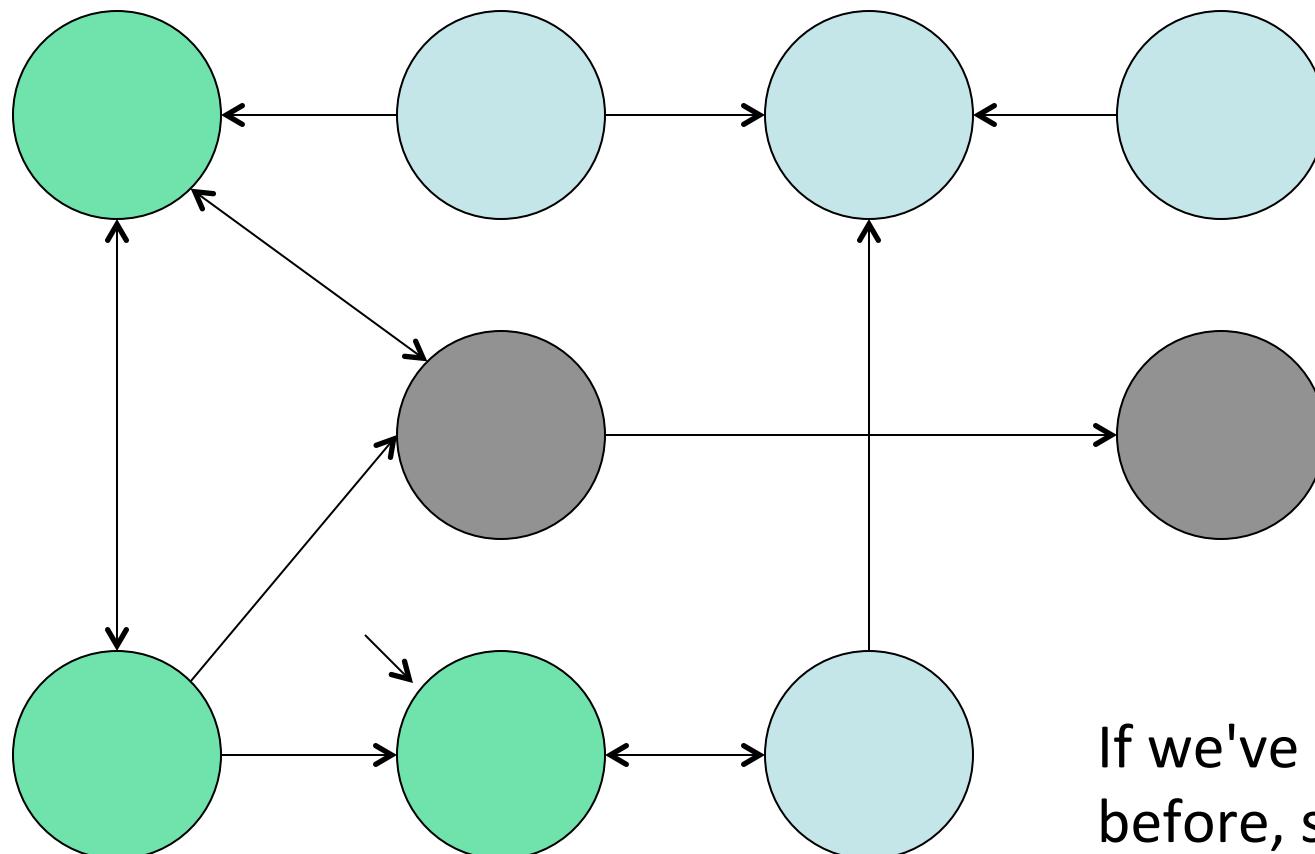
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



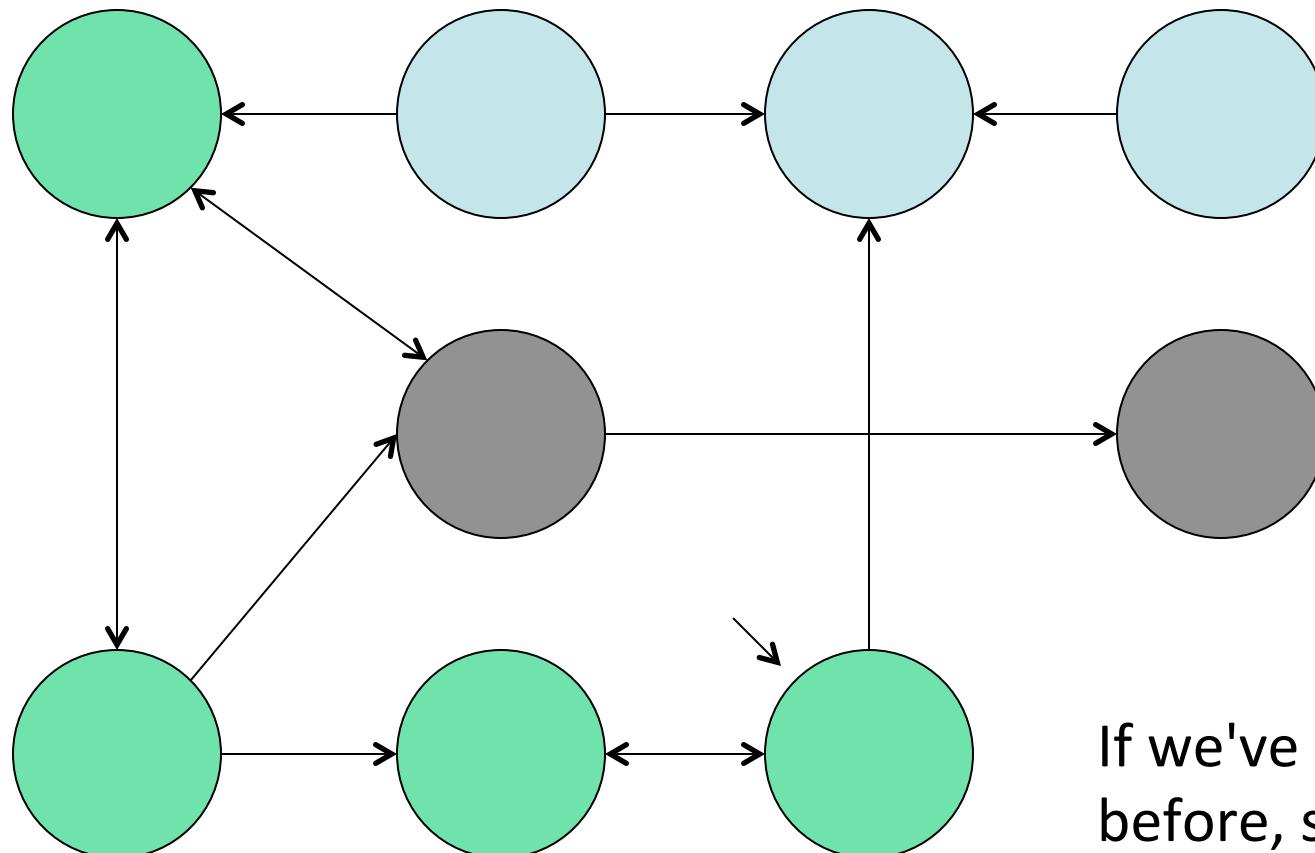
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



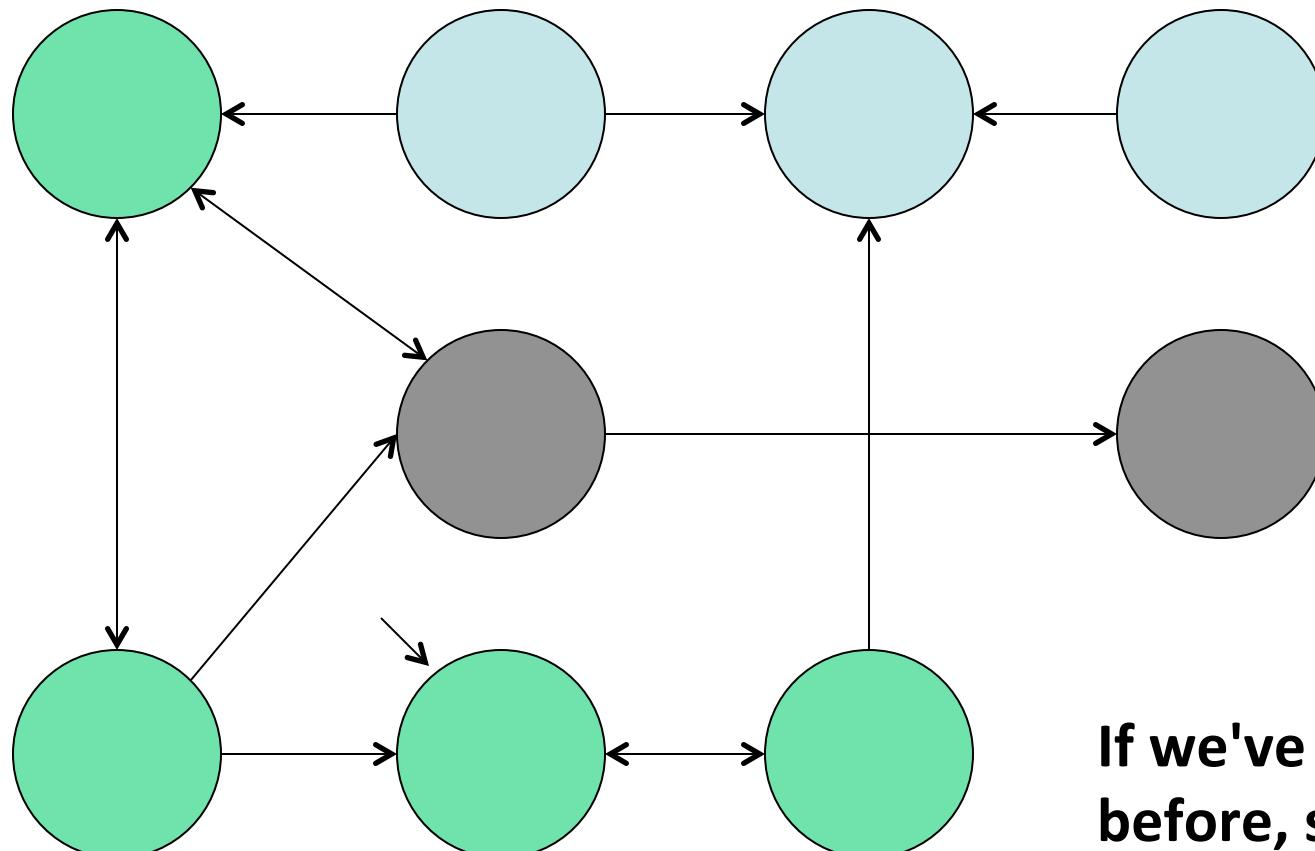
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



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

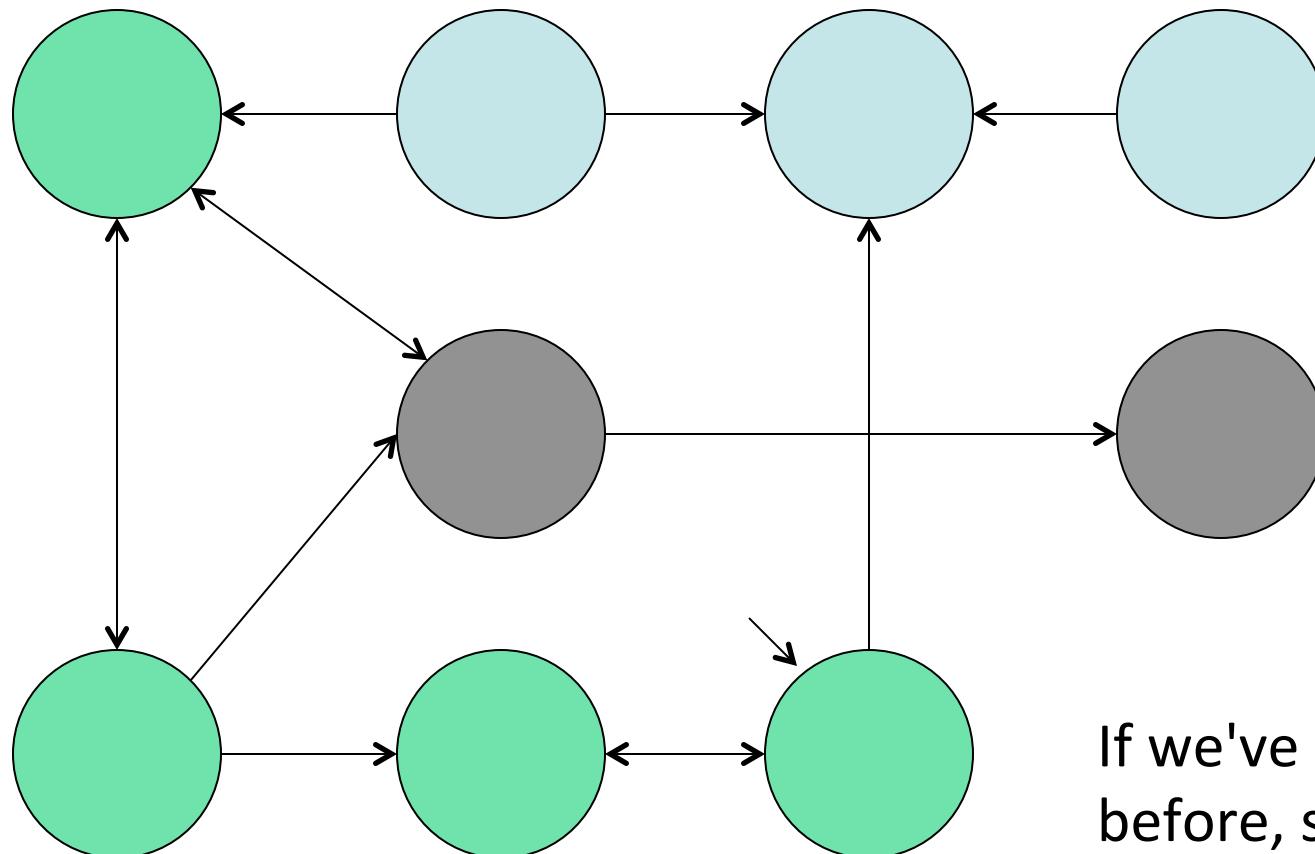
# DFS



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

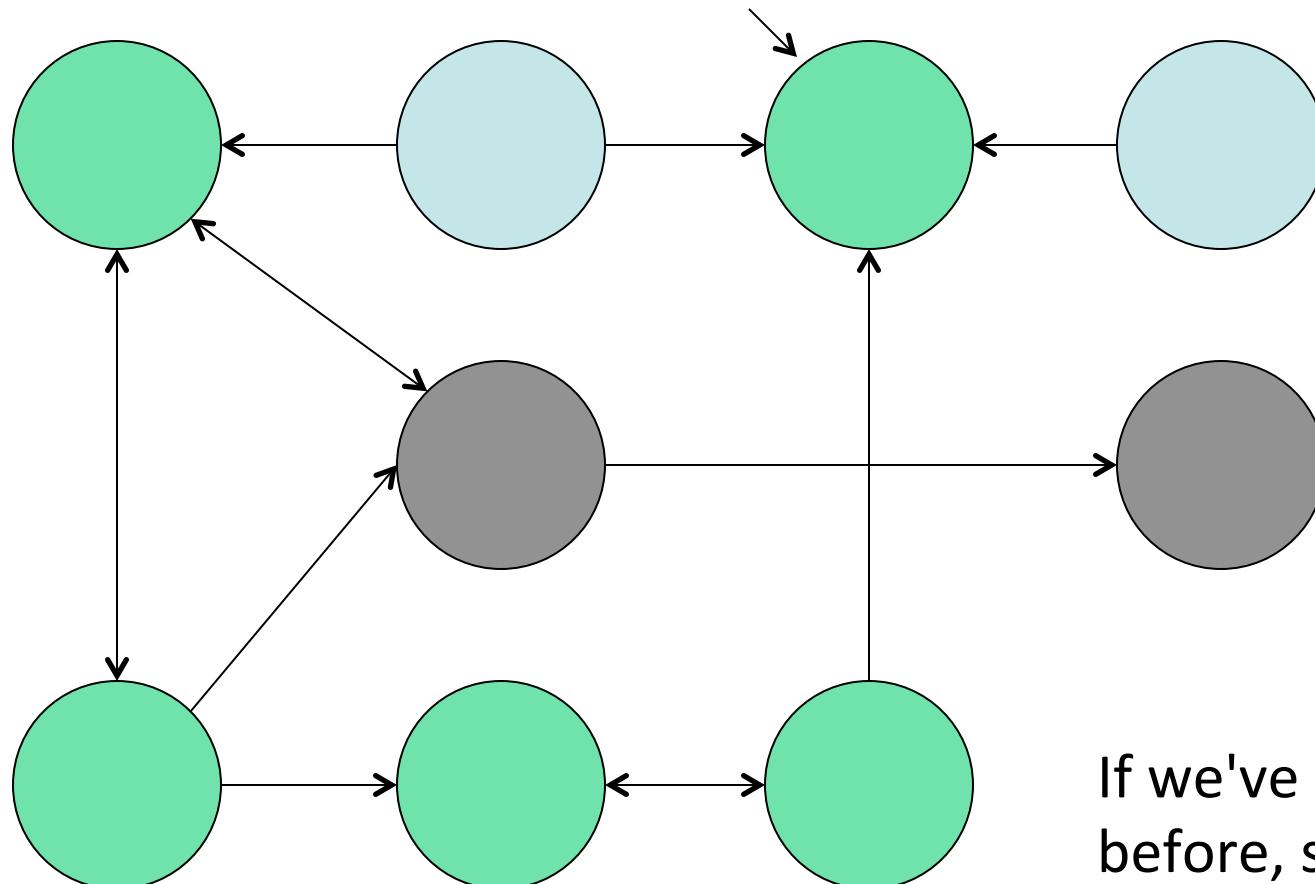
Otherwise, visit all the unvisited nodes from this node

# DFS



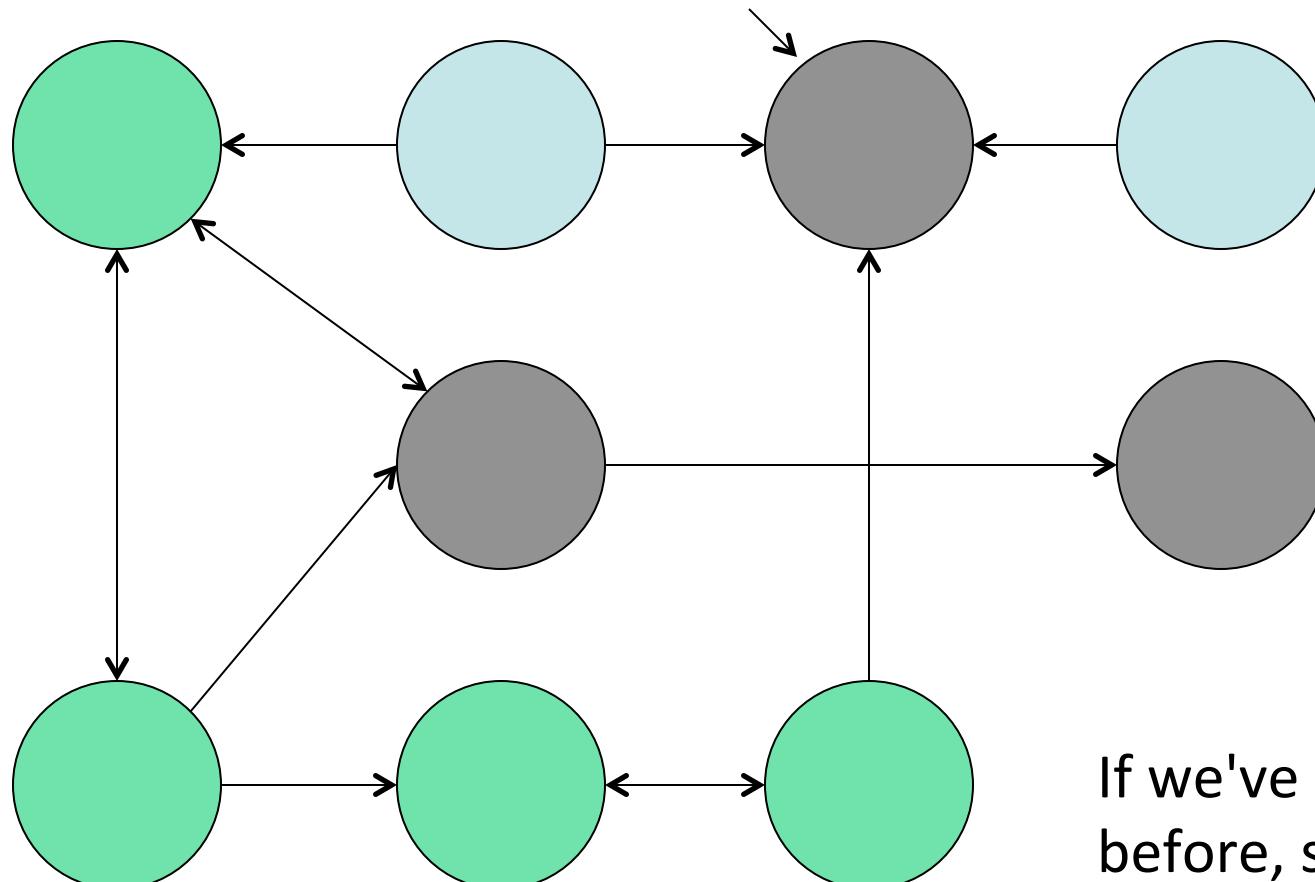
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



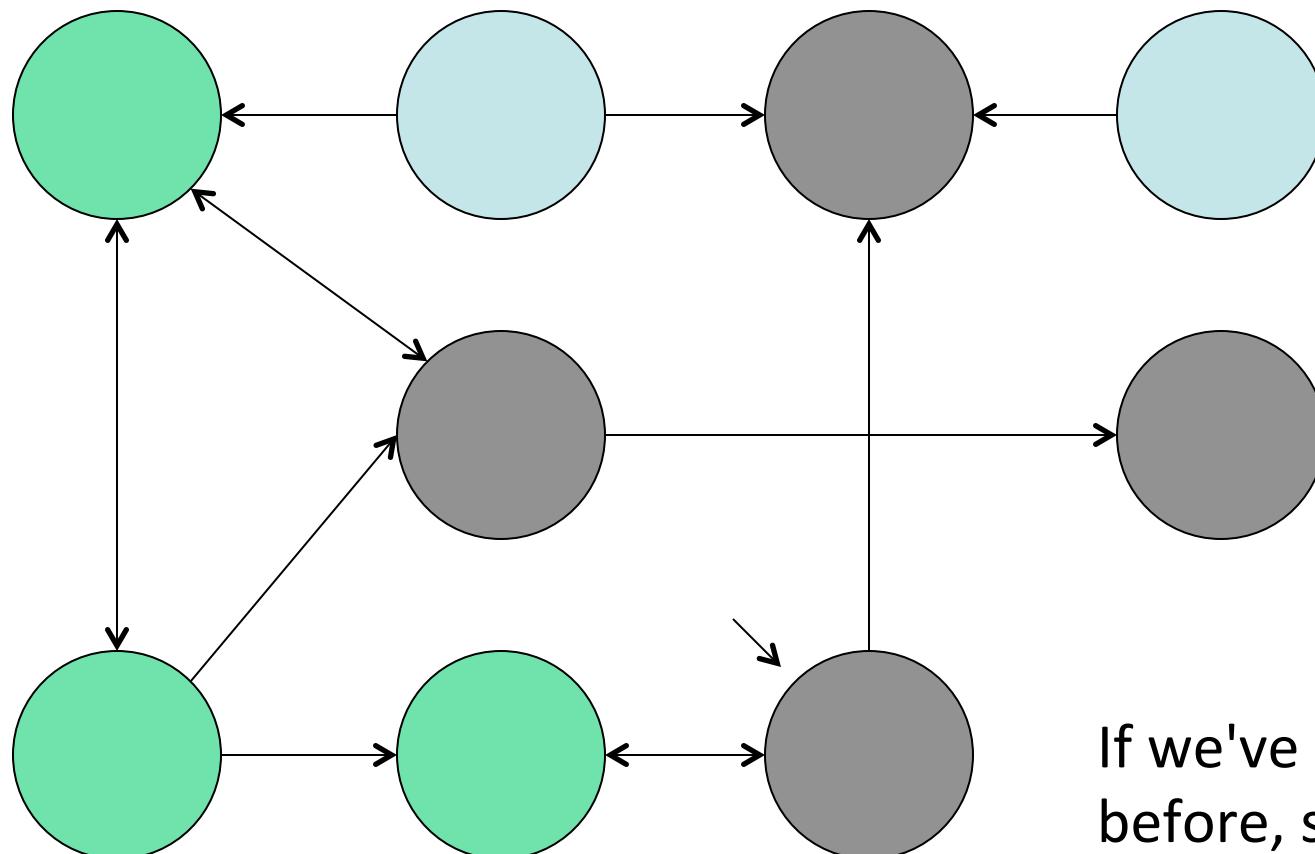
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



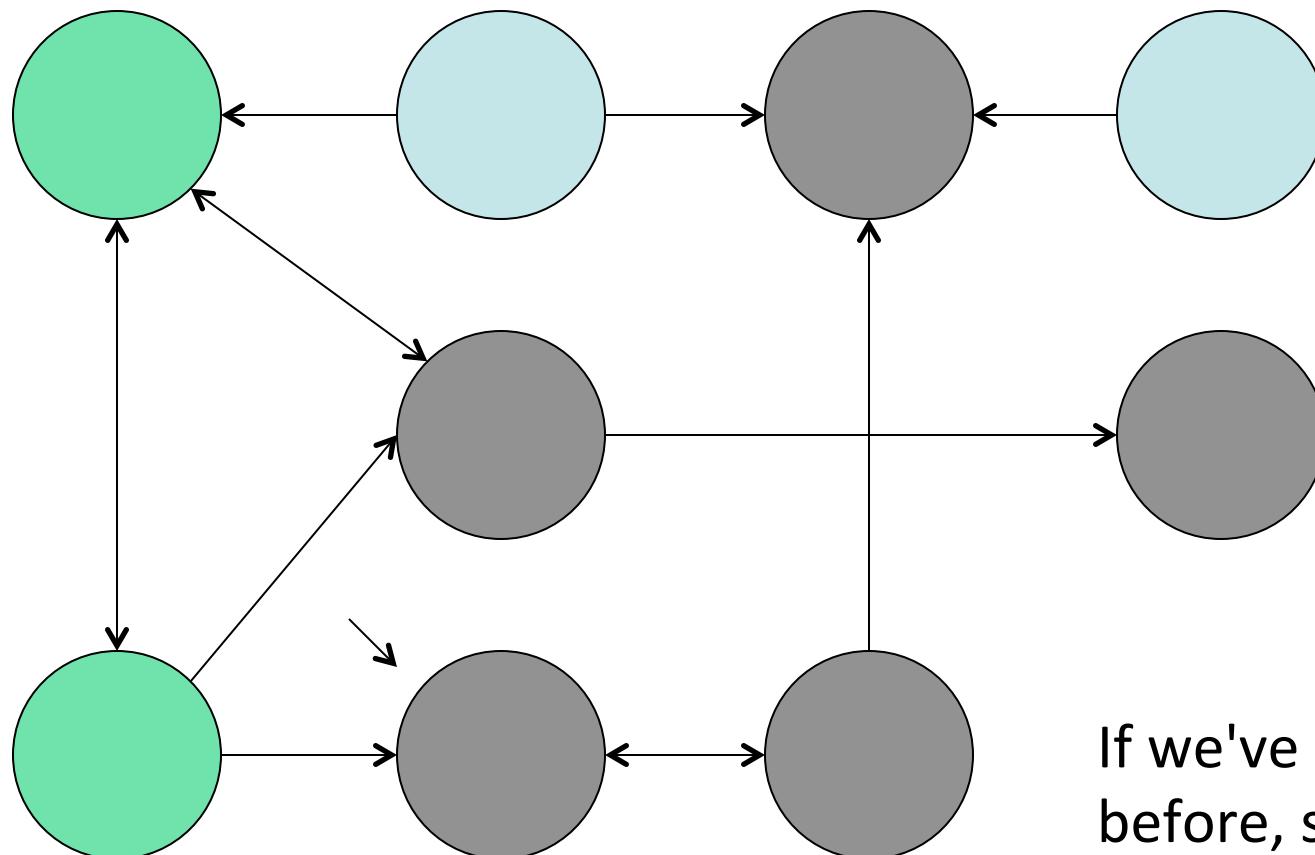
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



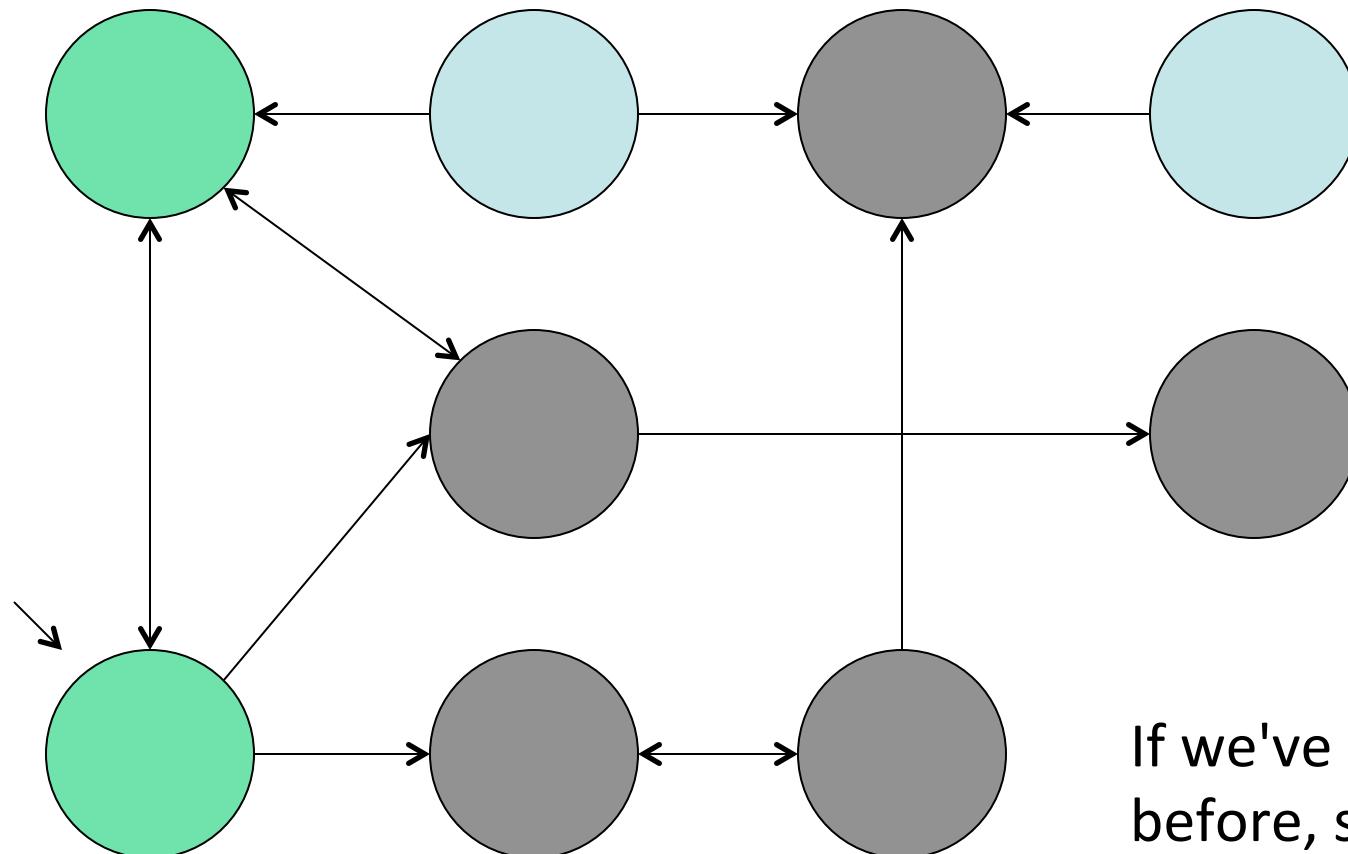
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



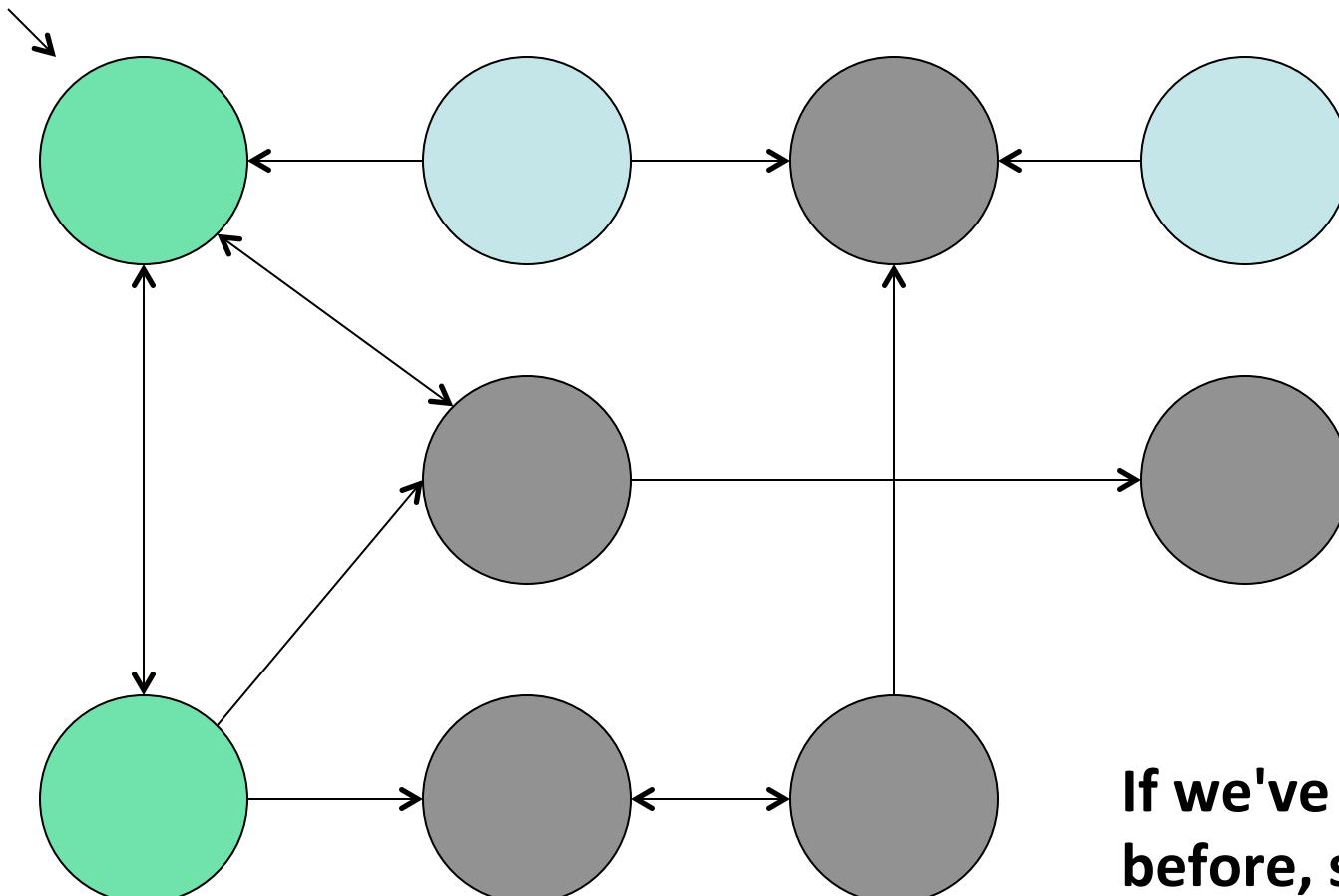
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



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

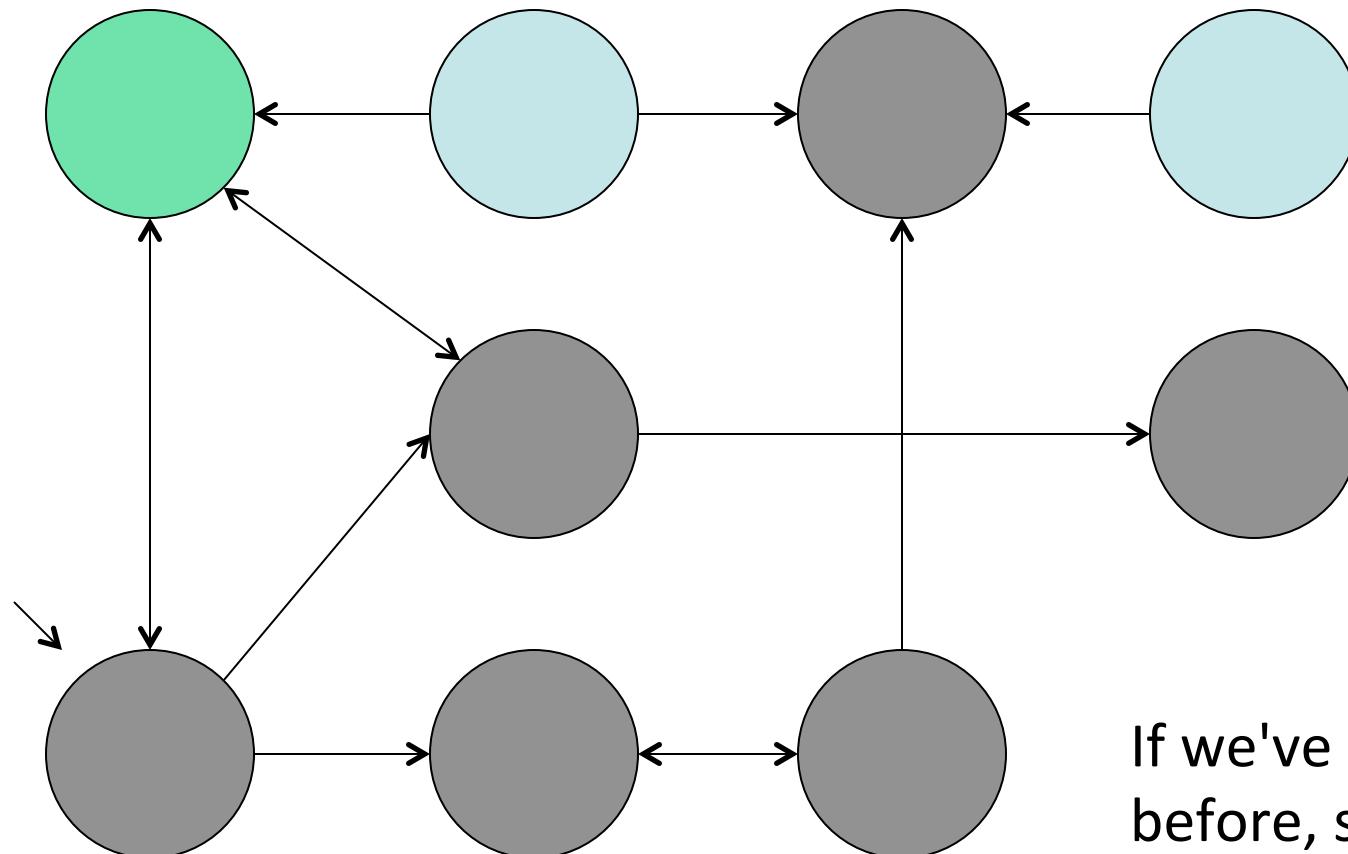
# DFS



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

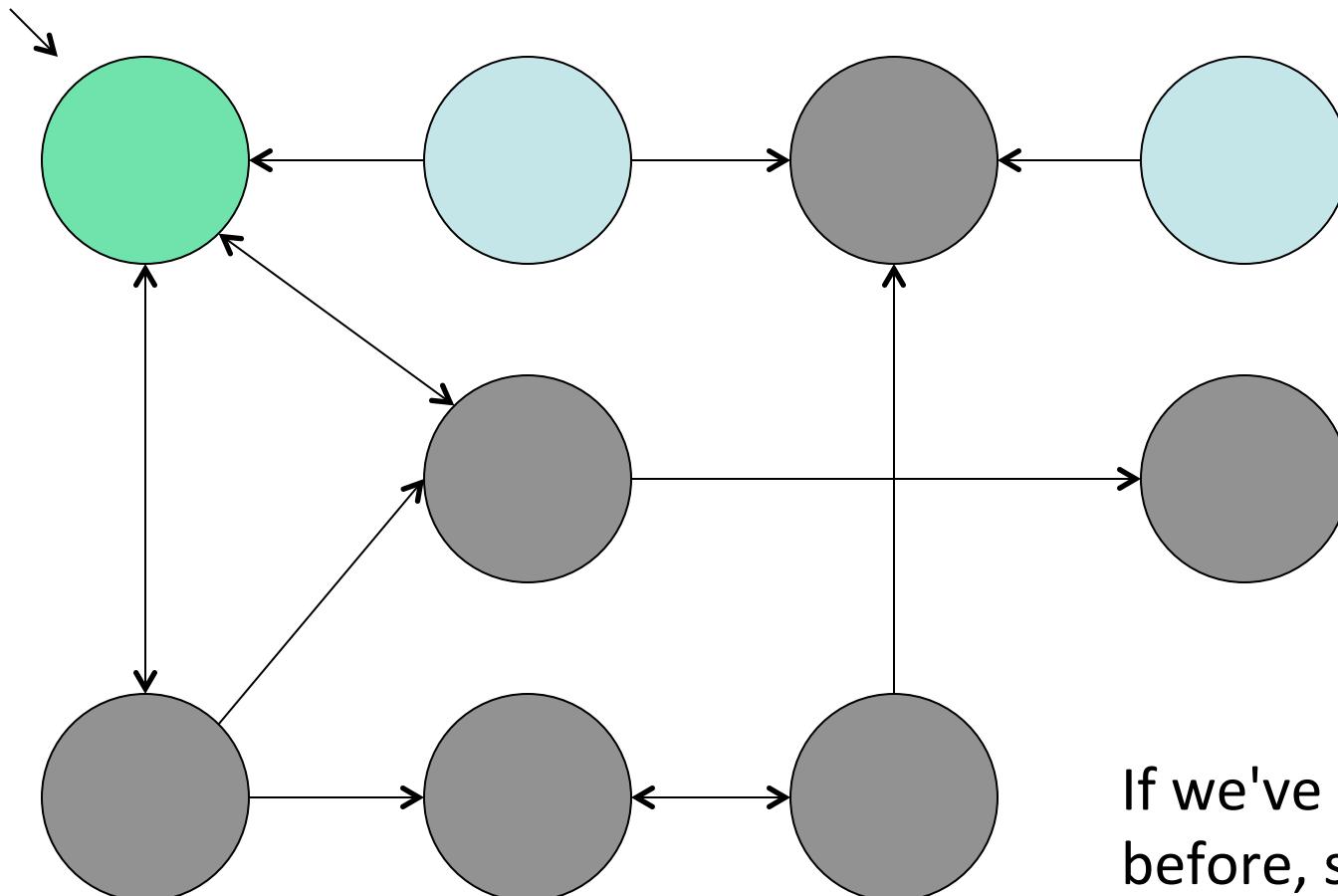
Otherwise, visit all the unvisited nodes from this node

# DFS



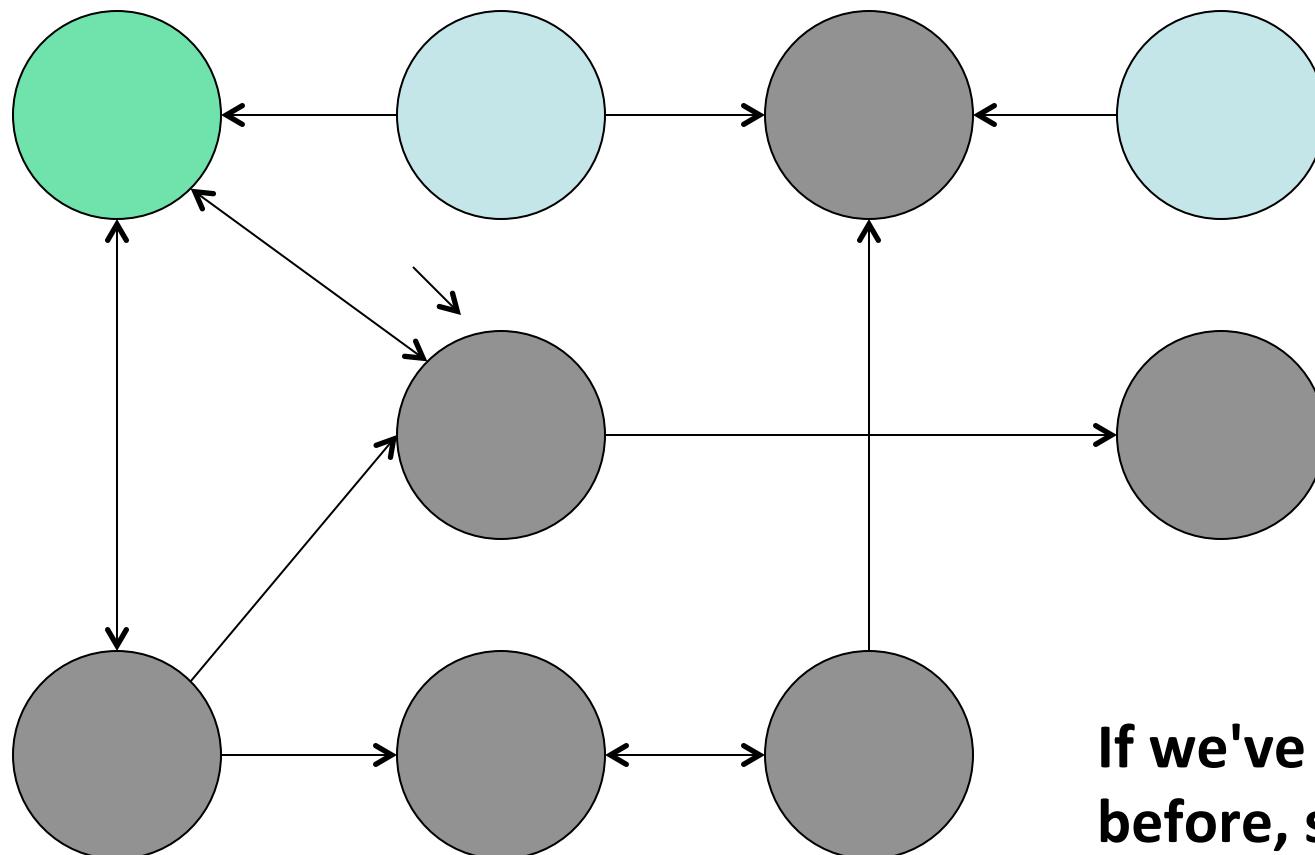
If we've seen the node before, stop  
Otherwise, visit all the unvisited nodes from this node

# DFS



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

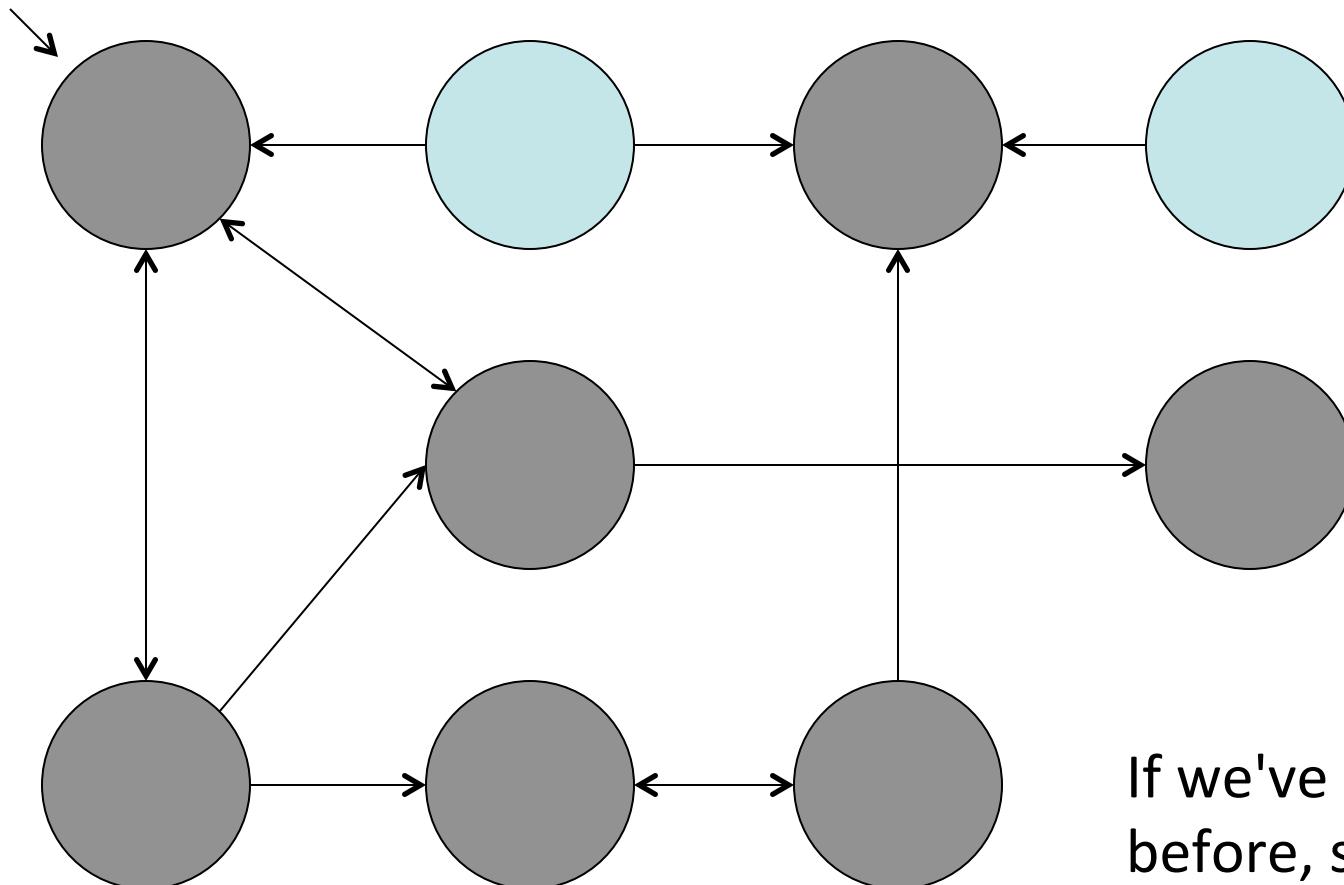
# DFS



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 week 4

# 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?

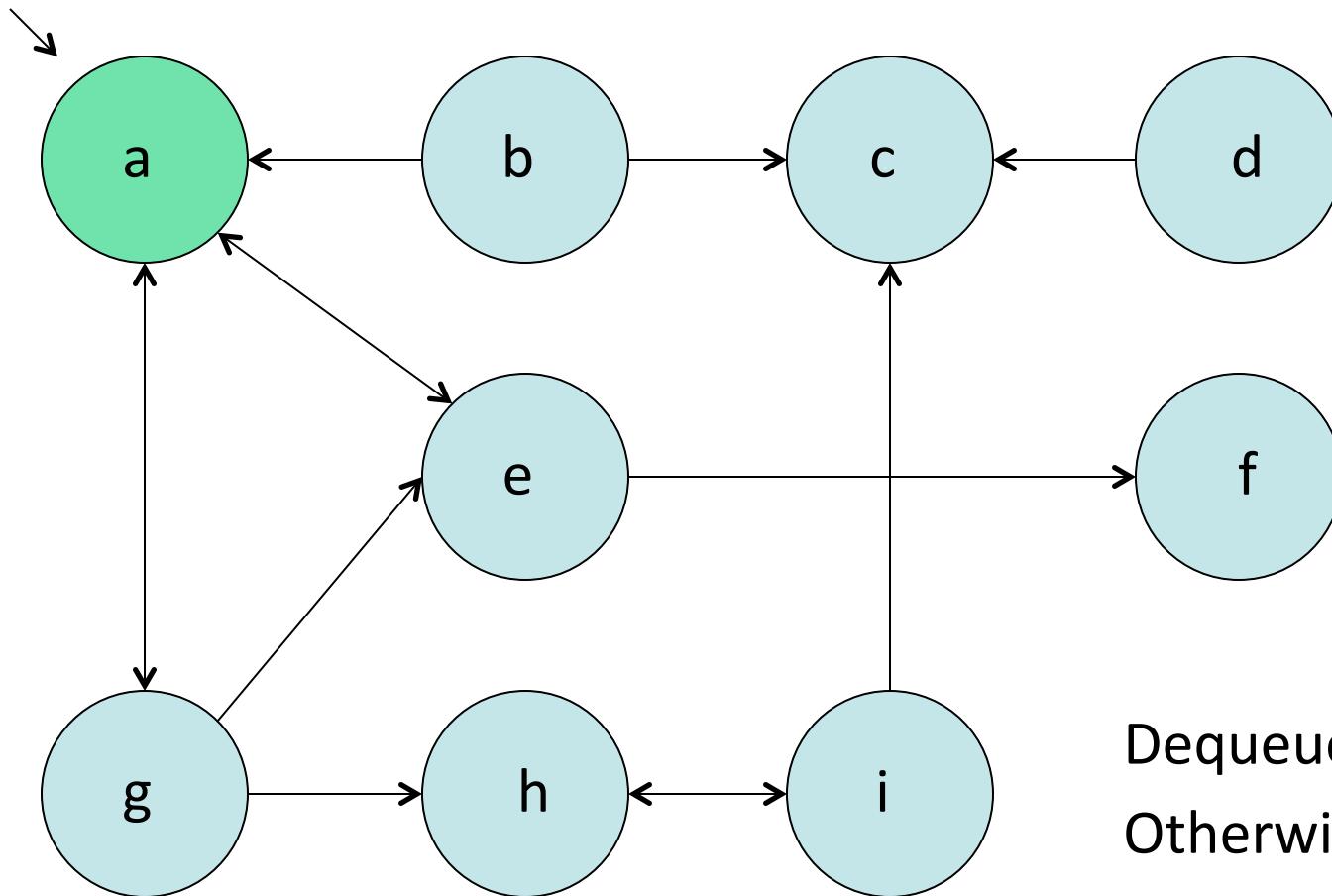
# Breadth-First Search (BFS)

- 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

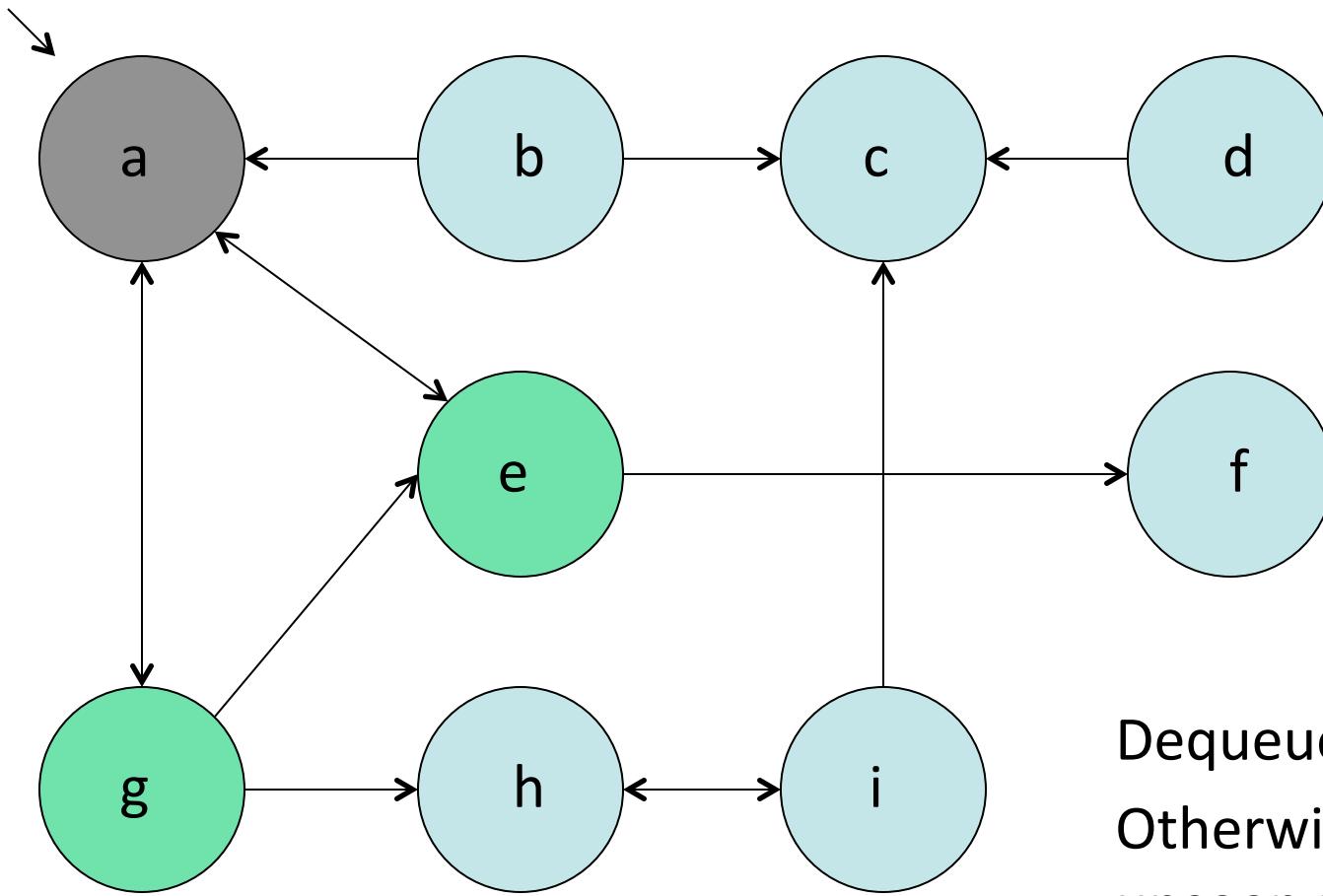
# BFS



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

queue: a

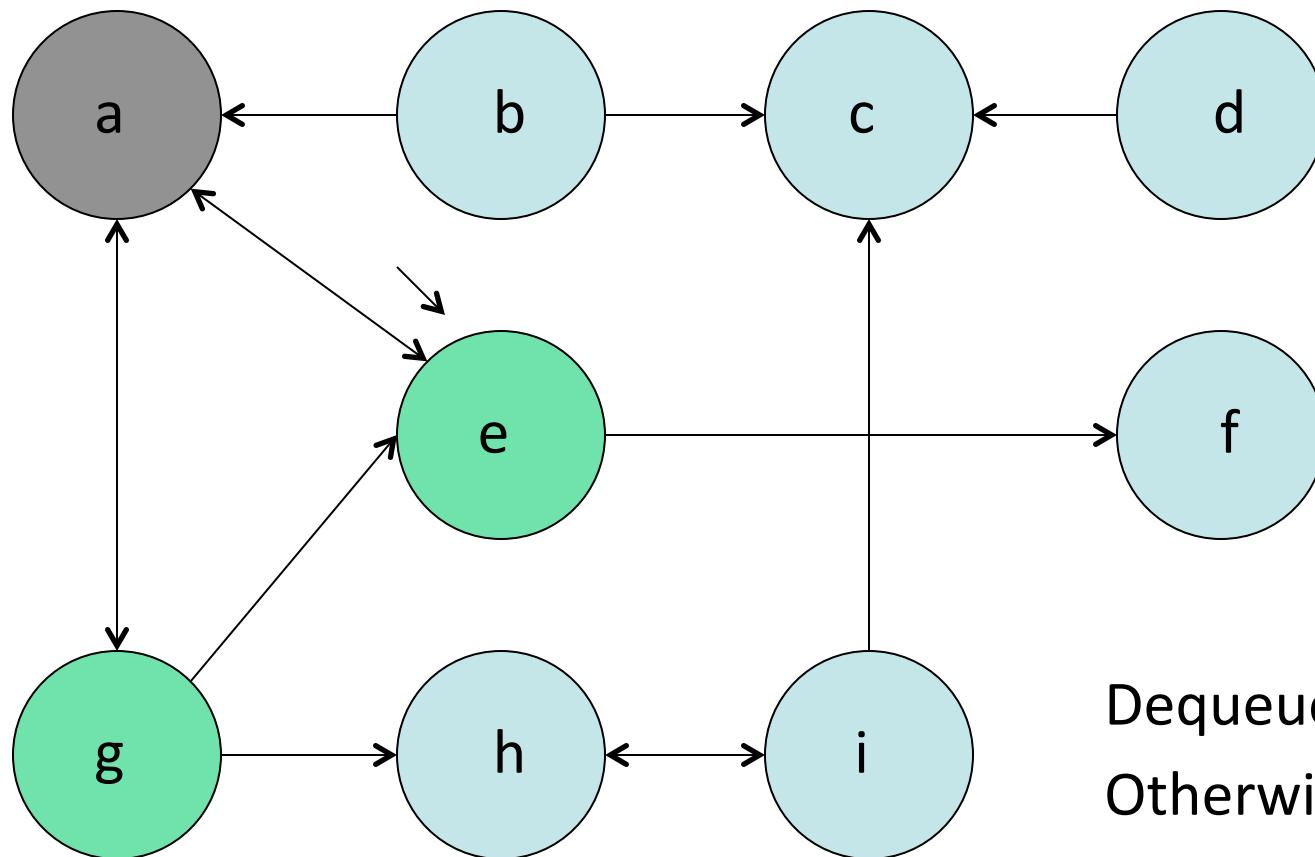
# BFS



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

queue: e, g

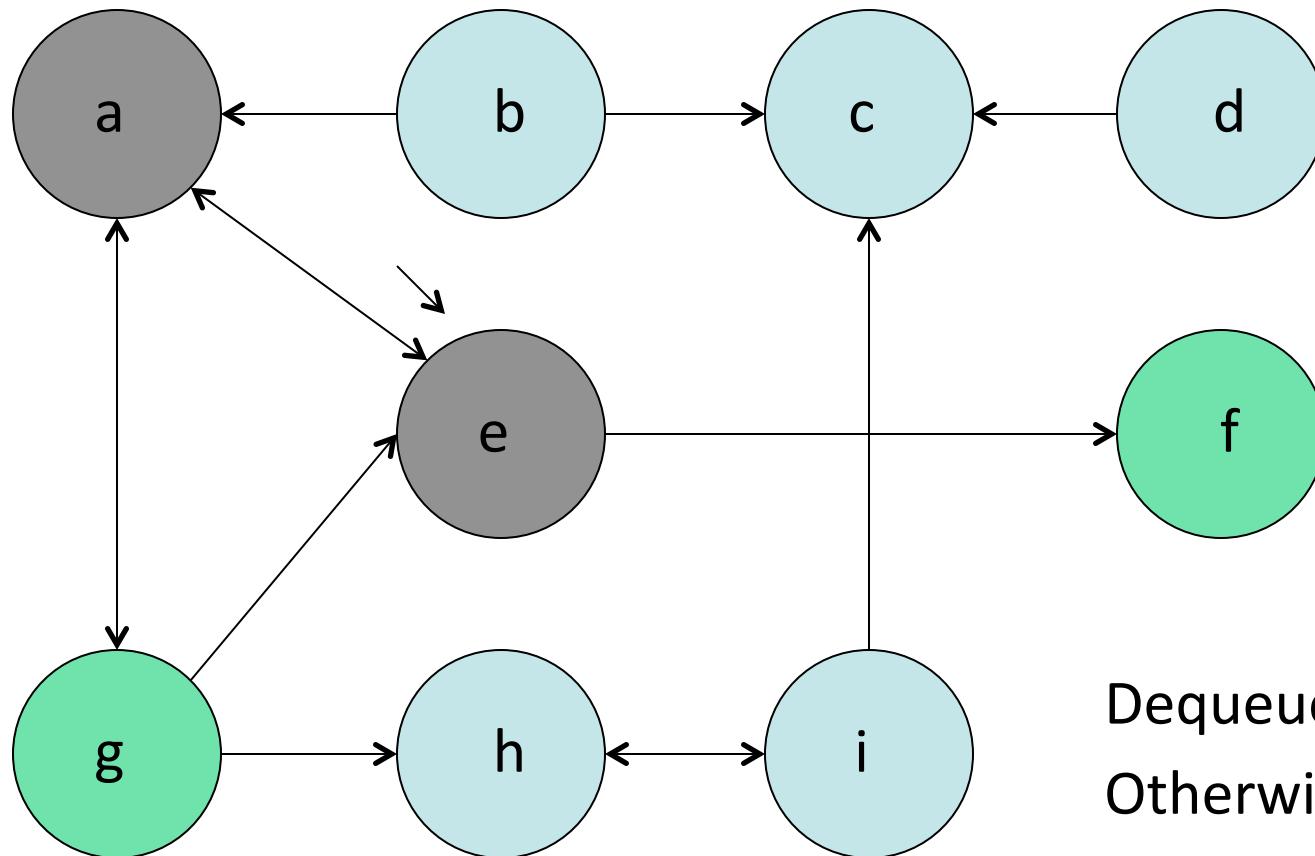
# BFS



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

queue: e, g

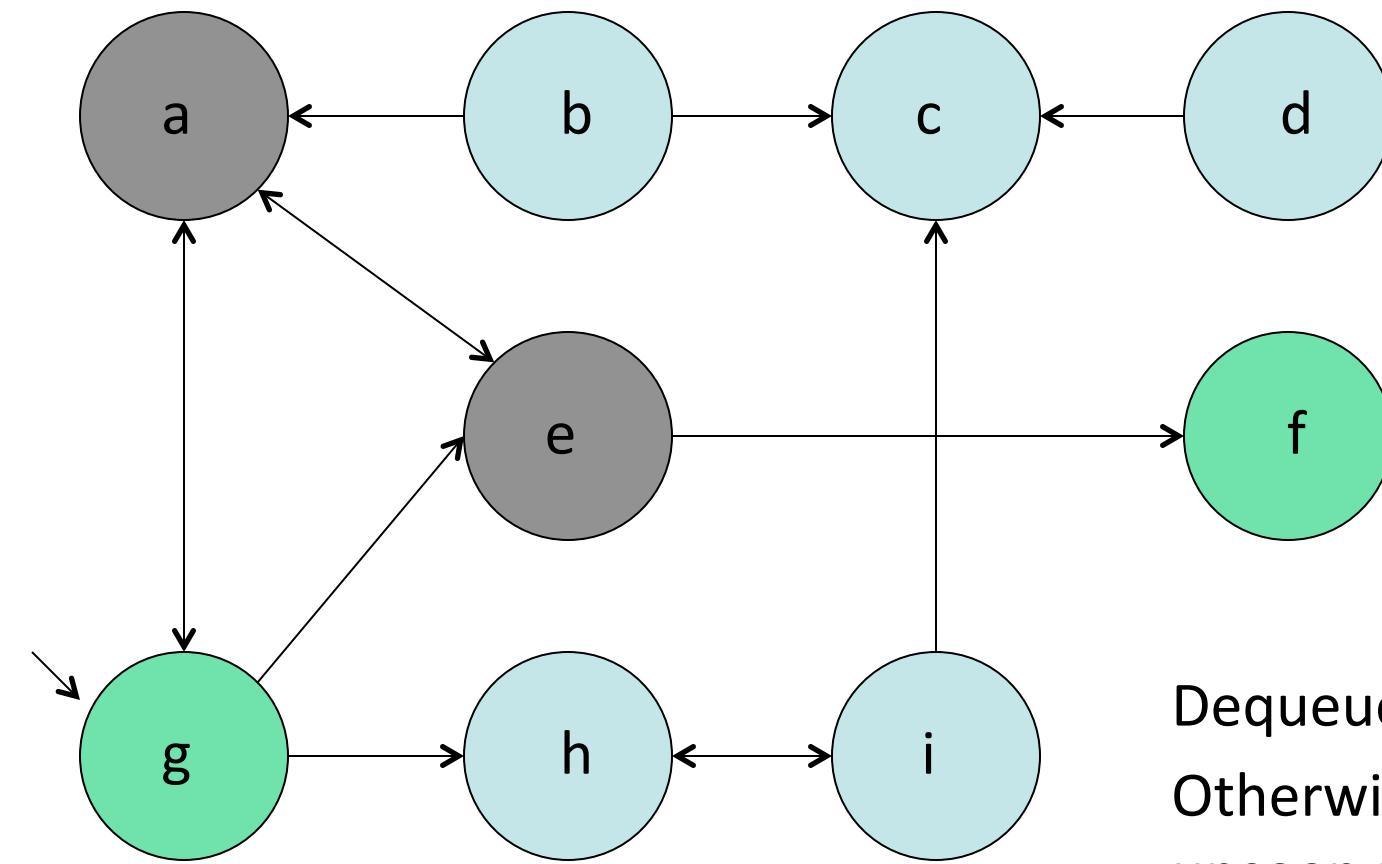
# BFS



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

queue: g, f

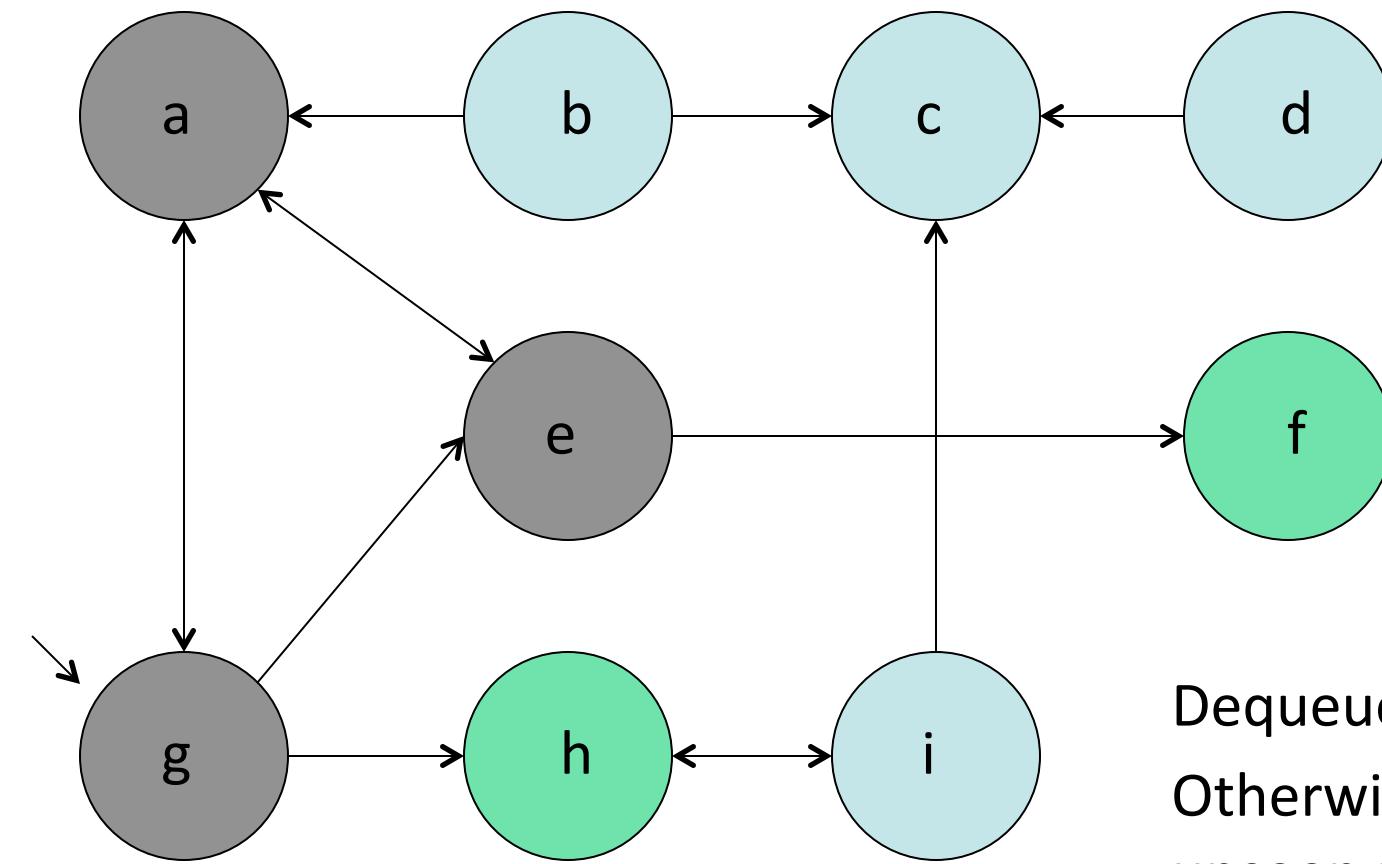
# BFS



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

queue: g, f

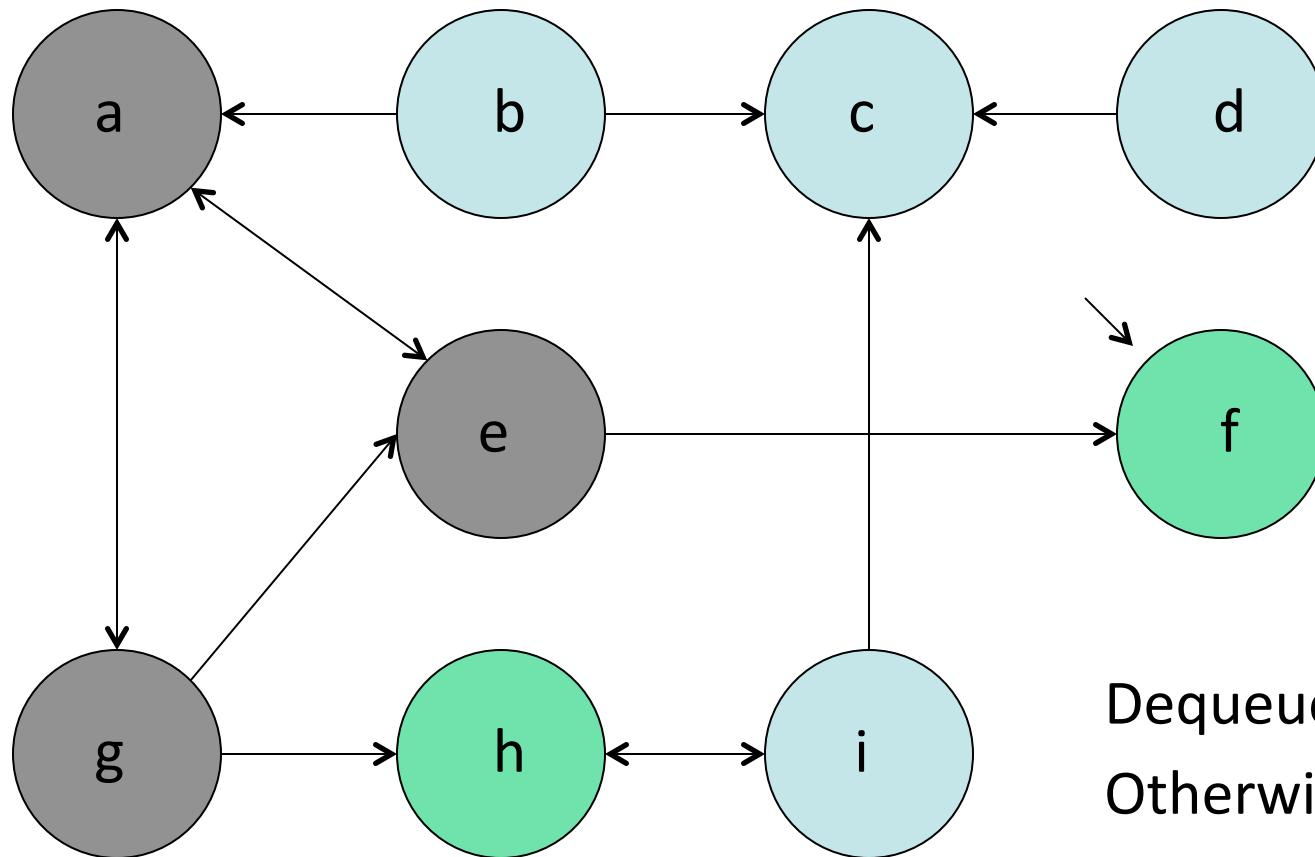
# BFS



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

queue: f, h

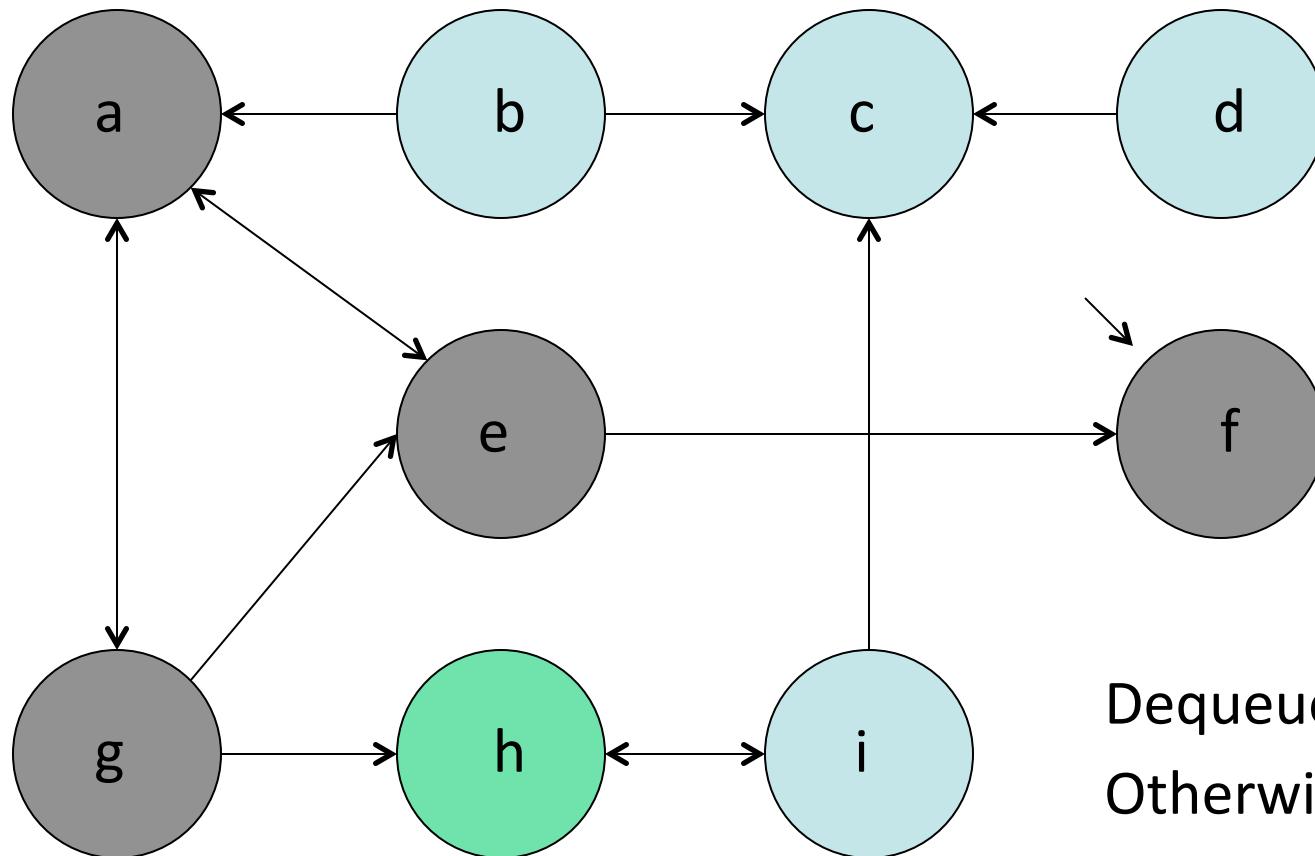
# BFS



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

queue: f, h

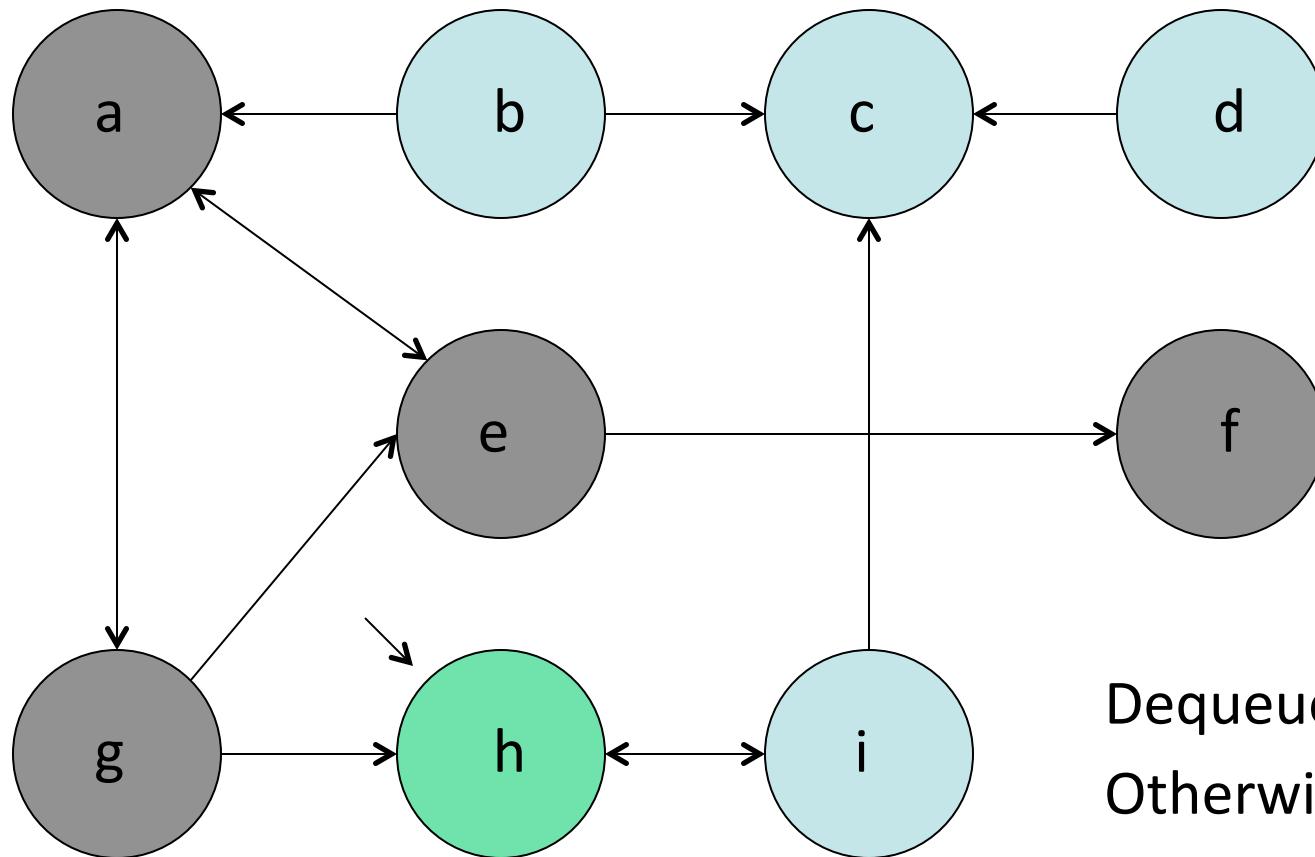
# BFS



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

queue: h

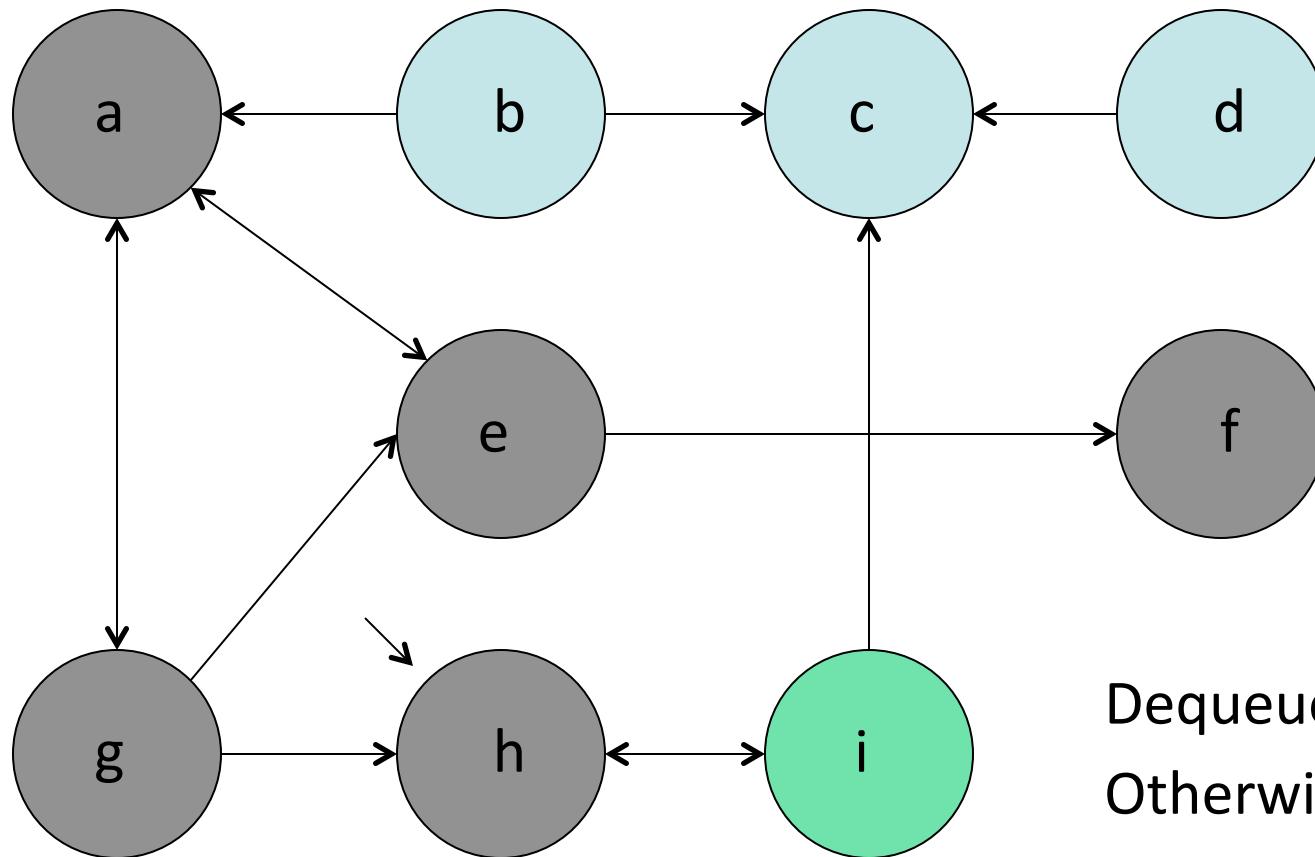
# BFS



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

queue: h

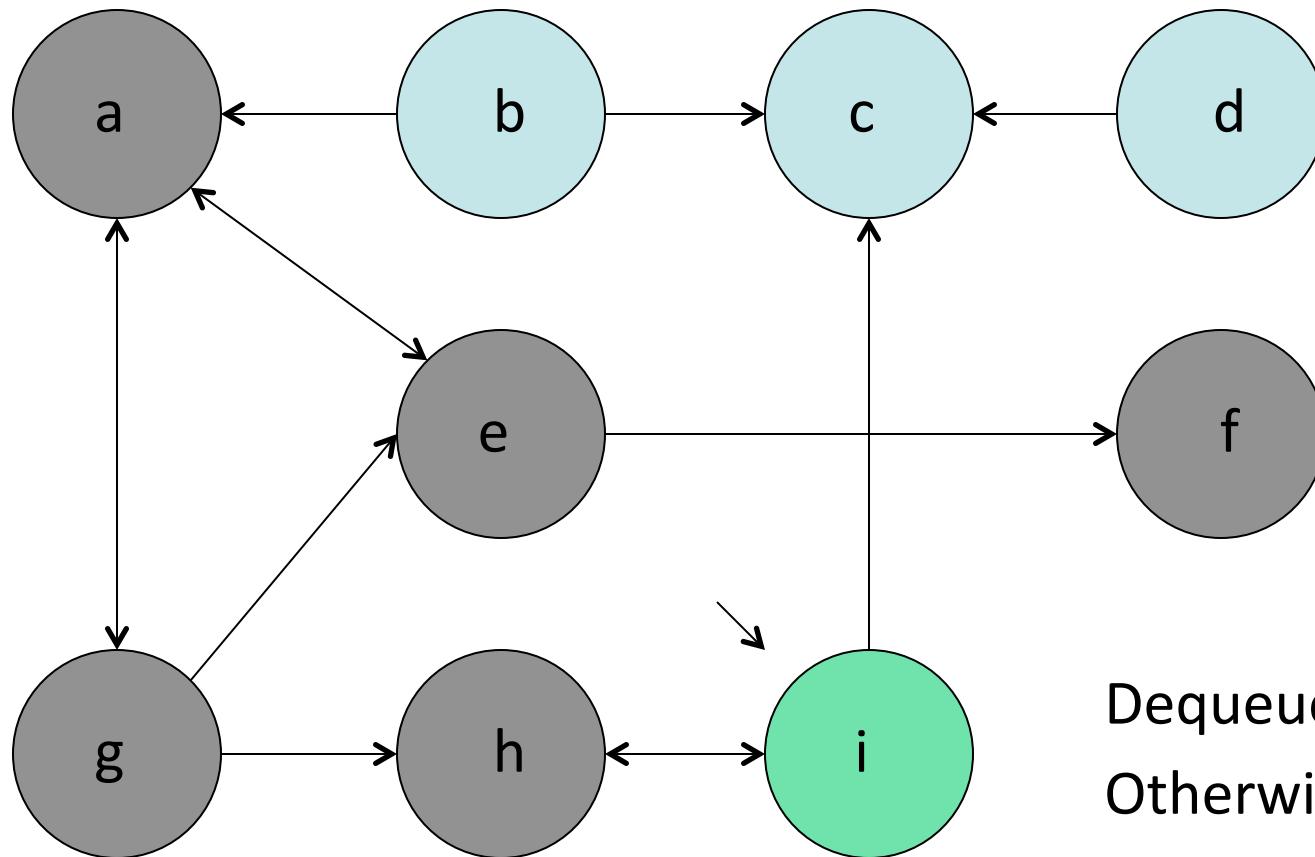
# BFS



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

queue: i

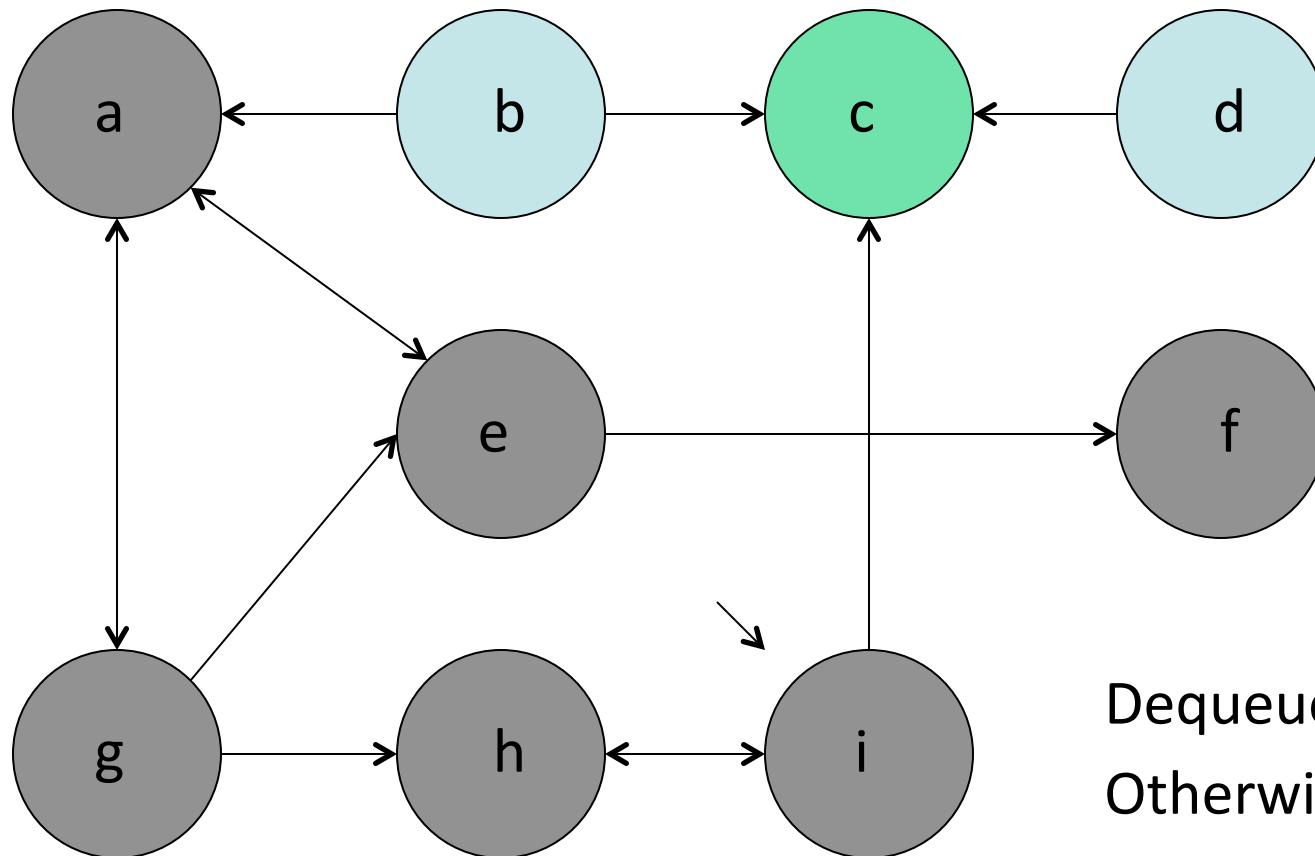
# BFS



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

queue: i

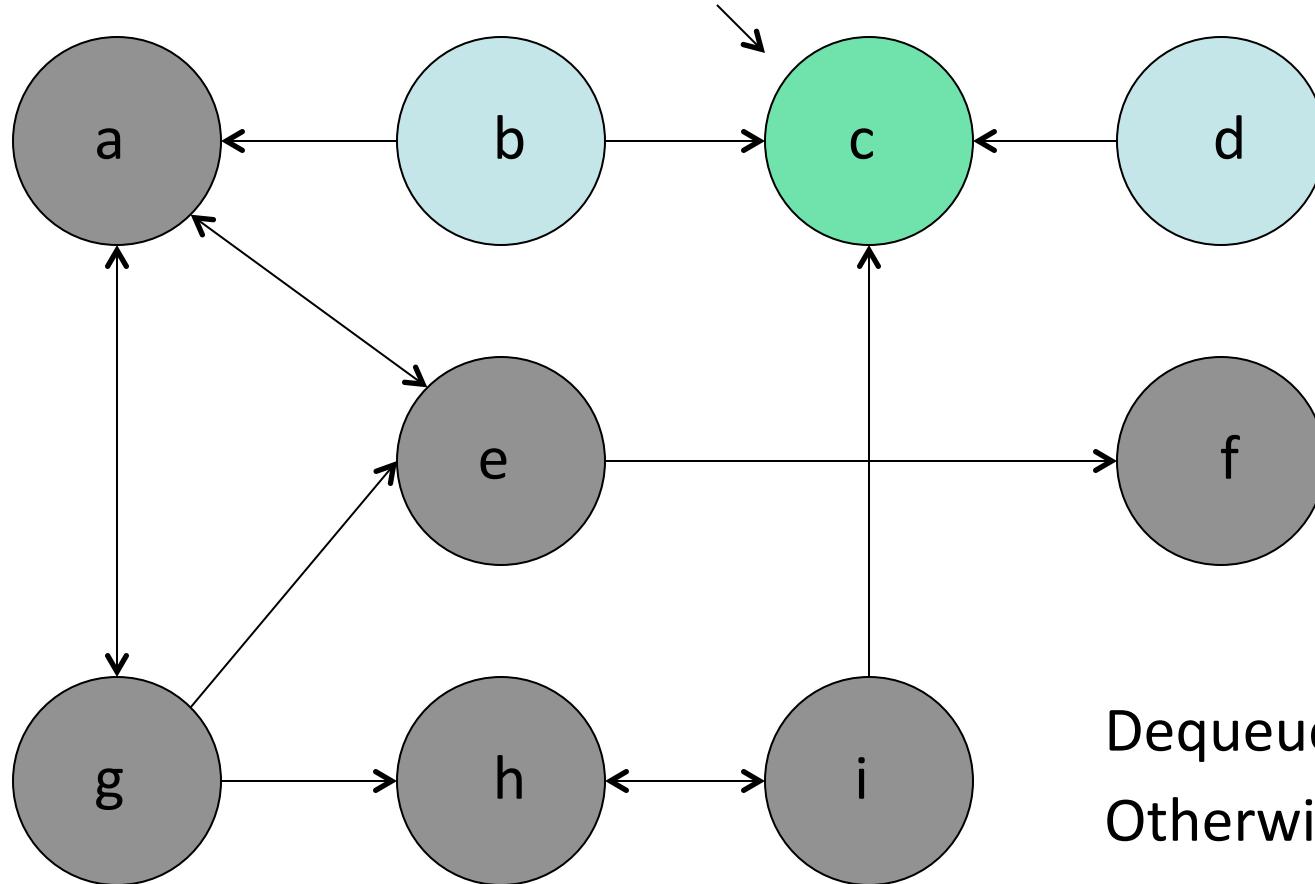
# BFS



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

queue: c

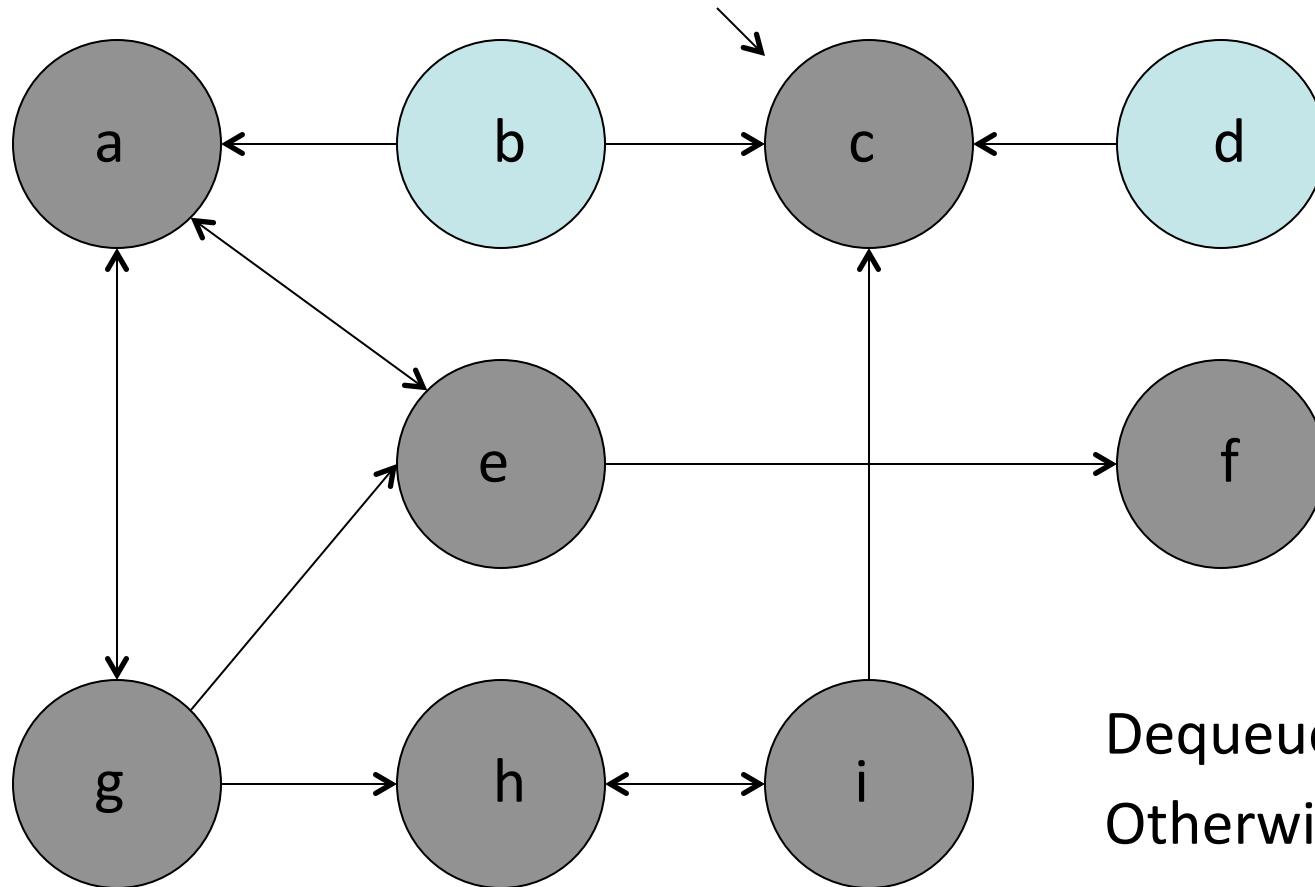
# BFS



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?