

# Uninformed Search

Artificial Intelligence

September 9, 2019

# Plan

09/09/2019	Search	Uninformed Search	Search (Korf)	
09/11/2019	Search	Heuristic Search	Search (Korf)	
09/16/2019	Search	Adversarial Search	Search (Korf)	
09/18/2019	Search	Local Search	Local Search (Russell and Norvig)	
09/23/2019	<b>Search</b>	<b>Quiz</b>	<i>Search Worksheet</i>	Quiz 1 (Search)
09/25/2019	Multiagent Systems	Behavior-based AI		Discussion Question
09/30/2019	Multiagent Systems	Swarm Intelligence	Python Tutorial	<b>Assignment 1 (Search)</b>

# Topic 2: Search

- **Uninformed search**
- Heuristic search
- Adversarial search
- Local search



**This reading is at a higher conceptual level, so consult slides and online resources**

We will cover the highlighted sections.

You do not need to read the rest.

# 22

## Artificial Intelligence Search Algorithms

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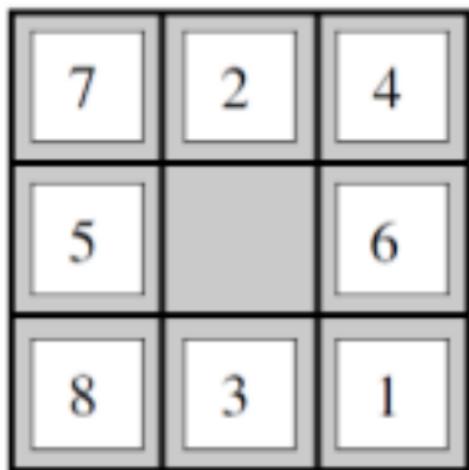
22.1	Introduction .....	22-1
22.2	Problem Space Model.....	22-3
22.3	Brute-Force Search .....	22-3
	Breadth-First Search • Uniform-Cost Search • Depth-First Search • Depth-First Iterative-Deepening • Bidirectional Search • Frontier Search • Disk-Based Search Algorithms • Combinatorial Explosion	
22.4	Heuristic Search .....	22-7
	Heuristic Evaluation Functions • Pattern Database Heuristics • Pure Heuristic Search • A* Algorithm • Iterative-Deepening-A* • Depth-First Branch-and-Bound • Complexity of Finding Optimal Solutions • Heuristic Path Algorithm • Recursive Best-First Search	
22.5	Interleaving Search and Execution .....	22-11
	Minimin Search • Real-Time-A* • Learning-Real-Time-A*	
22.6	Game Playing .....	22-13
	Minimax Search • Alpha-Beta Pruning • Other Techniques • Significant Milestones • Multiplayer Games, Imperfect and	
	Tie-breaking Information	

# Agenda

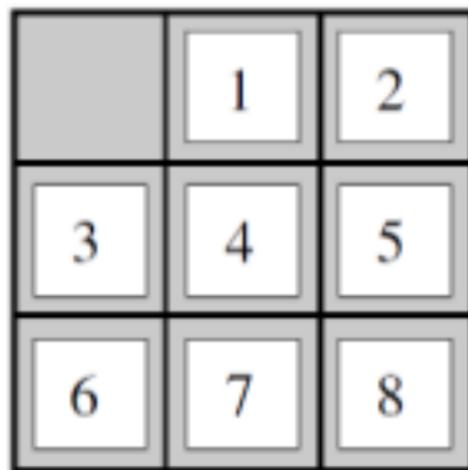
- Introduction to search & problem space model
- Basic brute force search strategies
- In-class activity
- Analysis of search algorithms
- Improving brute-force search algorithms

# **Introduction to Search & Problem Space Model**

# Single agent path finding: Eight Puzzle Problem

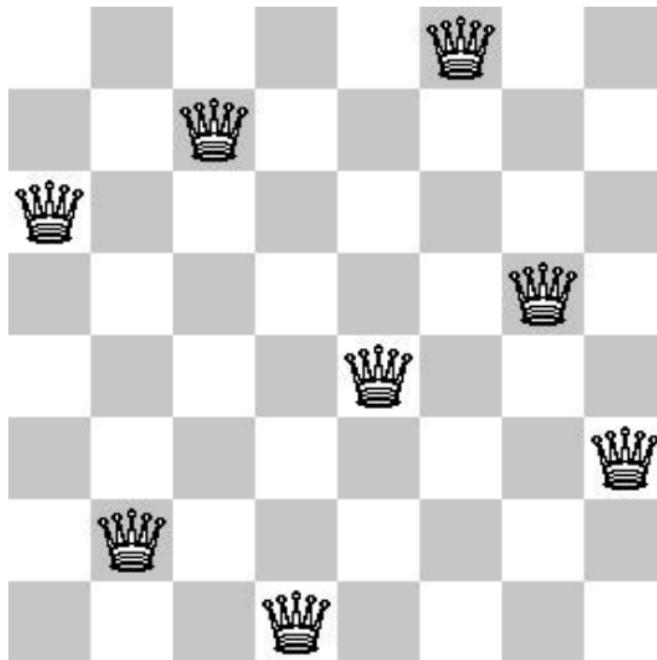


Start State

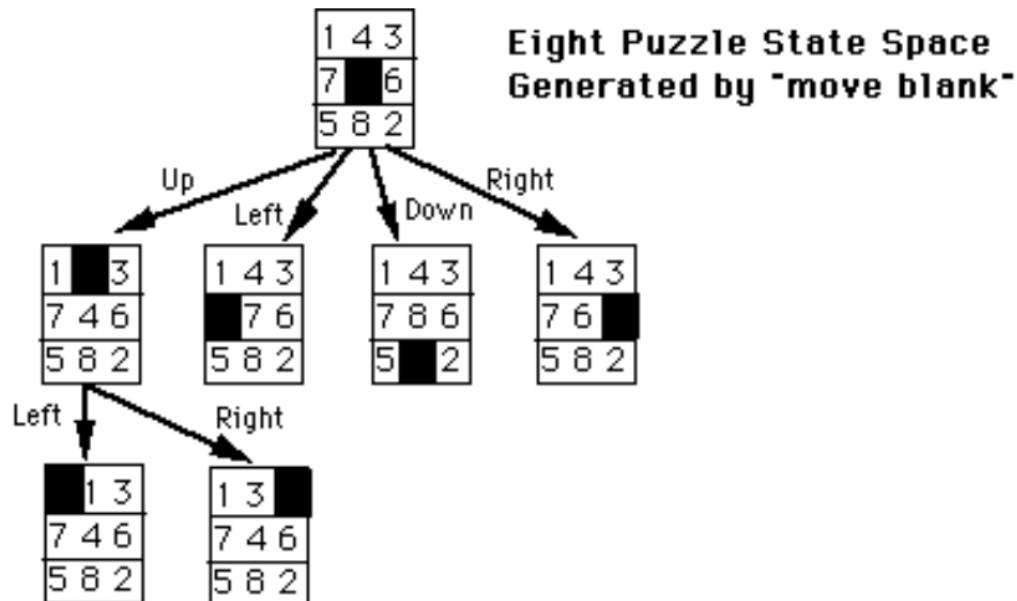


Goal State

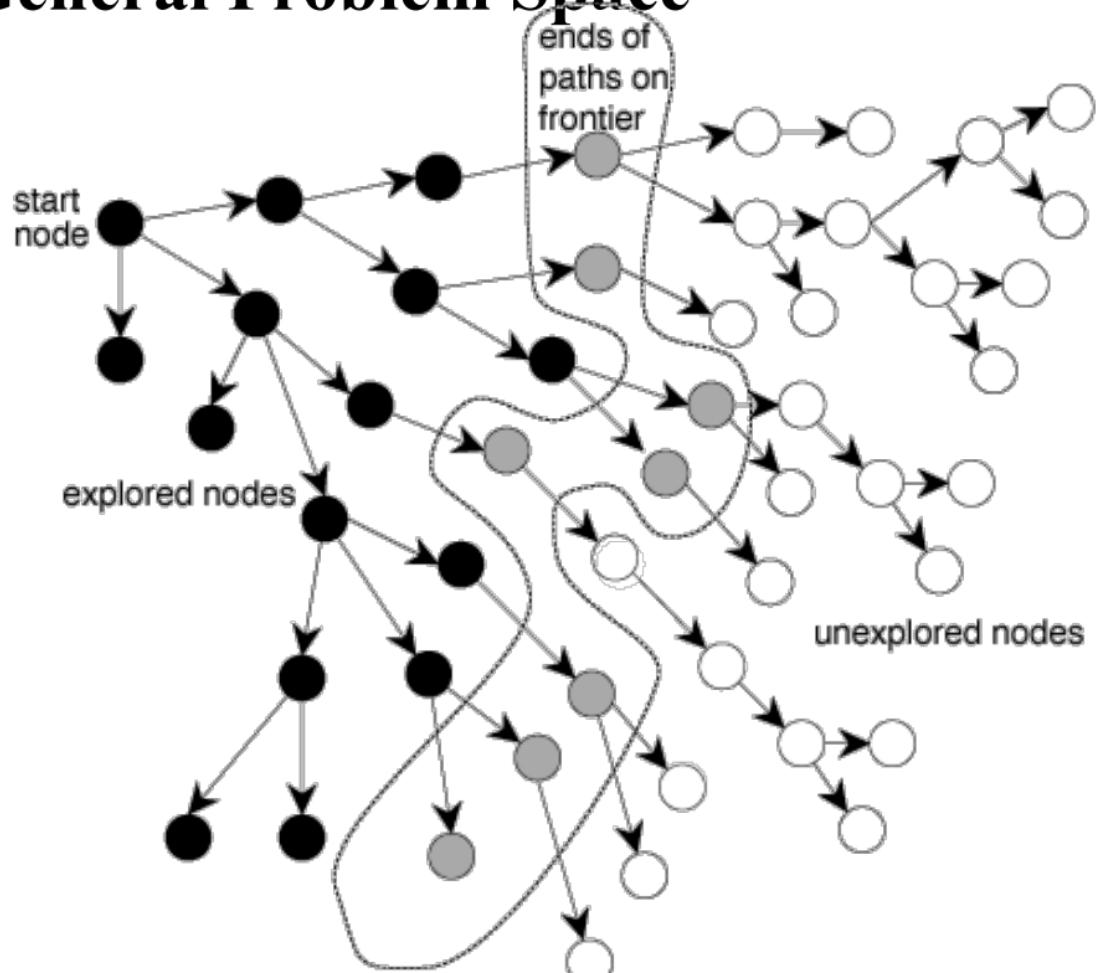
# Constraint satisfaction problem - Eight-Queens Problem



# Eight-Puzzle Problem Space (State Space)

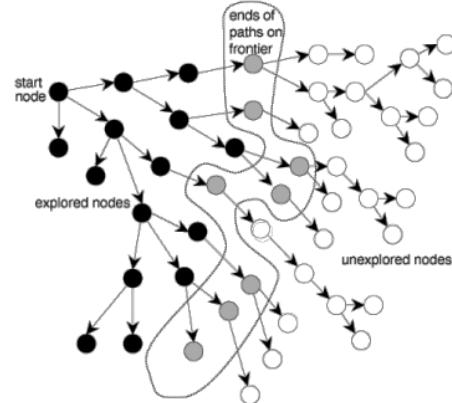


# General Problem Space



# Basic AI Search Algorithm

```
function TREE-SEARCH(problem, strategy) returns a solution, or failure
  initialize the search tree using the initial state of problem
  loop do
    if there are no candidates for expansion then return failure
    choose a leaf node for expansion according to strategy
    if the node contains a goal state then return the corresponding solution
    else expand the node and add the resulting nodes to the search tree
  end
```

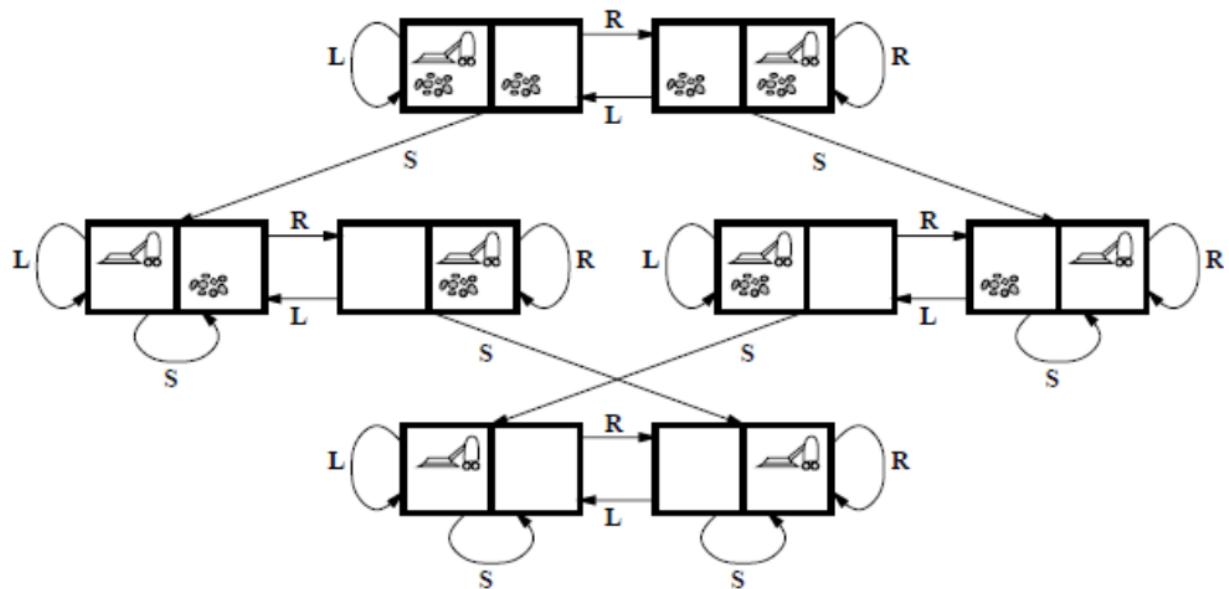


## Tree search vs. graph search (differences in **italics**)

```
function TREE-SEARCH(problem) returns a solution, or failure
  initialize the frontier using the initial state of problem
  loop do
    if the frontier is empty then return failure
    choose a leaf node and remove it from the frontier
    if the node contains a goal state then return the corresponding solution
    expand the chosen node, adding the resulting nodes to the frontier
```

```
function GRAPH-SEARCH(problem) returns a solution, or failure
  initialize the frontier using the initial state of problem
  initialize the explored set to be empty
  loop do
    if the frontier is empty then return failure
    choose a leaf node and remove it from the frontier
    if the node contains a goal state then return the corresponding solution
    add the node to the explored set
    expand the chosen node, adding the resulting nodes to the frontier
    only if not in the frontier or explored set
```

# Robotic Vacuum Cleaner as a search problem

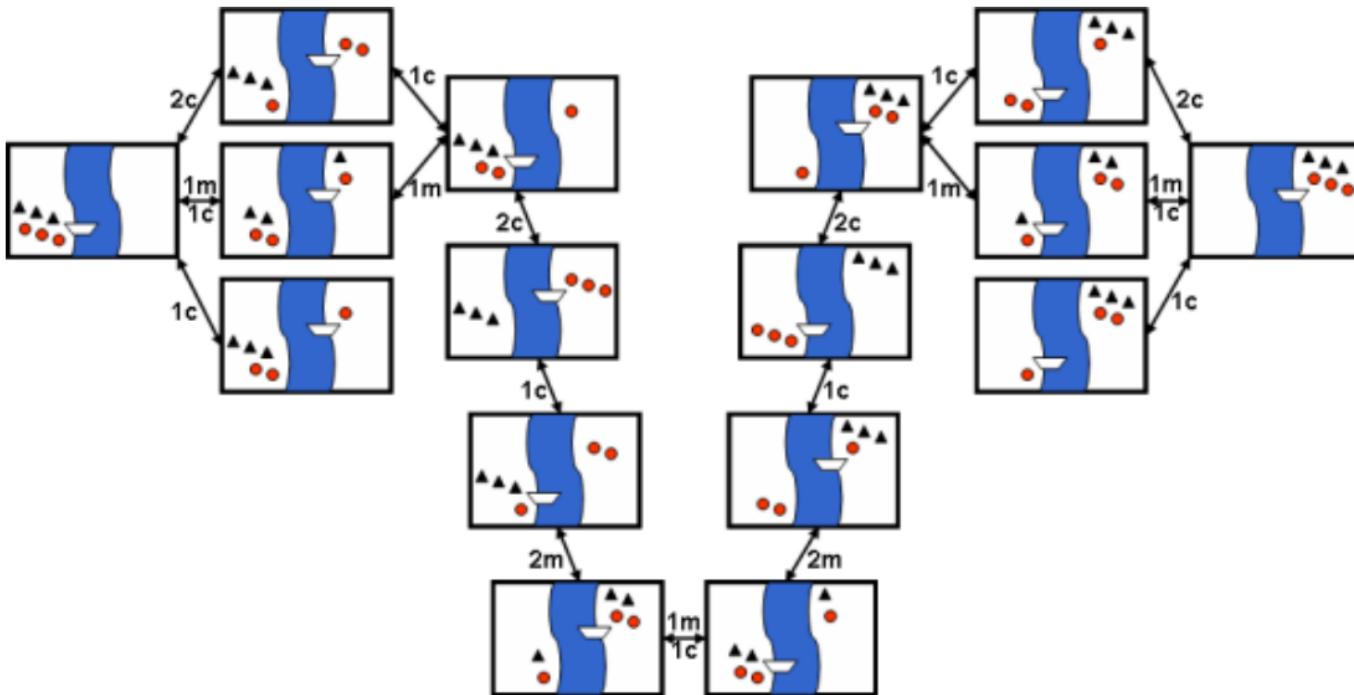


**Time: 15.614**

Three missionaries and three cannibals must cross a river using a boat which can carry at most two people, under the constraint that, for both banks, if there are missionaries present on the bank, they cannot be outnumbered by cannibals (if they were, the cannibals would eat the missionaries). The boat cannot cross the river by itself with no people on board



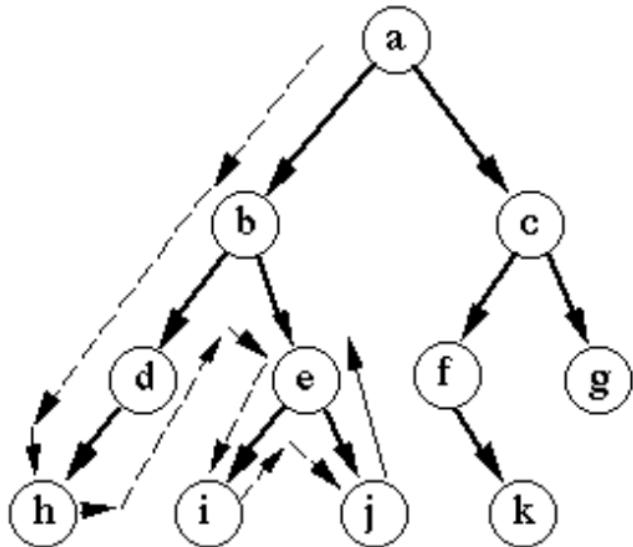
# Search Tree for M & C



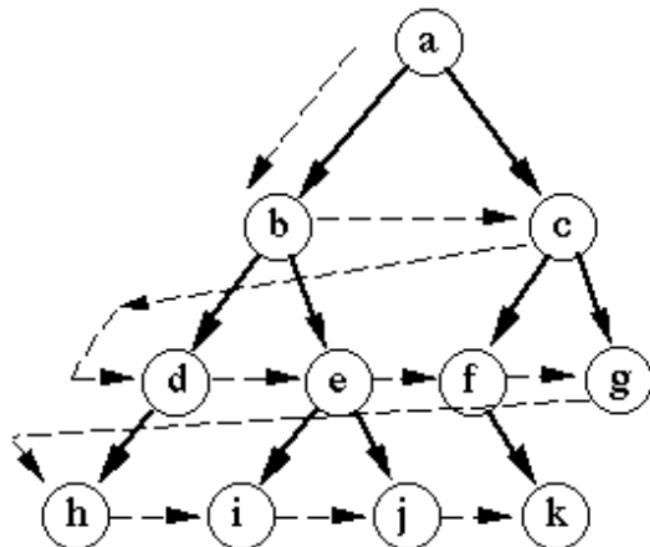
# **The Basic Brute force Search Strategies**

## **Breadth-first [BFS] and Depth-first [DFS]**

# Depth first vs. Breadth first search

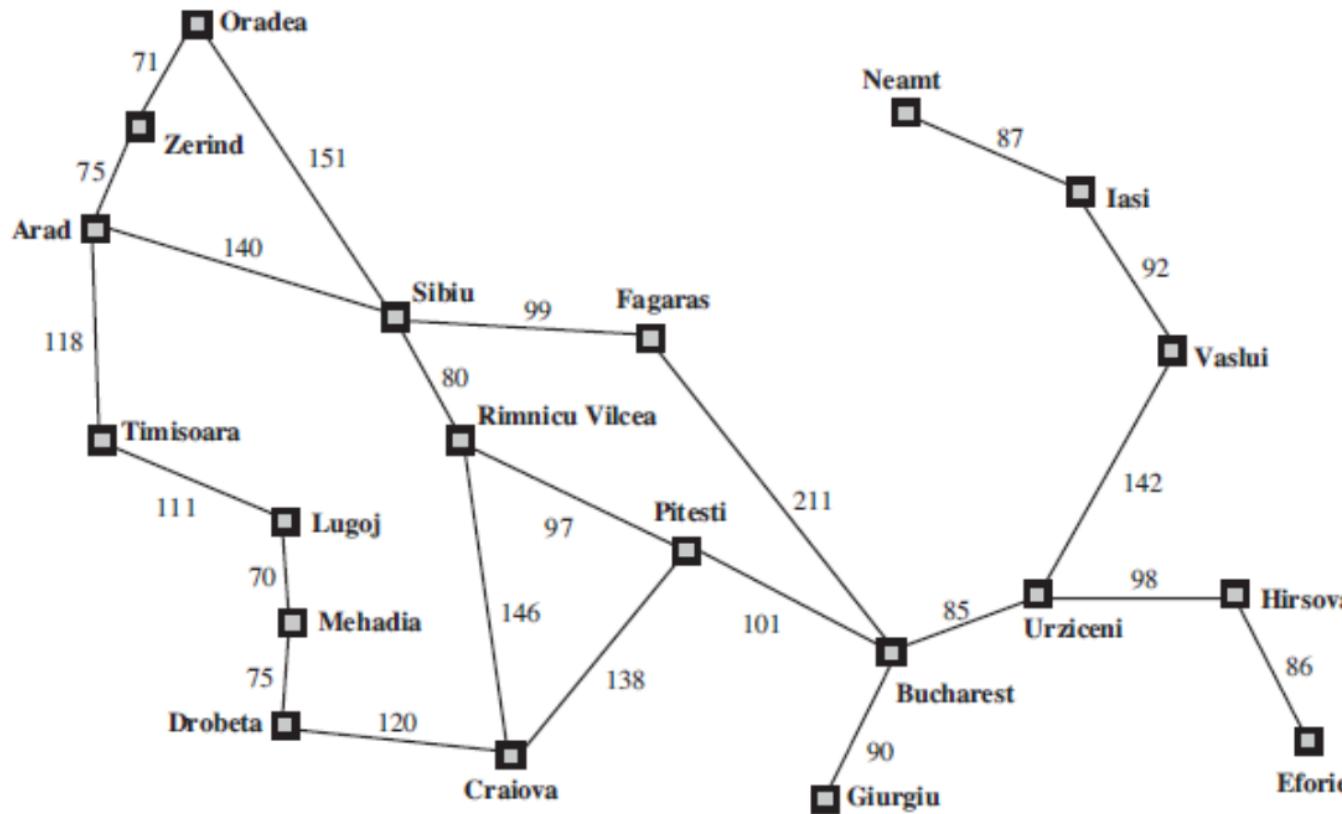


Depth-first search

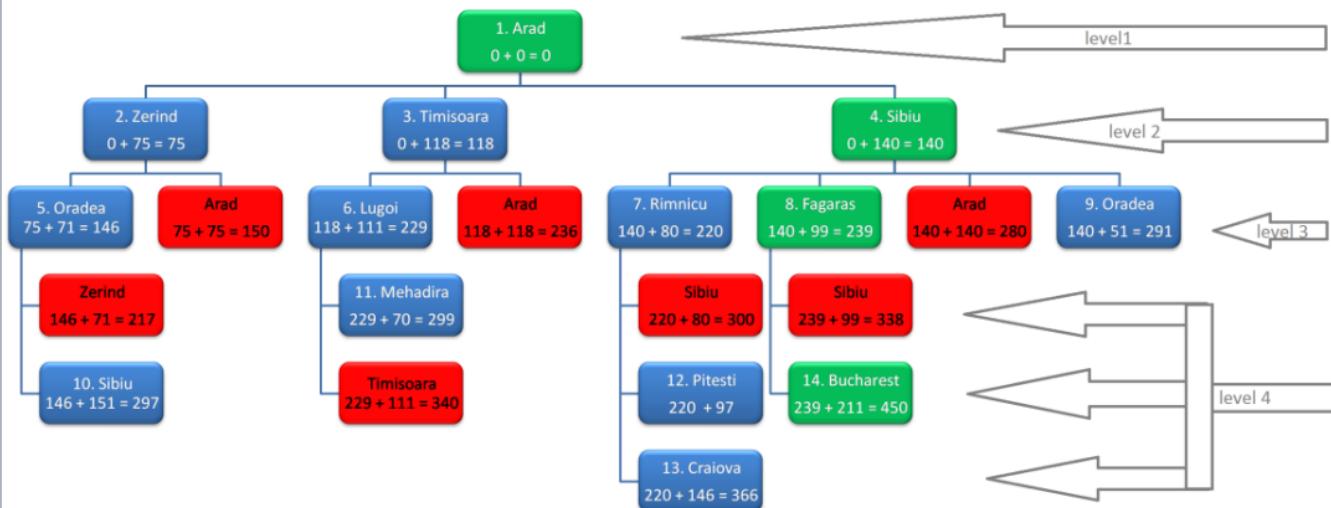


Breadth-first search

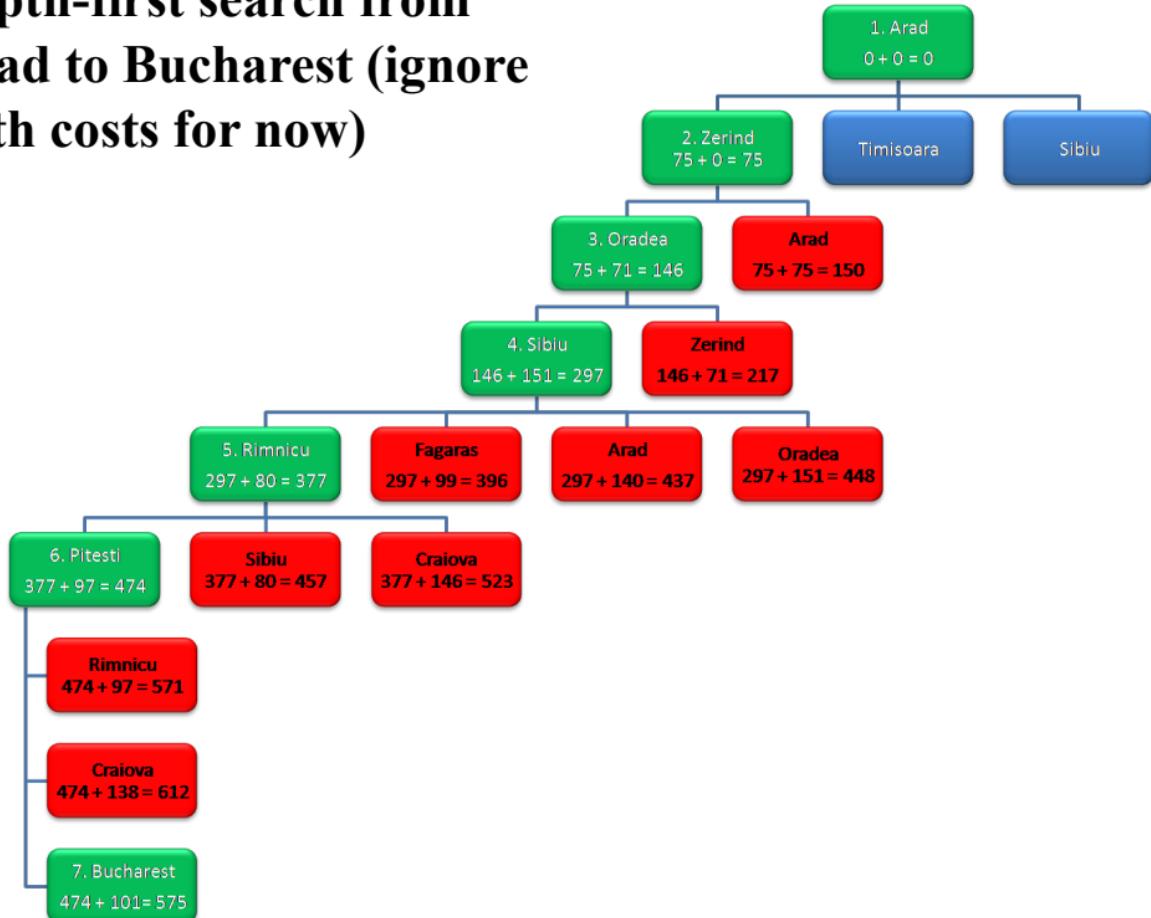
# Path finding example (Arad to Bucharest)



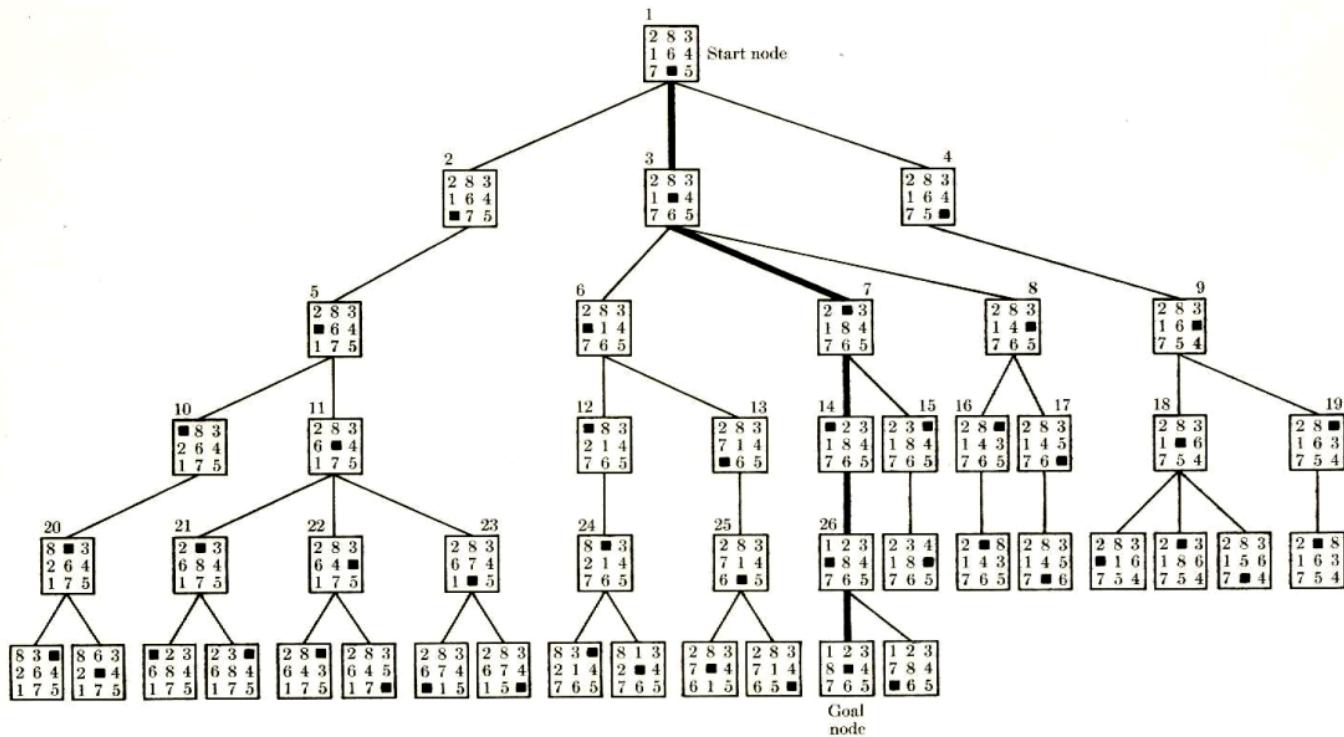
**Breadth-first search from Arad to Bucharest (ignore path costs gives us Arad – Sibiu – Fagaras - Bucharest)**



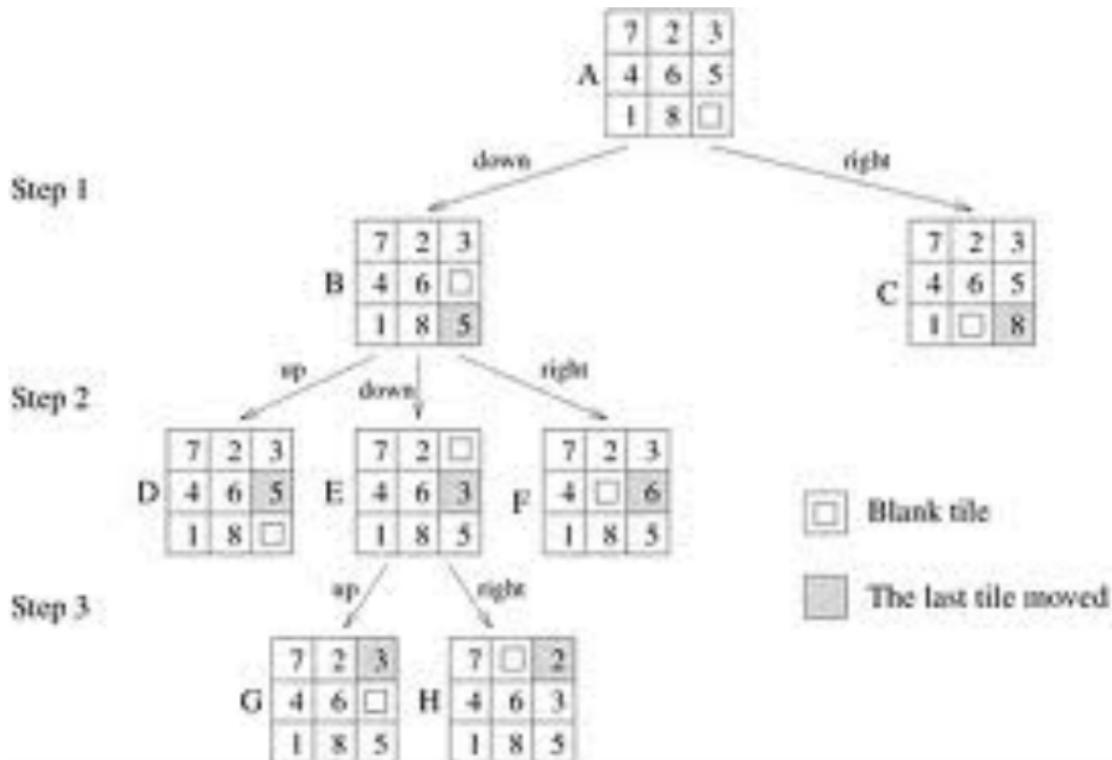
# Depth-first search from Arad to Bucharest (ignore path costs for now)



# Breadth-first search on eight puzzle



# Depth-first search on eight-puzzle



# **In Class Activity**

## Breadth first search (Oradea - Giurgiu)

Assumption: Left most node is chosen for expansion first.

D<sub>0</sub>: Oradea

D<sub>1</sub>: Oradea

D<sub>2</sub>:

Oradea

Zerind Sibiu

Zerind Sibiu

Arad Rimnicu Fagaras  
Vilcea

D<sub>3</sub>:

Oradea

Zerind

Sibiu

Arad

Rimnicu

Vilcea

Fagaras

Bucharest

D<sub>4</sub>:

Oradea

Zerind

Sibiu

Arad

Rimnicu

Fagaras

Vilcea

Bucharest

Timis

gora

Gra

o

pitesti

Buc

arest

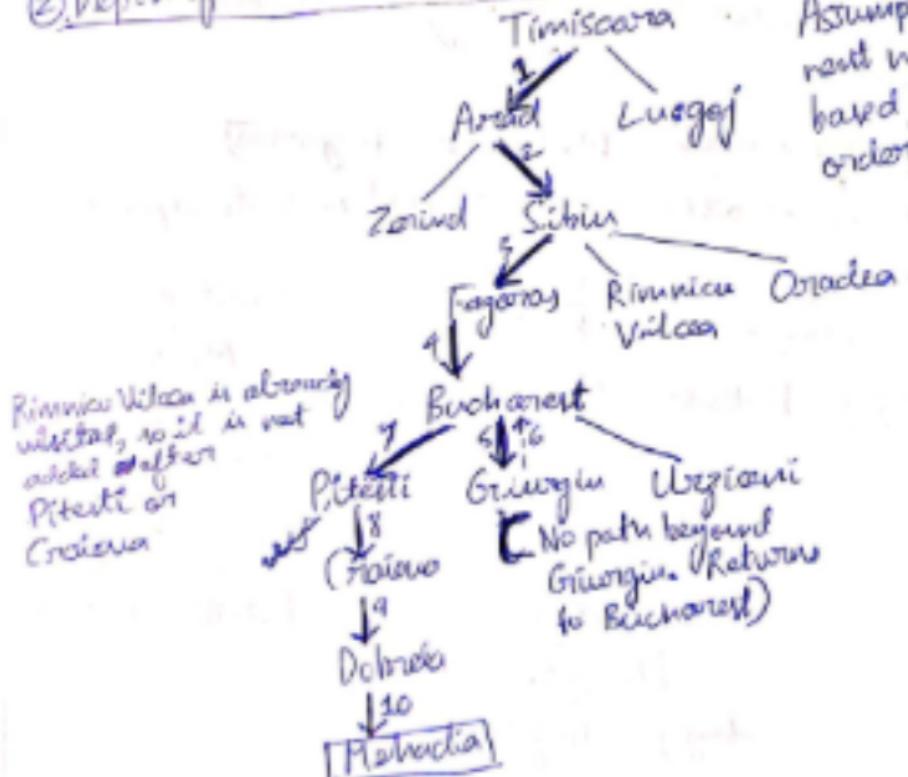
Lugoj

Debrata

Giurgiu

Uzicani

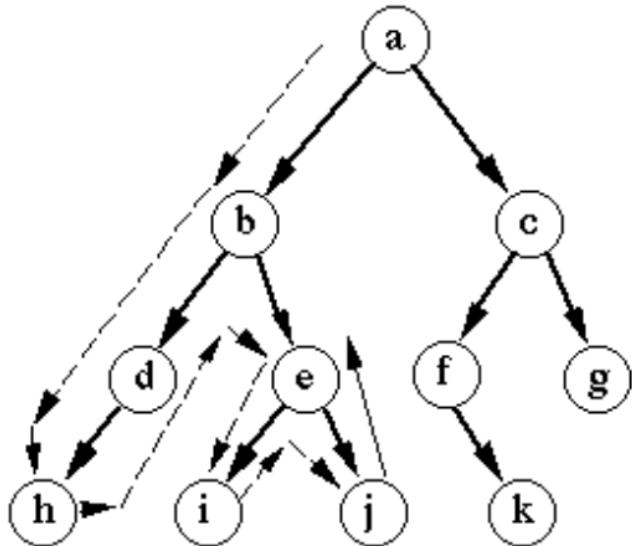
## ② Depth first search (Timisoara, Mehadia)



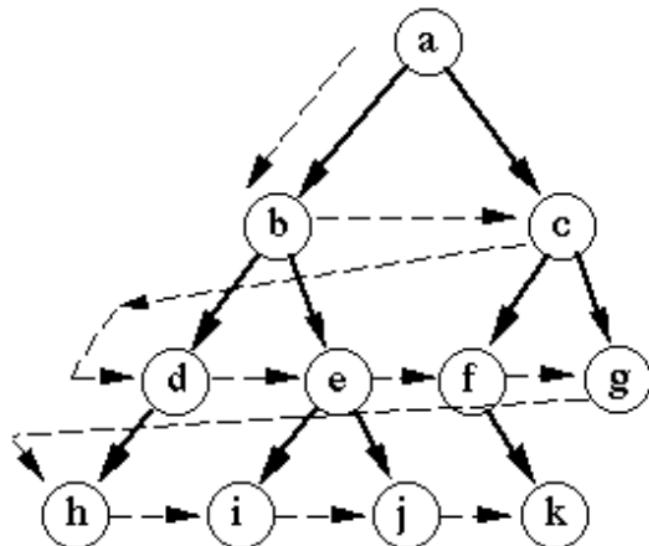
Assumption: Choose the next node for expansion based on alphabetical order.

# **Evaluating Search Strategies**

# Depth first vs. Breadth first search



Depth-first search



Breadth-first search

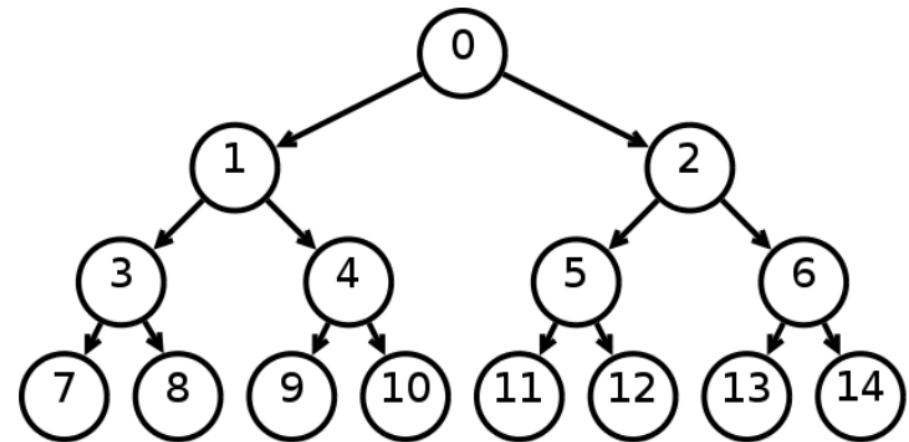
# How many nodes in tree with branching factor(b) = 2?

$d = 0$ ; 1 node (20)

$d = 1$ ; 2 nodes (21)

$d = 2$ ; 4 nodes (22)

$d = 3$ ; 8 nodes (23)



Total nodes  $- 20 + 21 + 22 + \dots 2d = 2d$  where  $d$  = solution depth

If  $b$  = branching factor, then  $bd$  (the full tree)

# **Improved Search Strategies**

# Depth Limited Search

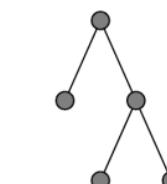
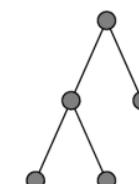
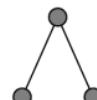
Limit = 0



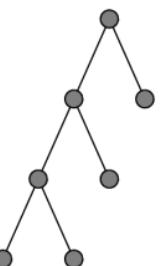
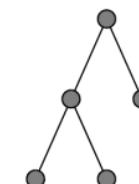
Limit = 1



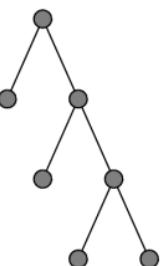
Limit = 2



Limit = 3

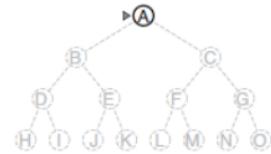
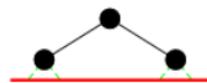
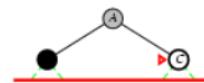
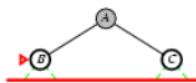


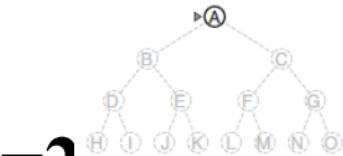
.....



# Iterative deepening search $l=1$

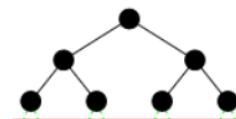
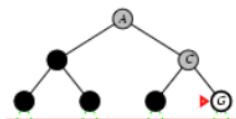
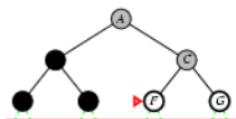
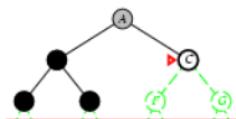
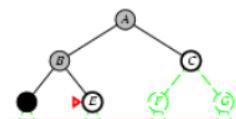
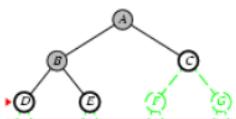
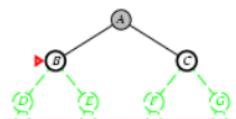
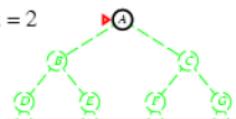
Limit = 1

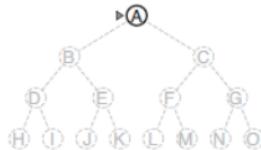




# Iterative deepening search $l=2$

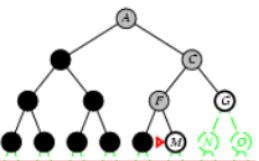
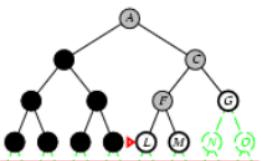
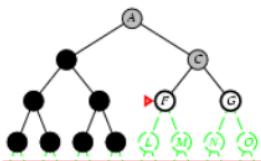
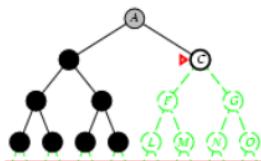
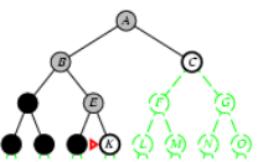
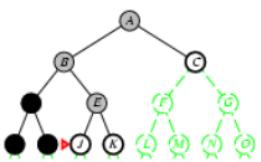
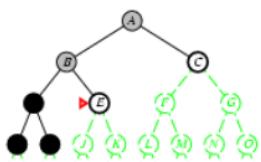
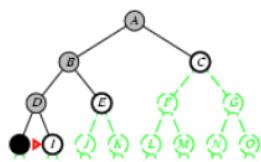
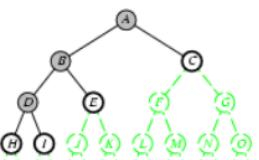
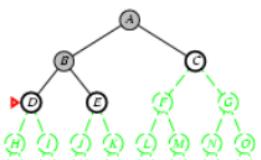
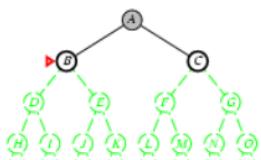
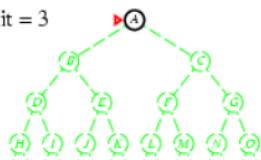
Limit = 2





# Iterative deepening search $l=3$

Limit = 3



# Comparing Search Strategies

Criterion	Breadth-First	Uniform-Cost	Depth-First	Depth-Limited	Iterative Deepening	Bidirectional (if applicable)
Complete?	Yes <sup>a</sup>	Yes <sup>a,c</sup>	No	No	Yes <sup>a</sup>	Yes <sup>a,g</sup>
Optimal?	Yes <sup>b,d</sup>	Yes <sup>b</sup>	No	No	Yes <sup>b,d</sup>	Yes <sup>b,d,g</sup>
Time	$O(b^d)$	$O(b^{1+\lfloor C^*/\epsilon \rfloor})$	$O(b^m)$	$O(b^l)$	$O(b^d)$	$O(b^{d/2})$
Space	$O(b^d)$	$O(b^{1+\lfloor C^*/\epsilon \rfloor})$	$O(bm)$	$O(bl)$	$O(bd)$	$O(b^{d/2})$

$b$  finite branching factor

$d$  depth of solution

$m$  maximum depth of the search tree

$l$  depth limit

$C^*$  optimal solution cost

$\epsilon > 0$  minimal action cost

Footnotes:

<sup>a</sup> if  $b$  is finite

<sup>b</sup> if action costs  $\geq 0$

<sup>c</sup> if action costs  $\geq \epsilon > 0$

<sup>d</sup> if action costs are all identical

<sup>g</sup> if both directions use breadth-first search

# Time and Memory Requirements for BFS

Depth	Nodes	Time	Memory
2	110	1.1 milliseconds	107 kilobytes
4	11,110	111 milliseconds	10.6 megabytes
6	$10^6$	11 seconds	1 gigabytes
8	$10^8$	19 minutes	103 gigabytes
10	$10^{10}$	31 hours	10 terabytes
12	$10^{12}$	129 days	1 petabytes
14	$10^{14}$	35 years	99 petabytes
16	$10^{16}$	3,500 years	10 exabytes

**Figure 3.13** Time and memory requirements for breadth-first search. The numbers shown assume branching factor  $b = 10$ ; 100,000 nodes/second; 1000 bytes/node.

# Animations

- <https://qiao.github.io/PathFinding.js/visual/>

# Review

