

# Uniformed Search (cont.)

**CPSC 322 Lecture 6**

# Lecture Overview

- **Recap DFS vs BFS**
- Uninformed Iterative Deepening (IDS)
- Search with Costs

# Recap: Graph Search Algorithm

```
Inputs: a graph, a start node  $n_o$ , Boolean procedure  $goal(n)$ 
          that tests if  $n$  is a goal node
 $frontier := [<s>: s \text{ is a start node}]$ ;
While  $frontier$  is not empty:
    select and remove path  $<n_o, \dots, n_k>$  from  $frontier$ ;
    If  $goal(n_k)$ 
        return  $<n_o, \dots, n_k>$ ;
    For every neighbor  $n$  of  $n_k$ 
        add  $<n_o, \dots, n_k, n>$  to  $frontier$ ;
return NULL
```

In what aspects do DFS and BFS differ when we look at the generic graph search algorithm?

# When to use BFS vs. DFS?

- The search graph has cycles or is infinite

BFS

DFS

- We need the shortest path to a solution

BFS

DFS

- There are only solutions at great depth

BFS

DFS

- There are some solutions at shallow depth

BFS

DFS

- Memory is limited

BFS

DFS

# Learning Goals for Search (up to today)

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

	complete?	optimal?	time $O()$	space $O()$
DFS	False	False	$b^m$	$mb$
BFS	True	True*	$b^m$	$b^m$
IDS				
LCFS				

# Learning Goals for Search (up to today)

- Select the most appropriate search algorithms for specific problems.
  - BFS vs. DFS vs. IDS
  - LCFS vs. BestFS
  - A\* vs. B&B vs. IDA\* vs. MBA\*
- Define/read/write/trace/debug different search algorithms
  - With / Without cost
  - Informed / Uninformed

in upcoming lectures

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# Iterative Deepening (sec 3.6.3)

Can we achieve an acceptable (linear) space complexity maintaining completeness and optimality?



	complete?	optimal?	time $O()$	space $O()$
DFS	False	False	$b^m$	$mb$
BFS	True	True*	$b^m$	$b^m$
IDS	True	True*	$b^m$	$mb$
LCFS				

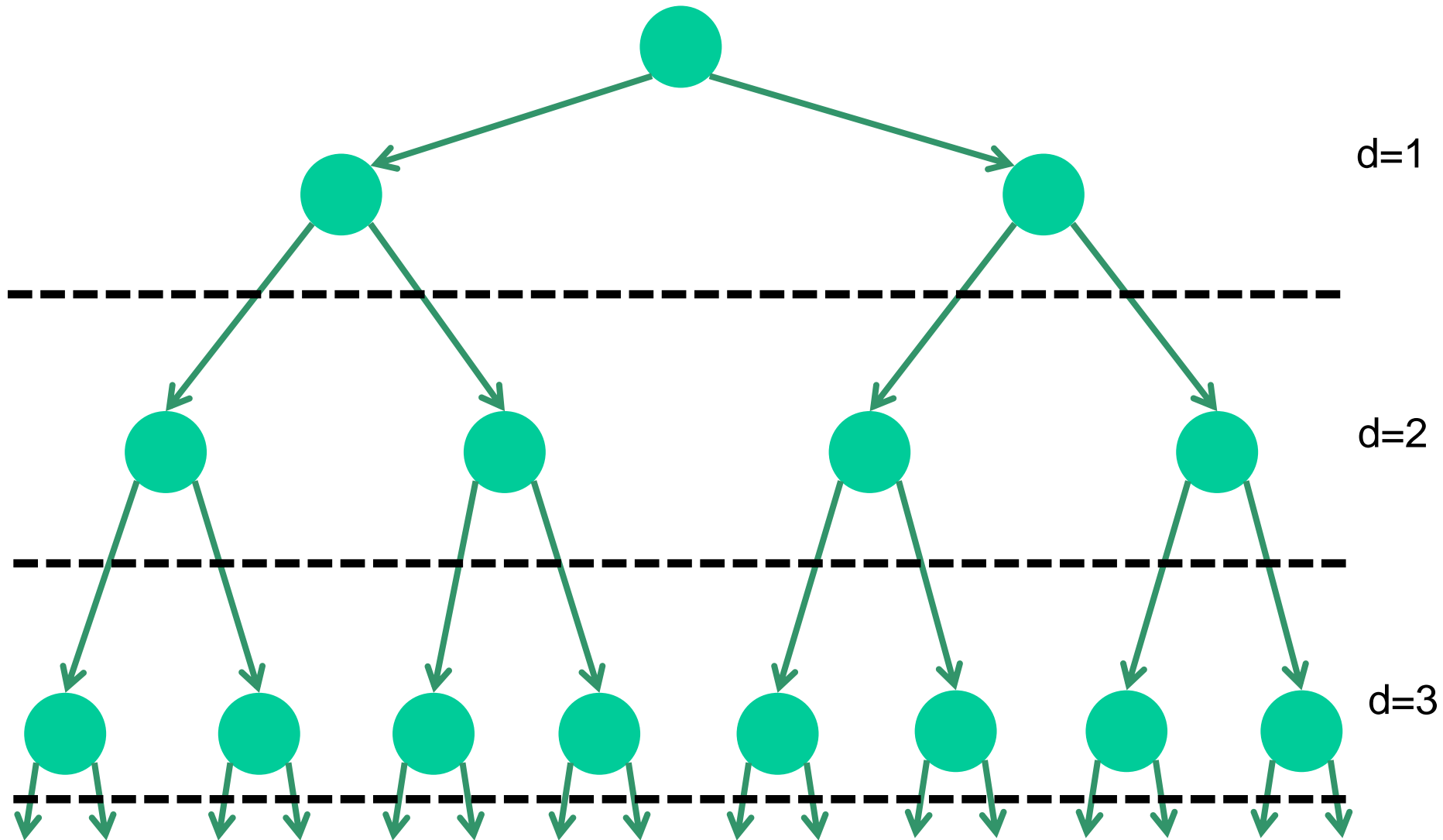
**Key Idea:** let's re-compute elements of the frontier rather than saving them.



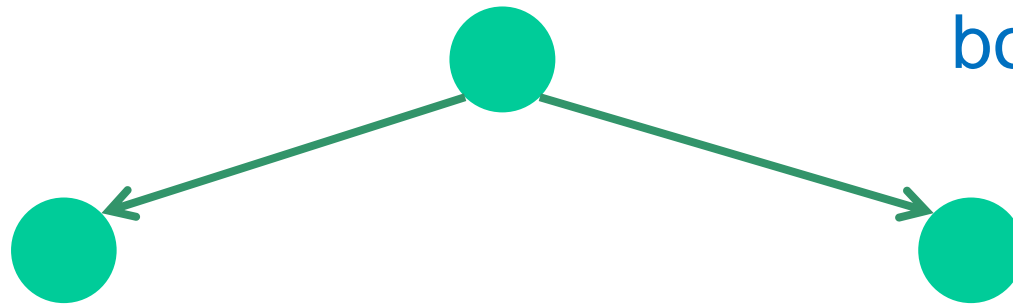
# Iterative Deepening in Essence

- **Look with DFS** for solutions at depth 1, then 2, then 3, etc.
- If a solution cannot be found at depth  $D$ , look for a solution at depth  $D + 1$ .
- You need a **depth-bounded depth-first searcher**.
- Given a bound  $B$  you simply assume that paths of length  $B$  cannot be expanded....

# IDS



# IDS

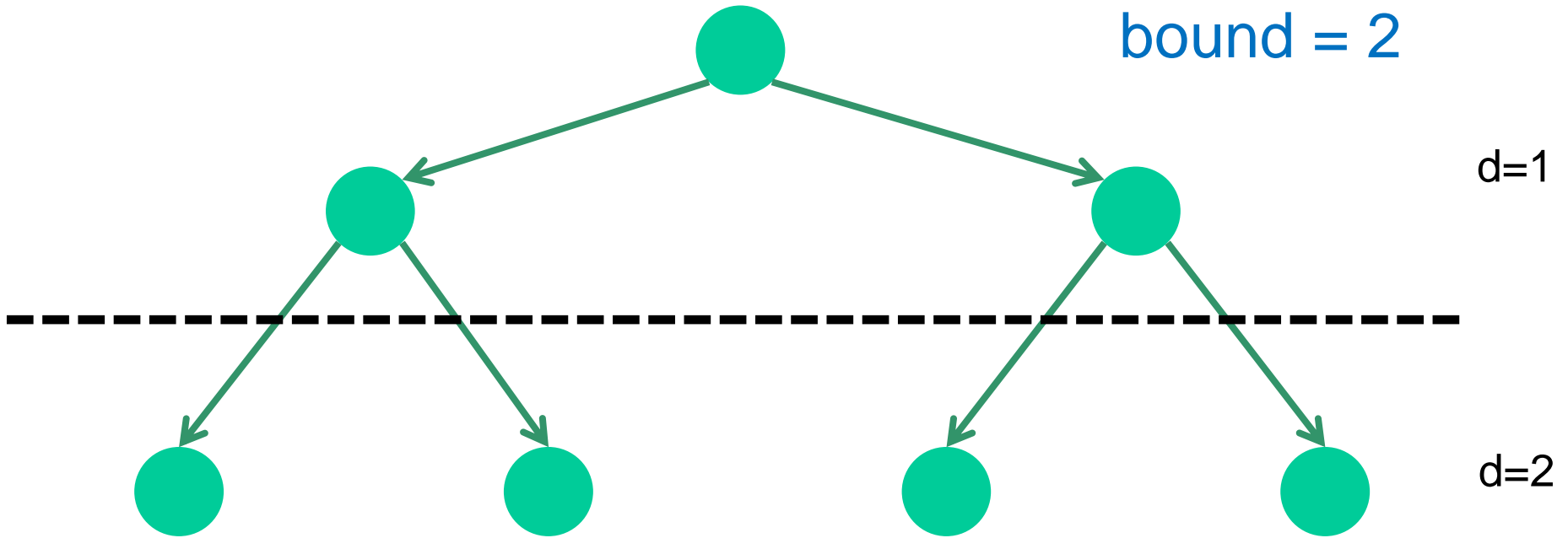


bound = 1

d=1

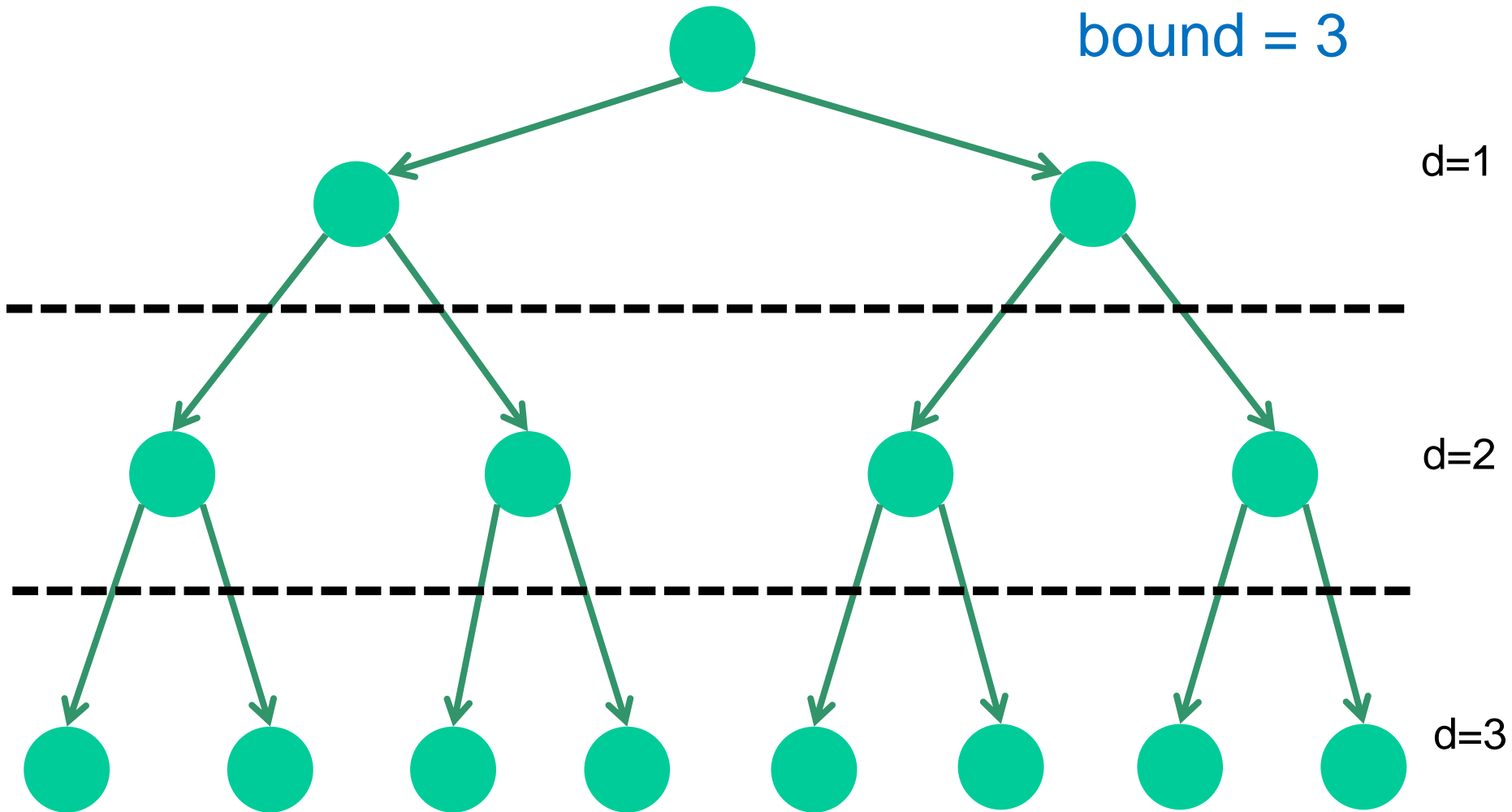
# IDS

bound = 2



# IDS

bound = 3



# (Time) Complexity of Iterative Deepening

Complexity of solution at depth  $m$  with branching factor  $b$

depth	# paths at this depth	# times each path evaluated by the time we reach depth $m$	total # of path evaluations at this depth
1	$b$	$m$	$mb$
2	$b^2$	$m-1$	$(m-1)b^2$
3	$b^3$	$m-2$	$(m-2)b^3$
4	$b^4$	$m-3$	$(m-3)b^4$
.	.	.	.
.	.	.	.
.	.	.	.
$m$	$b^m$	1	$b^m$

sum to get complexity

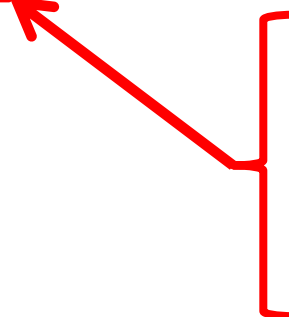
# (Time) Complexity of Iterative Deepening

Complexity of solution at depth  $m$  with branching factor  $b$

Total # of paths generated

$$b^m + 2 b^{m-1} + 3 b^{m-2} + \dots + mb =$$
$$b^m (1 + 2 b^{-1} + 3 b^{-2} + \dots + m b^{1-m}) \leq$$

$$b^m \left( \sum_{i=1}^{\infty} i b^{1-i} \right) = b^m \left( \frac{b}{b-1} \right)^2 = O(b^m)$$



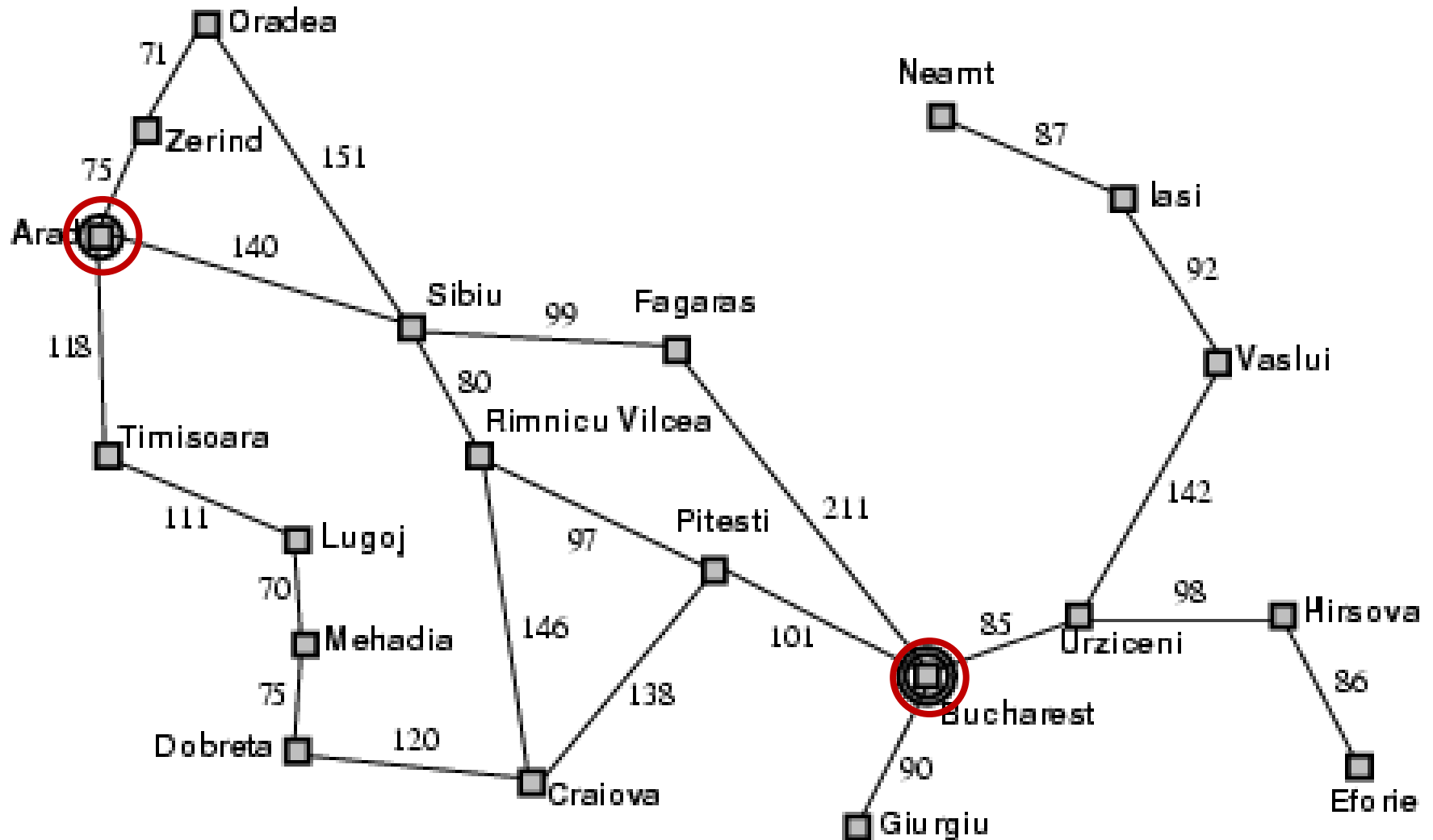
$b=2$	4
$b=3$	2.25
$b=4$	1.77...

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# Example: Romania



# Search with Costs

Sometimes there are **costs** associated with arcs.

## Definition (cost of a path)

The cost of a path is the sum of the costs of its arcs:

$$\text{cost}(\langle n_0, \dots, n_k \rangle) = \sum_{i=1}^k \text{cost}(\langle n_{i-1}, n_i \rangle)$$

In this setting we often don't just want to find just any solution

- **we usually want to find the solution that minimizes cost**

## Definition (optimal algorithm)

A search algorithm is **optimal** if, when it returns a solution, it is the one with minimal cost.


# Lowest-Cost-First Search (LCFS)

- At each stage, lowest-cost-first search selects a path on the frontier with **lowest cost**.
  - The frontier is a **priority queue ordered by path cost**
  - We say “a path” because there may be ties
- **Example of one step for LCFS:**
  - the frontier is  $[\langle p_2, 5 \rangle, \langle p_3, 7 \rangle, \langle p_1, 11 \rangle,]$
  - $p_2$  is the lowest-cost path in the frontier
  - “neighbors” of  $p_2$  are  $\{\langle p_9, 10 \rangle, \langle p_{10}, 15 \rangle\}$
- What happens?
  - $p_2$  is selected, and tested for being a goal (its end).
  - (if not a goal) Neighbors of  $p_2$  are inserted into the frontier
  - Thus, the frontier is now  $[\langle p_3, 7 \rangle, \langle p_9, 10 \rangle, \langle p_1, 11 \rangle, \langle p_{10}, 15 \rangle]$ .
  - \_\_\_\_\_ is selected next.



- When arc costs are equal LCFS is equivalent to..
  - A. DFS
  - B. BFS
  - C. IDS
  - D. None of the above
  - E. Click E to escape the Matrix

# Analysis of Lowest-Cost Search

- Is LCFS **complete**?
  - not in general: a cycle with **zero or negative** arc costs could be followed forever. 
  - yes, as long as arc costs are strictly positive
- Is LCFS **optimal**?
  - Not in general. Why not?
  - Arc costs could be negative: a path that initially looks high-cost could end up getting a “refund”.
  - However, LCFS *is* optimal if arc costs are guaranteed to be non-negative.

# Analysis of Lowest-Cost Search

- What is the **time complexity**, if the maximum path length is  $m$  and the maximum branching factor is  $b$ ?
  - The time complexity is  $O(b^m)$ : may need to examine every node in the tree.
  - Knowing costs doesn't help here.
- What is the **space complexity**?
  - Space complexity is  $O(b^m)$ : in the case where arc costs are equal (and  $> 0$ ), LCFS behaves like BFS.

# Search Summary Table

	complete?	optimal?	time $O()$	space $O()$
DFS	False	False	$b^m$	mb
BFS	True	True*	$b^m$	$b^m$
IDS	True	True*	$b^m$	mb
LCFS	True**	True**	$b^m$	$b^m$

\* Assuming arc costs are equal

\*\* Assuming arc costs are positive

# Beyond uninformed search....

**What information we could use to better select paths from the frontier?**

- A. an estimate of the shortest distance from the last node on the path to the goal
- B. an estimate of the shortest distance from the start state to the goal
- C. an estimate of the cost of the current path
- D. None of the above
- E. Roll a d20 and hope your dungeon master is feeling nice





# Next Class

- Heuristic Search (textbook 3.6)
- Best-First Search
- Combining LCFS and BestFS: A\* (finish 3.6)
- A\* Optimality

## Finish Search (finish Ch. 3)

- Branch-and-Bound
- A\* enhancements
- Non-heuristic Pruning
- Dynamic Programming