

# CS 4260 and CS 5260

## Vanderbilt University

### Lecture on Uniformed Search

This lecture assumes that you have

- Read Chapter 2 through section 2.3 of ArtInt (15 pages)
- Read Chapter 3 through section 3.5.2 of ArtInt (20 pages) and
- Watched Doug's iterative deepening search video playlist (material from section 3.5.3 optional reading)

ArtInt: Poole and Mackworth, Artificial Intelligence 2E

at <http://artint.info/2e/html/ArtInt2e.html>

and some slides at <https://artint.info/2e/slides/index.html>

Iterative Deepening playlist:

<https://www.youtube.com/watch?v=7QcoJjSVT38&list=PLXAjOiPf89kPs82cbS6j9PR3t7ZzixnaO>

At the end of the class you should be able to:

- define a directed graph
- represent a problem as a state-space graph
- explain how a generic searching algorithm works

- Often we are not given an algorithm to solve a problem, but only a specification of what is a solution — we have to search for a solution.
- A typical problem is when the agent is in one state, it has a set of deterministic actions it can carry out, and wants to get to a goal state.
- Many AI problems can be abstracted into the problem of finding a path in a directed graph.
- Often there is more than one way to represent a problem as a graph.

# State-space Search

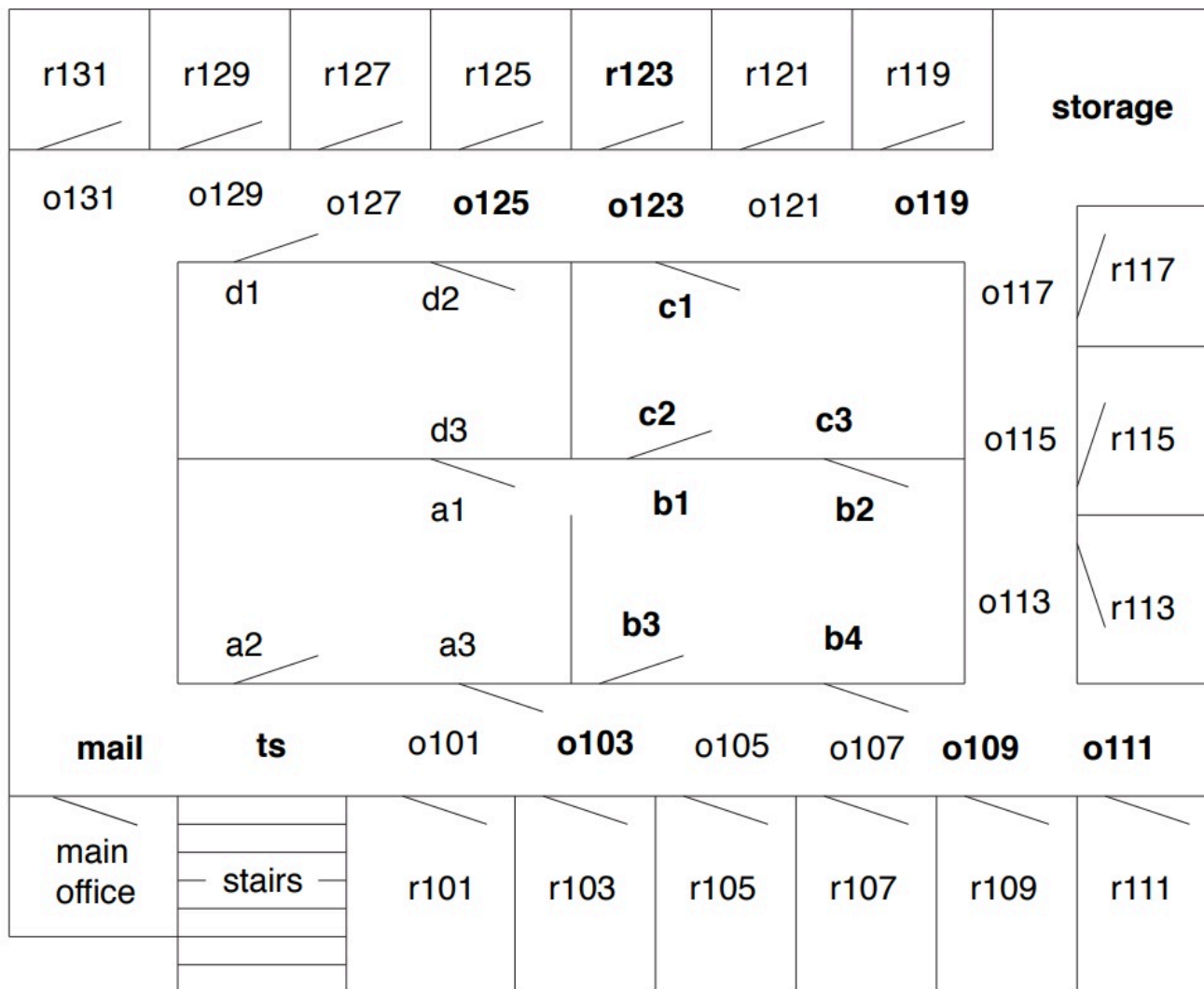
- **flat** or modular or hierarchical
- **explicit states** or features or individuals and relations
- static or finite stage or **indefinite stage** or infinite stage
- **fully observable** or partially observable
- **deterministic** or stochastic dynamics
- **goals** or complex preferences
- **single agent** or multiple agents
- **knowledge is given** or knowledge is learned
- **perfect rationality** or bounded rationality

# Directed Graphs

- A (directed) **graph** consists of a set  $N$  of **nodes** and a set  $A$  of ordered pairs of nodes, called **arcs**.
- Node  $n_2$  is a **neighbor** of  $n_1$  if there is an arc from  $n_1$  to  $n_2$ . That is, if  $\langle n_1, n_2 \rangle \in A$ .
- A **path** is a sequence of nodes  $\langle n_0, n_1, \dots, n_k \rangle$  such that  $\langle n_{i-1}, n_i \rangle \in A$ .
- The **length** of path  $\langle n_0, n_1, \dots, n_k \rangle$  is  $k$ .
- Given a set of **start nodes** and **goal nodes**, a **solution** is a path from a start node to a goal node.

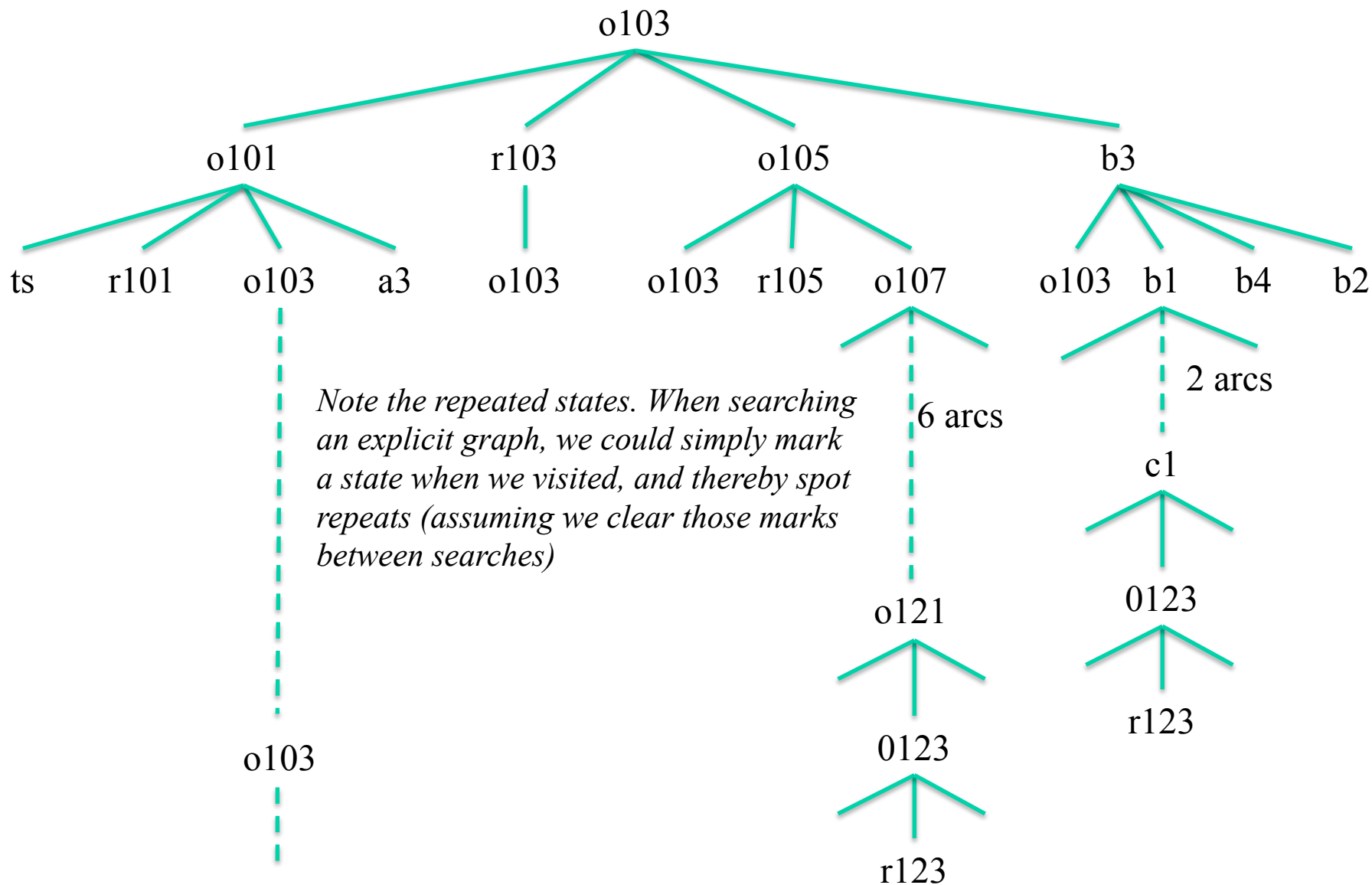
# Example Problem for Delivery Robot

The robot wants to get from outside room 103 to the inside of room 123.



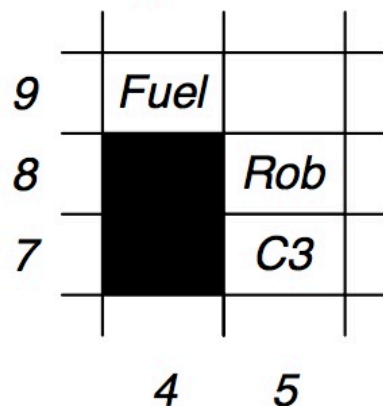


Search tree for Figure 3.1 of Poole and Mackworth, assuming robot starts at o103, with a goal of being in r123, with all arcs bidirectional (e.g., doors open in both directions, which is a different assumption than text's)



# Partial Search Space for a Video Game

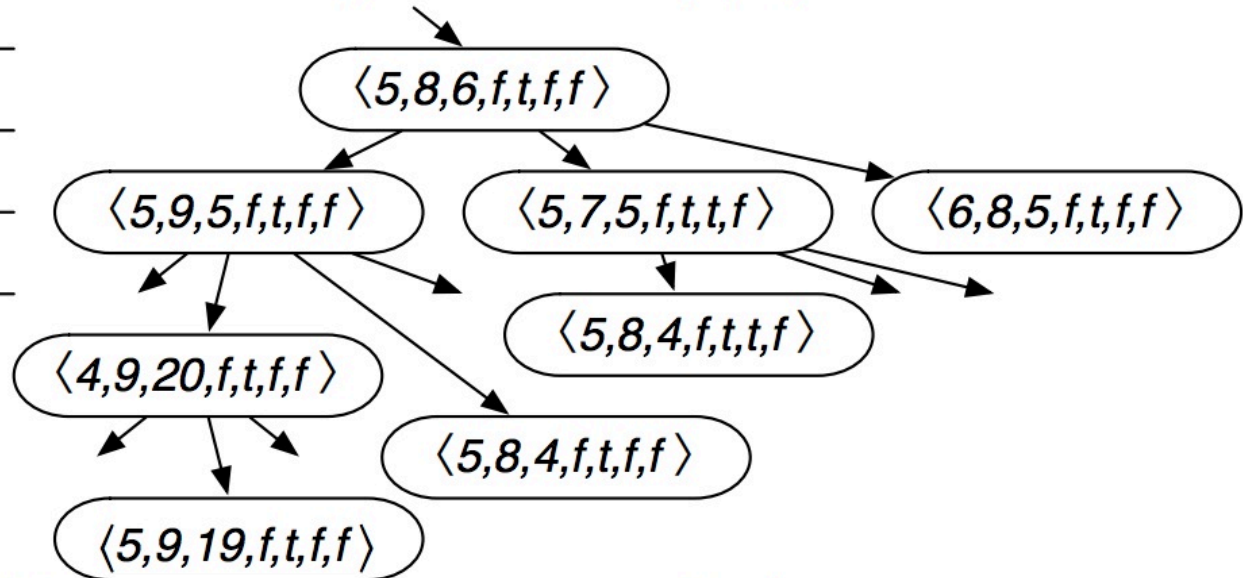
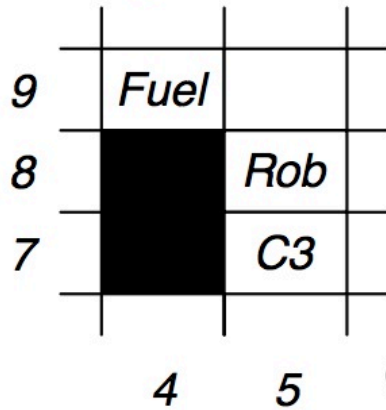
Grid game: Rob needs to collect coins  $C_1$ ,  $C_2$ ,  $C_3$ ,  $C_4$ , without running out of fuel, and end up at location (1, 1):





# Partial Search Space for a Video Game

Grid game: Rob needs to collect coins  $C_1, C_2, C_3, C_4$ , without running out of fuel, and end up at location (1, 1):



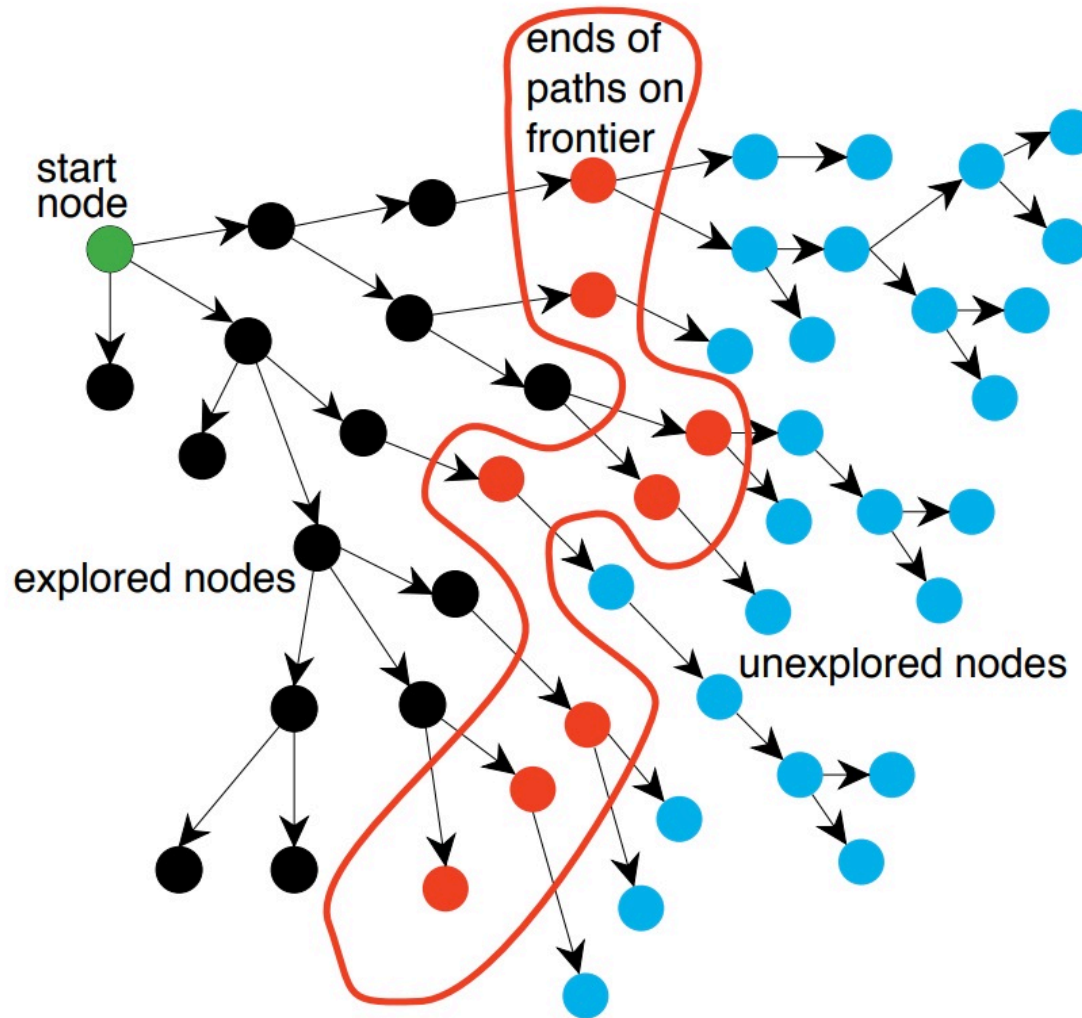
State:

$\langle X\text{-pos}, Y\text{-pos}, \text{Fuel}, C_1, C_2, C_3, C_4 \rangle$

Goal:

$\langle 1, 1, ?, t, t, t, t \rangle$

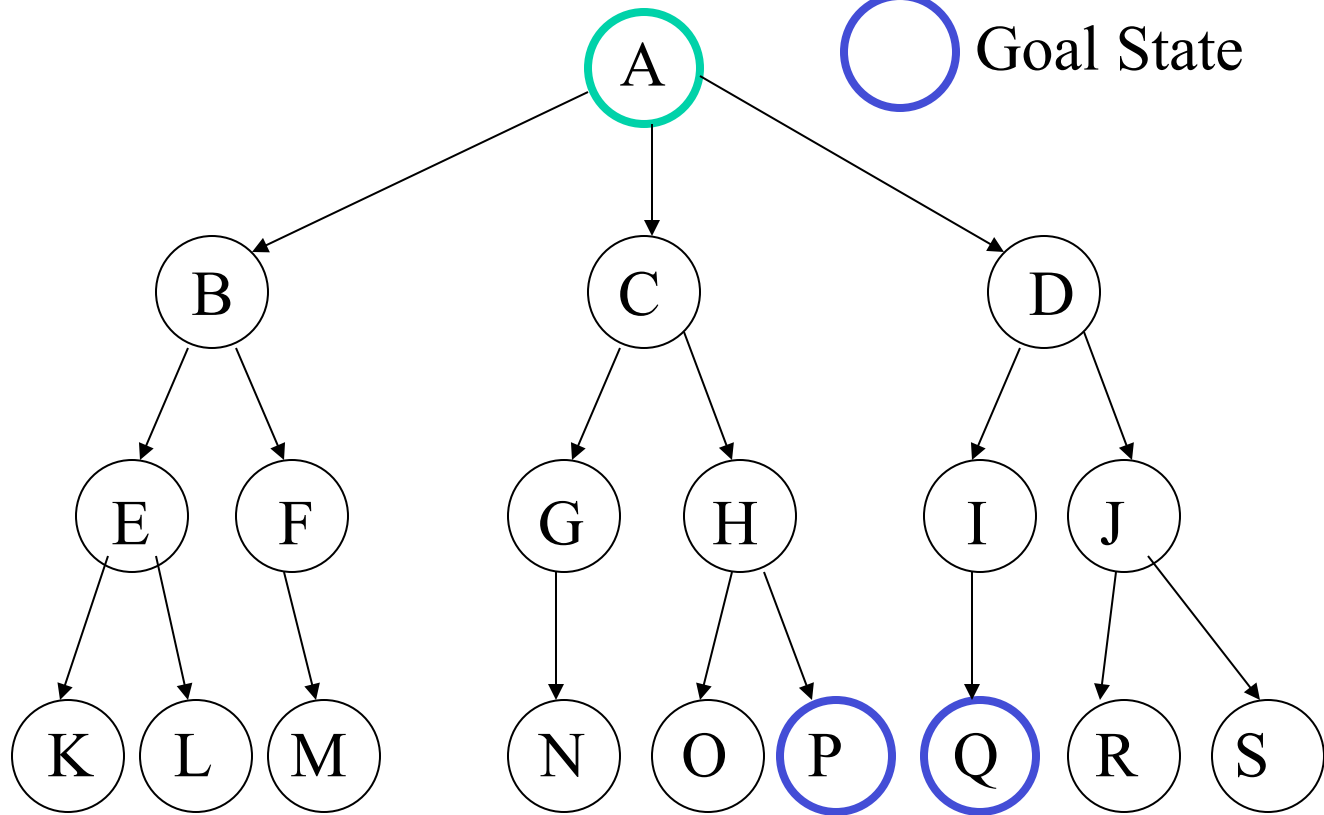
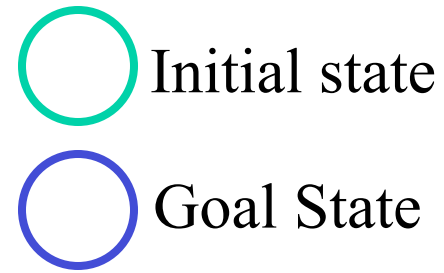
# Problem Solving by Graph Searching



# Graph Search Algorithm

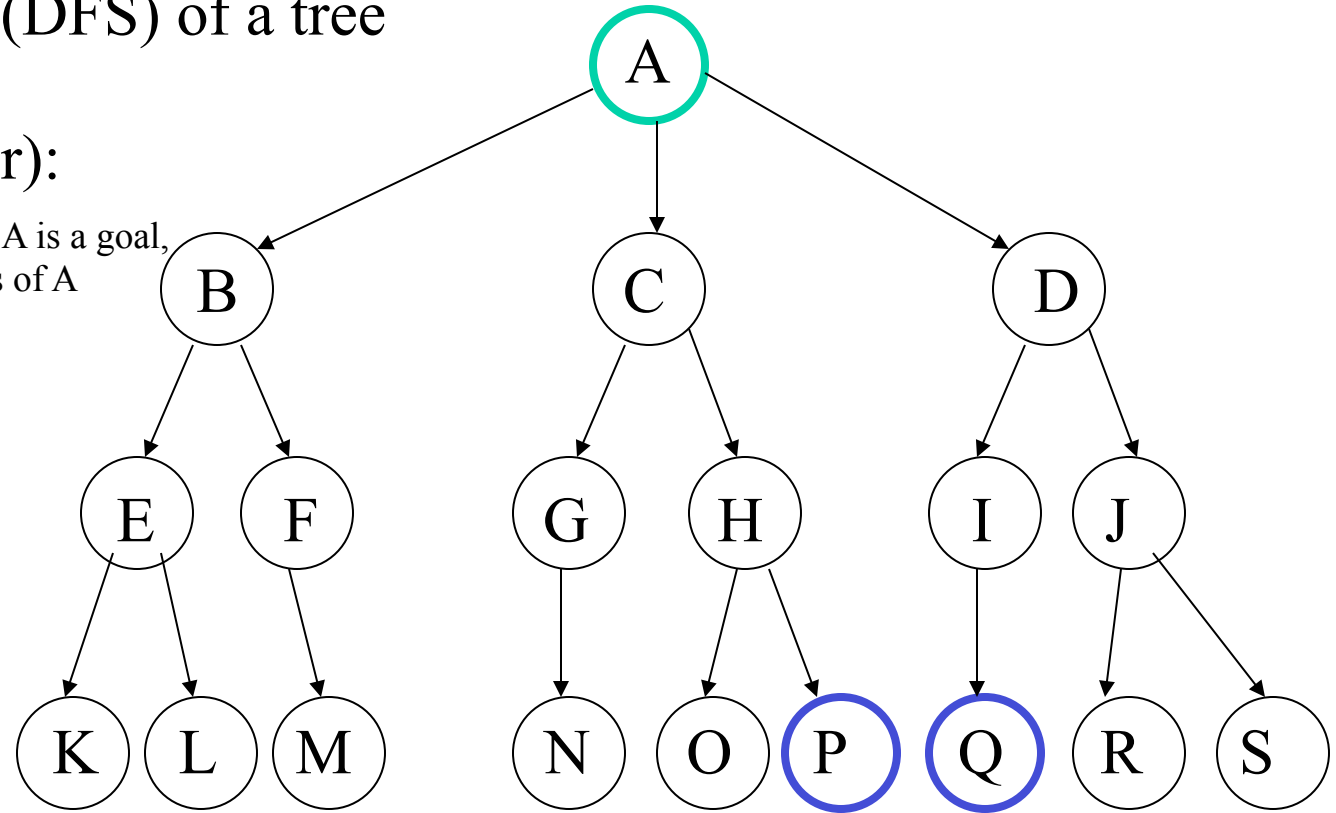
**Input:** a graph,  
a set of start nodes,  
Boolean procedure  $goal(n)$  that tests if  $n$  is a goal node.  
 $frontier := \{\langle s \rangle : s \text{ is a start node}\}$   
**while**  $frontier$  is not empty:  
    **select** and **remove** path  $\langle n_0, \dots, n_k \rangle$  from  $frontier$   
    **if**  $goal(n_k)$   
        **return**  $\langle n_0, \dots, n_k \rangle$   
    **for every** neighbor  $n$  of  $n_k$   
        **add**  $\langle n_0, \dots, n_k, n \rangle$  to  $frontier$   
**end while**

# Basic Search methods of a tree



Leaves are terminal states with no successors (or neighbors).

# Depth-first search (DFS) of a tree



State Stack (Frontier):

- {A} → Pop A, check if A is a goal, Push successors of A
- {B, C, D}
- {E, F, C, D}
- {K, L, F, C, D}
- {L, F, C, D}
- {F, C, D}
- {M, C, D}
- {C, D}
- {G, H, D}
- {N, H, D}
- {H, D}
- {O, P, D}
- {P, D}

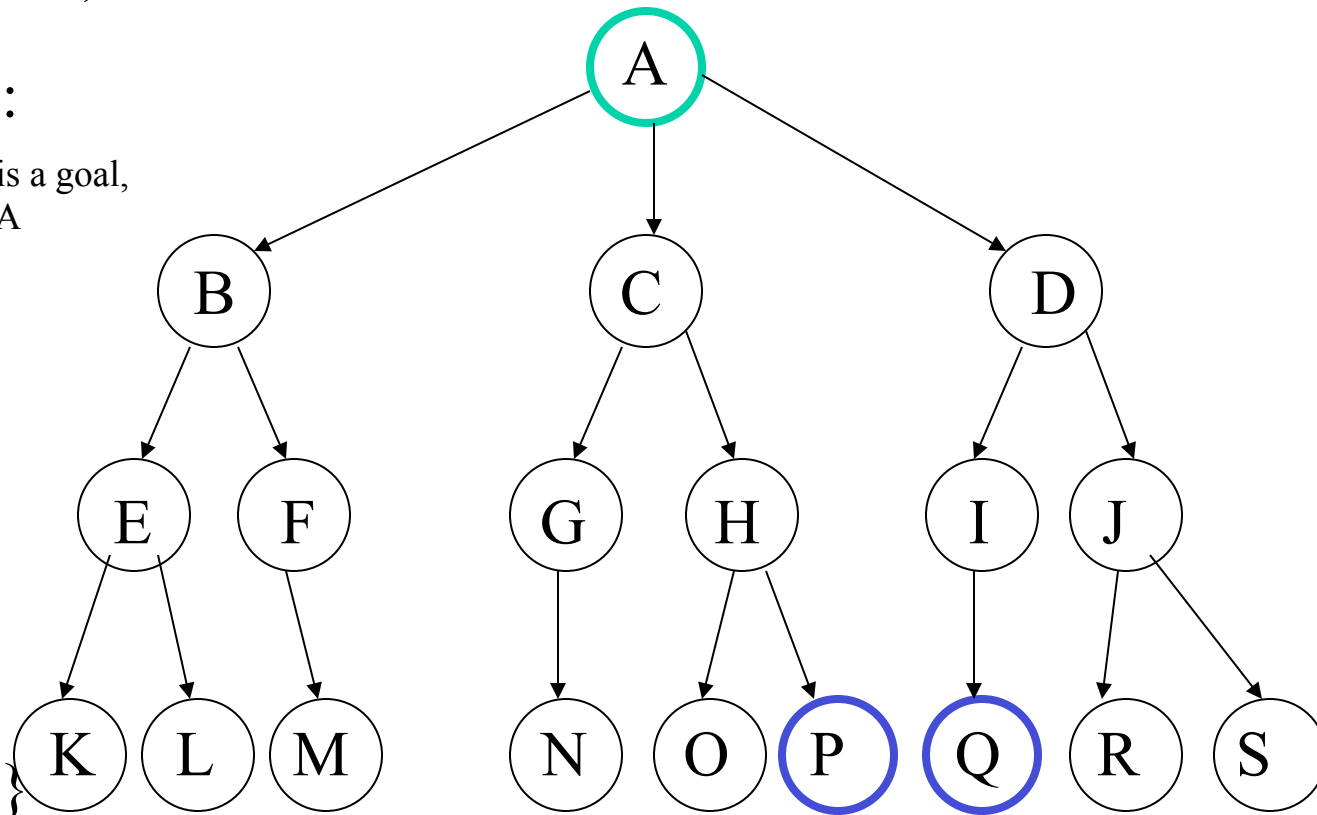
Pop P, check if P a goal, stop, return (P, (A, C, H)) or (A → C → H → P)

Assume each state in stack also includes the path used to reach it. So, A is really (A, ( )), B is really (B, (A)), E is really (E, (A B)), K is really (K, (A, B, E)), L is really (L, (A, B, E)), F is (F, (A, B)), etc. This convention differs very slightly from textbook's.

# Breadth-first search (BFS) of a tree

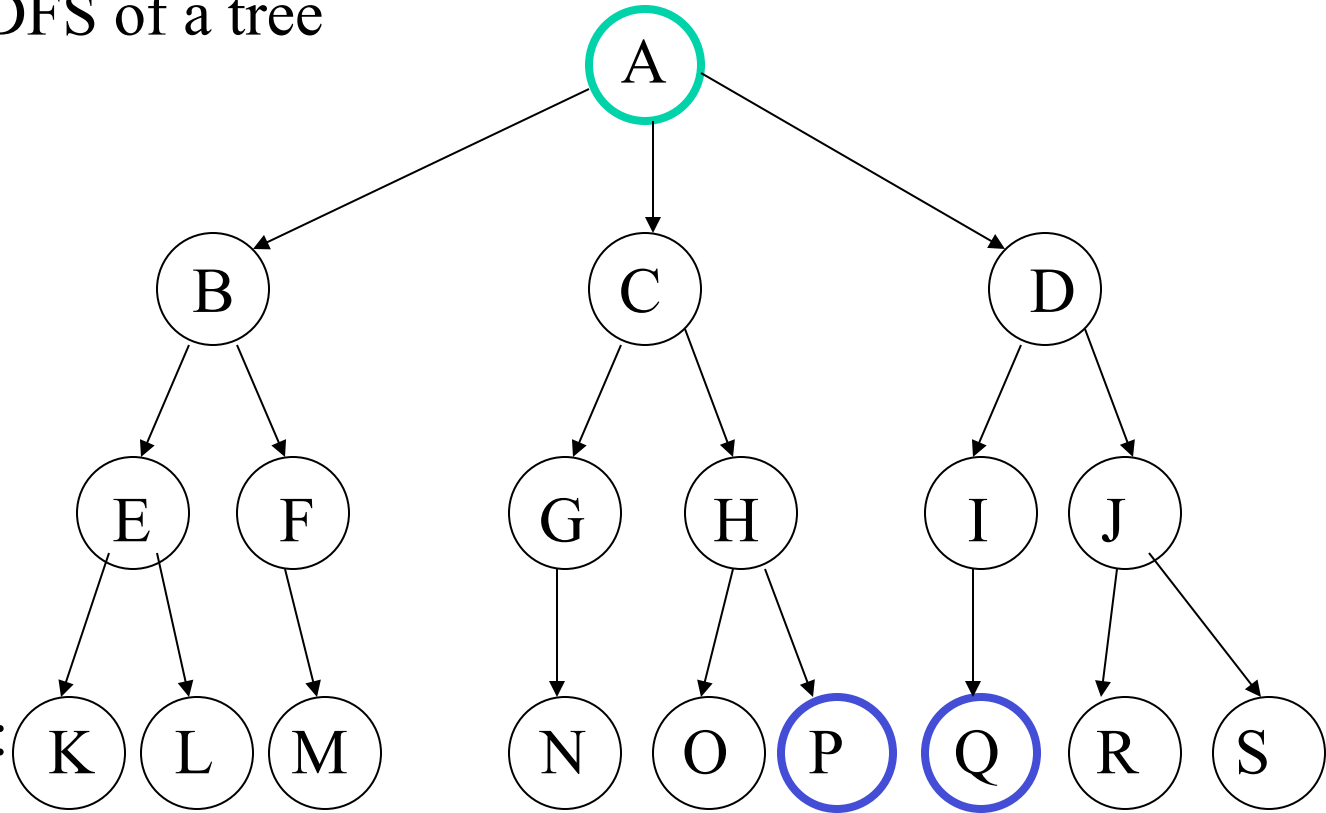
## State Queue (Frontier):

- {**A**} → Dequeue A, check if A is a goal, Enqueue successors of A
- {**B, C, D**}
- {**C, D, E, F**}
- {**D, E, F, G, H**}
- {**E, F, G, H, I, J**}
- {**F, G, H, I, J, K, L**}
- {**G, H, I, J, K, L, M**}
- {**H, I, J, K, L, M, N**}
- {**I, J, K, L, M, N, O, P**}
- {**J, K, L, M, N, O, P, Q**}
- {**K, L, M, N, O, P, Q, R, S**}
- {**L, M, N, O, P, Q, R, S**}
- {**M, N, O, P, Q, R, S**}
- {**N, O, P, Q, R, S**}
- {**O, P, Q, R, S**}
- {**P, Q, R, S**} → Dequeue P, check if P a goal, stop, return (P, (A, C, H)) or (A → C → H → P)

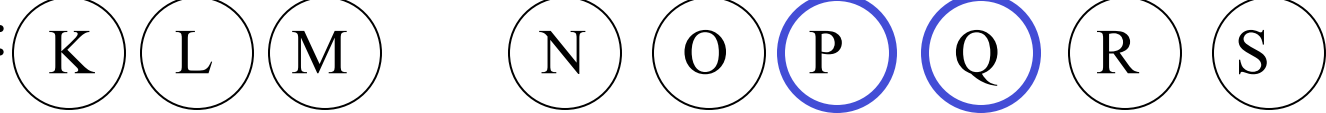




# Iterative deepening DFS of a tree



State Stack (Frontier):



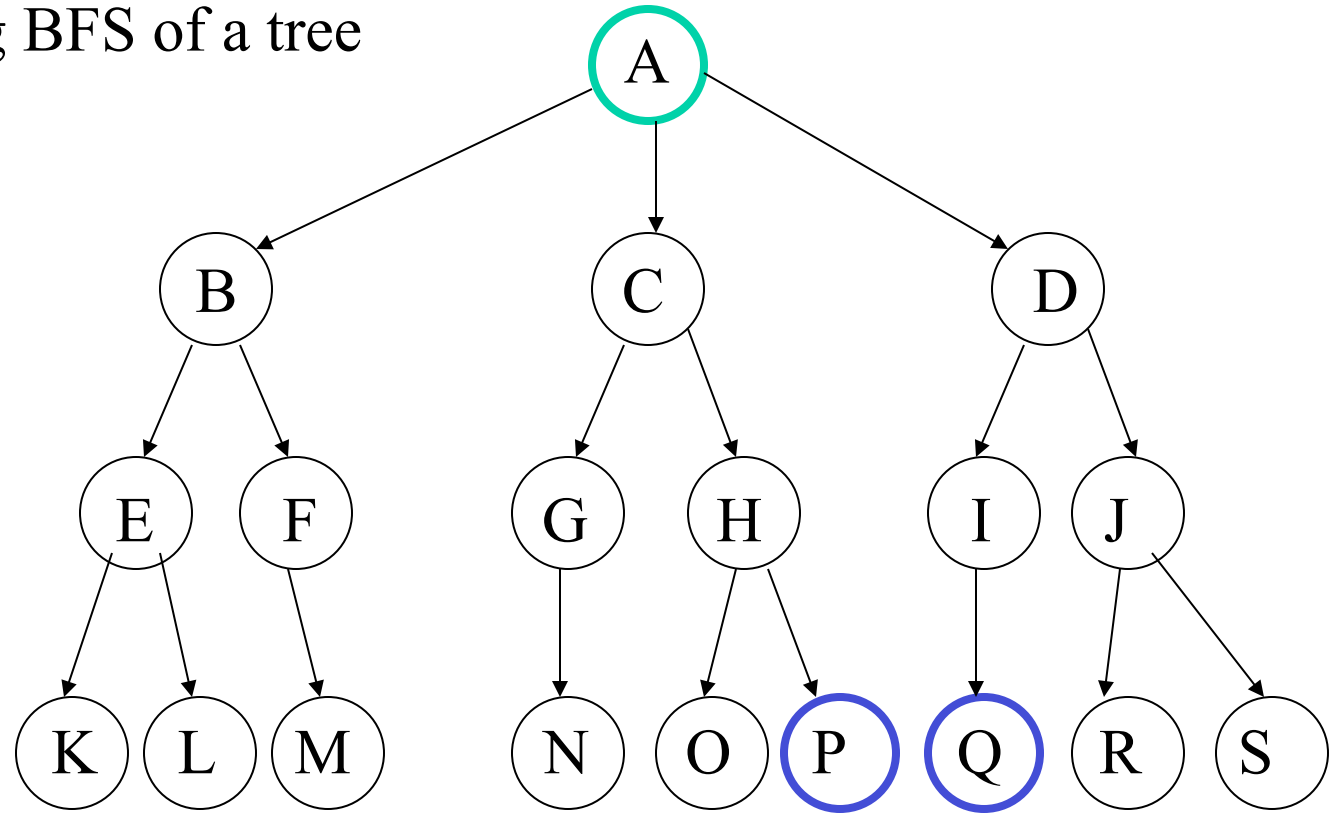
1] {A}, {}

2] {A}, {B, C, D}, {C, D}, {D}, {}

3] {A}, {B, C, D}, {E, F, C, D}, {F, C, D}, {C, D}, {G, H, D}, {H, D}, {D}, {I, J}, {J}, {}

4] {A}, {B, C, D}, {E, F, C, D}, {K, L, F, C, D}, {L, F, C, D}, {F, C, D}, {M, C, D}, {C, D}, {G, H, D}, {N, H, D}, {H, D}, {O, P, D}, {P, D} Pop P, check if P a goal, stop, return (P, (A, C, H)) or (A → C → H → P)

# Iterative widening BFS of a tree



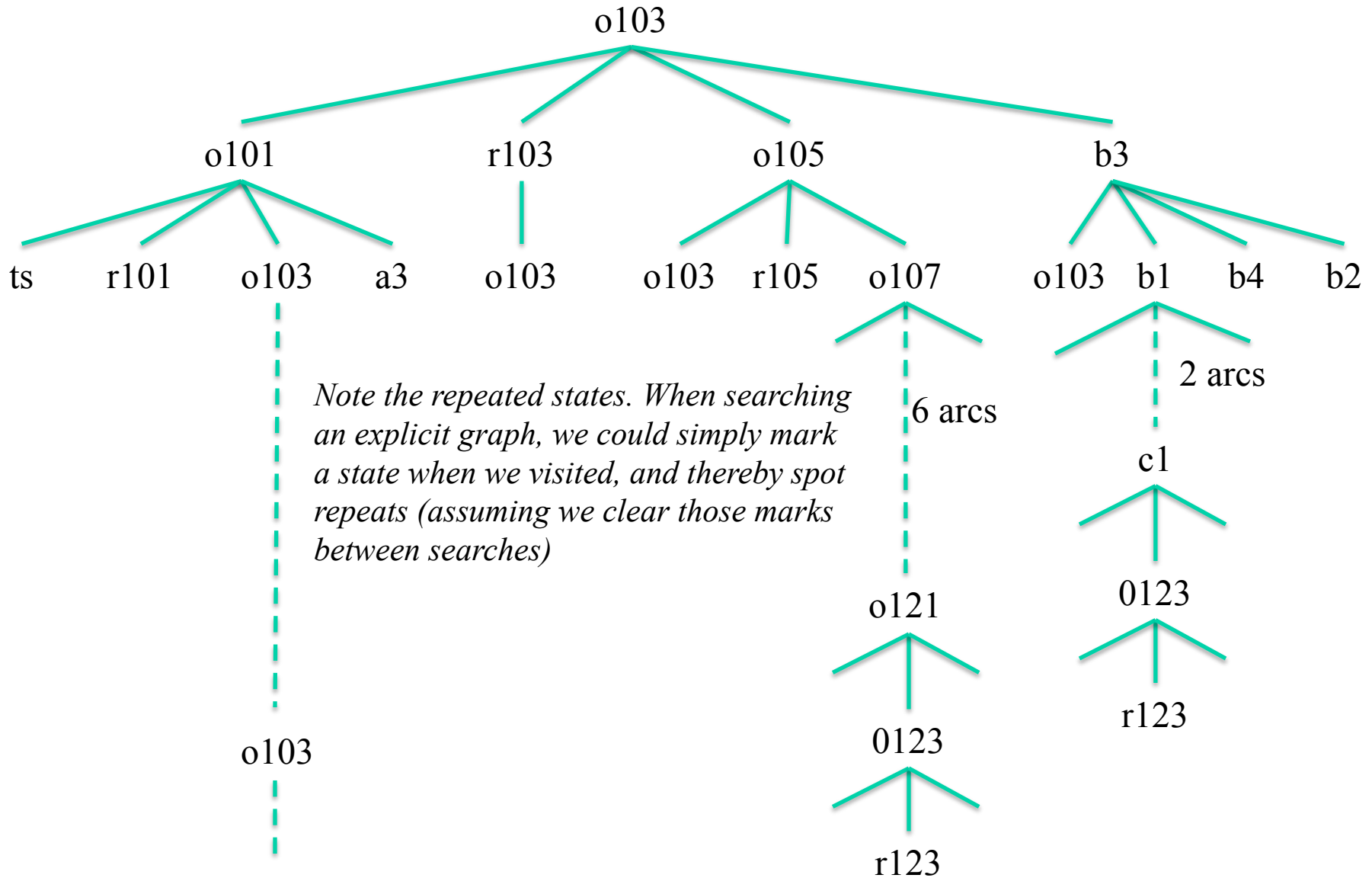
State Queue:

1] {A}, {B, ~~C, D~~}, {E}, {K}, {}

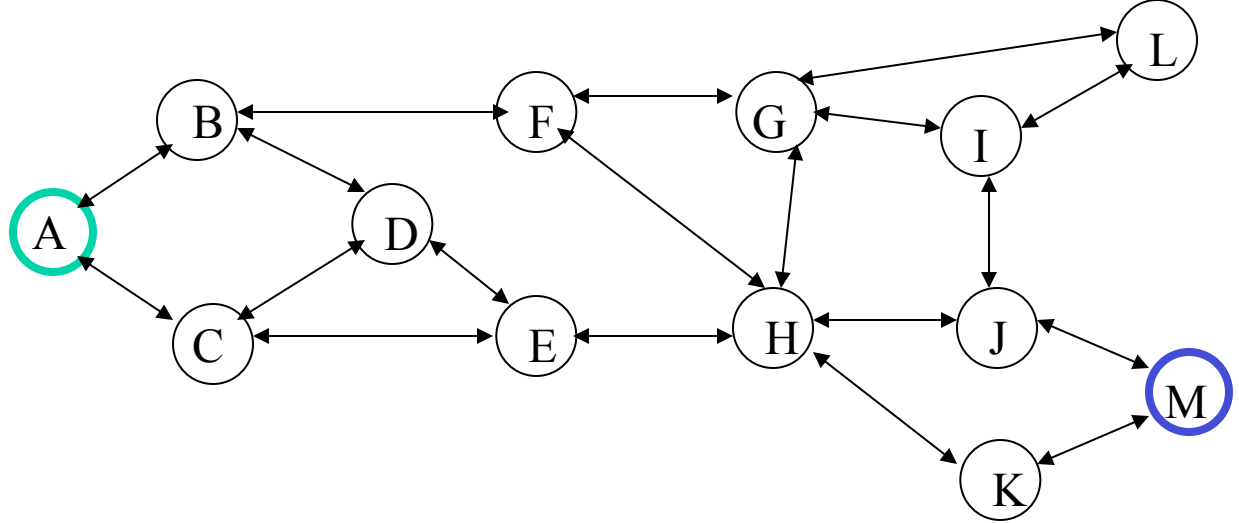
2] {A}, {B, C}, {C, E}, {E, G}, {G, K}, {K, N}, {N}, {}

3] {A}, {B, C, D}, {C, D, E}, {D, E, G}, {E, G, I}, {G, I, K}, {I, K, N},  
{K, N, Q}, {N, Q}, {Q} Dequeue Q, check if Q a goal, stop,  
return (Q, (A, D, I)) or (A → D → I → Q)

Search tree for Figure 3.1 of Poole and Mackworth, assuming robot starts at o103, with a goal of being in r123, with all arcs bidirectional (a different assumption than text's)



Searching a graph with DFS



Successors not replaced on Open (already on

Open or Explored)

Path to TOS State

State Stack (Frontier)

Explored States

	Path to TOS State	State Stack (Frontier)	Explored States
		{A}	{}
A	(A)	{ <u>B</u> , C}	{A}
B	(A,B)	{ <u>F</u> , D, C}	{A, B}
F H	(A,B,F)	{ <u>G</u> , H, D, C}	{A, B, F}
G I	(A,B,F,G)	{ <u>L</u> , I, H, D, C}	{A, B, F, G}
G L	(A,B,F,G,I)	{ <u>J</u> , H, D, C}	{A, B, F, G, L}
H I	(A,B,F,G,I,J)	{ <u>M</u> , H, D, C}	{A, B, F, G, L, I, J}
M is goal, return (M, (A,B,F,G,I,J))			

# Tennessee Supreme Court



**h (Westend via Kessington)**

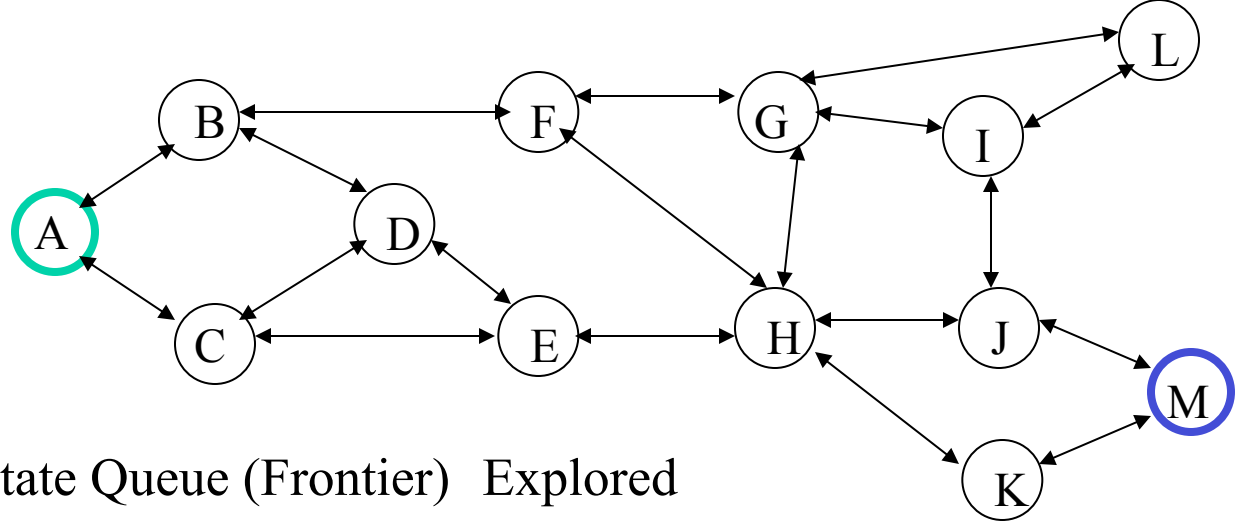
**h (25<sup>th</sup> Ave Garage by Jess Neely)**

**Westend via Kessington \***

**Memorial Gym \***

**Jess Neely and 25<sup>th</sup> Ave Garage**

# Searching a graph with BFS



Repeated  
Successors

Path

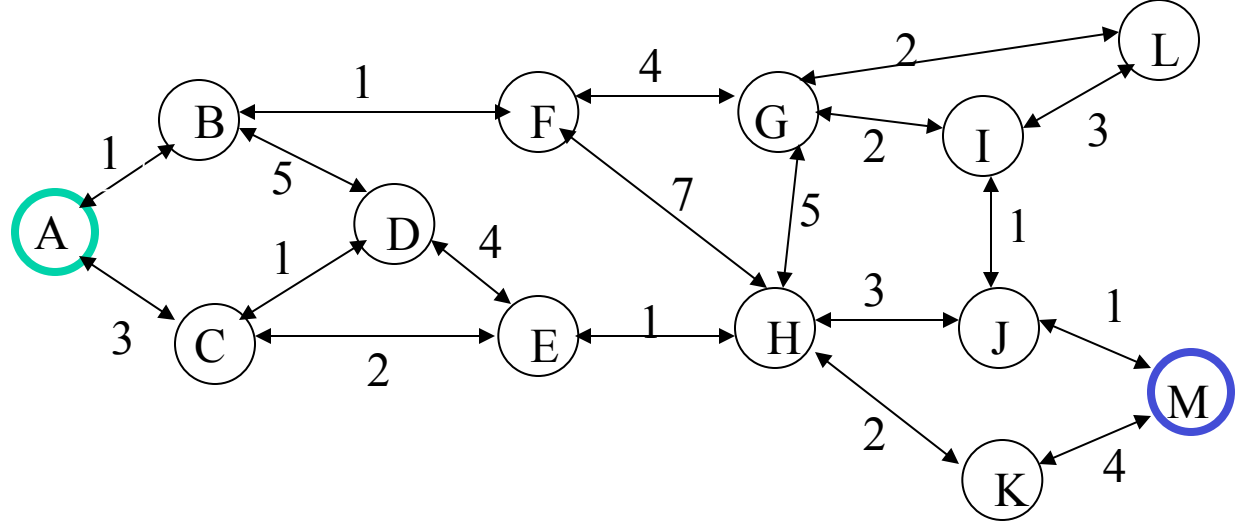
State Queue (Frontier)

Explored

	Path	State Queue (Frontier)	Explored
	( )	{A}	
	(A)	{ <u>B</u> ,C}	{A}
A	(A)	{C, <u>D</u> ,F}	{A,B}
A,D	(A,B)	{D, <u>F</u> ,E}	{A,B,C}
B,C,E	(A,B)	{F,E}	{A,B,C,D}
B	(A,C)	{E, <u>G</u> ,H}	{A,B,C,D,F}
C,D,H	(A,B,F)	{G,H}	{A,B,C,D,F,E}
F,H	(A,B,F)	{H, <u>L</u> ,I}	{A,B,C,D,F,E,G}
E,F,G	(A,B,F,G)	{L,I, <u>J</u> ,K}	{A,B,C,D,F,E,G,H}
G,I	(A,B,F,G)	{I,J,K}	{A,B,C,D,F,E,G,H,L}
G,L,J	(A,B,F,H)	{J,K}	{A,B,C,D,F,E,G,H,L,I}
H,I	(A,B,F,H)	{K, <u>M</u> }	{A,B,C,D,F,E,G,H,L,I,J}
H,M	(A,B,F,H,J)	{M} M is goal, return (M, (A,B,F,H,J))	



# Searching a graph with costs (Lowest Cost First Search)



Repeated  
Successors

Path

State Priority Queue (Frontier)

Closed

	( )	{A(0)}	
	(A)	{B(1), C(3)}	A(0)
A(1)	(A,B)	{F(2), C(3), D(6)}	A(0),B(1)

continue the example