

# Uninformed Search

Computer Science cpsc322, Lecture 5

*(Textbook Chpt 3.5)*

Sept, 14, 2012

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# Recap

- Search is a key computational mechanism in many AI agents
- We will study the basic principles of search on the simple **deterministic planning agent model**

## Generic search approach:

- define a search space graph,
- start from current state,
- incrementally explore paths from current state until goal state is reached.

# Searching: Graph Search Algorithm with three bugs ☹️

Input: a graph,

a start node,

Boolean procedure  $goal(n)$  that tests if  $n$  is a goal node.

~~$frontier := \{ \langle g \rangle : g \text{ is a goal node} \};$~~  ← should be initiated with start node  
**while**  $frontier$  is not empty:

**select and remove** path  $\langle n_0, n_1, \dots, n_k \rangle$  from  $frontier$ , ←

**if**  $goal(n_k)$  ←

~~**return**  $\langle n_k \rangle;$~~  ← should return the path

**for every** neighbor  $n$  of  $n_k$

~~**add**  $\langle n_0, n_1, \dots, n_k, n \rangle$  to  $frontier$ ,~~ ←

**end while**

- The *goal* function defines what is a solution.
- The *neighbor* relationship defines the graph.
- Which path is selected from the frontier defines the search strategy.

# Lecture Overview

- Recap
- Criteria to compare Search Strategies
- Simple (Uninformed) Search Strategies
  - Depth First
  - Breadth First



# Comparing Searching Algorithms: will it find a solution? the best one?

**Def. (complete):** A search algorithm is **complete** if, whenever at least one solution exists, the algorithm is **guaranteed to find a solution** within a finite amount of time.

**Def. (optimal):** A search algorithm is **optimal** if, when it finds a solution, it is the best solution

# Comparing Searching Algorithms: Complexity

## Def. (time complexity)

The **time complexity** of a search algorithm is an expression for the worst-case amount of time it will take to run,

- expressed in terms of the **maximum path length  $m$**  and the **maximum branching factor  $b$** .

Def. (space complexity) : The **space complexity** of a search algorithm is an expression for the **worst-case** amount of memory that the algorithm will use (*number of nodes*),

- Also expressed in terms of  $m$  and  $b$ .

# Lecture Overview

- **Recap**
- Criteria to compare Search Strategies
- Simple (Uninformed) Search Strategies
  - **Depth First**
  - Breadth First

# Depth-first Search: DFS

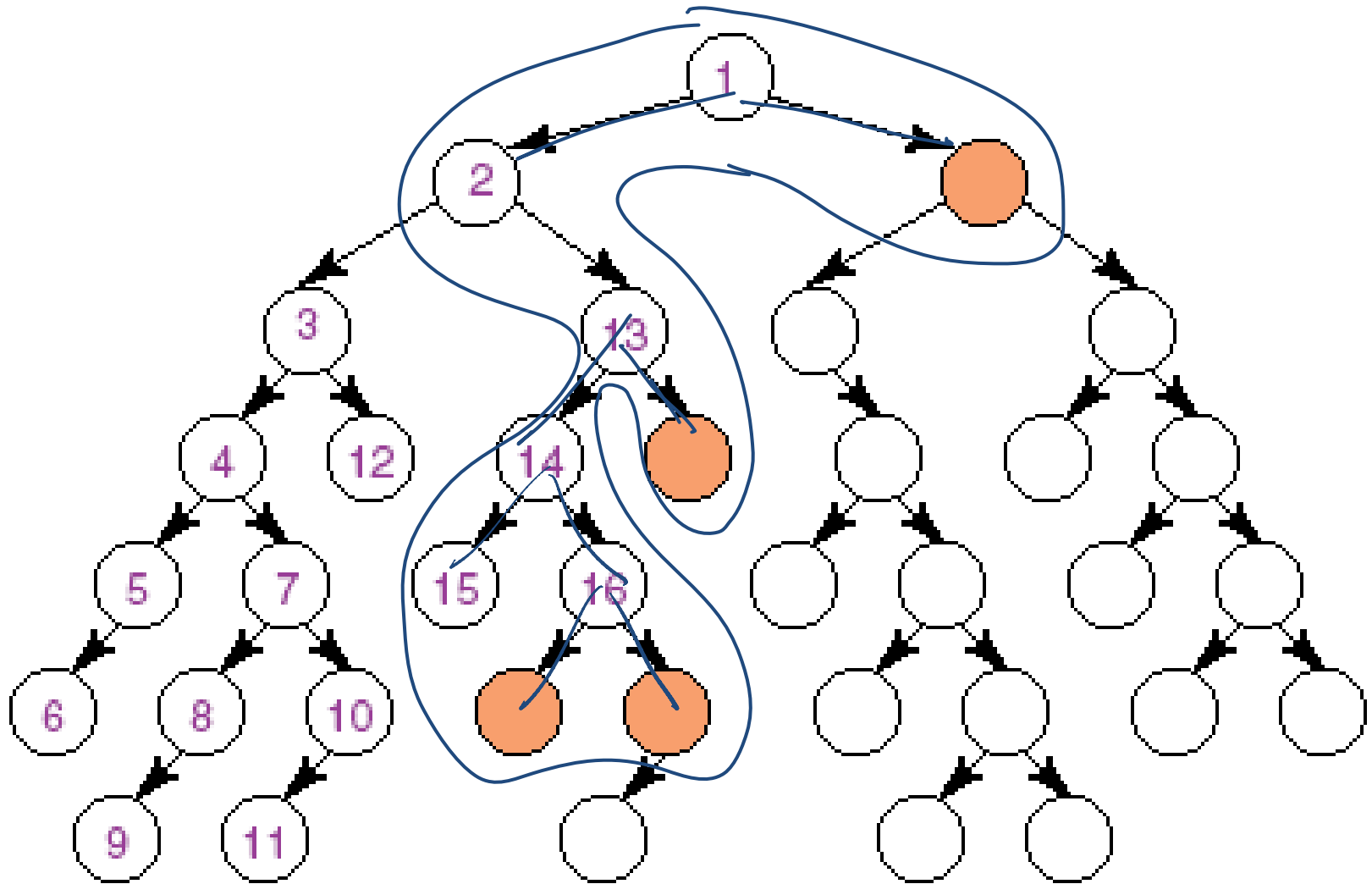
- **Depth-first search** treats the frontier as a stack
- It always selects one of the last elements added to the frontier.

Example:

- the frontier is  $[p_1, p_2, \dots, p_r]$  *push pop*
- neighbors of last node of  $p_1$  (its end) are  $\{n_1, \dots, n_k\}$  *order in which these are added is not specified in pure DFS*
- What happens?
  - $p_1$  is selected, and its end is tested for being a goal. *if not...*
  - New paths are created attaching  $\{n_1, \dots, n_k\}$  to  $p_1$  *K new paths*
  - These “replace”  $p_1$  at the beginning of the frontier.
  - Thus, the frontier is now  $[(p_1, n_1), \dots, (p_1, n_k), p_2, \dots, p_r]$ .
  - *NOTE:*  $p_2$  is only selected when all paths extending  $p_1$  have been explored.



## Depth-first search: Illustrative Graph --- Depth-first Search Frontier



# Depth-first Search: Analysis of DFS

- Is DFS complete?

Yes

No



- Is DFS optimal?

Yes

No



- What is the time complexity, if the maximum path length is  $m$  and the maximum branching factor is  $b$ ?

$O(b^m)$

$O(m^b)$

$O(bm)$

$O(b+m)$

- What is the space complexity?


$O(b^m)$

$O(m^b)$

$O(bm)$

$O(b+m)$

# Depth-first Search: Analysis of DFS

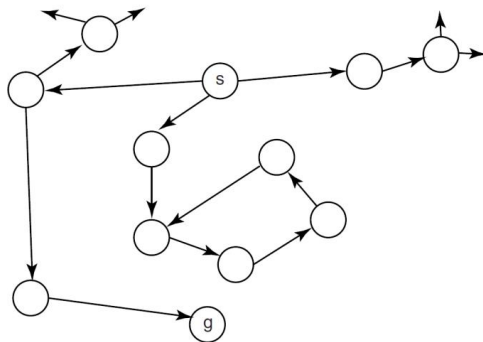
- Is DFS **complete**?
  - Depth-first search isn't guaranteed to halt on graphs with cycles.
  - However, DFS *is* complete for finite acyclic graphs.
- Is DFS **optimal**? 
- What is the **time complexity**, if the maximum path length is  $m$  and the maximum branching factor is  $b$ ?
  - The time complexity is  $O(b^m)$ ? must examine every node in the tree.
  - Search is unconstrained by the goal until it happens to stumble on the goal.
- What is the *space complexity*?
  - Space complexity is  $O(m \cdot b)$ ? the longest possible path is  $m$ , and for every node in that path must maintain a fringe of size  $b$ .

# Analysis of DFS

**Def. :** A search algorithm is **complete** if whenever there is at least one solution, the algorithm is **guaranteed to find it** within a finite amount of time.

Is DFS **complete**?

No



- If there are cycles in the graph, DFS may get “stuck” in one of them
- see this in AIspace by loading “Cyclic Graph Examples” or by adding a cycle to “Simple Tree”
  - e.g., click on “Create” tab, create a new edge from N7 to N1, go back to “Solve” and see what happens



# Analysis of DFS

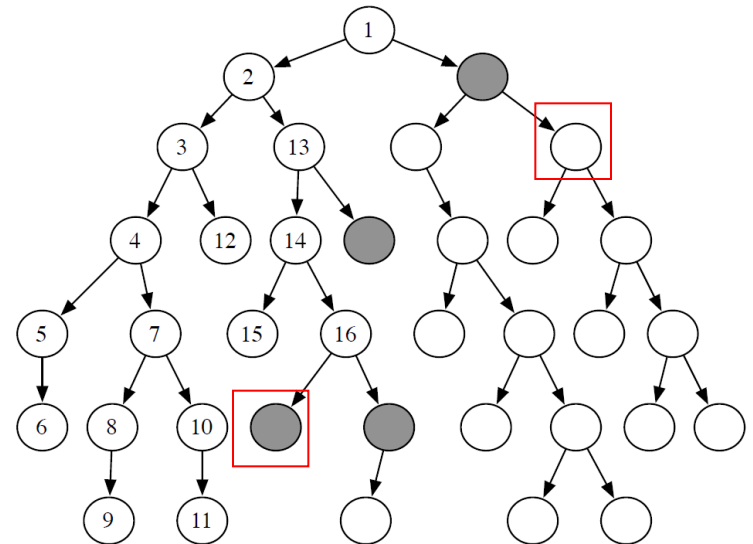
Def.: A search algorithm is **optimal** if when it finds a solution, it is the best one (e.g., the shortest)

Is DFS **optimal**?

Yes

No

- E.g., goal nodes: red boxes



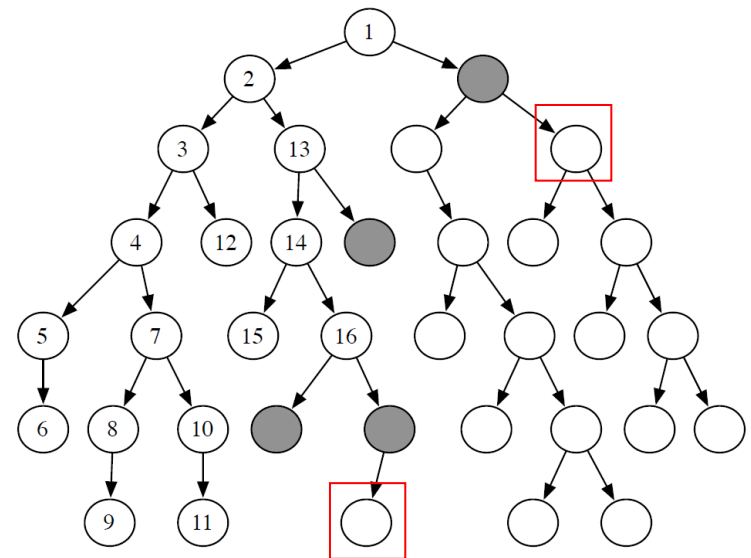
# Analysis of DFS

Def.: A search algorithm is **optimal** if when it finds a solution, it is the best one (e.g., the shortest)

Is DFS **optimal**?

No

- It can “stumble” on longer solution paths before it gets to shorter ones.
  - E.g., goal nodes: red boxes
- see this in AISpace by loading “Extended Tree Graph” and set N6 as a goal
  - e.g., click on “Create” tab, right-click on N6 and select “set as a goal node”



# Analysis of DFS

Def.: The **time complexity** of a search algorithm is the **worst-case** amount of time it will take to run, expressed in terms of

- maximum path length  $m$
- maximum forward branching factor  $b$ .

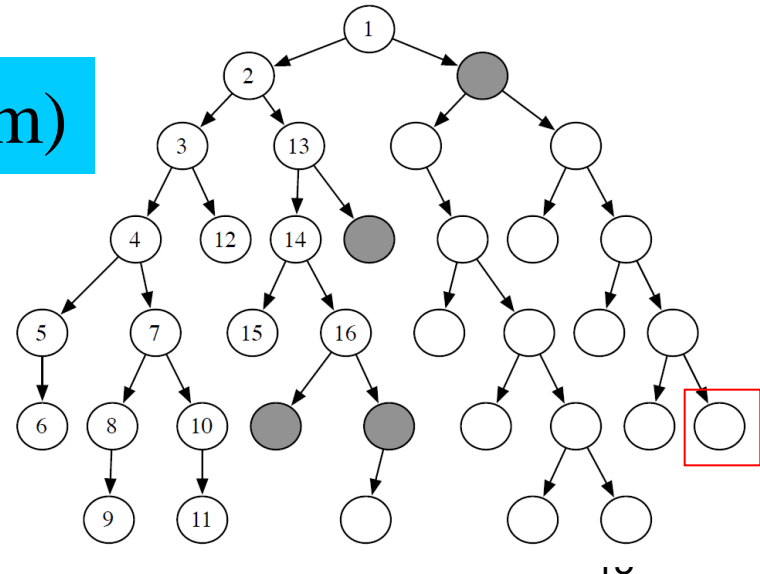
- What is DFS's **time complexity**, in terms of **m** and **b** ?

$$O(b^m)$$

$$O(m^b)$$

$$O(bm)$$

$$O(b+m)$$



- E.g., single goal node -> red box

# Analysis of DFS

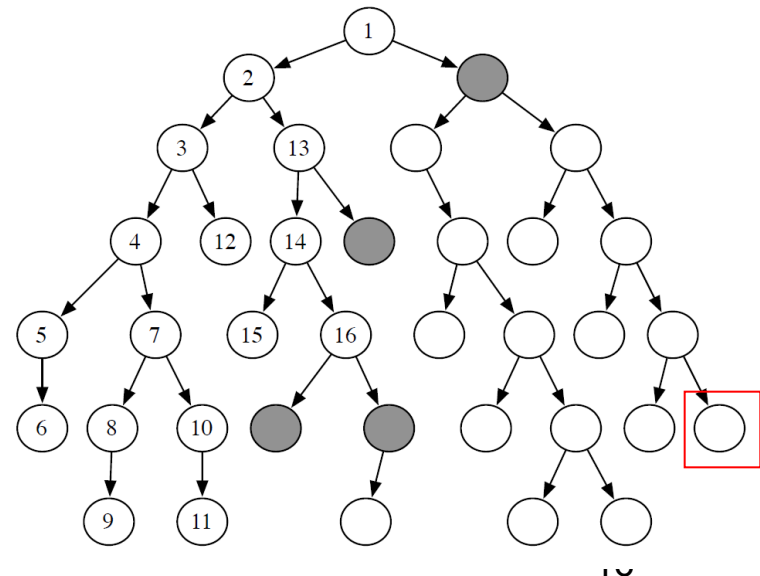
Def.: The **time complexity** of a search algorithm is the **worst-case** amount of time it will take to run, expressed in terms of

- maximum path length  $m$
- maximum forward branching factor  $b$ .

- What is DFS's **time complexity**, in terms of  $m$  and  $b$  ?

$$O(b^m)$$

- In the worst case, must examine every node in the tree
  - E.g., single goal node -> red box





# Analysis of DFS

Def.: The **space complexity** of a search algorithm is the **worst-case** amount of memory that the algorithm will use (i.e., the maximal number of nodes on the frontier), expressed in terms of

- maximum path length  $m$
- maximum forward branching factor  $b$ .

- What is DFS's **space complexity**, in terms of  $m$  and  $b$  ?

$O(b^m)$

$O(m^b)$

$O(bm)$

$O(b+m)$

See how this  
works in



# Analysis of DFS

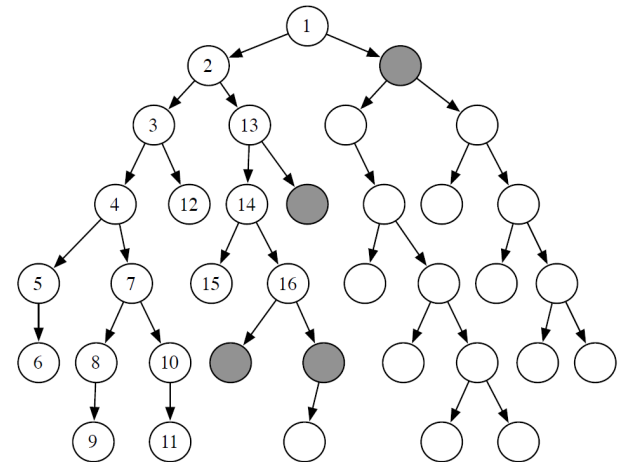
Def.: The **space complexity** of a search algorithm is the **worst-case** amount of memory that the algorithm will use (i.e., the maximum number of nodes on the frontier), expressed in terms of

- maximum path length  $m$
- maximum forward branching factor  $b$ .

- What is DFS's **space complexity**, in terms of **m** and **b** ?  $\mathcal{O}(m)$

 $O(bm)$ 


- for every node in the path currently explored, DFS maintains a path to its unexplored siblings in the search tree
  - Alternative paths that DFS needs to explore
- The longest possible path is  $m$ , with a maximum of  $b-1$  alternative paths per node



See how this works in



# Depth-first Search: Analysis of DFS

- Is DFS **complete**?
  - Depth-first search isn't guaranteed to halt on graphs with cycles.
  - However, DFS *is* complete for finite acyclic graphs.
- Is DFS **optimal**? 
- What is the **time complexity**, if the maximum path length is  $m$  and the maximum branching factor is  $b$ ?
  - The time complexity is  $O(b^m)$ ? must examine every node in the tree.
  - Search is unconstrained by the goal until it happens to stumble on the goal.
- What is the **space complexity**?
  - Space complexity is  $O(m \cdot b)$ ? the longest possible path is  $m$ , and for every node in that path must maintain a fringe of size  $b$ .

# Depth-first Search: When it is appropriate?

## Appropriate

- Space is restricted (complex state representation e.g., robotics) ↙
- There are many solutions, perhaps with long path lengths, particularly for the case in which all paths lead to a solution ↙




## Inappropriate

- Cycles
- There are shallow solutions
- if you care about optimality!

# Why DFS need to be studied and understood?

- It is simple enough to allow you to learn the basic aspects of searching (When compared with breadth first)

- 
- It is the basis for a number of more sophisticated / useful search algorithms

# Lecture Overview

- Recap
- Simple (Uninformed) Search Strategies
  - Depth First
  - Breadth First

# Breadth-first Search: BFS

- Breadth-first search treats the frontier as a **queue**
  - it always selects one of the earliest elements added to the frontier.

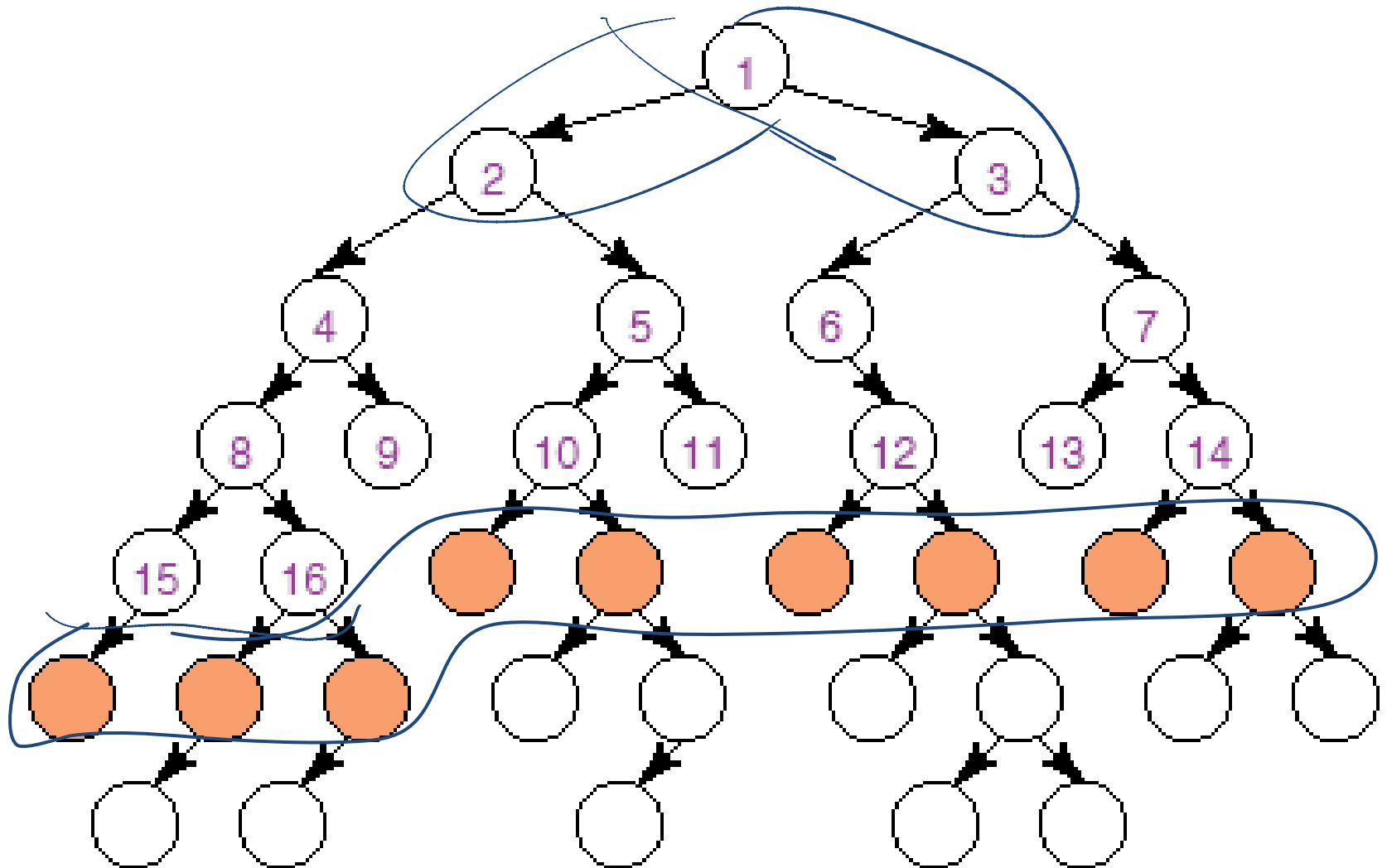
Example:

pop push

- the frontier is  $[p_1, p_2, \dots, p_r]$
- neighbors of the last node of  $p_1$  are  $\{n_1, \dots, n_k\}$
- What happens?
  - $p_1$  is selected, and its end tested for being a path to the goal.
  - New paths are created attaching  $\{n_1, \dots, n_k\}$  to  $p_1$
  - These follow  $p_r$  at the end of the frontier.
  - Thus, the frontier is now  $[p_2, \dots, p_r, (p_1, n_1), \dots, (p_1, n_k)]$
  - $p_2$  is selected next.



# Illustrative Graph - Breadth-first Search





# Breadth-first Search: Analysis of BFS

- Is BFS complete?

Yes

No



- Is DFS optimal?

Yes

No



- What is the time complexity, if the maximum path length is  $m$  and the maximum branching factor is  $b$ ?

$O(b^m)$

$O(m^b)$

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$O(b+m)$

- What is the space complexity?

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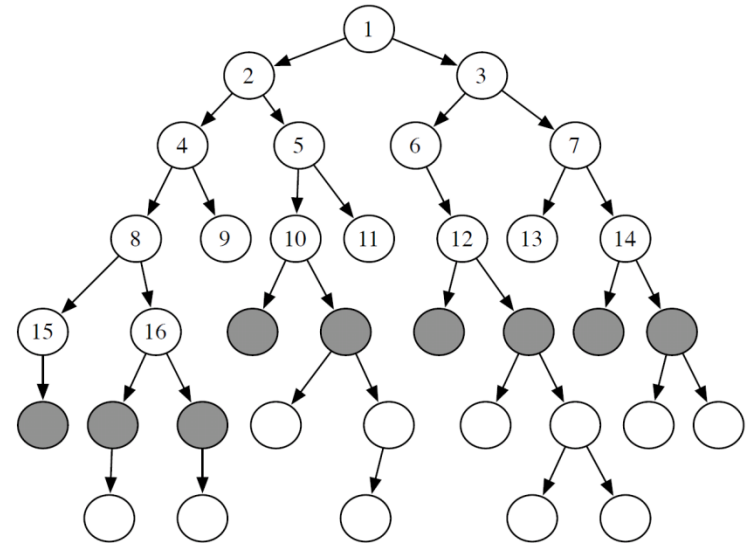
# Analysis of BFS

Def. : A search algorithm is **complete** if whenever there is at least one solution, the algorithm is **guaranteed to find it** within a finite amount of time.

Is BFS **complete**?

Yes

No



# Analysis of BFS

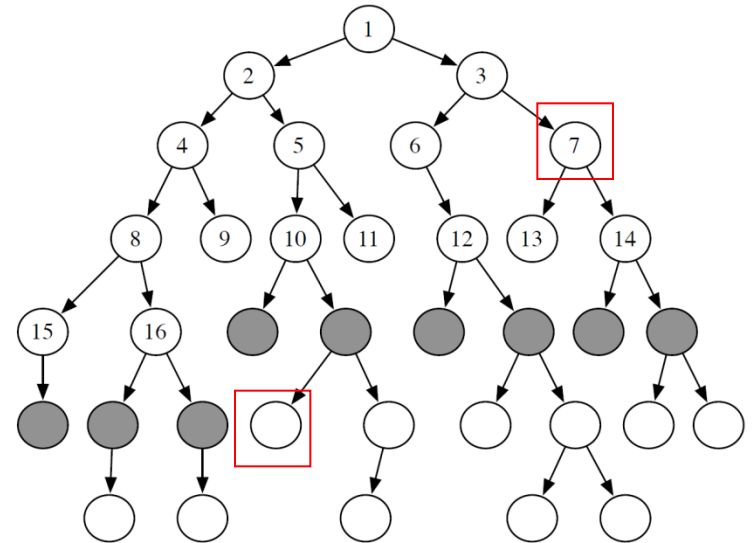
Def.: A search algorithm is **optimal** if  
when it finds a solution, it is **the best one**

# Is BFS optimal?

Yes

No

- E.g., two goal nodes: red boxes

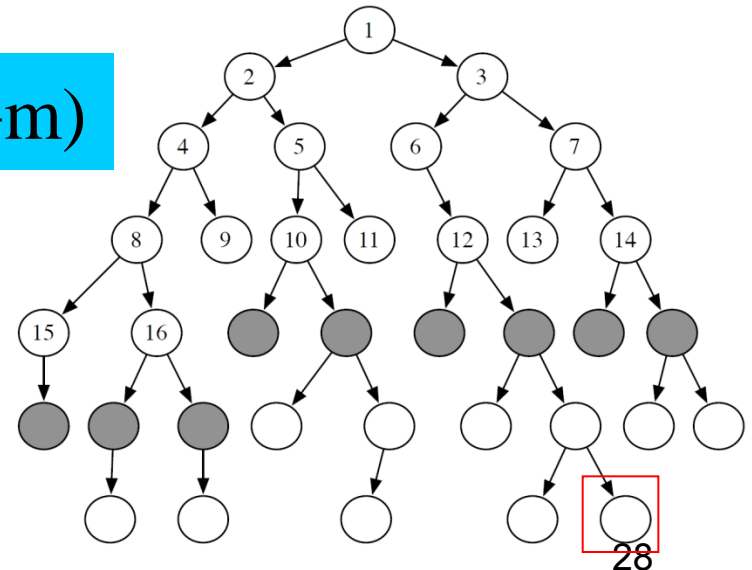


# Analysis of BFS

Def.: The **time complexity** of a search algorithm is the **worst-case** amount of time it will take to run, expressed in terms of

- maximum path length  $m$
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- What is BFS's **time complexity**, in terms of **m** and **b** ?

$$O(b^m)$$
$$O(m^b)$$
$$O(\text{bm})$$
$$O(b+m)$$


- E.g., single goal node: red box

# Analysis of BFS

Def.: The **space complexity** of a search algorithm is the **worst case** amount of memory that the algorithm will use (i.e., the maximal number of nodes on the frontier), expressed in terms of

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- What is BFS's **space complexity**, in terms of  $m$  and  $b$  ?

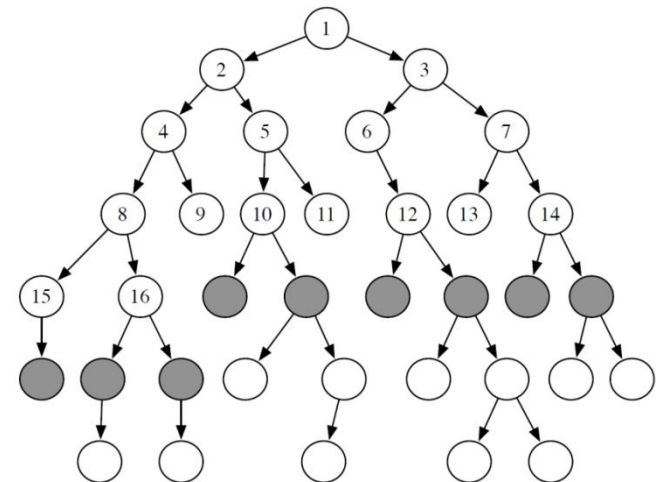
$O(b^m)$

$O(m^b)$

$O(bm)$

$O(b+m)$

- How many nodes at depth  $m$ ?



# Analysis of Breadth-First Search

- Is BFS complete?

- Yes



- In fact, BFS is guaranteed to find the path that involves the fewest arcs (why?)




- What is the time complexity, if the maximum path length is  $m$  and the maximum branching factor is  $b$ ?

- The time complexity is  $O(b^m)$  ? must examine every node in the tree.
- The order in which we examine nodes (BFS or DFS) makes no difference to the worst case: search is unconstrained by the goal.

- What is the space complexity?

- Space complexity is  $O(b^m)$  ?

# Using Breadth-first Search

- When is BFS **appropriate**?
  - space is not a problem 
  - it's necessary to find the solution with the fewest arcs *optimality*
  - although all solutions may not be shallow, at least some are
- When is BFS **inappropriate**?
  - space is limited
  - all solutions tend to be located deep in the tree 
  - the branching factor is very large 

# What have we done so far?

**GOAL:** **study search**, a set of basic methods underlying many intelligent agents

AI agents can be very complex and sophisticated

Let's start from a very simple one, **the deterministic, goal-driven agent** for which: the sequence of actions and their appropriate ordering is the solution

**We have looked at two search strategies DFS and BFS:**

- To understand key properties of a search strategy
- They represent the basis for more sophisticated (heuristic / intelligent) search



# Learning Goals for today's class

- Apply basic properties of search algorithms: completeness, optimality, time and space complexity of search algorithms.

	Comp	opt	time	Space
DFS	False	False	$b^m$	$m b$
BFS	True	True	$b^m$	$b^m$

- Select the most appropriate search algorithms for specific problems.

- BFS vs DFS vs IDS vs ~~Bidirectional~~

- LCFS vs. BFS –

- A\* vs. B&B vs IDA\* vs MBA\*

next 4 lectures

informed

To test your understanding of today's class

- Work on First **Practice Exercise 3.B**
- <http://www.aispace.org/exercises.shtml>

## Next Class

- Iterative Deepening
- Search with cost  
(read textbook.: 3.7.3, 3.5.3)
- (maybe) Start Heuristic Search  
(textbook.: start 3.6)

# Recap: Comparison of DFS and BFS

	Complete	Optimal	Time	Space
DFS	$\neg$ $N$ ( $\neg$ if no cycles)	<del><math>\neg</math></del> $N$	$\pm$ $O(b^m)$	$\pm$ $O(b^m)$
BFS	$\neg$	$\neg$	$O(b^m)$	$O(b^m)$