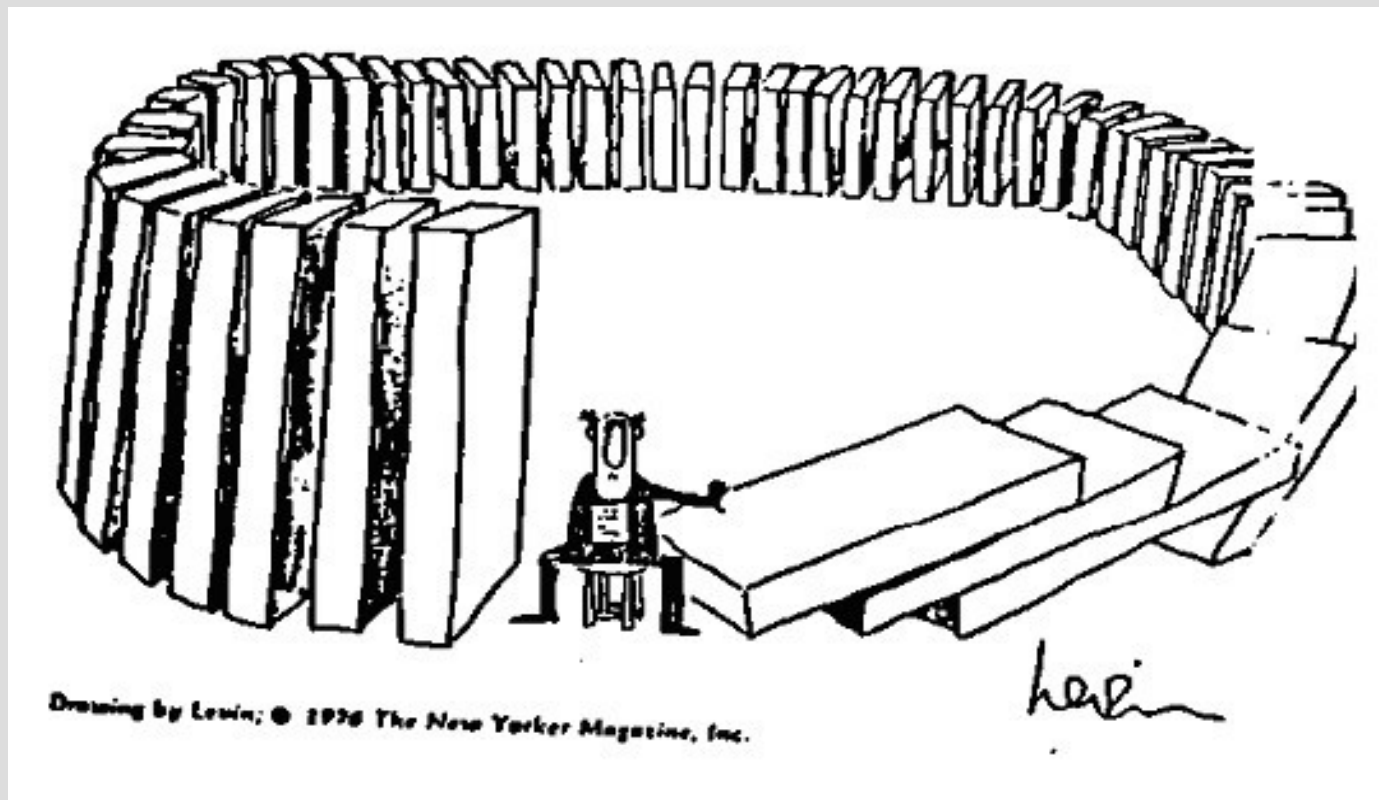


# Unweighted directed graphs



# Announcements

## Midterm & gradescope

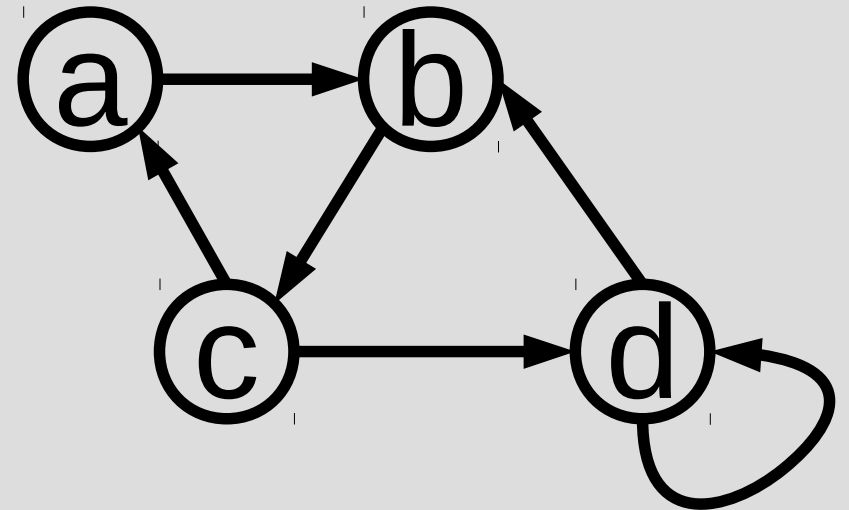
- will get an email today to register  
(username name is your email)
- tests should appear next Tuesday  
(nothing there now)

# Graph

A directed graph  $G$  is a set of edges and vertices:  $G = (V, E)$

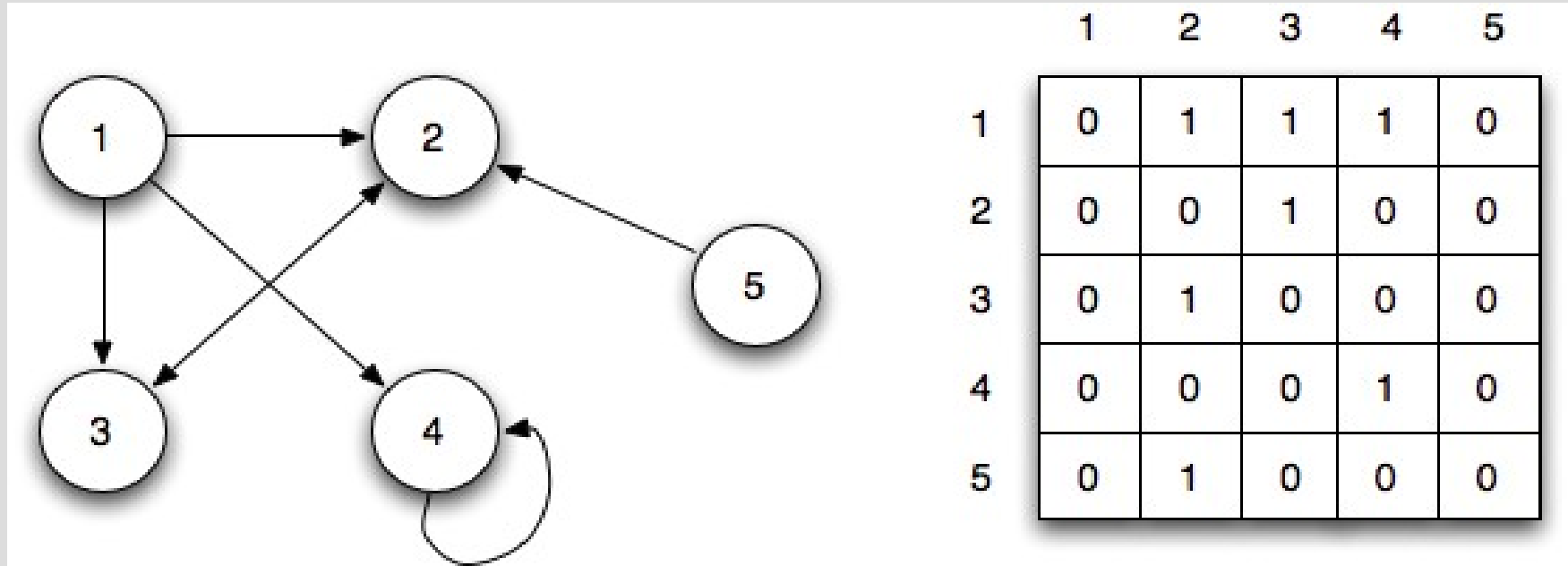
Two common ways to represent a graph:

- Adjacency matrix
- Adjacency list



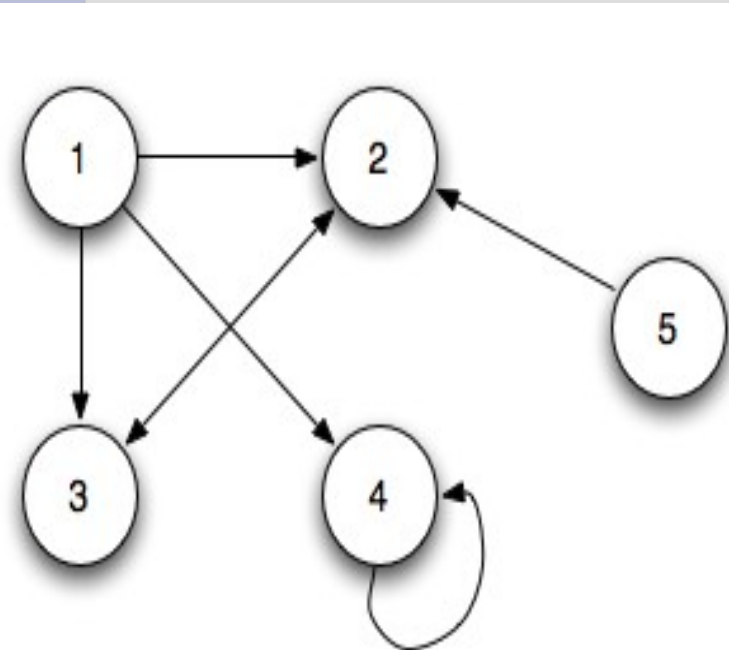
# Graph

An adjacency matrix has a 1 in row  $i$  and column  $j$  if you can go from node  $i$  to node  $j$

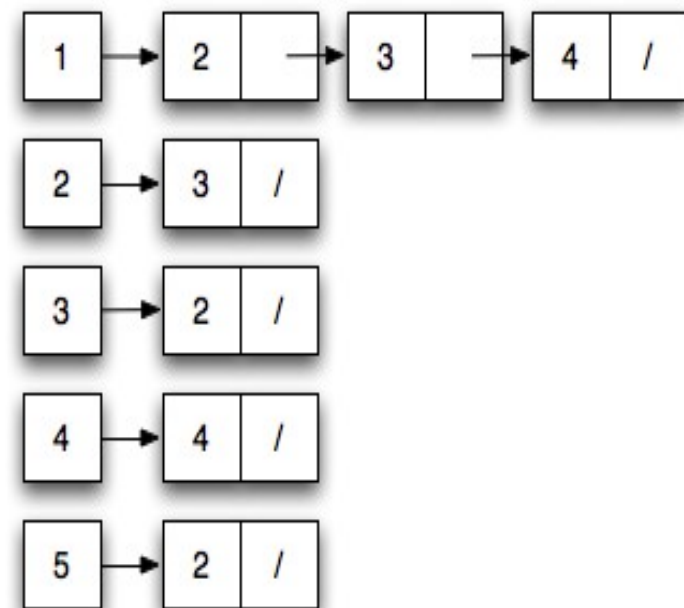


# Graph

An adjacency list just makes lists out of each row (list of edges out from every vertex)



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



# Graph

Difference between adjacency matrix and adjacency list?

# Graph

Difference between adjacency matrix and adjacency list?

Matrix is more memory  $O(|V|^2)$ ,  
less computation:  $O(1)$  lookup

List is less memory  $O(E+V)$  if sparse,  
more computation:  $O(\text{branch factor})$

# Graph

Adjacency matrix,  $A=A^1$ , represents the number of paths from row node to column node in 1 step

Prove:  $A^n$  is the number of paths from row node to column node in  $n$  steps



# Graph

Proof: Induction

Base:  $A^0 = I$ , 0 steps from  $i$  is  $i$

Induction: (Assume  $A^n$ , show  $A^{n+1}$ )

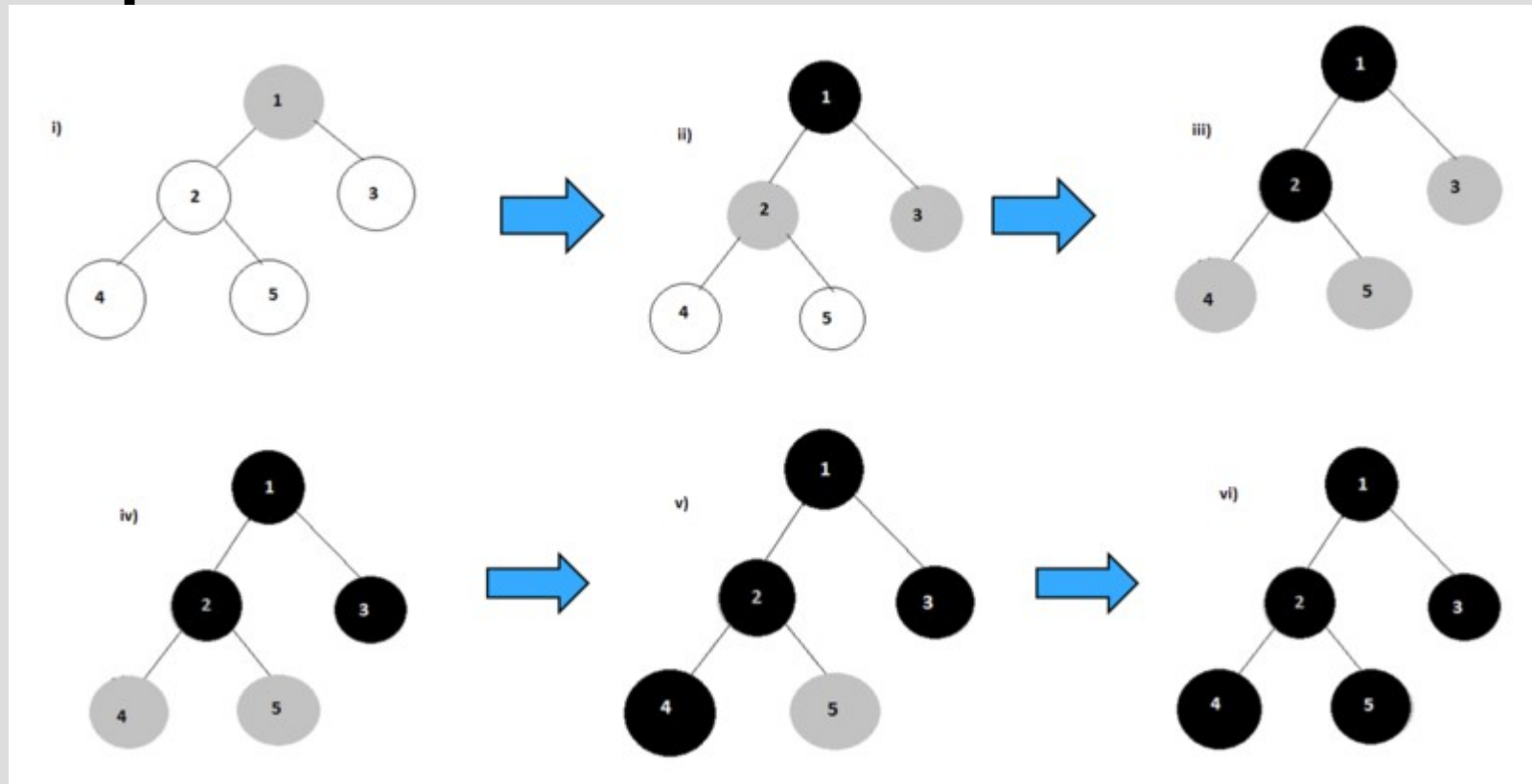
Let  $a_{i,j}^n = i^{\text{th}}$  row,  $j^{\text{th}}$  column of  $A^n$

Then  $a_{i,j}^{n+1} = \sum_k a_{i,k}^n a_{k,j}^1$

This is just matrix multiplication

# Breadth First Search Overview

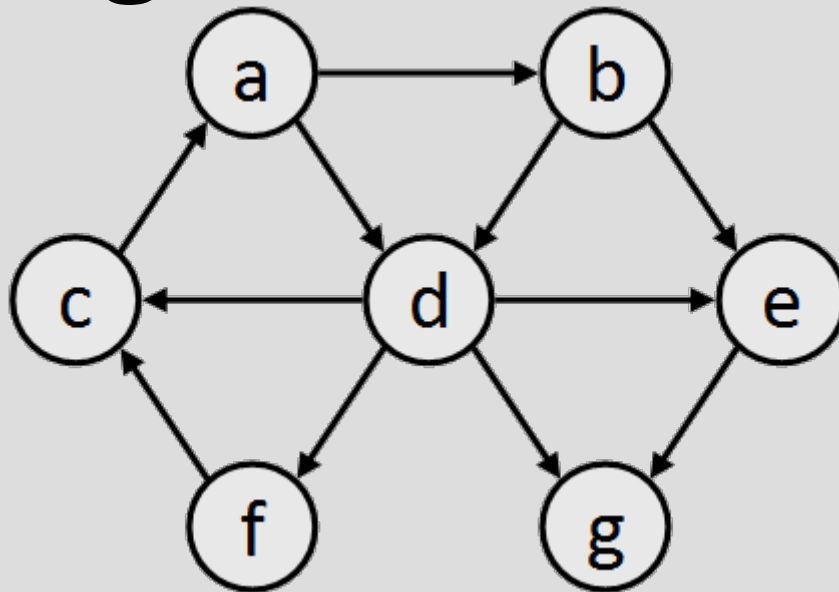
Create first-in-first-out (FIFO) queue to explore unvisited nodes



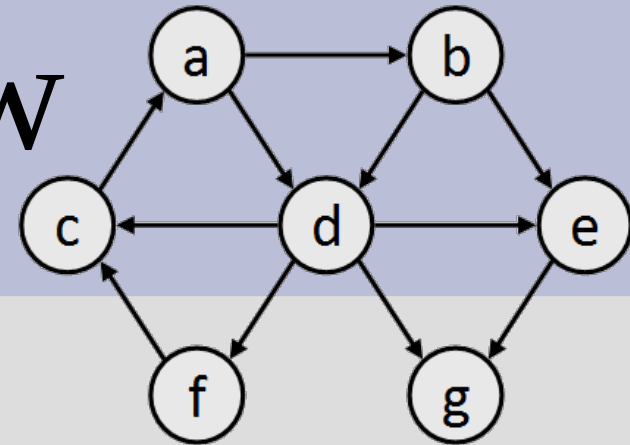
# Breadth First Search Overview

Consider the graph below

Suppose we wanted to get from “a” to “c” using breadth first search



# BFS Overview



To keep track of which nodes we have seen, we will do:

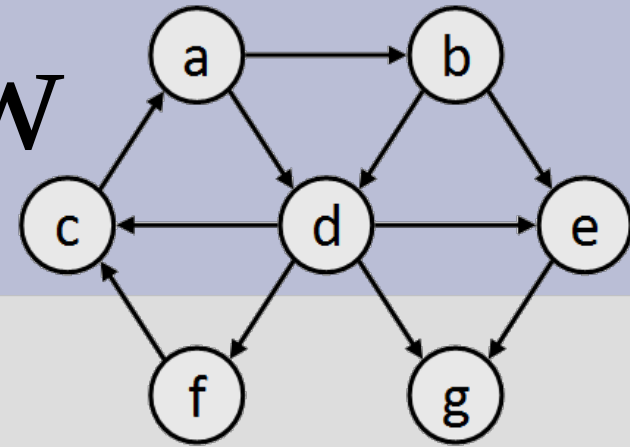
White nodes = never seen before

Grey nodes = nodes in  $Q$

Black nodes = nodes that are done

To keep track of who first saw nodes  
I will make red arrows ( $\pi$  in book)

# BFS Overview



First, we add the start to the queue, so  $Q = \{a\}$

Then we will repeatedly take the left-most item in  $Q$  and add all of its neighbors (that we haven't seen yet) to the  $Q$  on the right

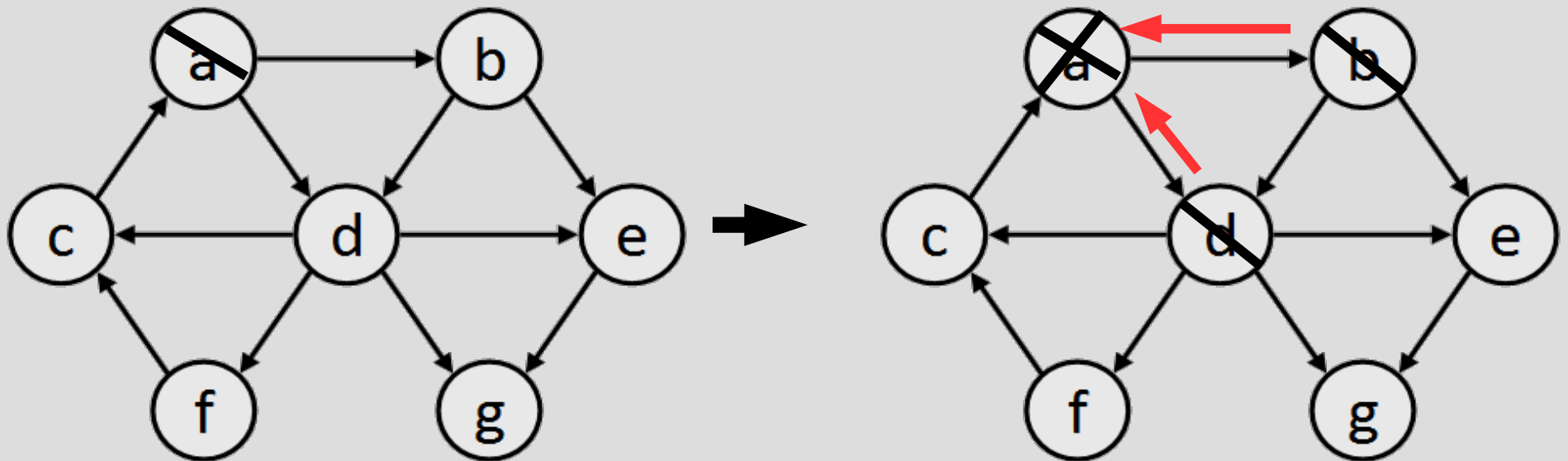
# BFS Overview

$Q = \{a\}$

Left-most = a

White neighbors = b & d

New  $Q = \{b, d\}$



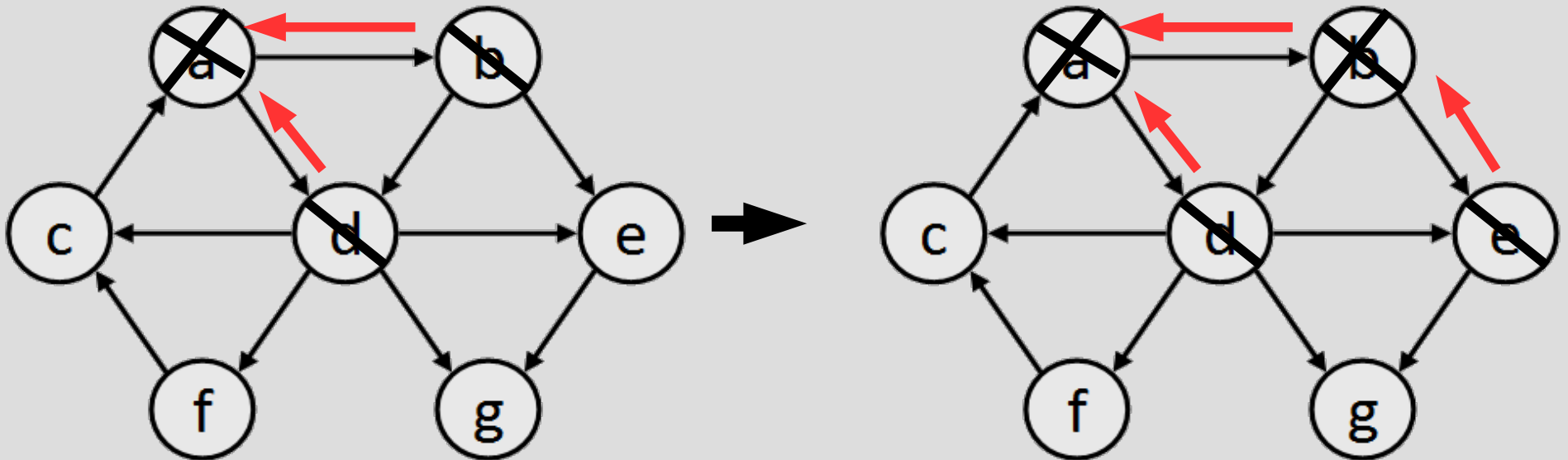
# BFS Overview

$Q = \{b, d\}$

Left-most = b

White neighbors = e

New  $Q = \{d, e\}$



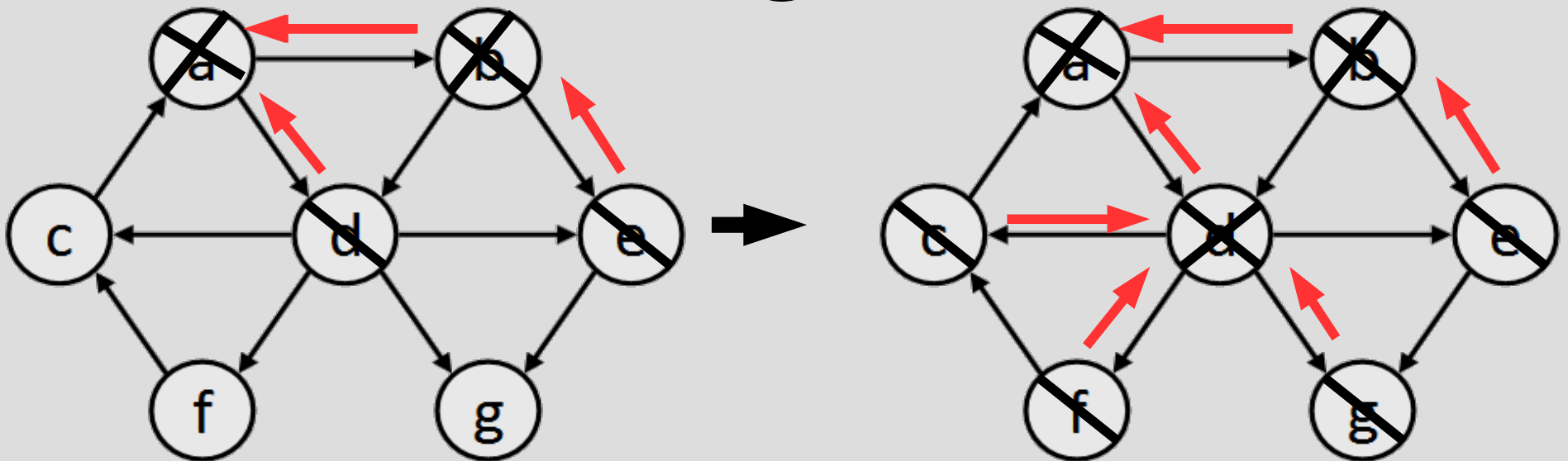
# BFS Overview

$Q = \{d, e\}$

Left-most =  $d$

White neighbors =  $c$  &  $f$  &  $g$

New  $Q = \{e, c, f, g\}$





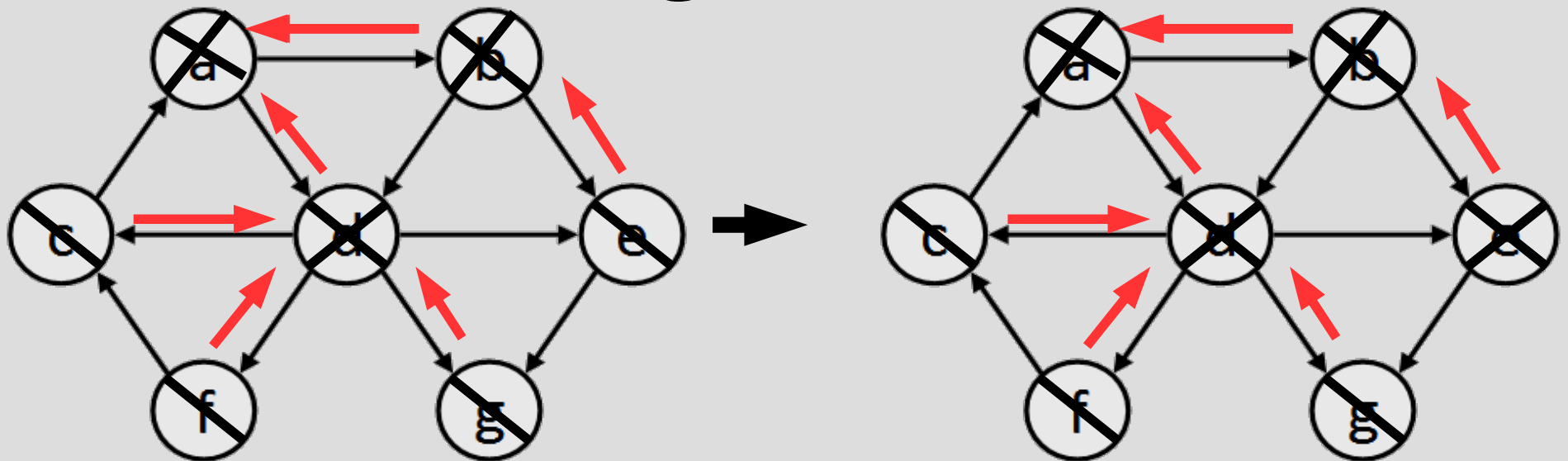
# BFS Overview

$Q = \{e, c, f, g\}$

Left-most = e

White neighbors = (none)

New  $Q = \{c, f, g\}$

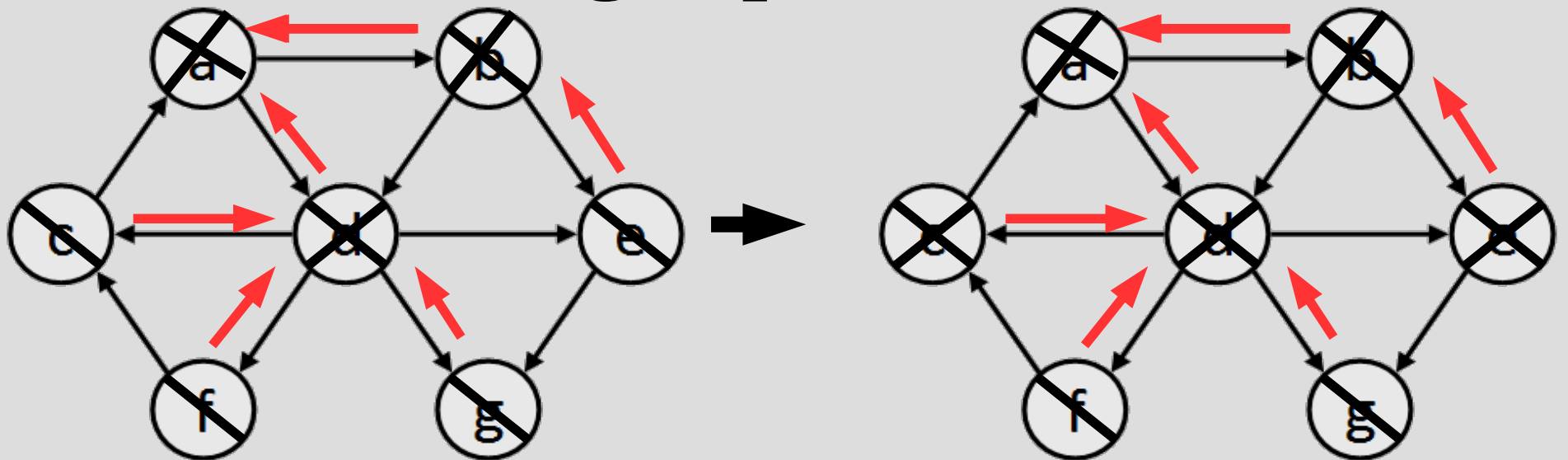


# BFS Overview

$Q = \{c, f, g\}$

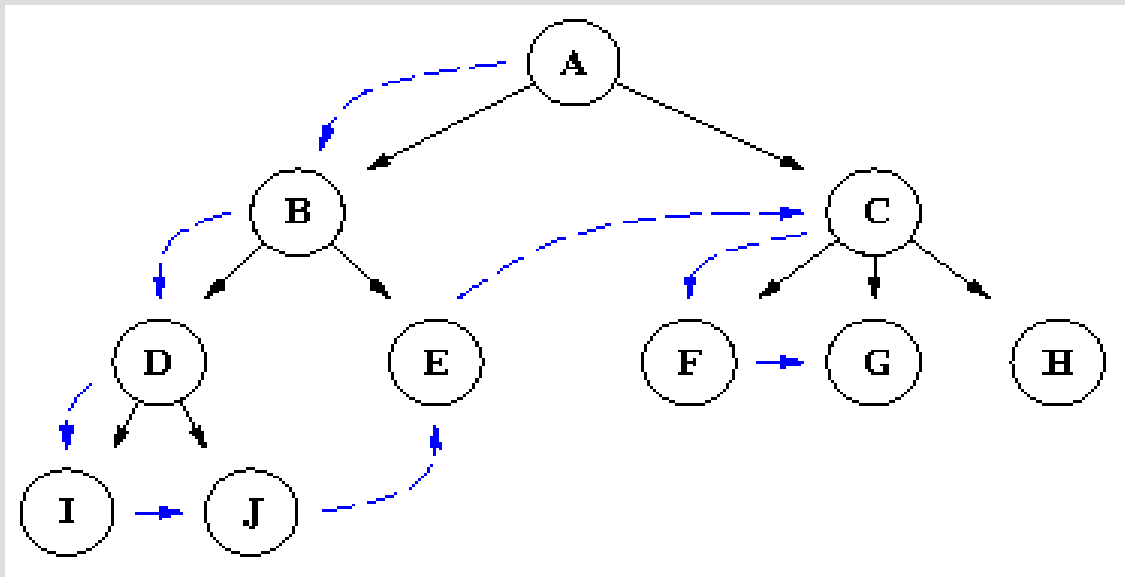
Left-most = c

Done! We found c, backtrack on red arrows to get path from “a”



# Depth First Search Overview

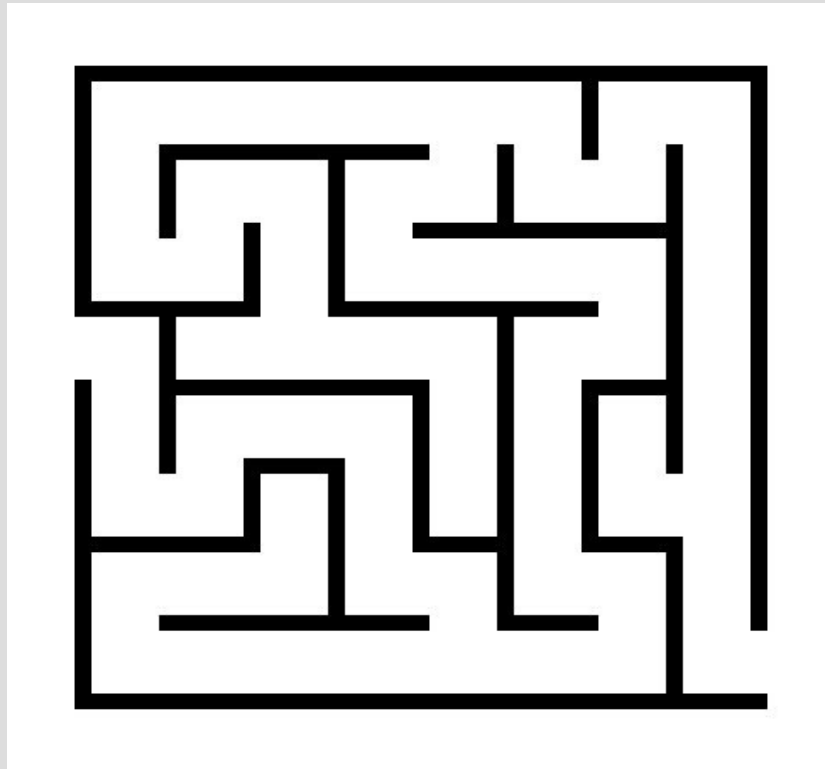
Create first-in-last-out (FILO) queue to explore unvisited nodes



# Depth First Search Overview

You can solve mazes by putting your left-hand on the wall and following it

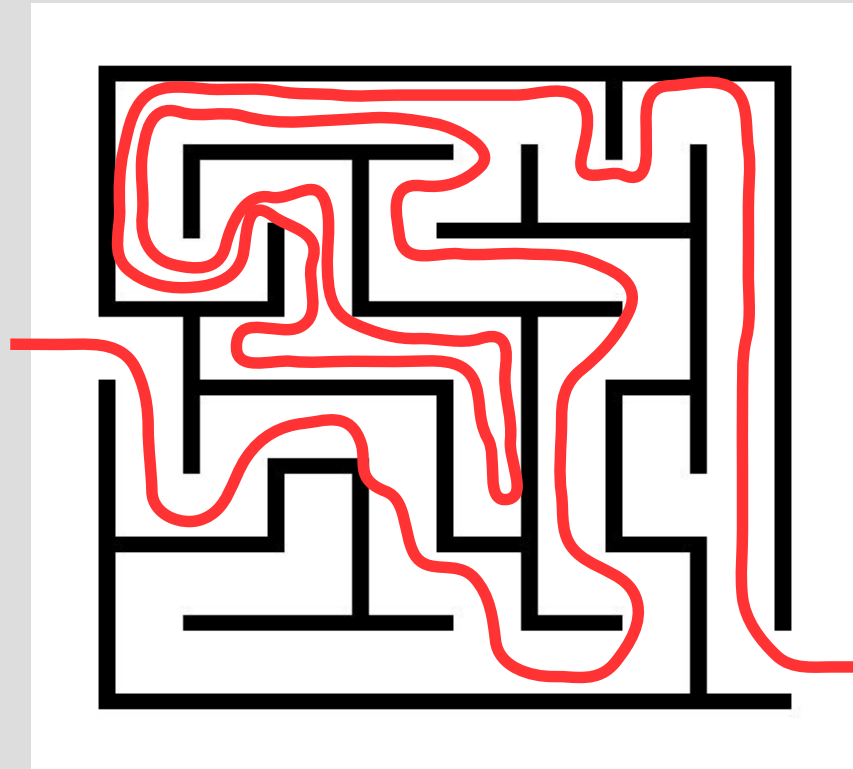
(i.e. left turns at every intersection)



# Depth First Search Overview

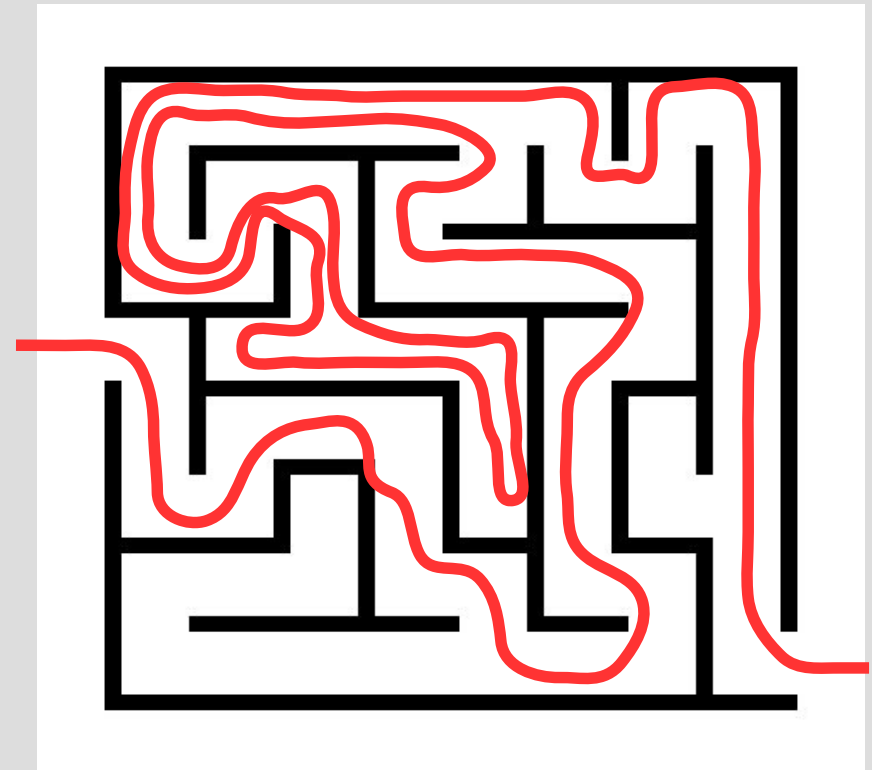
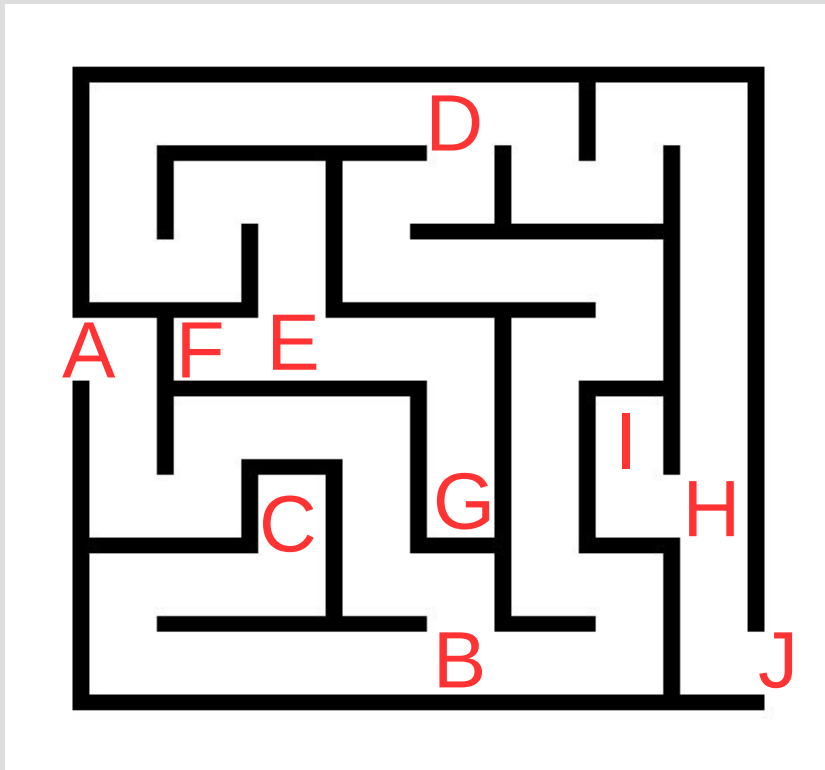
You can solve mazes by putting your left-hand on the wall and following it

(i.e. left turns at every intersection)



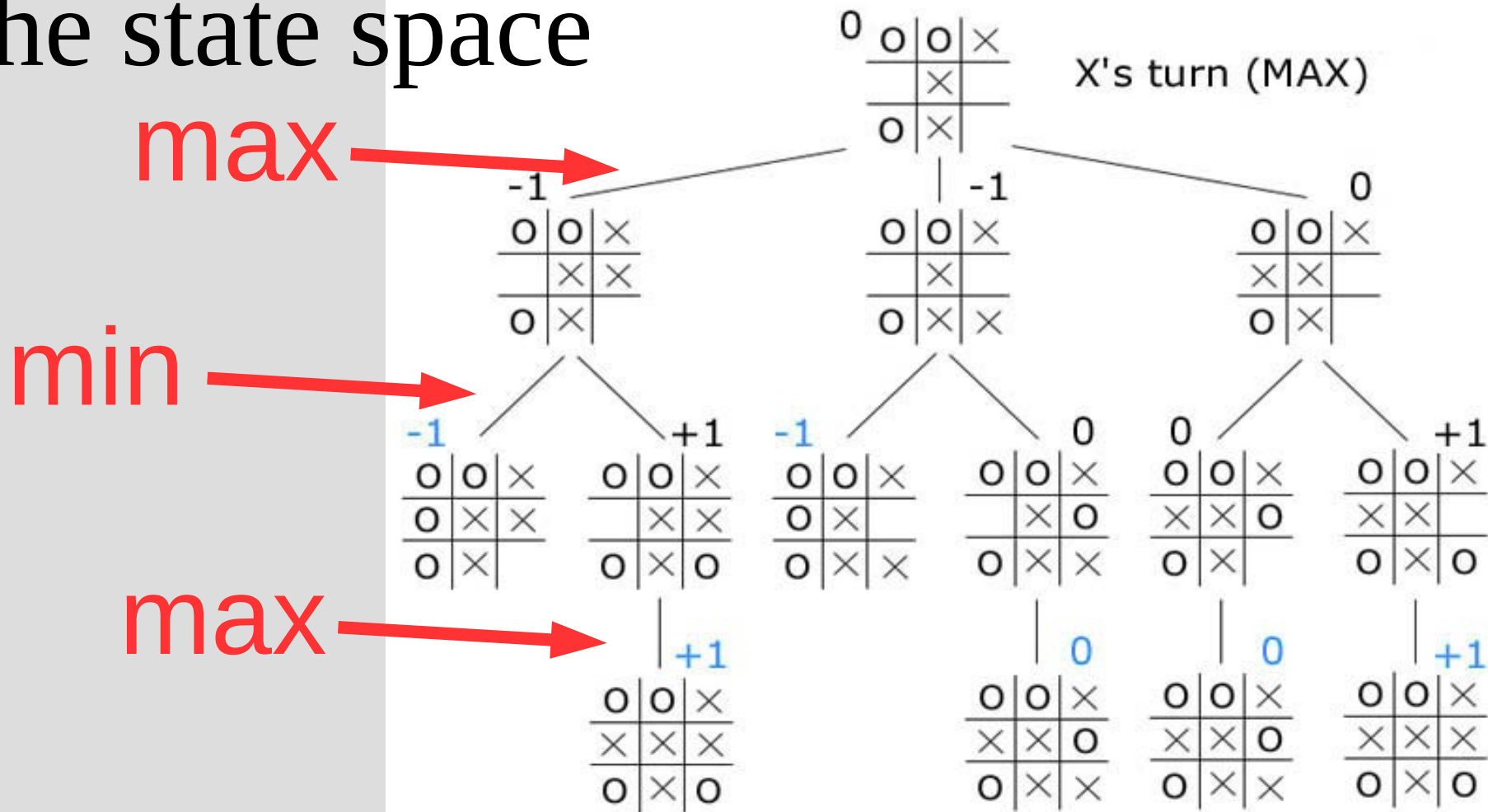
# Depth First Search Overview

This is actually just depth first search



# BFS and DFS in trees

Solve problems by making a tree of the state space



# BFS and DFS in trees

Often times, fully exploring the state space is too costly (takes forever)

Chess:  $10^{47}$  states (tree about  $10^{123}$ )

Go:  $10^{171}$  states (tree about  $10^{360}$ )

At 1 million states per second...

Chess:  $10^{109}$  years (past heat death

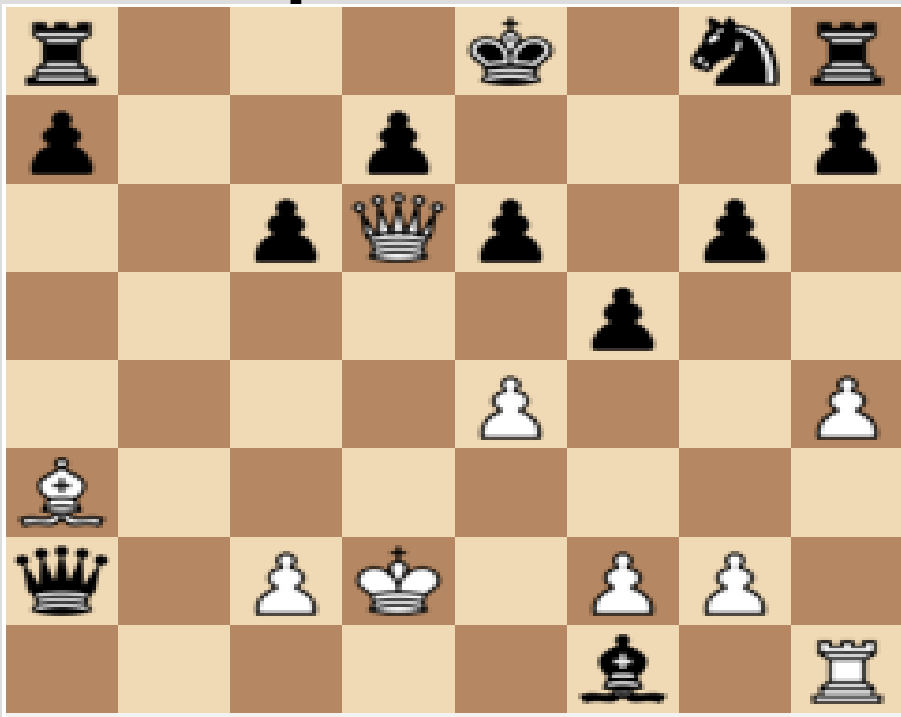
Go:  $10^{346}$  years of universe)



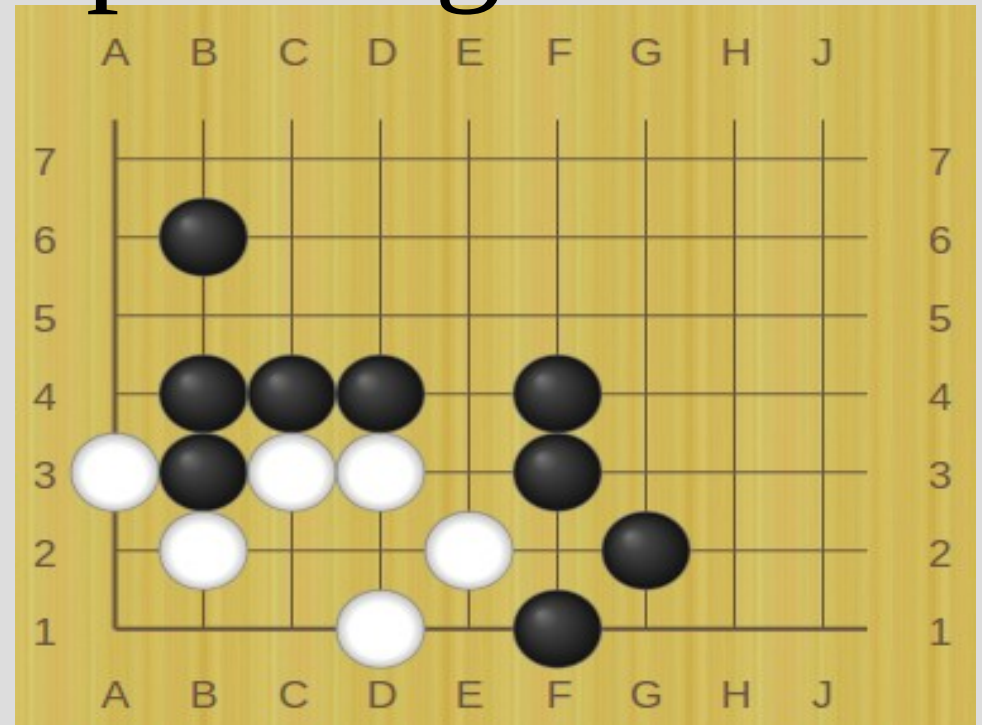
# BFS and DFS in trees

BFS prioritizes “exploring”

DFS prioritizes “exploiting”



White to move



Black to move

# BFS and DFS in trees

BFS benefits?

DFS benefits?

# BFS and DFS in trees

BFS benefits?

- if stopped before full search, can evaluate best found

DFS benefits?

- uses less memory on complete search

# BFS and DFS in graphs

BFS: shortest path from origin to any node

DFS: find graph structure

Both running time of  $O(V+E)$

# Breadth first search

BFS( $G, s$ ) // to find shortest path from  $s$

for all  $v$  in  $V$

$v.color = \text{white}$ ,  $v.d = \infty$ ,  $v.\pi = \text{NIL}$

$s.color = \text{grey}$ ,  $s.d = 0$

Enqueue( $Q, s$ )

while( $Q$  not empty)

$u = \text{Dequeue}(Q, s)$

    for  $v$  in  $G.adj[u]$

        if  $v.color == \text{white}$

$v.color = \text{grey}$ ,  $v.d = u.d + 1$ ,  $v.\pi = u$

            Enqueue( $Q, v$ )

$u.color = \text{black}$

# Breadth first search

Let  $\delta(s, v)$  be the shortest path from  $s$  to  $v$

After running BFS you can find this path as:  $v.\pi$  to  $(v.\pi).\pi$  to ...  $s$

(pseudo code on p. 601, recursion)

# BFS correctness

Proof: contradiction

Assume  $\delta(s,v) \neq v.d$

$v.d \geq \delta(s,v)$  (Lemma 22.2, induction)

Thus  $v.d > \delta(s,v)$

Let  $u$  be previous node on  $\delta(s,v)$

Thus  $\delta(s,v) = \delta(s,u) + 1$

and  $\delta(s,u) = u.d$

Then  $v.d > \delta(s,v) = \delta(s,u) + 1 = u.d + 1$

# BFS correctness

$$v.d > \delta(s,v) = \delta(s,u)+1 = u.d+1$$

Cases on color of  $v$  when  $u$  dequeue,  
all cases invalidate top equation

Case white: alg sets  $v.d = u.d + 1$

Case black: already removed

thus  $v.d \leq u.d$  (corollary 22.4)

Case grey: exists  $w$  that dequeued  $v$ ,  
 $v.d = w.d+1 \leq u.d+1$  (corollary 22.4)



# Depth first search

DFS can be implemented with BFS

We will mark both a start (colored grey) and finish (colored black) times

This helps us quantify properties of graphs

# Depth first search

DFS(G)

for all  $v$  in  $V$

$v.color = white$ ,  $v.\pi = NIL$

time=0

for each  $v$  in  $V$

    if  $v.color == white$

        DFS-Visit(G,  $v$ )

# Depth first search

DFS-Visit( $G, u$ )

time=time+1

$u.d = \text{time}$ ,  $u.\text{color} = \text{grey}$

for each  $v$  in  $G.\text{adj}[u]$

if  $v.\text{color} == \text{white}$

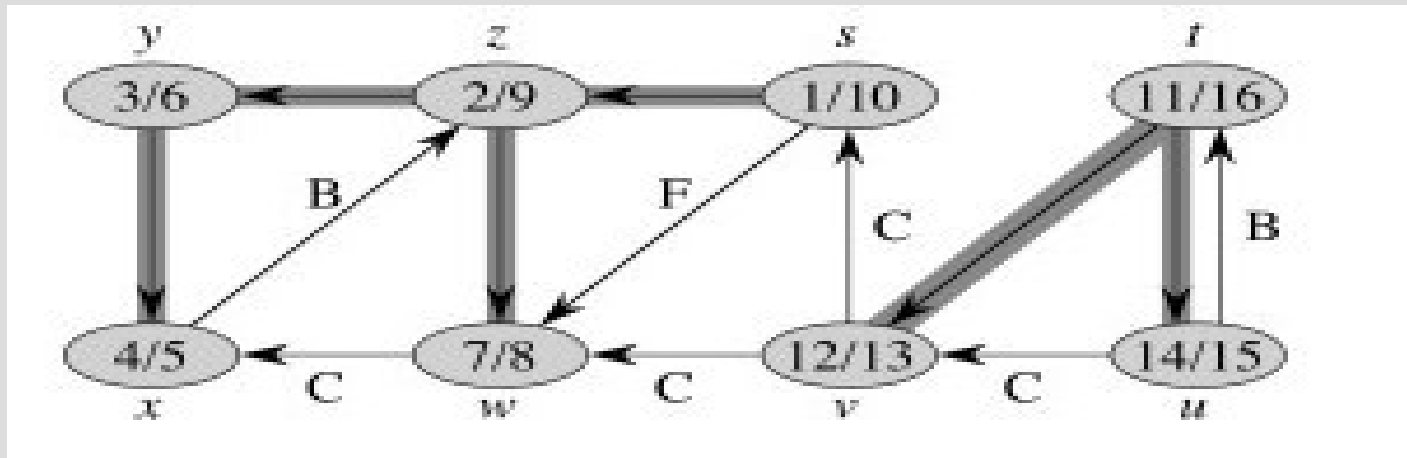
$v.\pi = u$

DFS-Visit( $G, v$ )

$u.\text{color} = \text{black}$ ,  $\text{time} = \text{time} + 1$ ,  $u.f = \text{time}$

# Depth first search

Edge markers:



Consider edge u to v

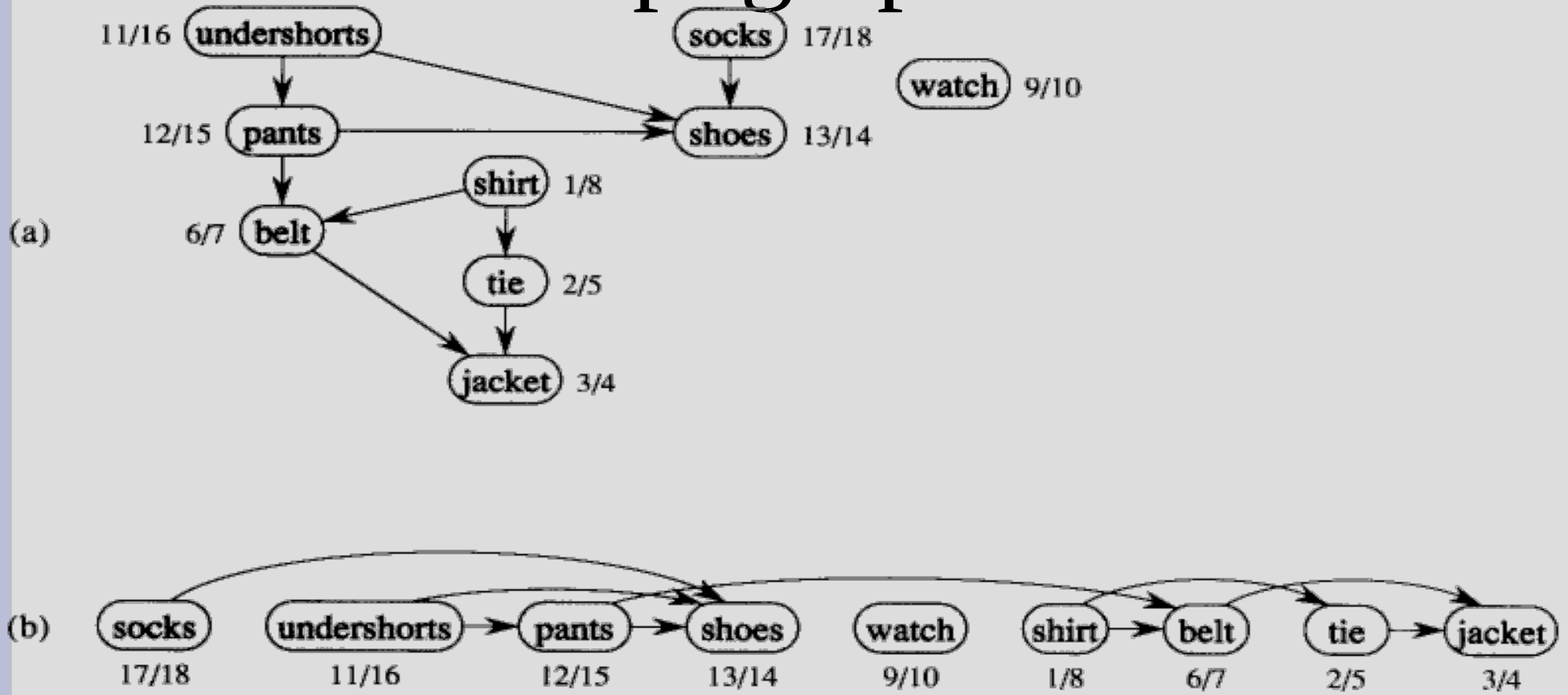
B = Edge to grey node ( $u.f < v.f$ )

F = Edge to black node ( $u.f > v.f$ )

C = Edge to black node ( $u.d > v.f$ )

# Depth first search

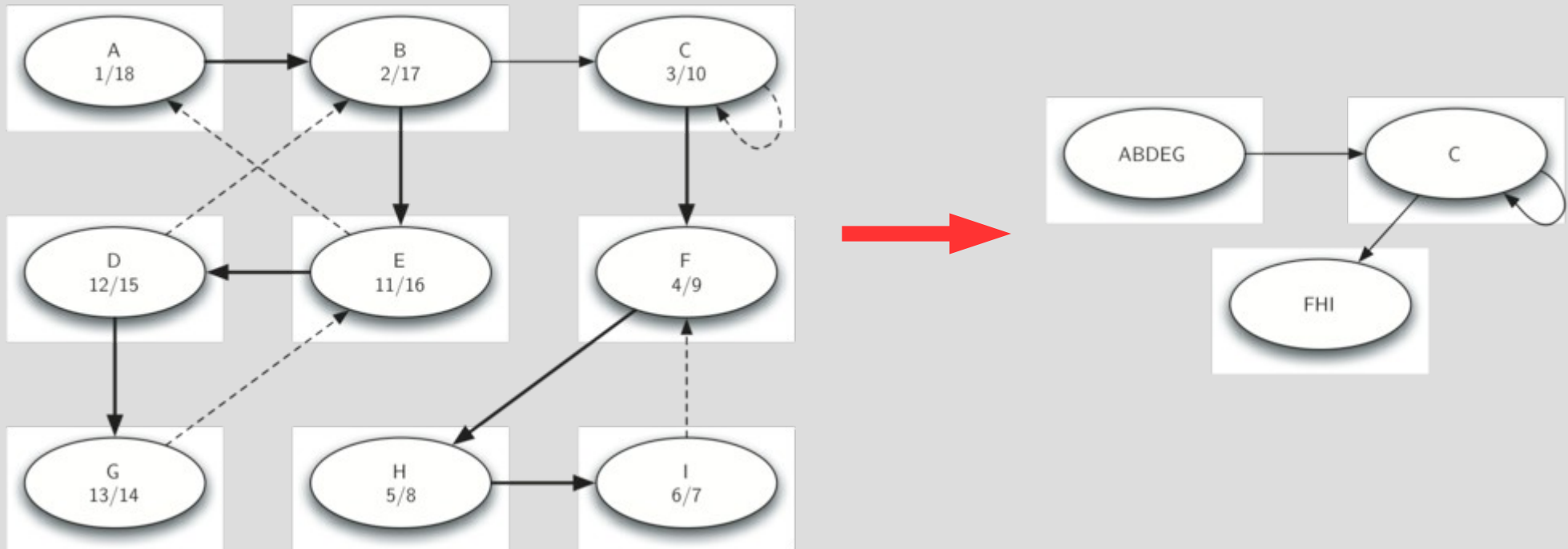
DFS can do topographical sort



Run DFS, sort in decreasing finish time

# Depth first search

DFS can find strongly connected components



# Depth first search

Let  $G^T$  be  $G$  with edges reversed

Then to get strongly connected:

1. DFS( $G$ ) to get finish times
2. Compute  $G^T$
3. DFS( $G^T$ ) on vertex in decreasing finish time
4. Each tree in forest SC component