

# Blind (Uninformed) Search

**Russell and Norvig:**  
**Chap. 3, Sect. 3.3 – 3.4**

Slides from Jean-Claude Latombe at Stanford University  
(used with permission)

# Simple Agent Algorithm

## Problem-Solving-Agent

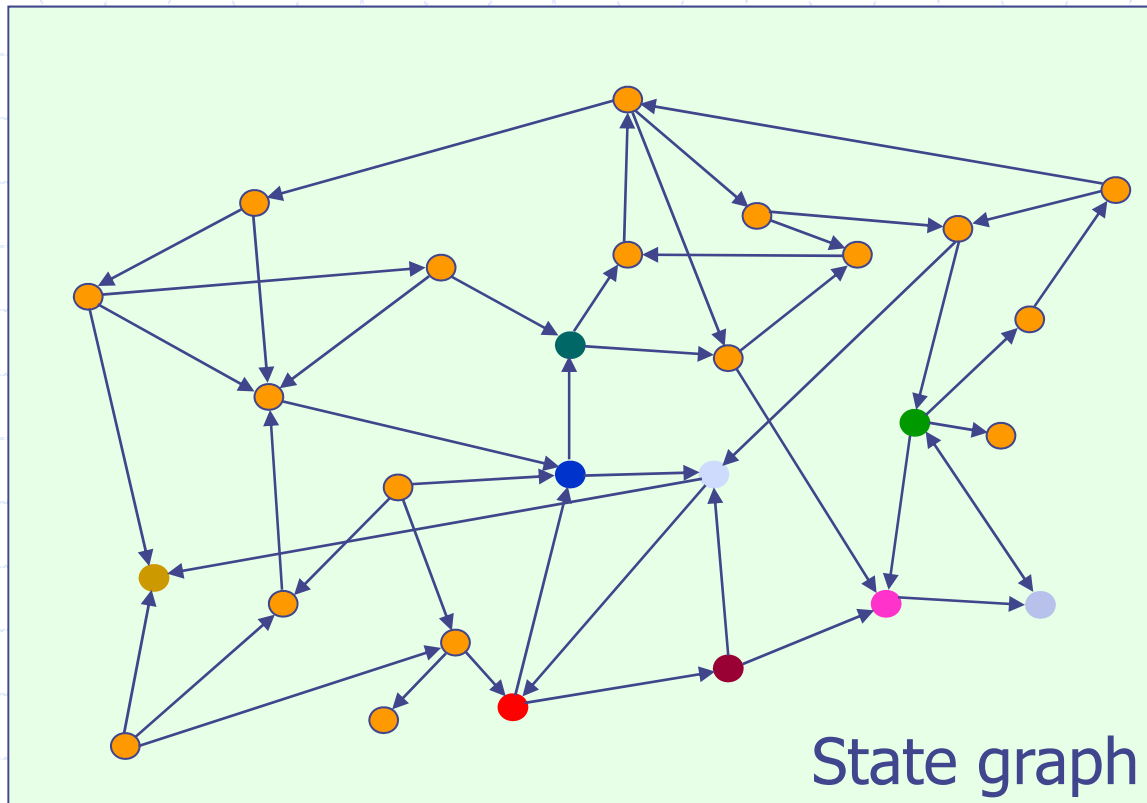
### 1. formulate: (abstraction!)

1.  $S_0$  = initial-state ◀ sense/read state
2. GOAL? = goal test ◀ select/read goal test
3. actions ◀ select/read action models
4. transition model ◀ select/read model
5. problem ◀ ( $S_0$ , GOAL?, actions, transition model)

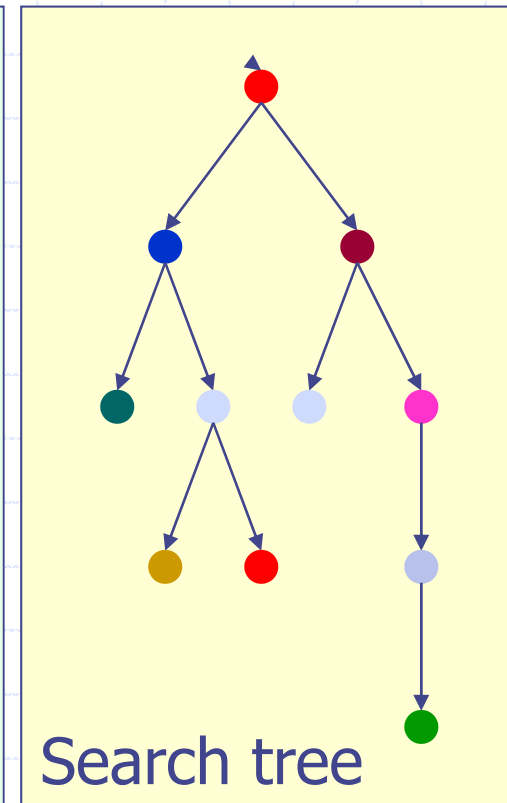
### 2. solution ◀ search(problem)

### 3. perform(solution)

# Search Tree



State graph



Search tree

Note that some states may be visited multiple times

# Search Nodes and States

8	2	
3	4	7
5	1	6

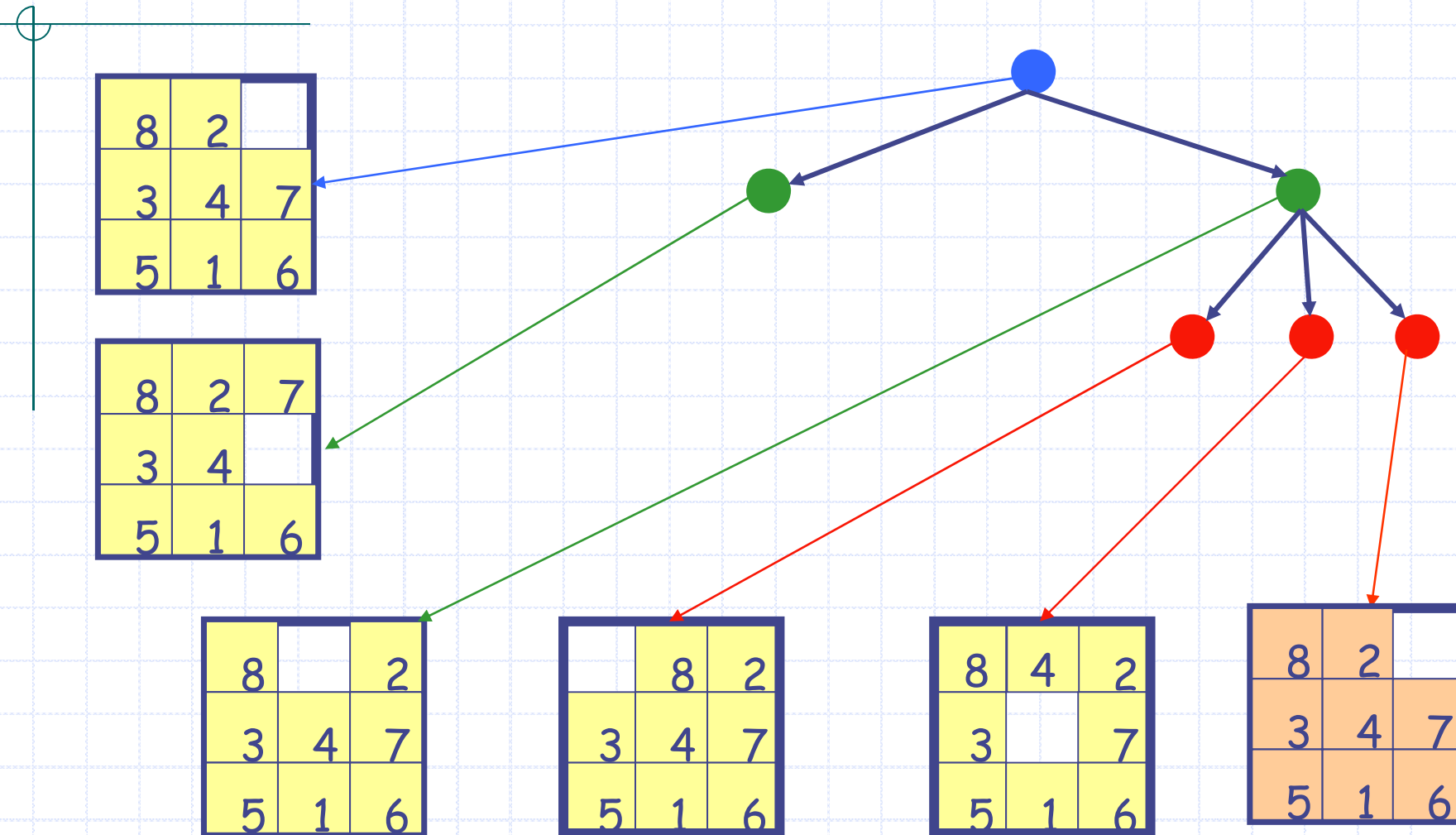
8	2	7
3	4	
5	1	6

8		2
3	4	7
5	1	6

	8	2
3	4	7
5	1	6

8	4	2
3		7
5	1	6

8	2	
3	4	7
5	1	6



# Search Nodes and States

8	2	
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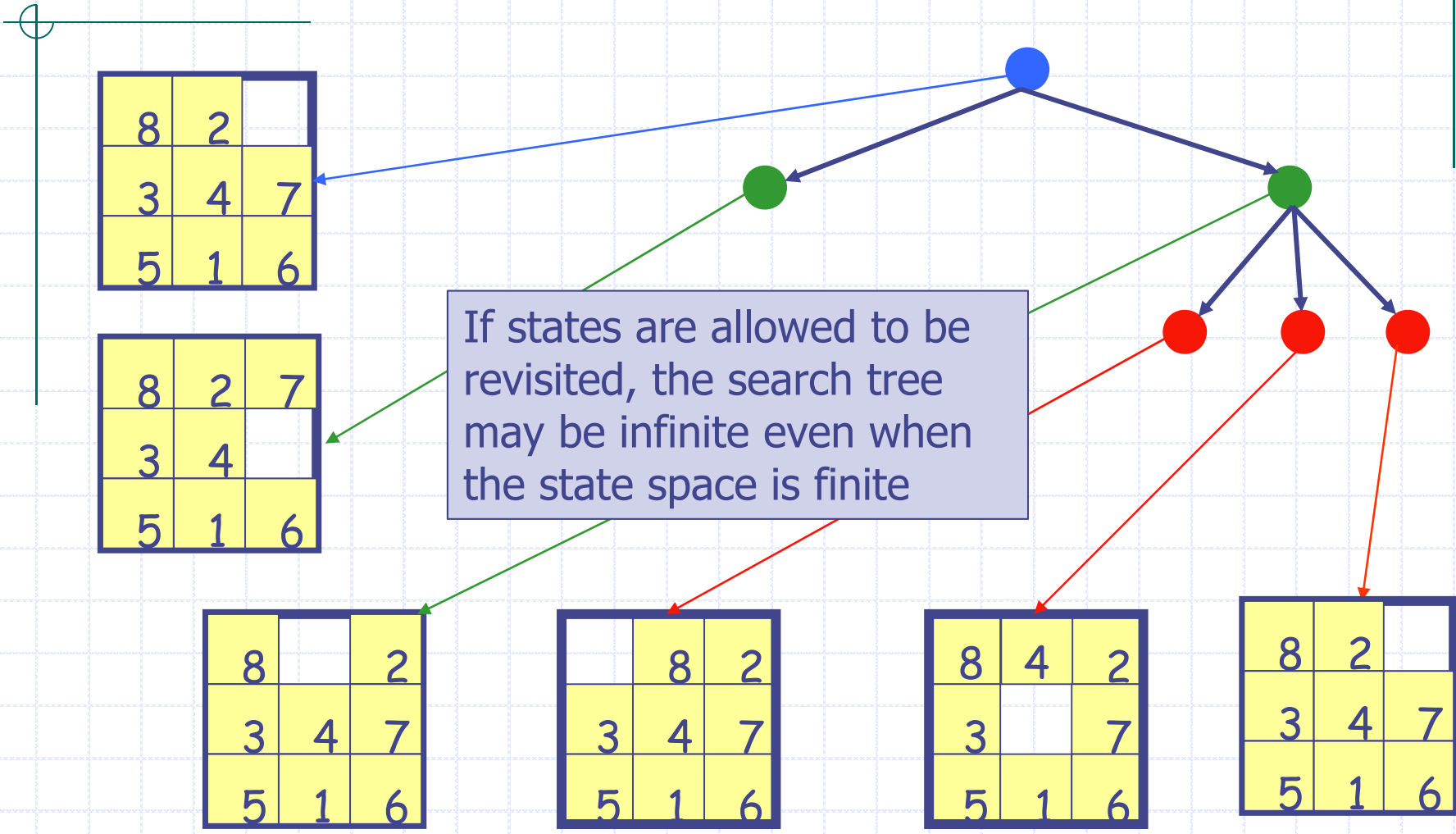
8		2
3	4	7
5	1	6

	8	2
3	4	7
5	1	6

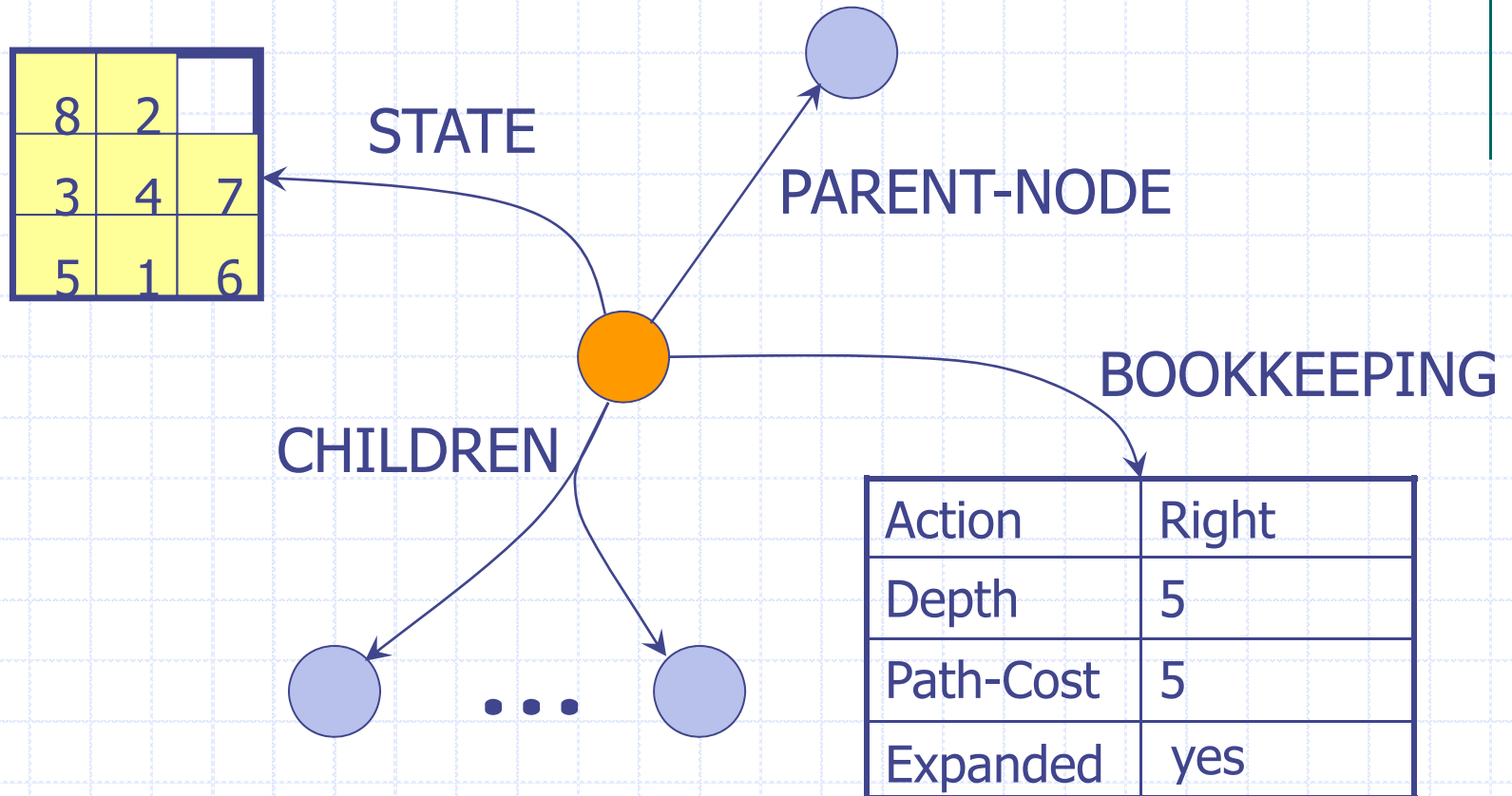
8	4	2
3		7
5	1	6

8	2	
3	4	7
5	1	6

If states are allowed to be revisited, the search tree may be infinite even when the state space is finite



# Data Structure of a Node



Depth of a node N = length of path from root to N  
(depth of the root = 0)

# Node expansion

◆ The expansion of a node N of the search tree consists of:

- ◆ Applying each legal action on STATE(N)
- ◆ Generating a child of N for each new accessible state

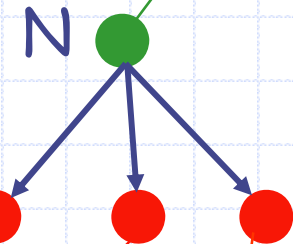
node generation  
≠  
node expansion!

	8	2
3	4	7
5	1	6

8	4	2
3		7
5	1	6

8	2	
3	4	7
5	1	6

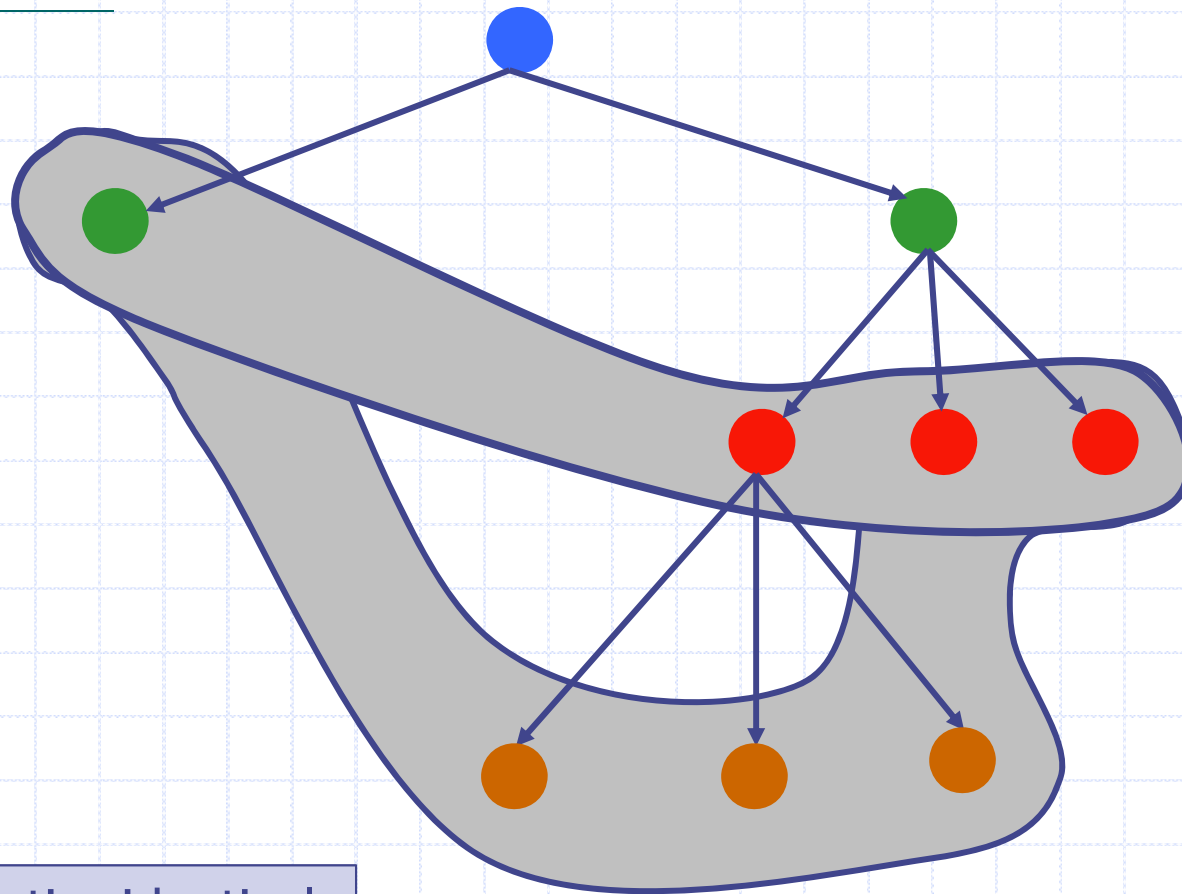
8		2
3	4	7
5	1	6



# Frontier of Search Tree

- ◆ The **frontier** is the set of all search nodes that haven't been expanded yet





Is the frontier identical to the set of leaves?

# Search Strategy

- ◆ The **frontier** is the set of all search nodes that haven't been expanded yet
- ◆ The frontier is implemented as a **priority queue FRONTIER**
  - ◆ INSERT(node, FRONTIER)
  - ◆ POP(FRONTIER)
- ◆ The ordering of the nodes in FRONTIER defines the **search strategy**

# Search Algorithm #1

1. If GOAL?( $S_0$ ) then return  $S_0$
2. INSERT( $N_0$ , FRONTIER)
3. Repeat:

SUCCESSORS( $s$ ) returns set of states reachable by single legal actions from  $s$

- a. If EMPTY?(FRONTIER) then return **failure**

b. **N** = POP(FRONTIER) Expansion of N

c. **S** = STATE(**N**)

d. For every state **s'** in SUCCESSORS(**s**)

i. Create a new node **N'** as a child of **N**

ii. If GOAL?(**s'**) then return **path or goal state**

iii. INSERT(**N'**, FRONTIER)

# Performance Measures

- ◆ **Completeness**

A search algorithm is complete if it finds a solution whenever one exists

- ◆ **Optimality**

A search algorithm is optimal if it returns a minimum-cost path whenever a solution exists

- ◆ **Complexity**

It measures the time and amount of memory required by the algorithm

# Blind vs. Heuristic Strategies

- ◆ **Blind** (or **un-informed**) strategies do not exploit state descriptions to order FRONTIER. They only exploit the positions of the nodes in the search tree
- ◆ **Heuristic** (or **informed**) strategies exploit state descriptions to order FRONTIER (the most “promising” nodes are placed at the beginning of FRONTIER)

# Example

8	2	
3	4	7
5	1	6

STATE  
←  
 $N_1$

1	2	3
4	5	
7	8	6

STATE  
←  
 $N_2$

1	2	3
4	5	6
7	8	

Goal state

For a **blind strategy**,  $N_1$  and  $N_2$  are just two nodes (at some position in the search tree)

# Example

8	2	
3	4	7
5	1	6

STATE  
 $N_1$

1	2	3
4	5	
7	8	6

STATE  
 $N_2$

1	2	3
4	5	6
7	8	

Goal state

For a **heuristic strategy** counting the number of misplaced tiles,  $N_2$  is more promising than  $N_1$

# Remark

- ◆ Some search problems, such as the  $(n^2-1)$ -puzzle, are NP-hard
- ◆ One can't expect to solve all instances of such problems in less than exponential time (in  $n$ )
- ◆ One may still strive to solve each instance as efficiently as possible

This is the purpose of the search strategy



# Blind Strategies

- ◆ Breadth-first
  - ◆ Bidirectional

- ◆ Depth-first
  - ◆ Depth-limited
  - ◆ Iterative deepening

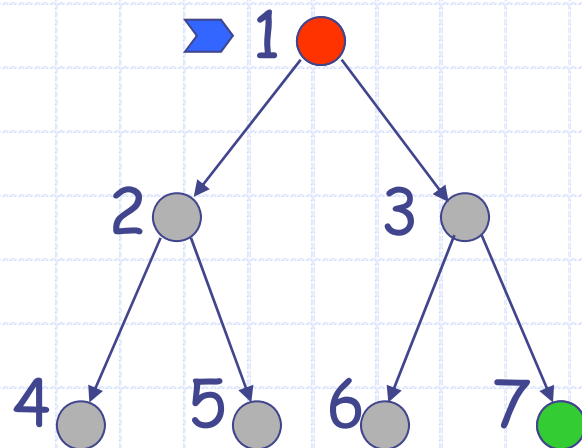
- ◆ Uniform-Cost  
(variant of breadth-first)

Arc cost = 1

Arc cost  
=  $c(\text{action}) \geq \epsilon > 0$

# Breadth-First Strategy

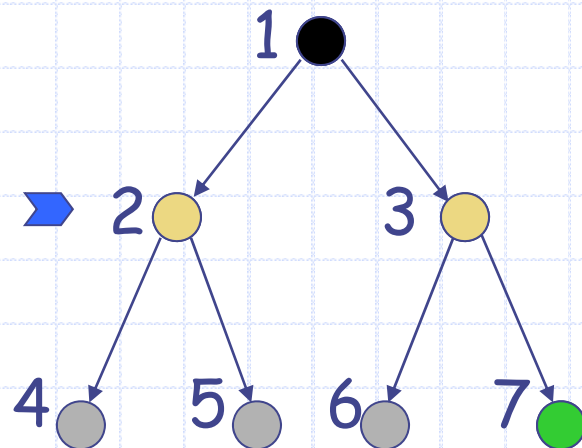
- ◆ New nodes are inserted at the end of FRONTIER



FRONTIER = (1)

# Breadth-First Strategy

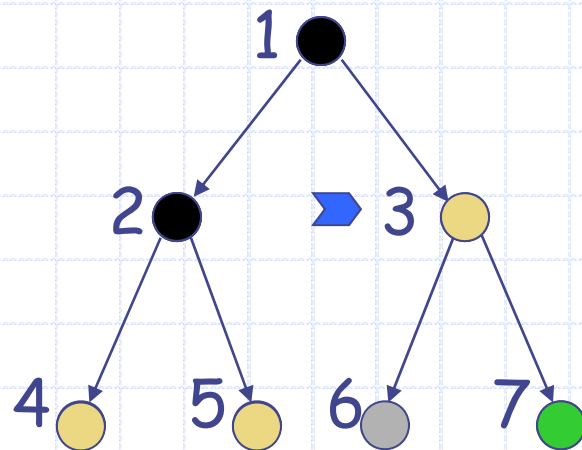
- ◆ New nodes are inserted at the end of FRONTIER



FRONTIER = (2, 3)

# Breadth-First Strategy

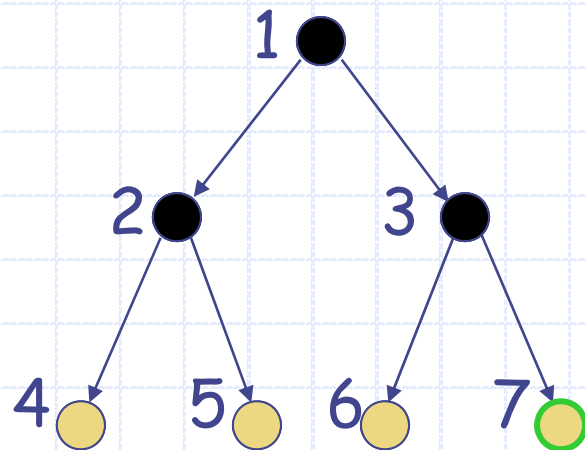
- ◆ New nodes are inserted at the end of FRONTIER



FRONTIER = (3, 4, 5)

# Breadth-First Strategy

- ◆ New nodes are inserted at the end of FRONTIER



FRONTIER = (4, 5, 6, 7)

# Important Parameters

- ◆ Maximum number of successors of any state
  - **branching factor  $b$**  of the search tree
- ◆ Minimal length ( $\neq$  cost) of a path between the initial and a goal state
  - **depth  $d$**  of the **shallowest goal node** in the search tree

# BF Evaluation

- ◆ **b**: branching factor
- ◆ **d**: depth of shallowest goal node
- ◆ Breadth-first search is:
  - ◆ Complete? Not complete?
  - ◆ Optimal? Not optimal?

# BF Evaluation

- ◆ **b**: branching factor
- ◆ **d**: depth of shallowest goal node
- ◆ Breadth-first search is:
  - ◆ Complete
  - ◆ Optimal if step cost is 1
- ◆ Number of nodes generated:



# BF Evaluation

- ◆ **b**: branching factor
- ◆ **d**: depth of shallowest goal node
- ◆ Breadth-first search is:
  - ◆ Complete
  - ◆ Optimal if step cost is 1
- ◆ Number of nodes generated:
$$1 + b + b^2 + \dots + b^d = O(b^d)$$

→ Time and space complexity is  $O(b^d)$

# Time and Memory Use

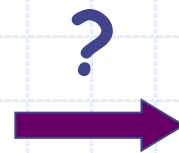
d	# Nodes	Time	Memory
2	110	.11 msec	107 kilobytes
4	11,110	11 msec	10.6 megabytes
6	$\sim 10^6$	1.1 sec	1 gigabyte
8	$\sim 10^8$	2 min	103 gigabytes
10	$\sim 10^{10}$	3 hours	10 terabytes
12	$\sim 10^{12}$	13 days	1 petabyte
14	$\sim 10^{14}$	3.5 years	99 petabytes

Assumptions:  $b = 10$ ; 1 million nodes/sec; 1000 bytes/node

# Remark

- ◆ If a problem has no solution, breadth-first may run for ever (if the state space is infinite or states can be revisited arbitrary many times)

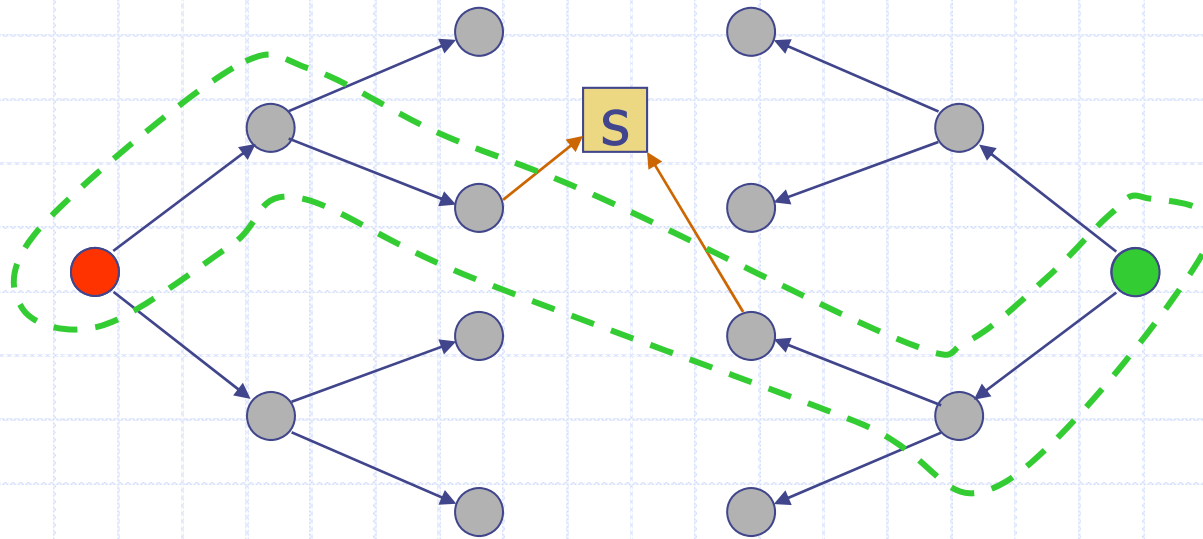
1	2	3	4
5	6	7	8
9	10	11	12
13	14	15	



1	2	3	4
5	6	7	8
9	10	11	12
13	15	14	

# Bidirectional Strategy

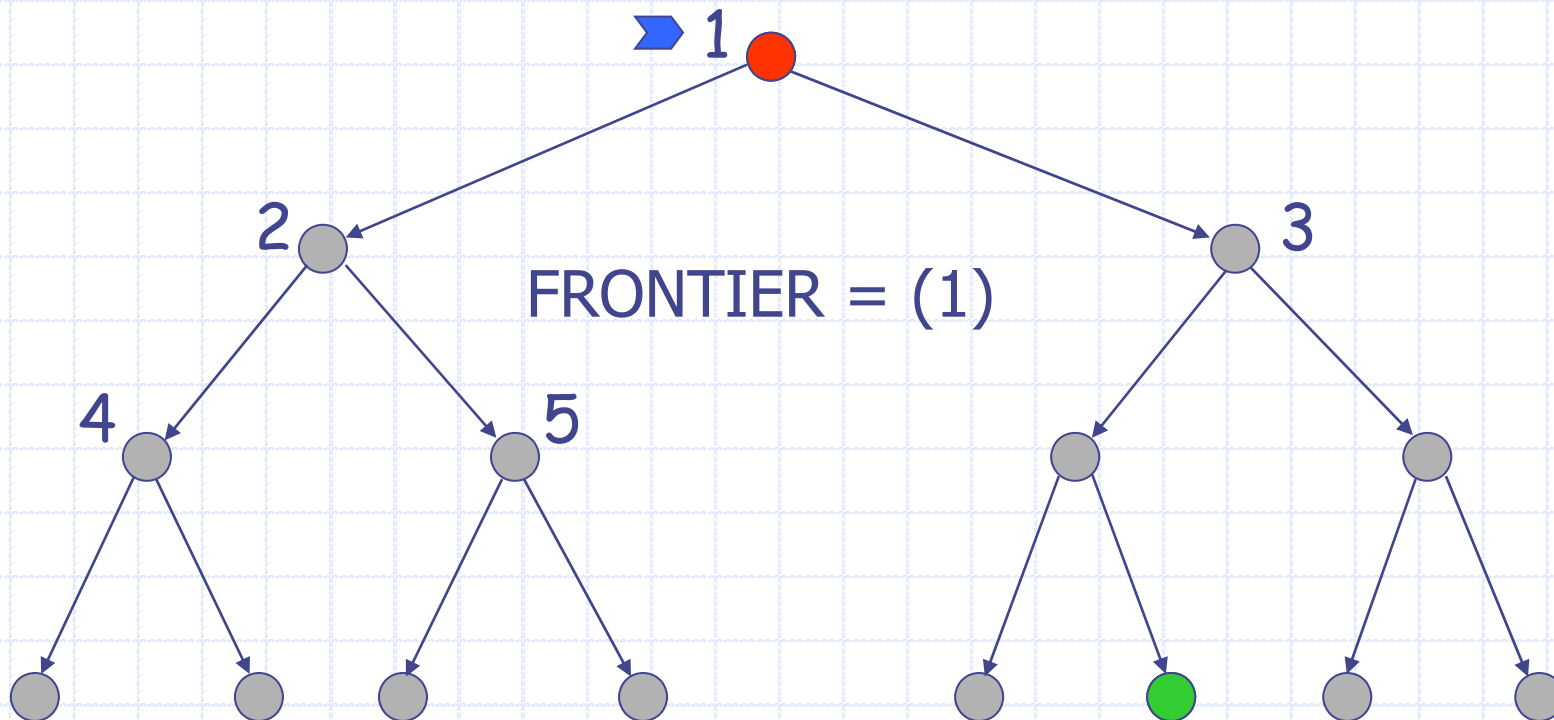
2 frontier queues: FRONTIER1 and FRONTIER2



Time and space complexity is  $O(b^{d/2}) \ll O(b^d)$   
if both trees have the same branching factor  $b$

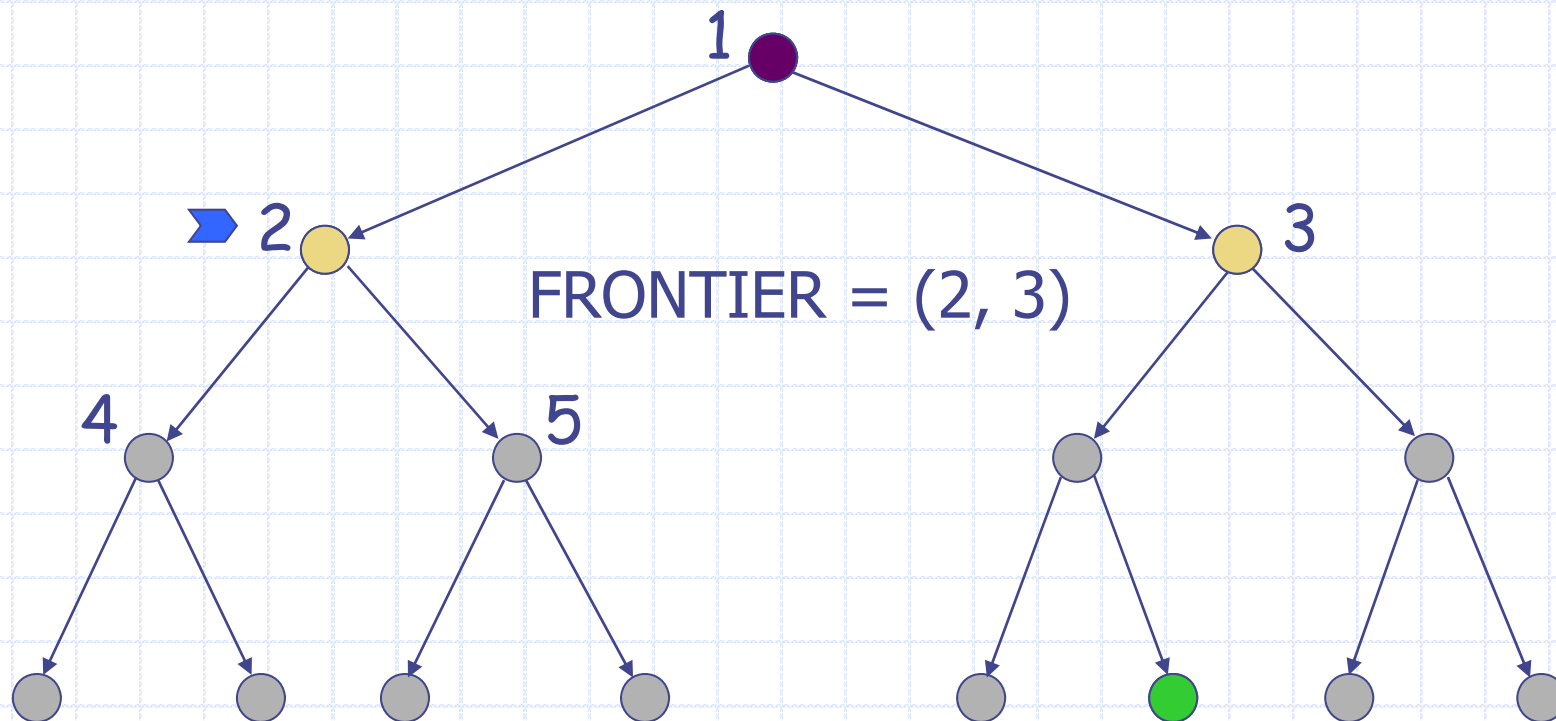
# Depth-First Strategy

- ◆ New nodes are inserted at the front of FRONTIER



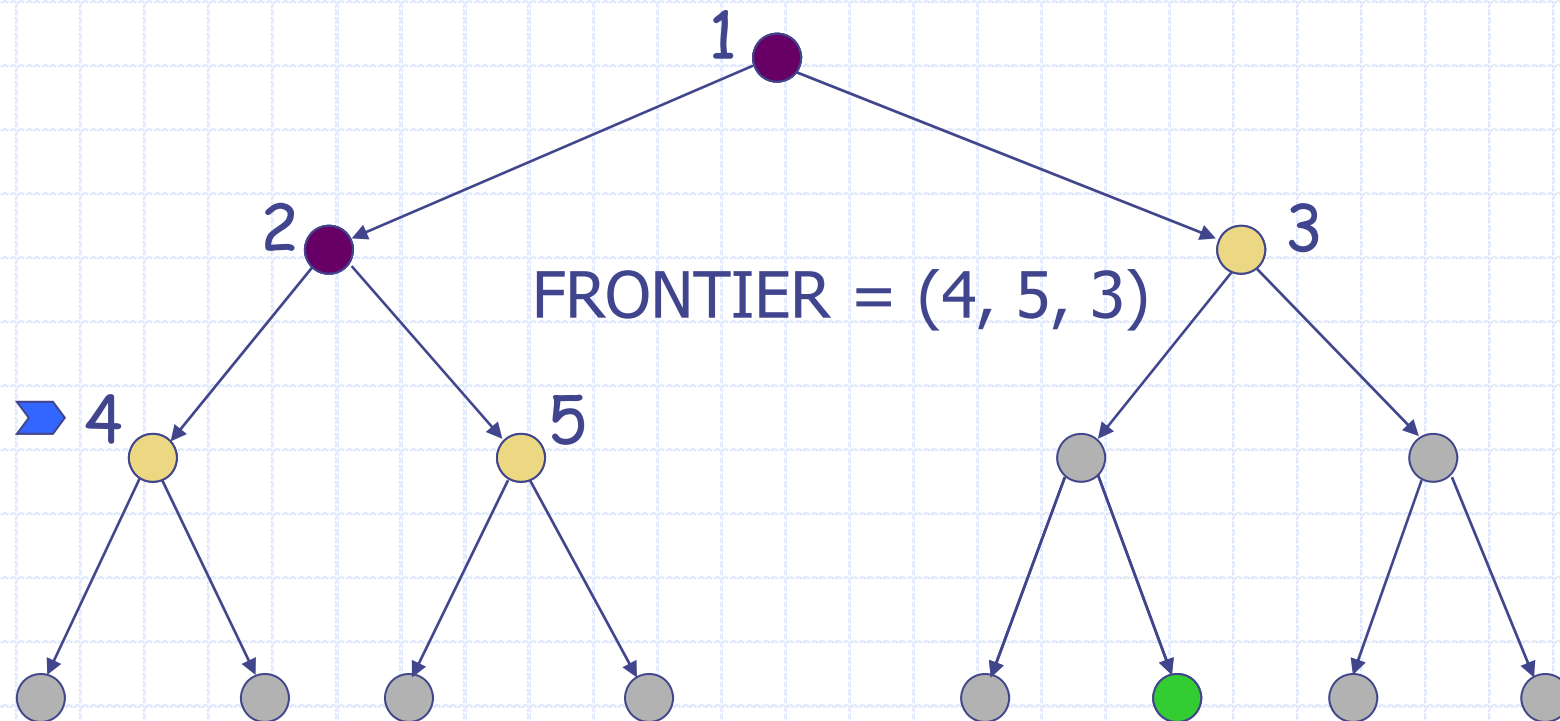
# Depth-First Strategy

- ◆ New nodes are inserted at **the front** of FRONTIER



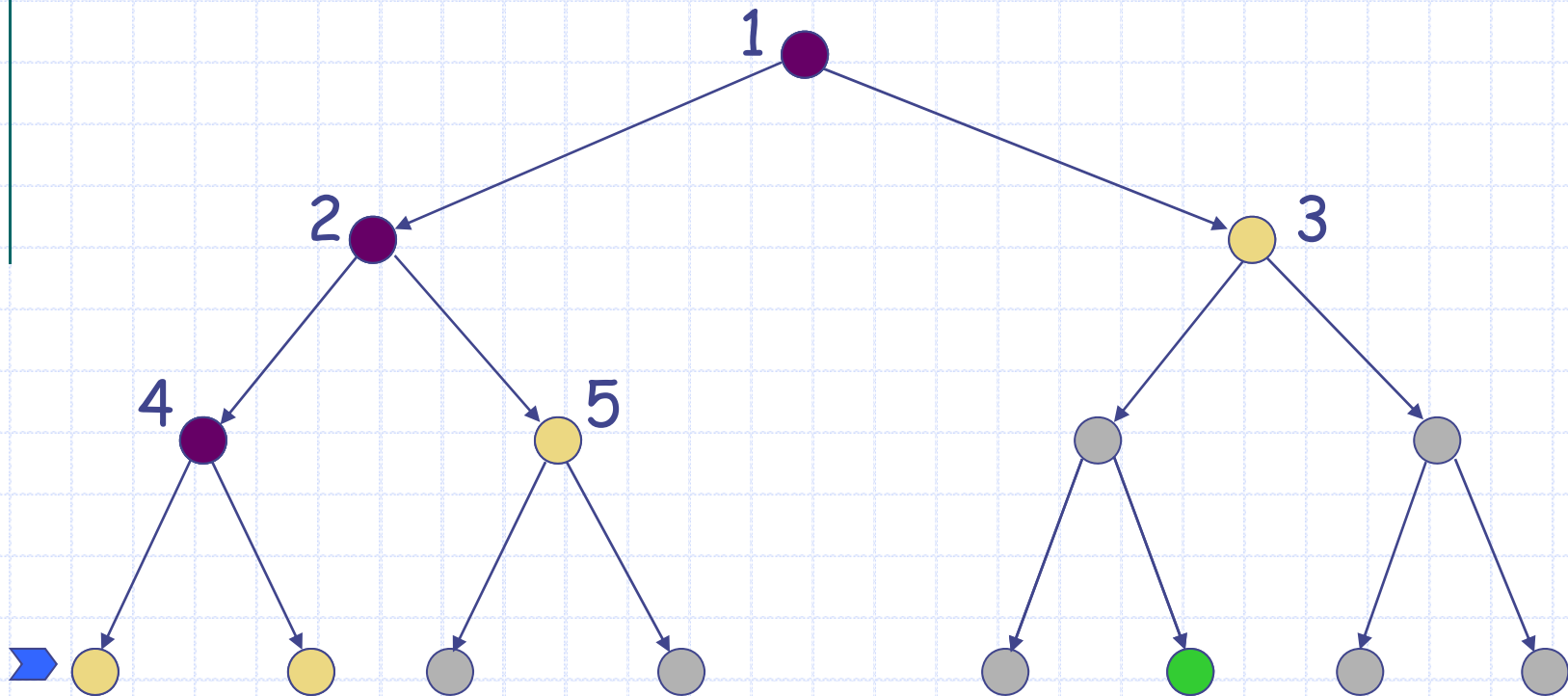
# Depth-First Strategy

- ◆ New nodes are inserted at the front of FRONTIER



# Depth-First Strategy

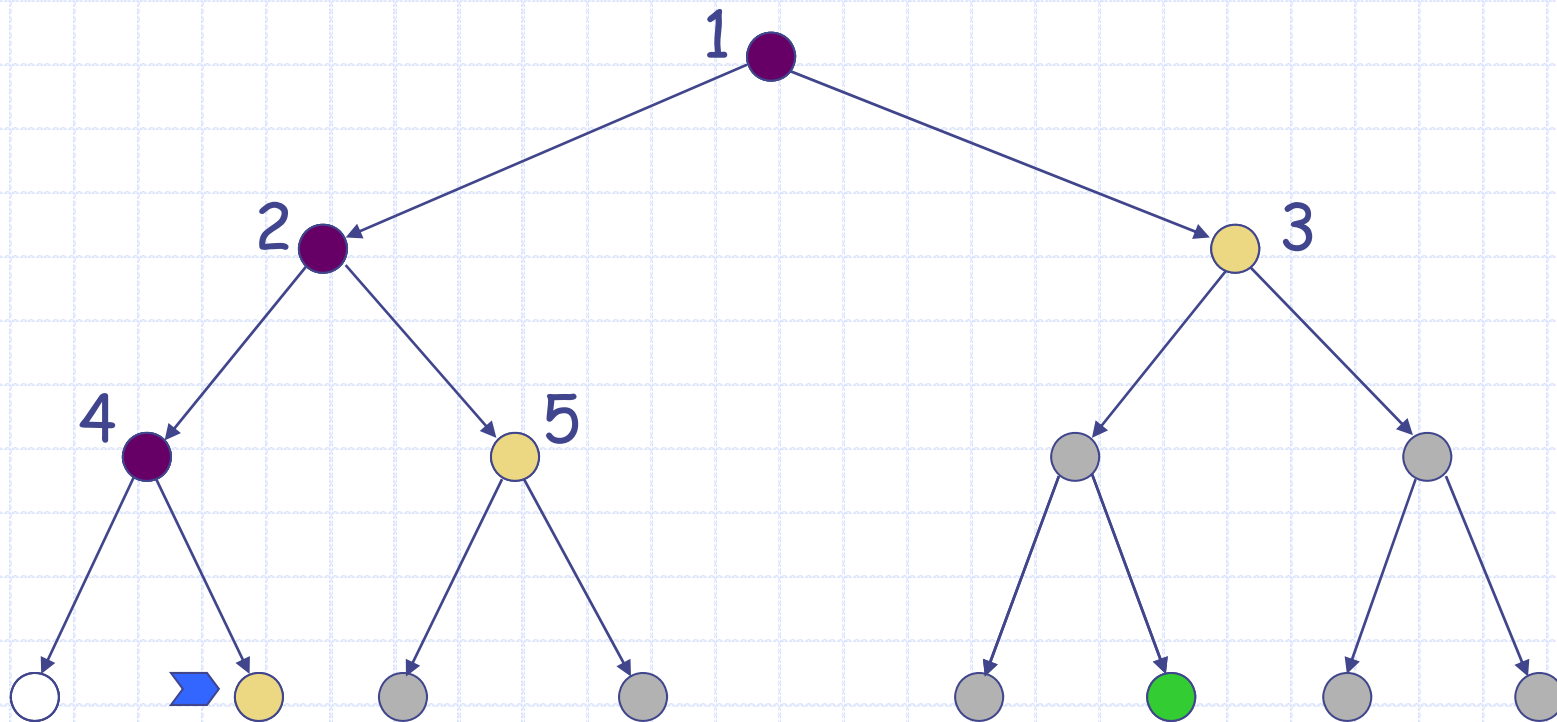
- ◆ New nodes are inserted at the front of FRONTIER





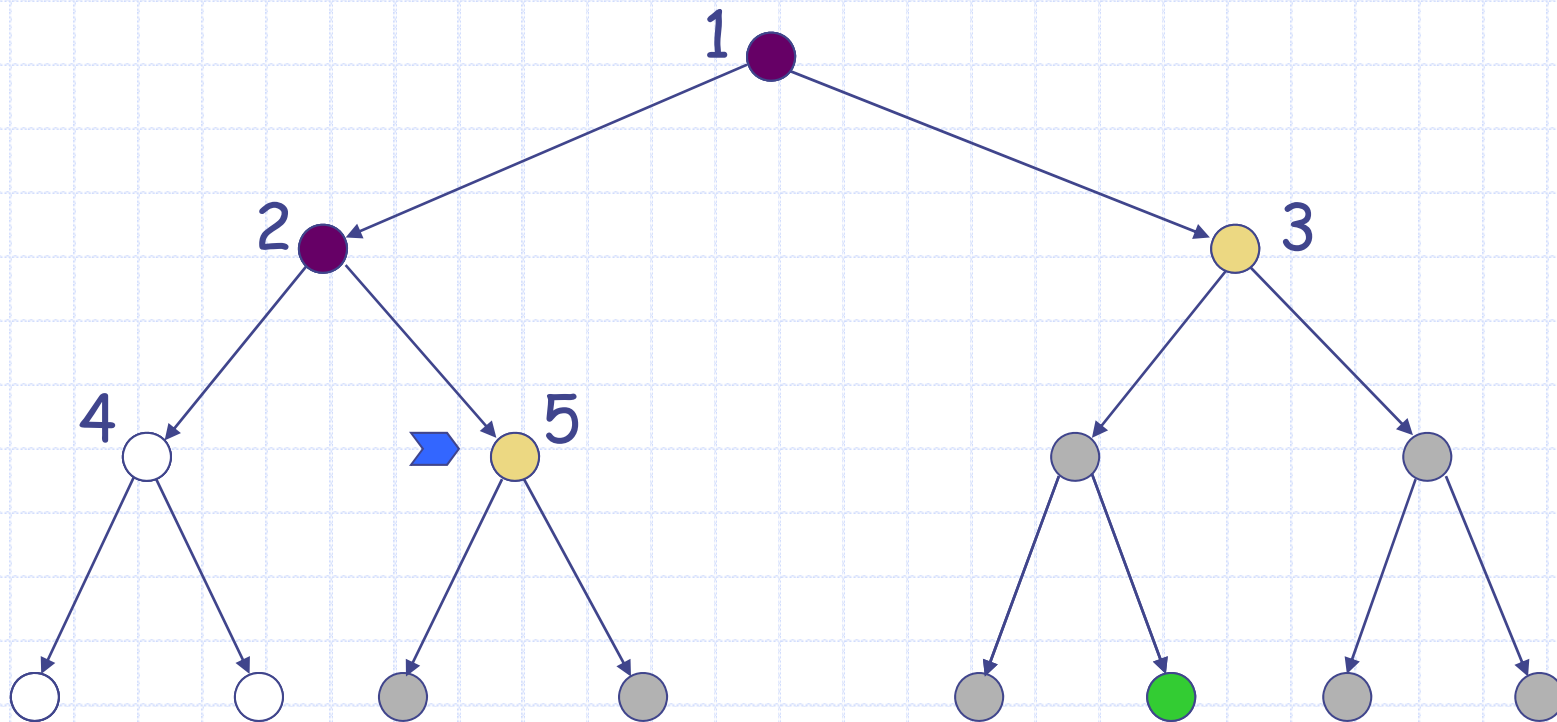
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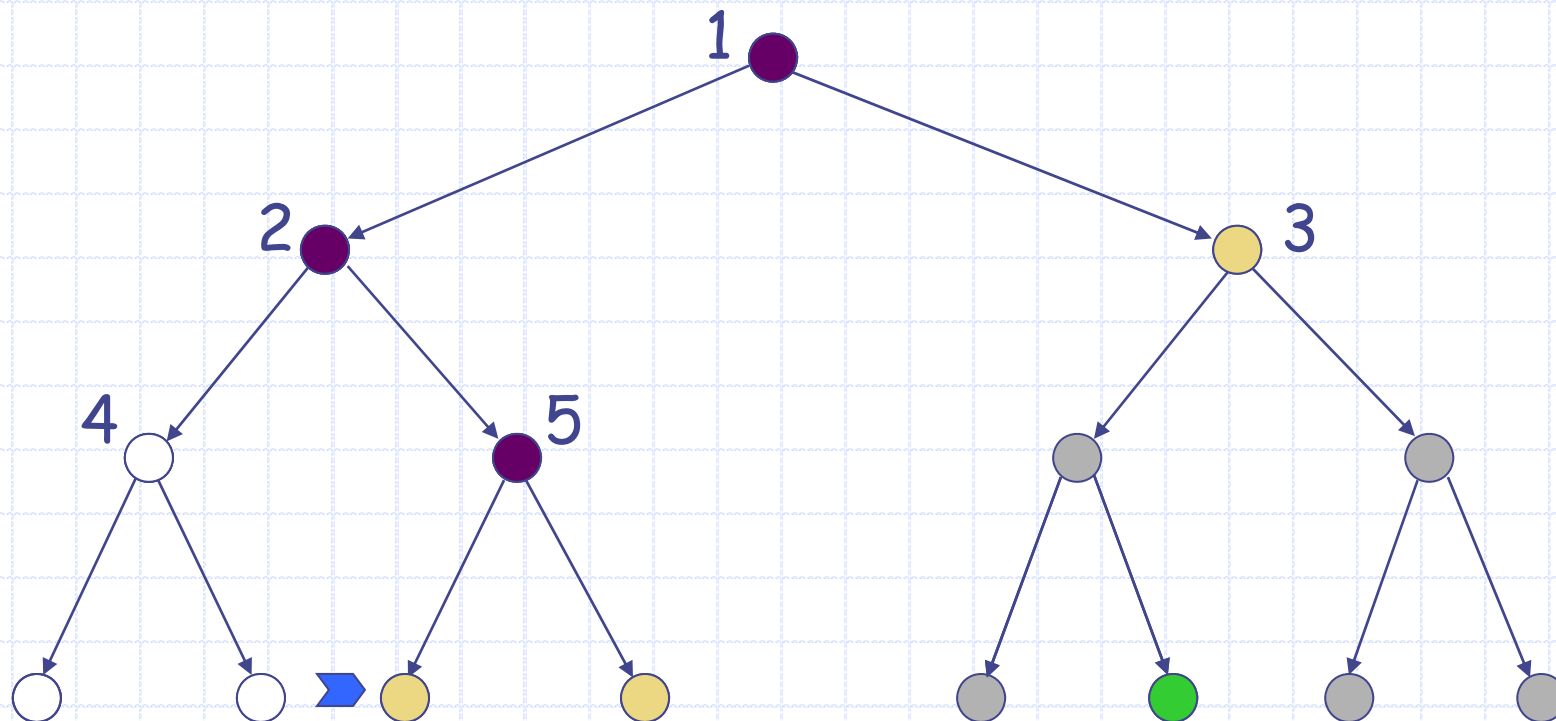
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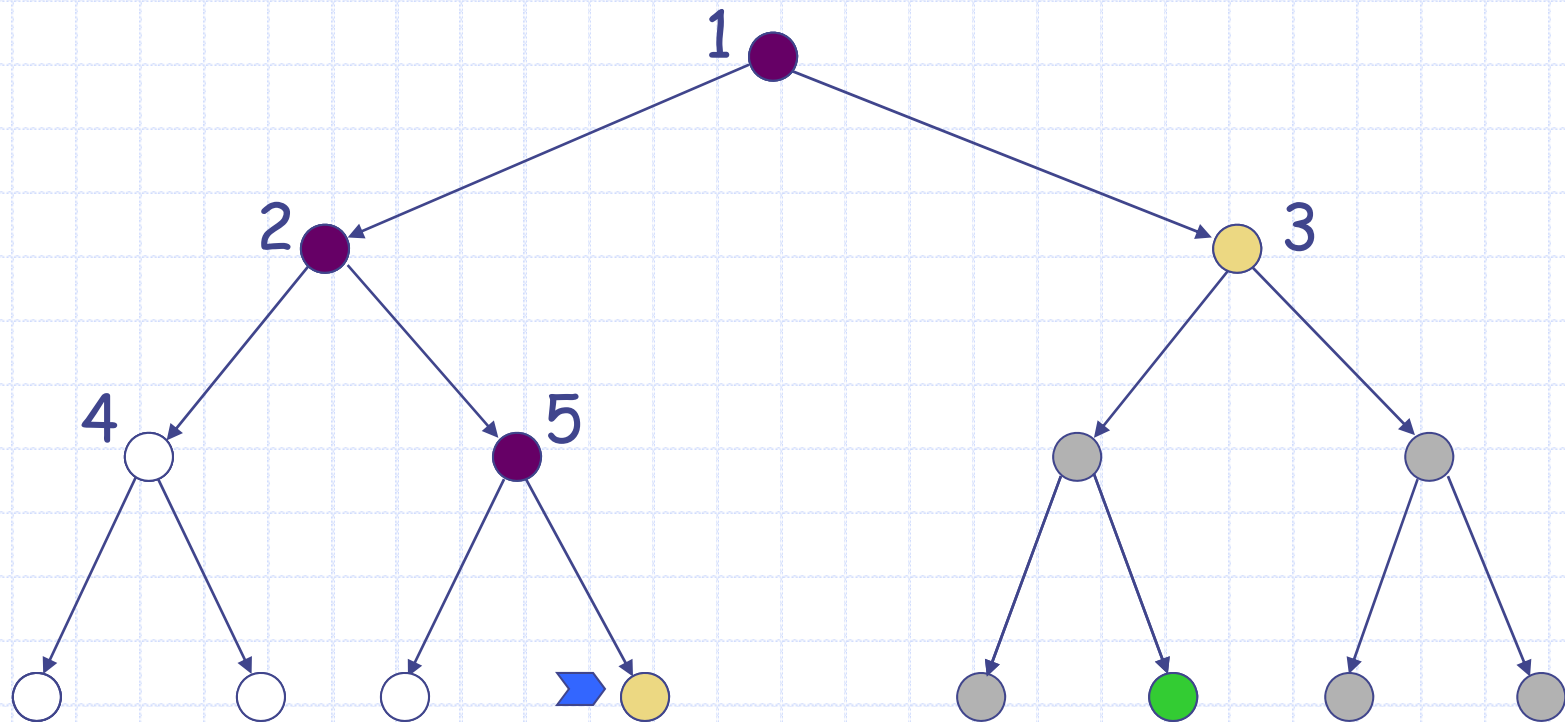
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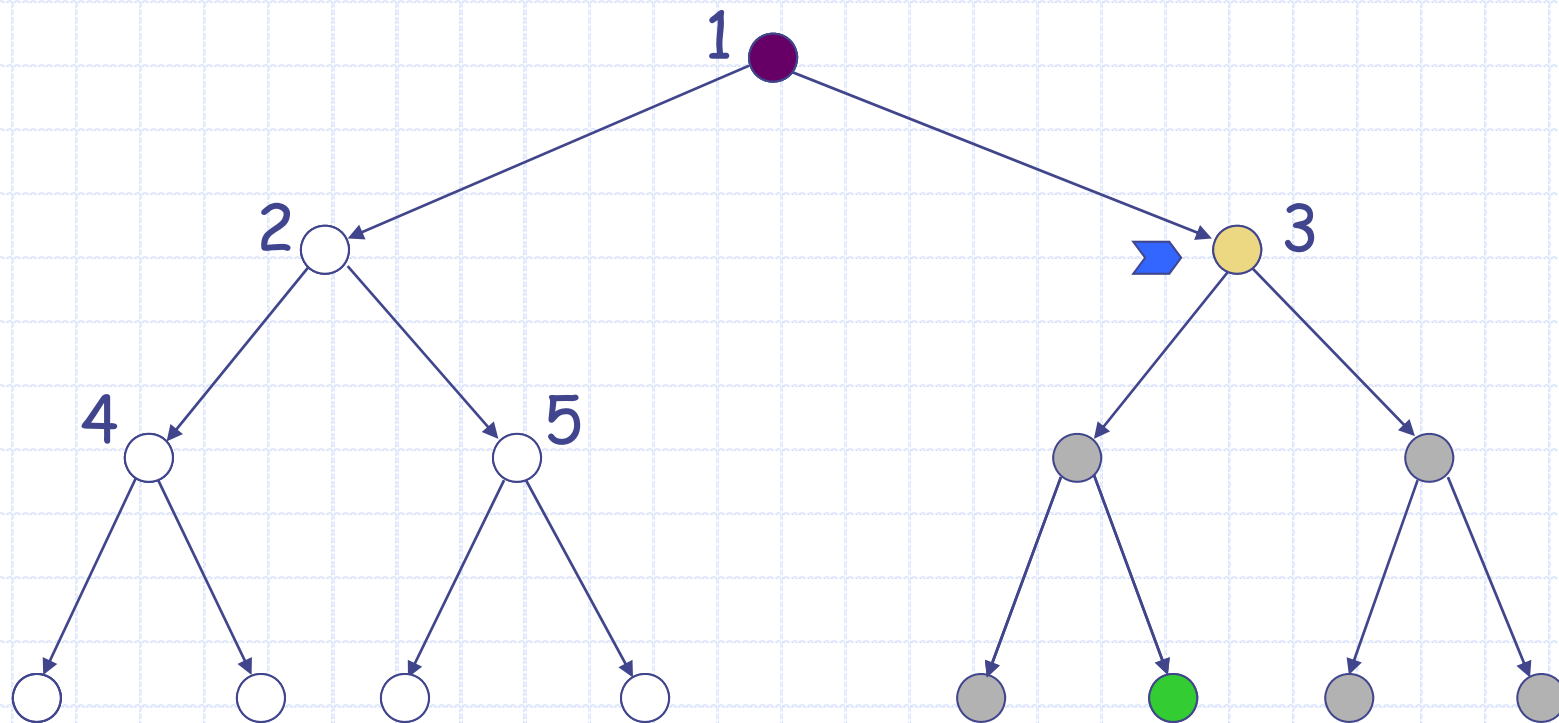
# Depth-First Strategy

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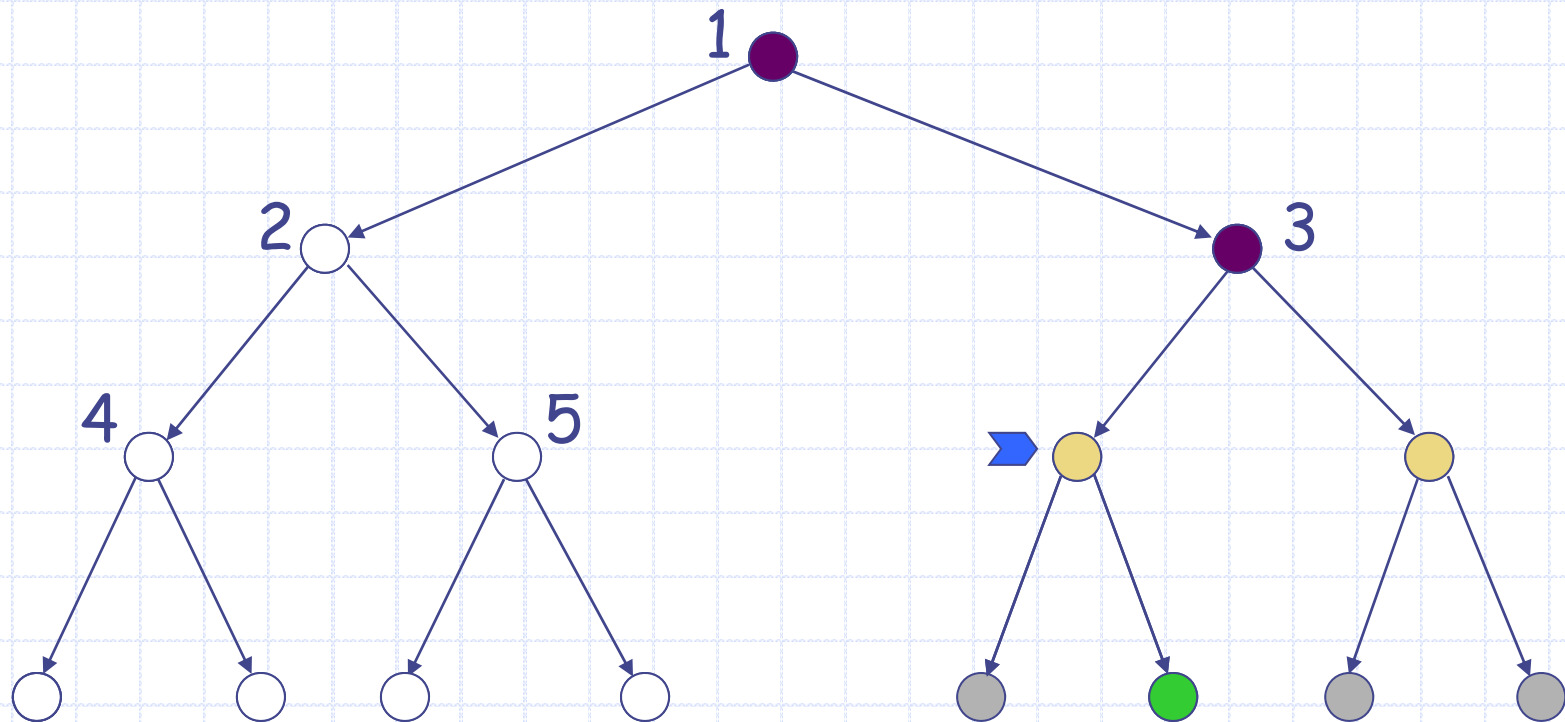
# Depth-First Strategy

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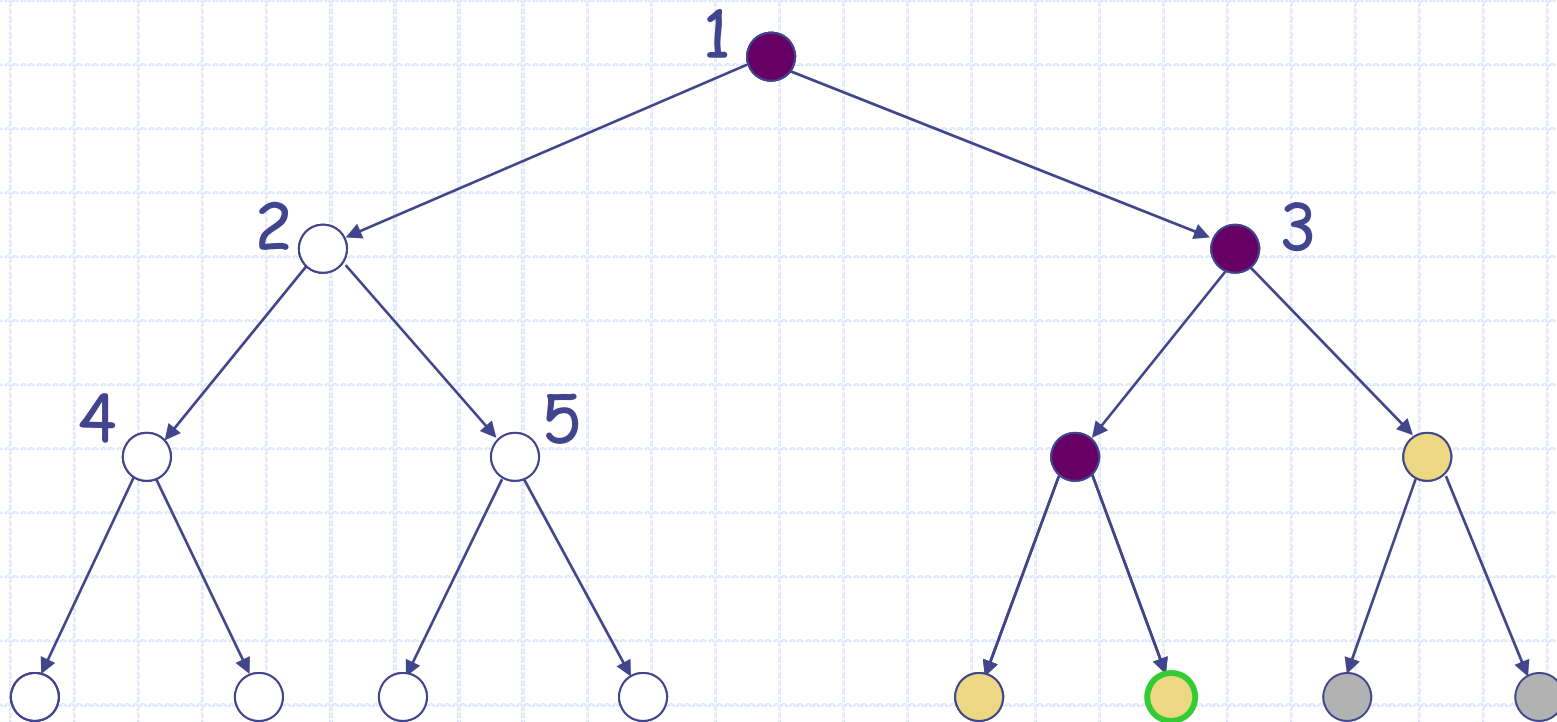
# Depth-First Strategy

- ◆ New nodes are inserted at the front of FRONTIER



# Depth-First Strategy

- ◆ New nodes are inserted at the front of FRONTIER



# DF Evaluation

- ◆ **b**: branching factor
- ◆ **d**: depth of shallowest goal node
- ◆ **m**: maximal depth of a leaf node
- ◆ Depth-first search is:
  - ◆ Complete?
  - ◆ Optimal?



# DF Evaluation

Reminder:  
Breadth-first requires  $O(b^d)$   
time and space

- ◆ **b**: branching factor
- ◆ **d**: depth of shallowest goal node
- ◆ **m**: maximal depth of a leaf node
- ◆ Depth-first search is:
  - ◆ Complete only for finite search tree
  - ◆ Not optimal
- ◆ Number of nodes generated (worst case):  
 $1 + b + b^2 + \dots + b^m = O(b^m)$ 
  - Time complexity is  $O(b^m)$
  - Space complexity is  $O(bm)$

# Depth-Limited Search

- ◆ Depth-first with **depth cutoff k**  
(depth at which nodes are not expanded)
- ◆ Three possible outcomes:
  - ◆ **Solution**
  - ◆ **Failure** (no solution)
  - ◆ **Cutoff** (no solution within cutoff)

# Iterative Deepening Search

- ◆ Provides the best of both breadth-first and depth-first search

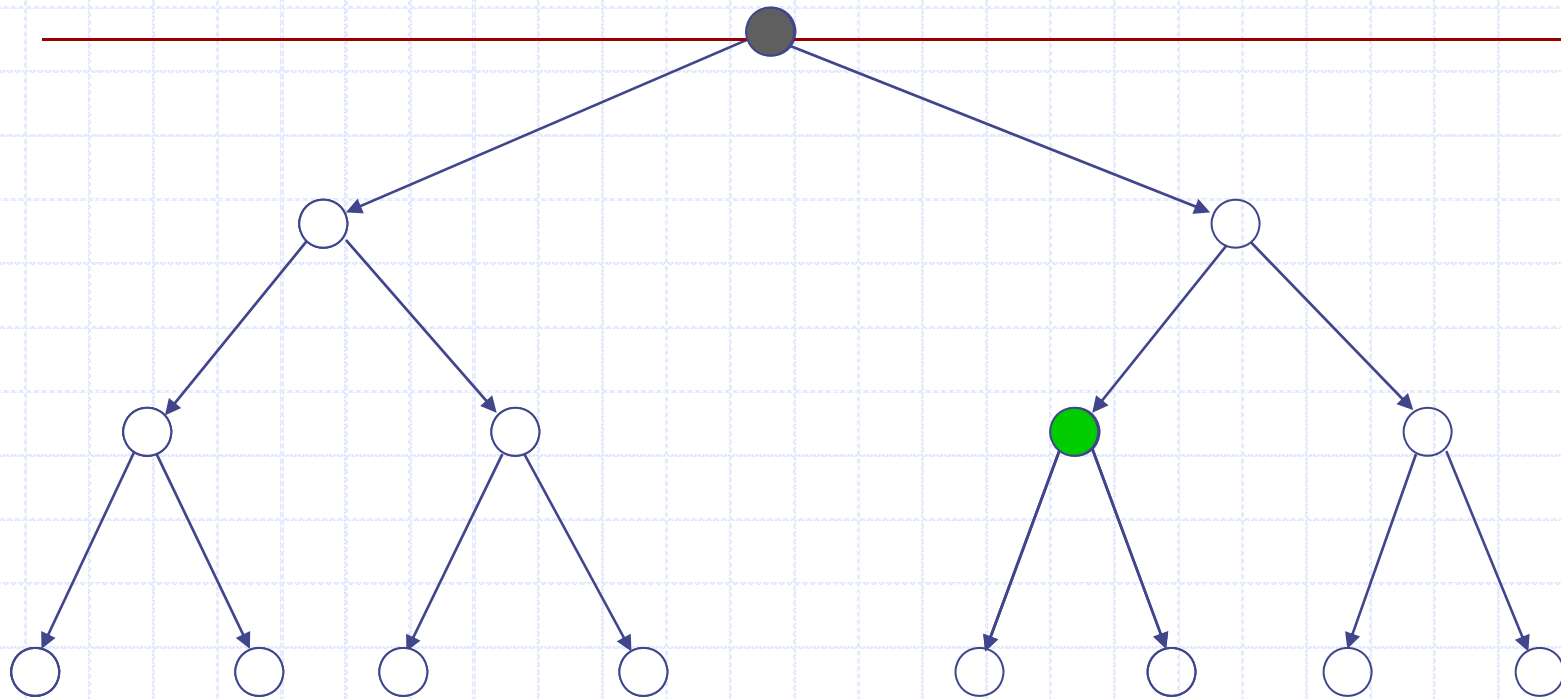
IDS

For  $k = 0, 1, 2, \dots$  do:

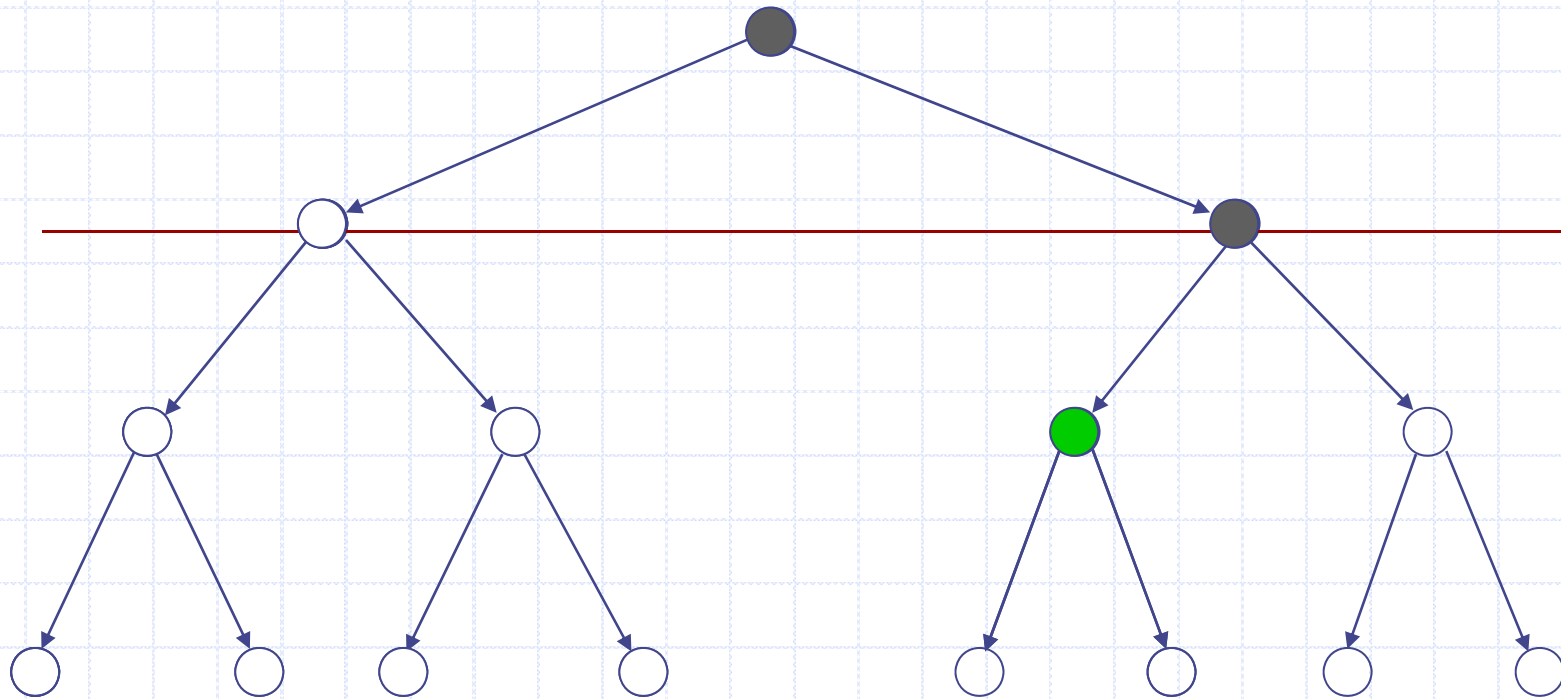
    Perform depth-first search with  
    depth cutoff  $k$

    (i.e., only generate nodes with depth  $\leq k$ )

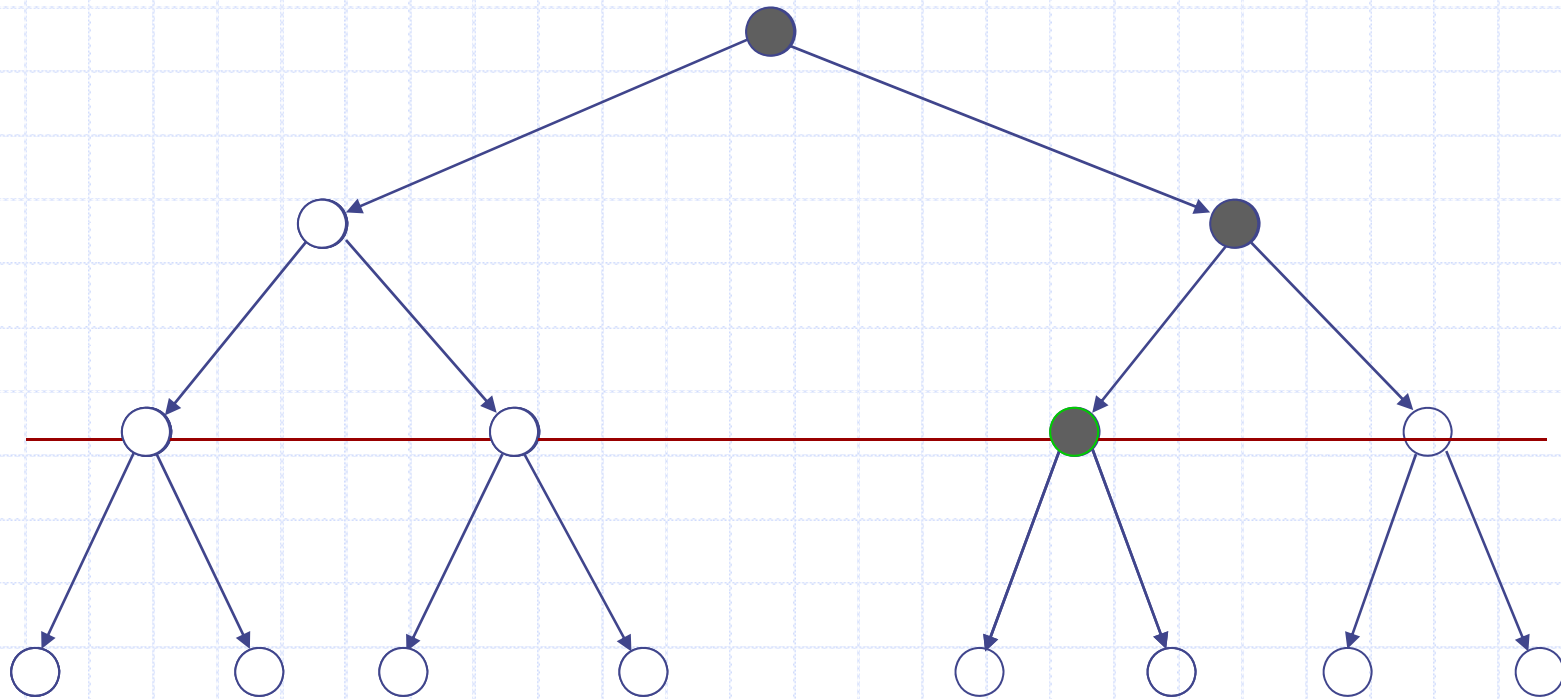
# Iterative Deepening



# Iterative Deepening



# Iterative Deepening



# ID Evaluation

- ◆ Iterative deepening search is:
  - ◆ Complete
  - ◆ Optimal if step cost = 1
- ◆ Time complexity is:
$$db + (d-1)b^2 + \dots + (1) b^d = O(b^d)$$
- ◆ Space complexity is:  $O(bd)$

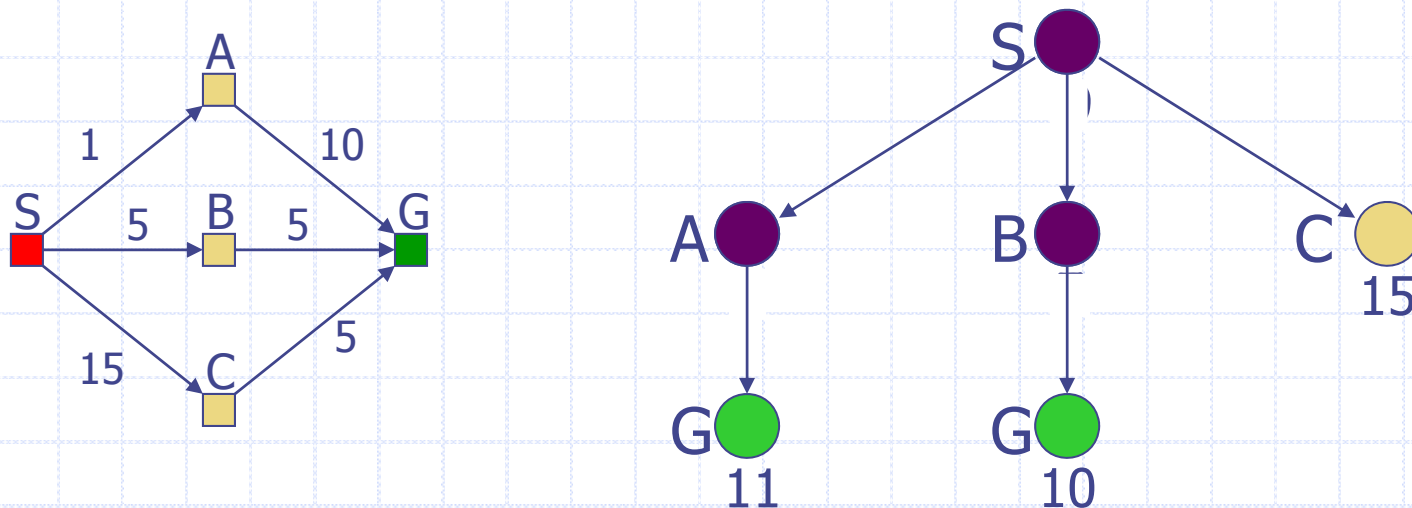
# Comparison of Strategies

- ◆ **Breadth-first** is complete and optimal, but has high space complexity
- ◆ **Depth-first** is space efficient, but is neither complete, nor optimal
- ◆ **Iterative deepening** is complete and optimal, with the same space complexity as depth-first and almost the same time complexity as breadth-first



# Uniform-Cost Search

- Each arc has some cost  $c \geq \epsilon > 0$
- The cost of the path to each node  $N$  is
$$g(N) = \sum \text{costs of arcs}$$
- The goal is to generate a solution path of minimal cost
- The nodes  $N$  in the queue FRONTIER are sorted in **increasing  $g(N)$**



- Need to modify search algorithm

# Search Algorithm #2

The goal test is applied to a node when this node is expanded, not when it is generated.

1. INSERT( $N_0$ , FRONTIER)

2. Repeat:

a. If EMPTY?(FRONTIER) then return **failure**

b.  $N = \text{POP}(\text{FRONTIER})$

c.  $S = \text{STATE}(N)$

Expansion of N

d. If GOAL?( $s$ ) then return **path or goal state**

e. For every state  $s'$  in SUCCESSORS( $s$ )

i. Create a new node  $N'$  as a child of  $N$

ii. INSERT( $N'$ , FRONTIER)