

# **EECS 391**

# **Intro to AI**

## **Problem Solving by Search**

L3:Thu, Sep 7, 2017

# Outline

- Problem solving agents
- Defining problem spaces
- Search algorithms
  - types
  - implementation
  - characterizing
- Uniformed search strategies
  - breath-first search
  - depth-first search
  - iterative deepening
  - bi-directional search

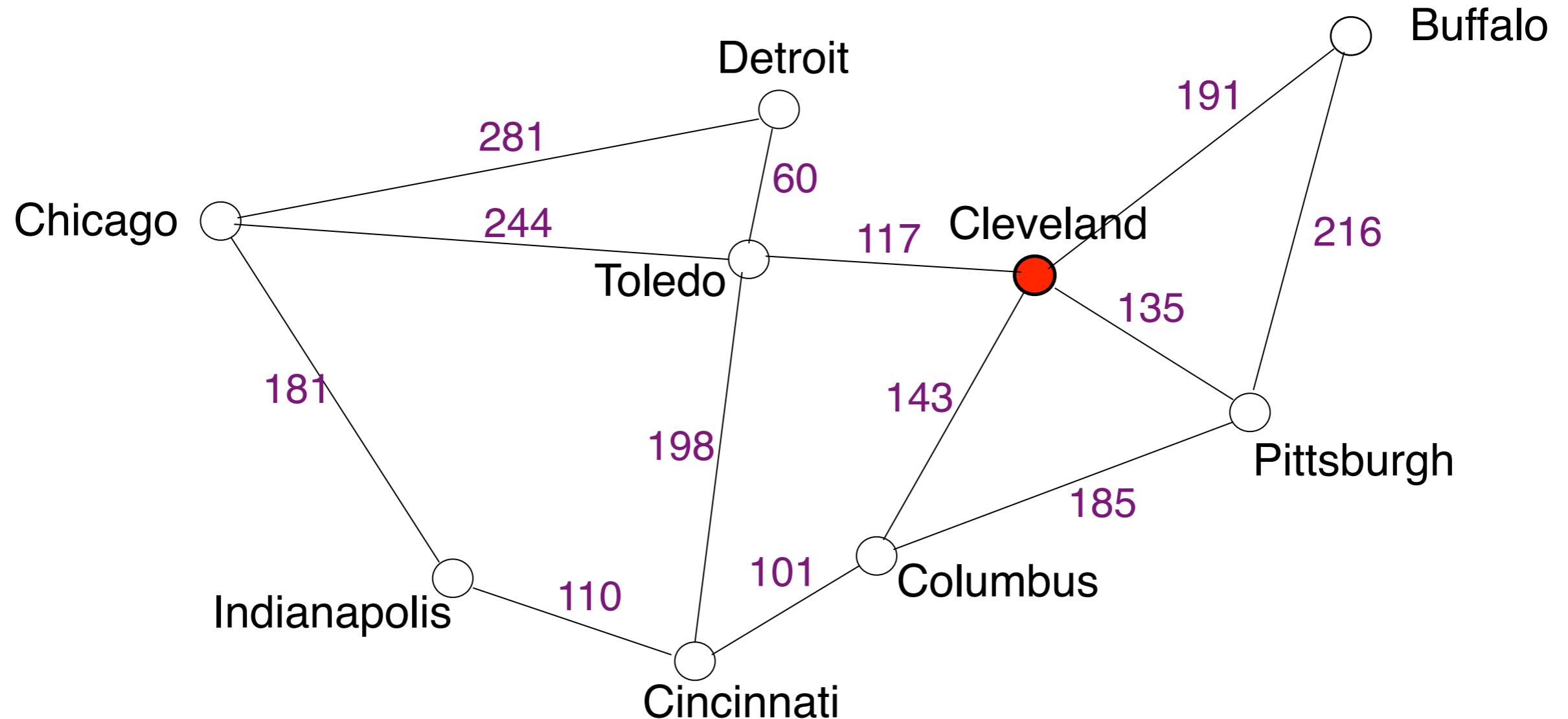
# Problem solving by search: problem space and goal

- problem solving by search:
  - **define a problem space** in which we can find the solution
- **goal** of search:
  - find the **state** representing the (or a) **solution**
- **uninformed** search:
  - only given the problem definition
  - **no a priori knowledge** of where to look for the solution

# How do we define the problem space?

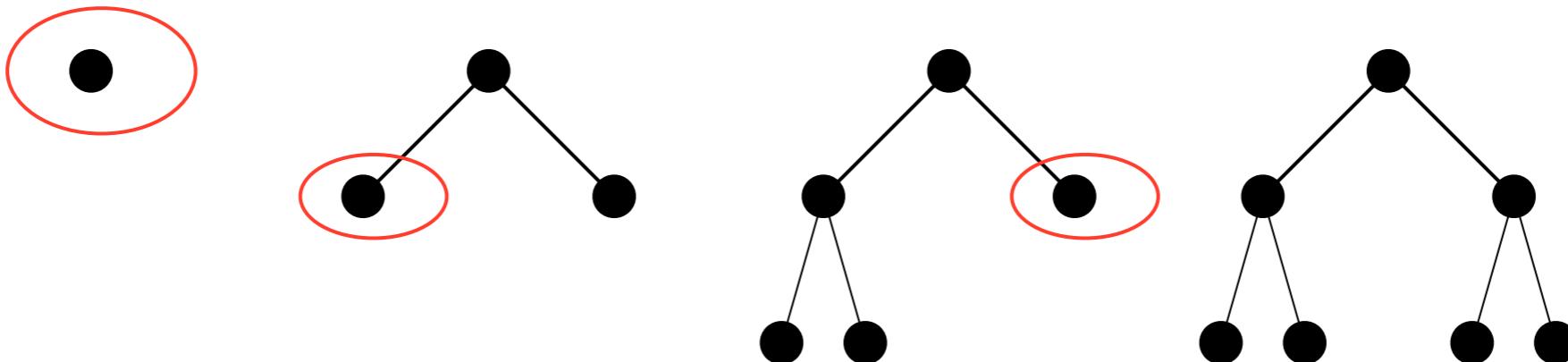
- Problem: *How do we get to Cincinnati?*
  - by plane?
  - by car?
  - by bike?
- Need to define:
  1. **initial state**
  2. **available actions**
  3. **goal test**
  4. action **cost** (which we'll address next lecture)

# Representing the problem space with a graph



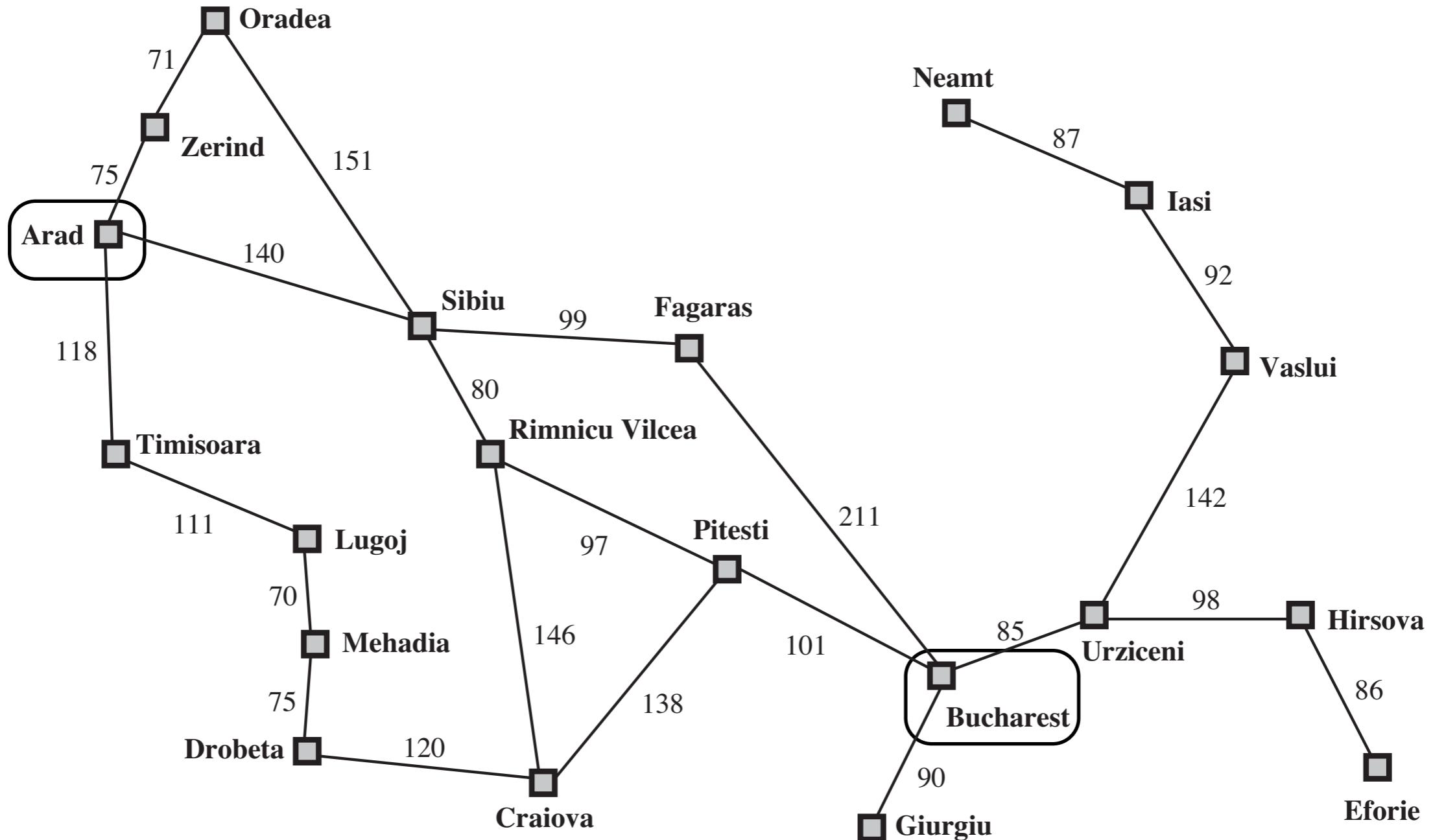
# Breadth-first search

```
function BREADTH-FIRST-SEARCH (problem) returns a solution or failure
  return GENERAL-SEARCH (problem, ENQUEUE-AT-END)
```



- Type type of search is determined by how the *fringe* is expanded
- breadth-first search is implemented using a first-in first-out (FIFO) queue
  - all new nodes go at end of queue
  - shallow nodes are expanded before deeper nodes

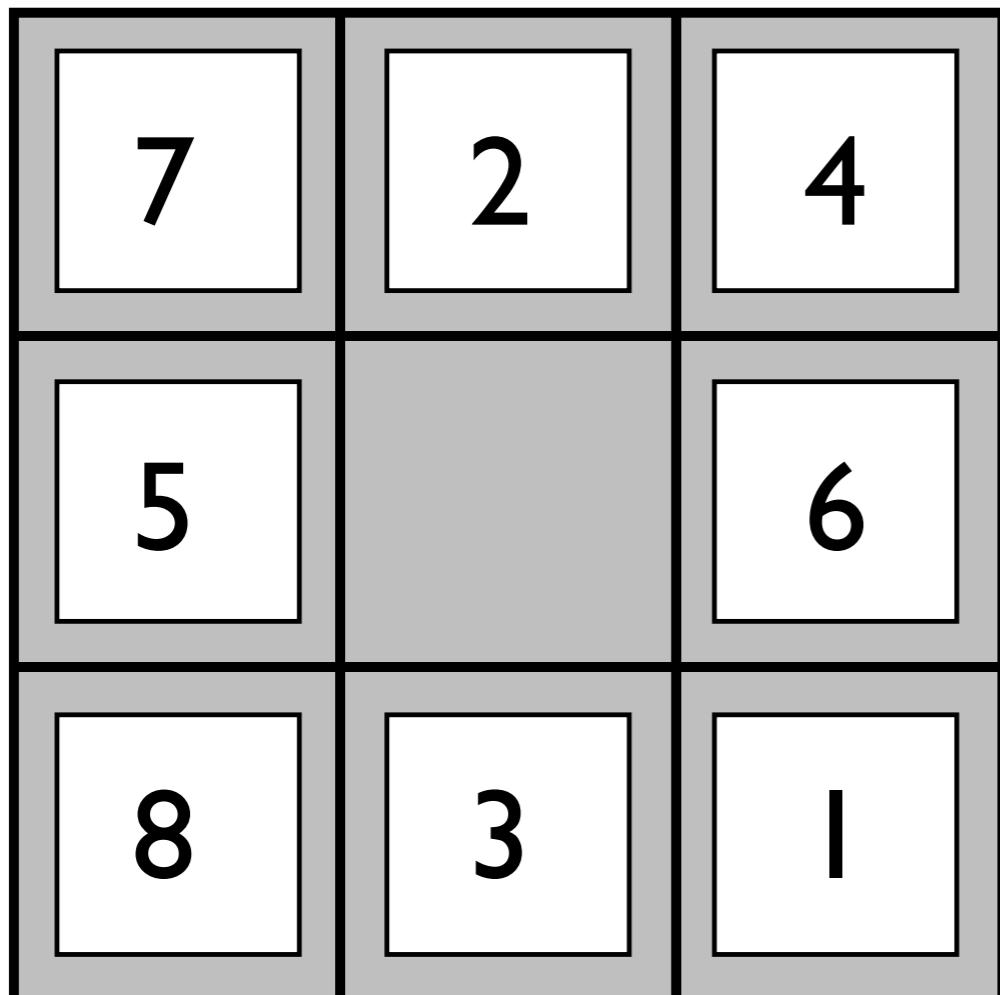
# BFS on Romanian road map example



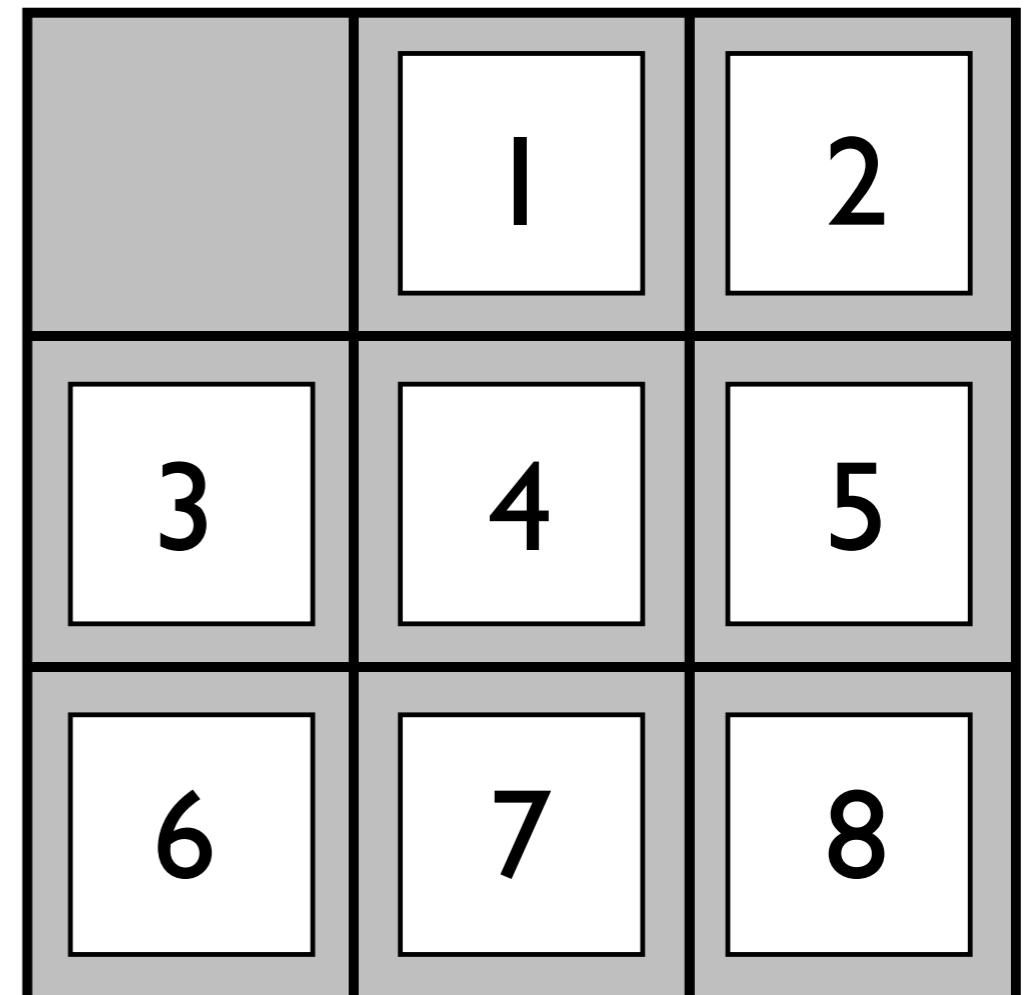
In absence of knowledge, node expansion order is arbitrary, i.e. alphabetical.  
(Example on board)

# The 8-puzzle (a sliding block puzzle)

start state



goal state



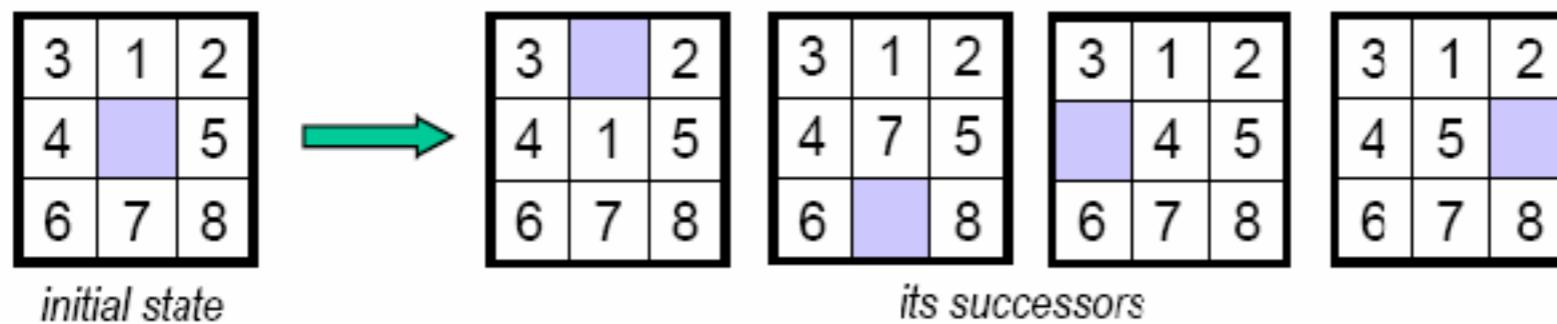
general class is NP-complete

*How do we define the problem space?*

state space, actions, and goal

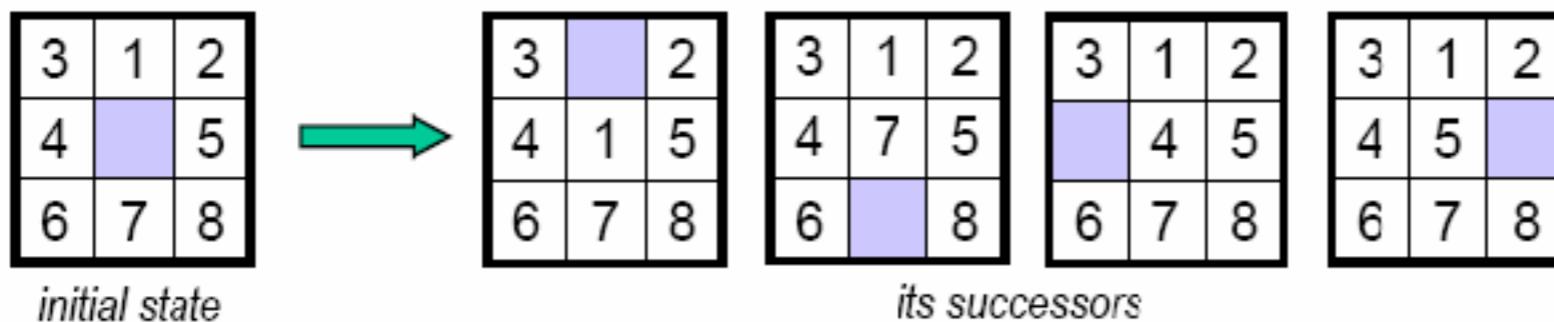
# State-space search

- Each successor defines different moves possible from the current puzzle state

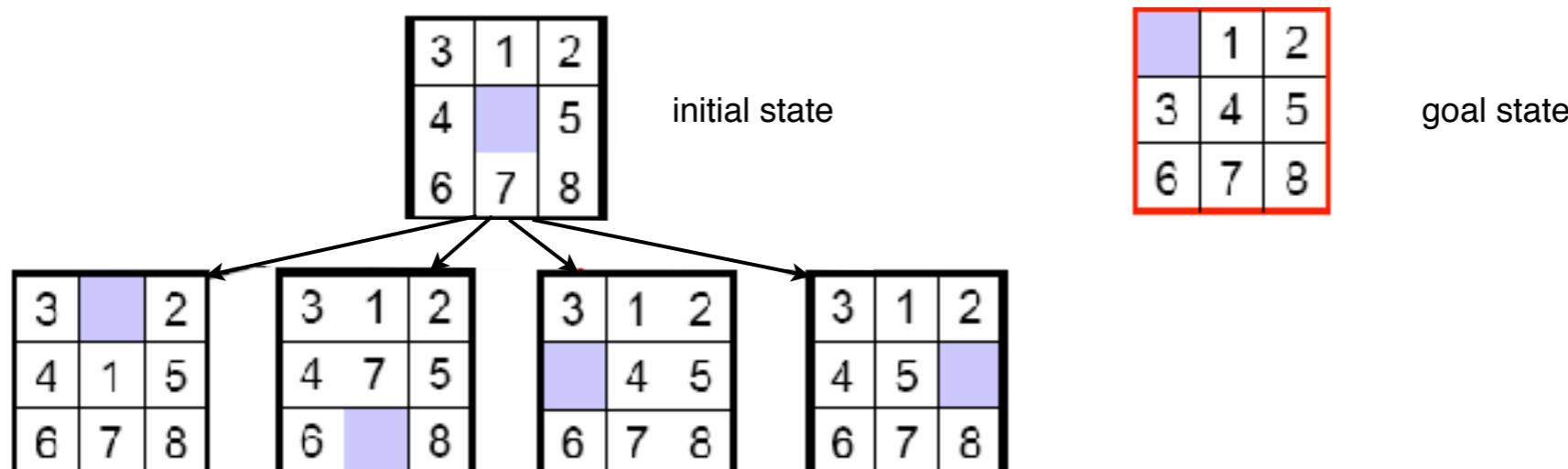


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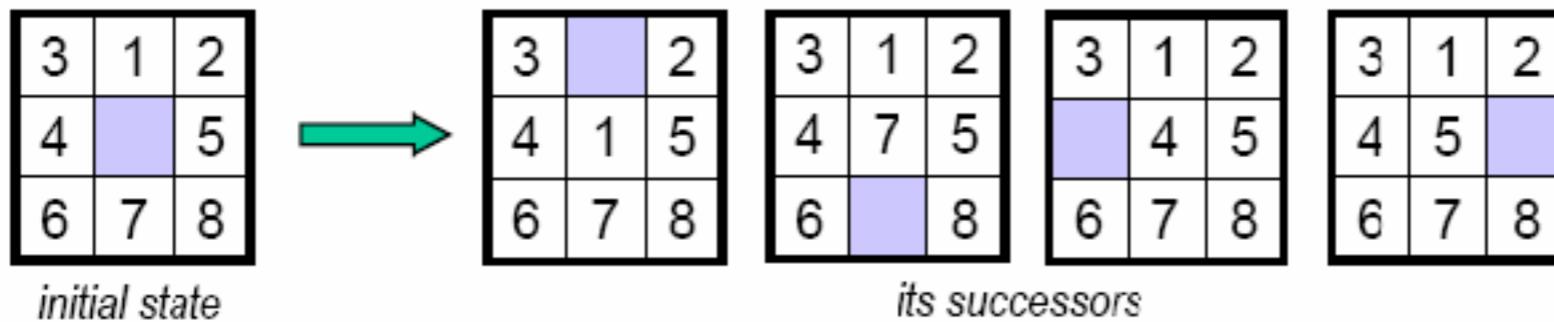


- We can employ different *search strategies* to find the goal state

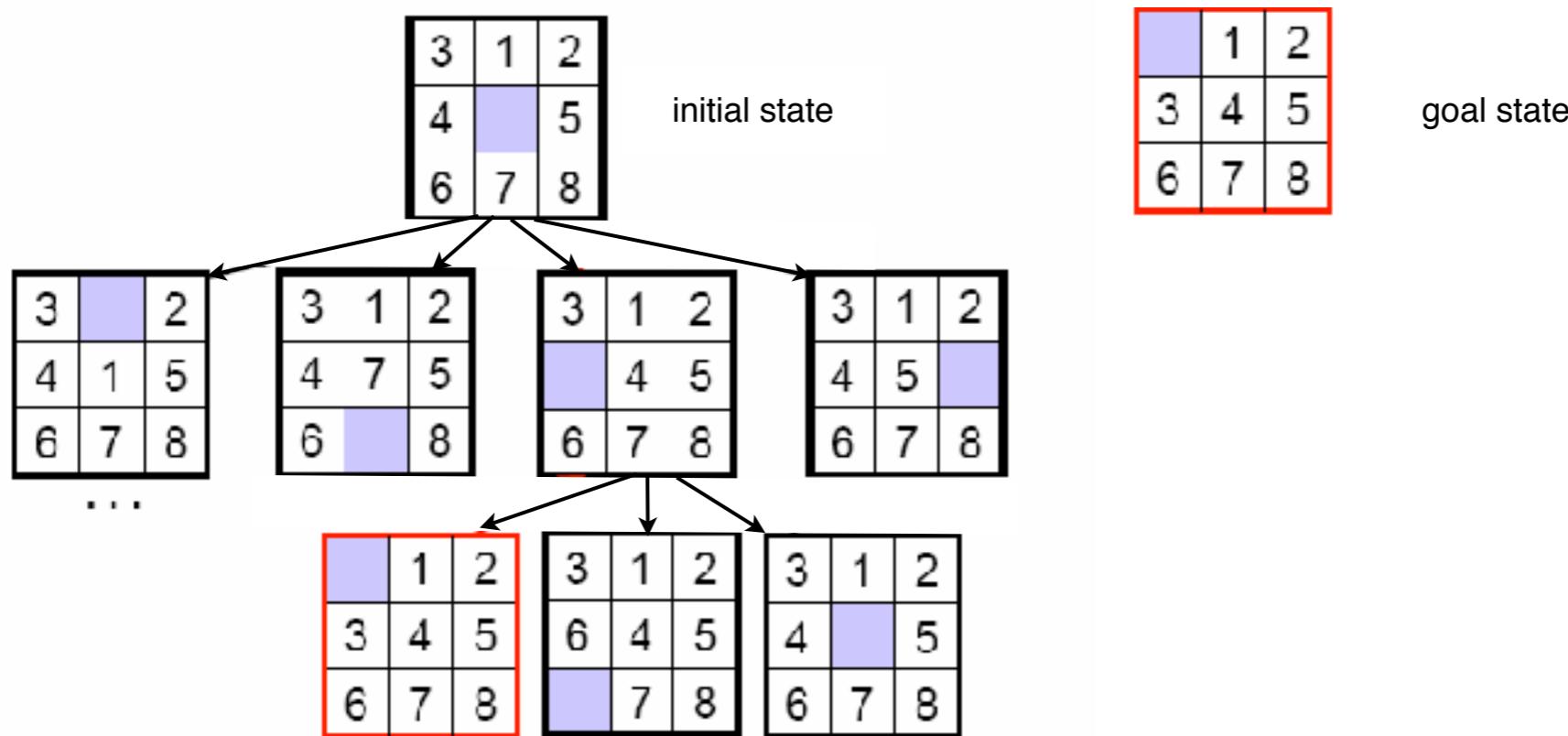


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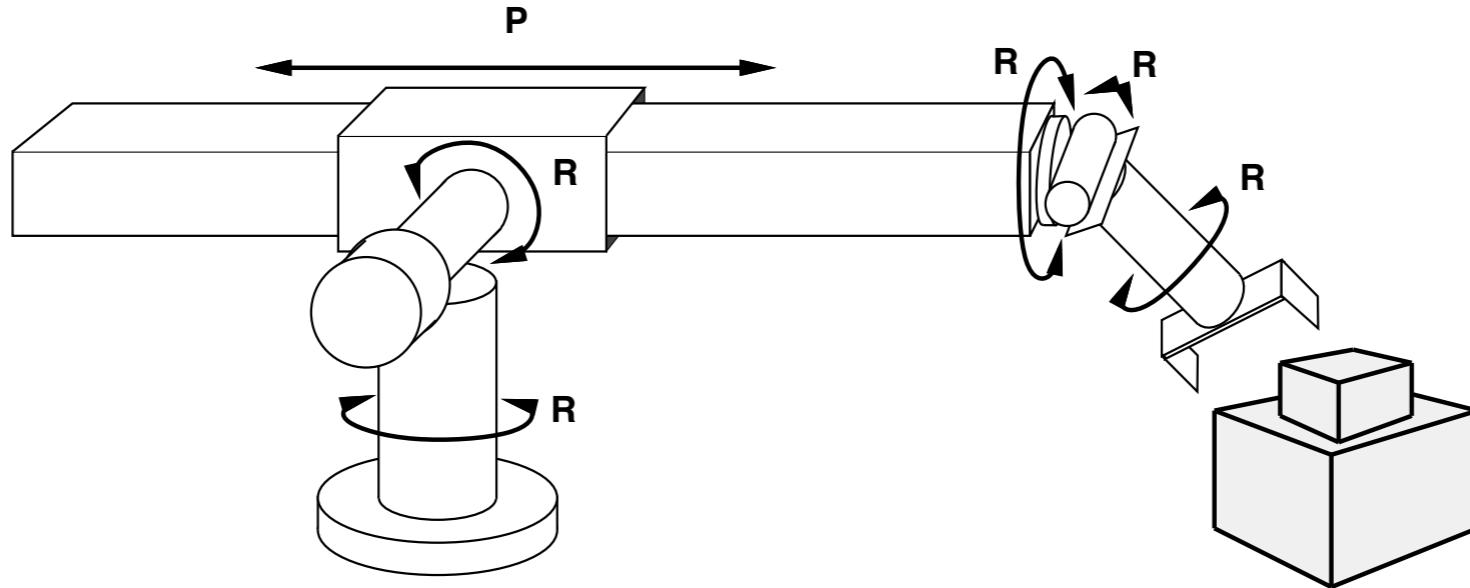
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# Robotic arm



1. initial state?

Angles and coordinations of joints.  
Object shape and position

2. available actions?

motion actions of robot arms and  
manipulators

3. goal?

grasp/place/sort object

4. action cost?

time, accuracy

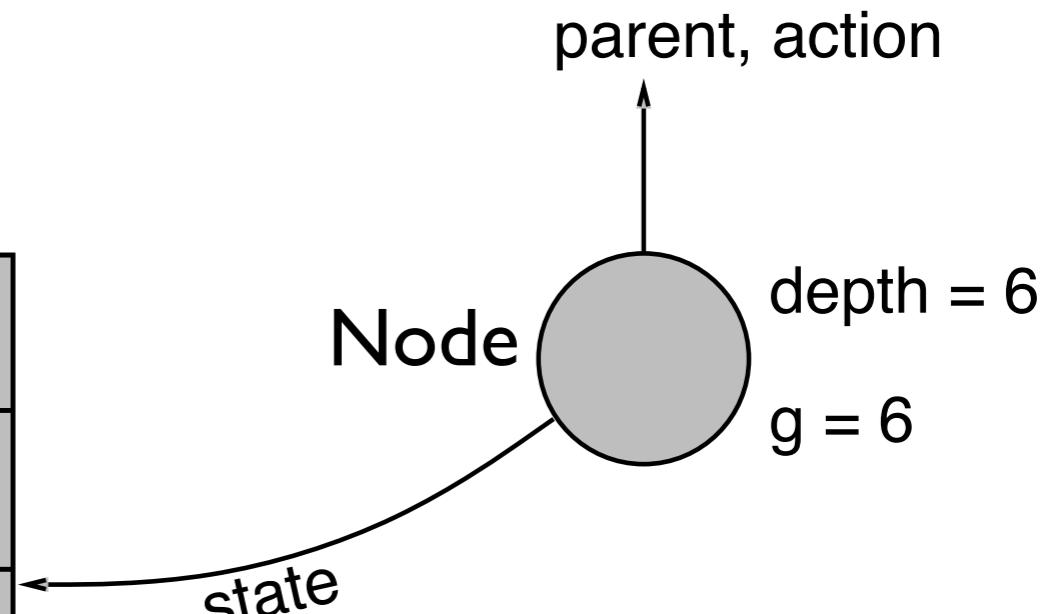
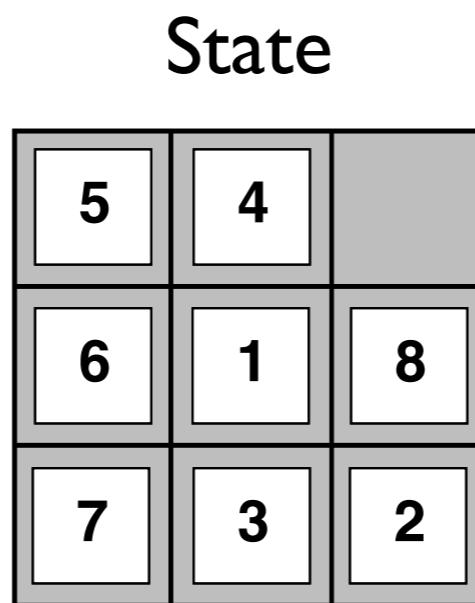
# Other types of problems

- puzzles, e.g. Rubik's cube  $\sim 10^{19}$  states!
- google maps, GPS navigators
- internet spidering
- decoding
- routing (paths, vehicles, salesman)
- scheduling (meetings, conferences, airlines)
- design (electric grid, VLSI layout)
- protein folding

# Implementing search

- state is the representation of the environment (e.g. city, or board position)
- graph nodes are created during search, could be infinite
- need to recognize
  - goal state
  - repeated states

- The **node** data type:
  - state
  - parent node
  - action
  - cost
  - depth



# Generic search function outline

**function** Tree-Search(*problem*, *strategy*) **returns** solution or failure

  initialize tree using initial state of *problem*

**loop**

**if** no candidates for expansion **return** failure

    choose leaf node for expansion using *strategy*

**if** node contains goal state **return** solution

**else** expand node and add resulting nodes to search tree

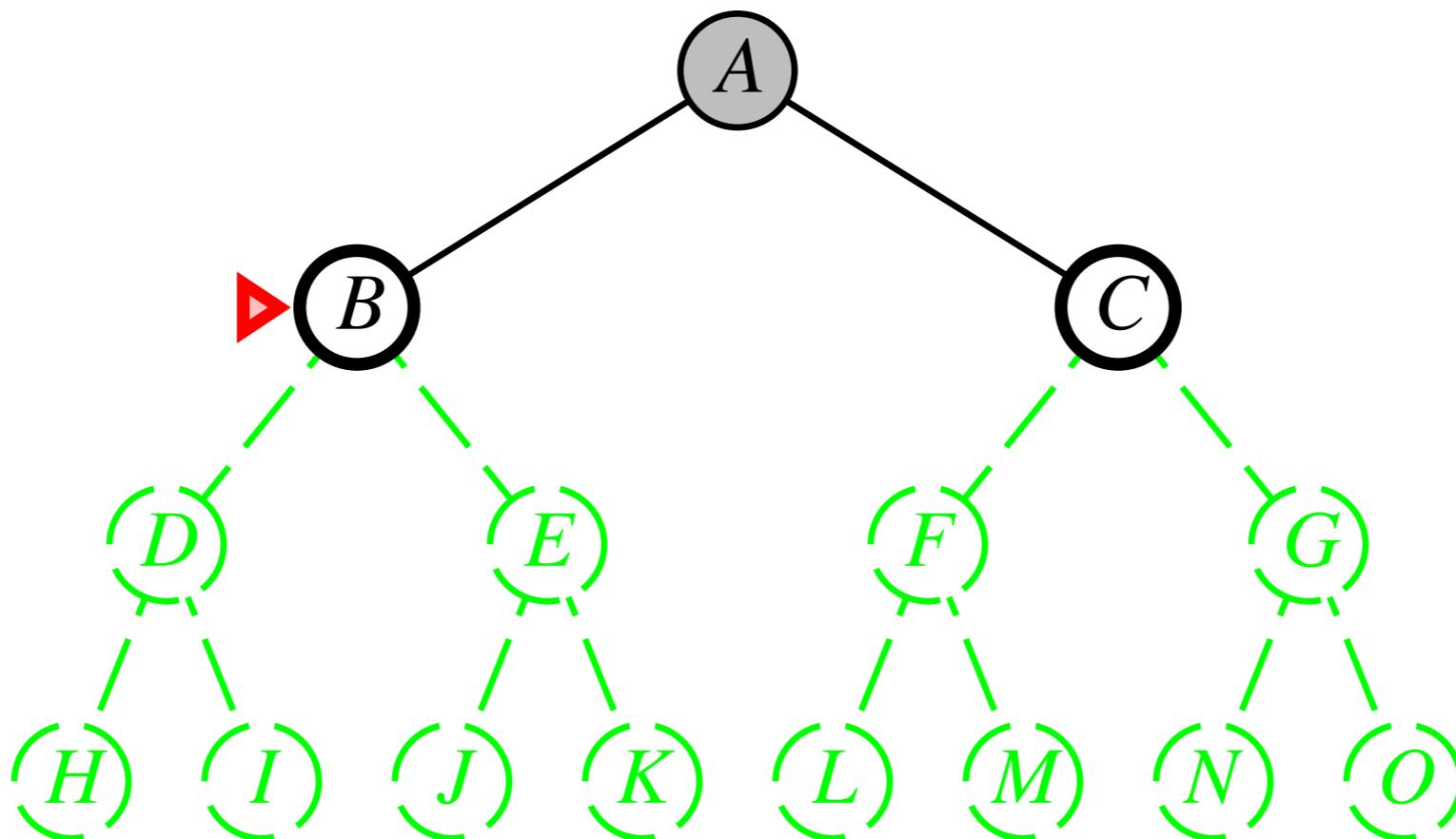
- How do we specify the *problem*?
- What *strategies* are there? How do we implement them?

# Uninformed search strategies

- Uninformed search strategies can only distinguish goal states from non-goal states, i.e. you can't tell when you're getting closing
- Types of uninformed search strategies:
  - Breadth-first search
  - Depth-first search
  - Depth-limited search
  - Iterative deepening search
  - Bi-directional search

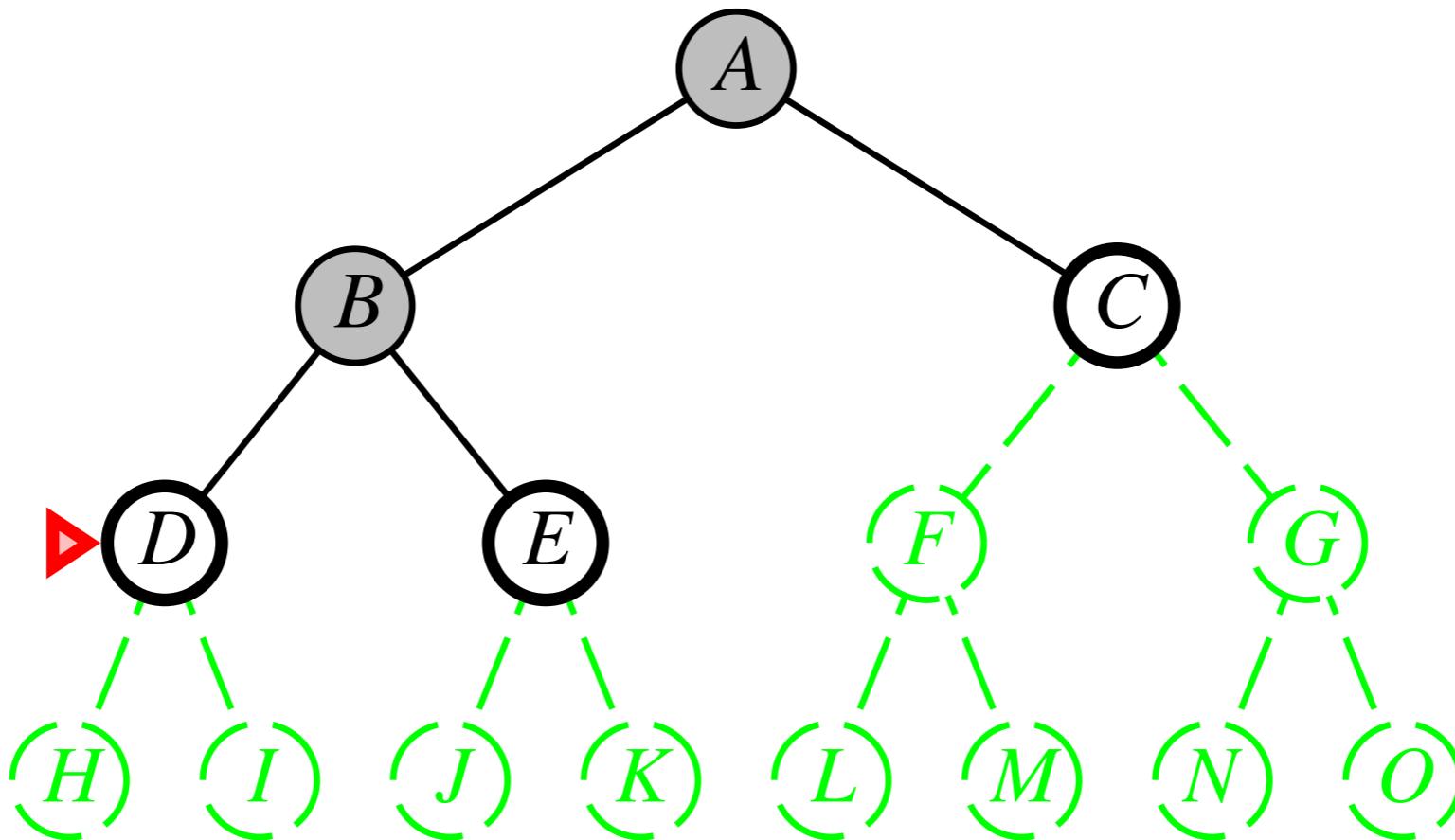
## Depth-first search

- expand *deepest unexpanded node*
- when expanding the fringe, the successors are put on the front (LIFO)



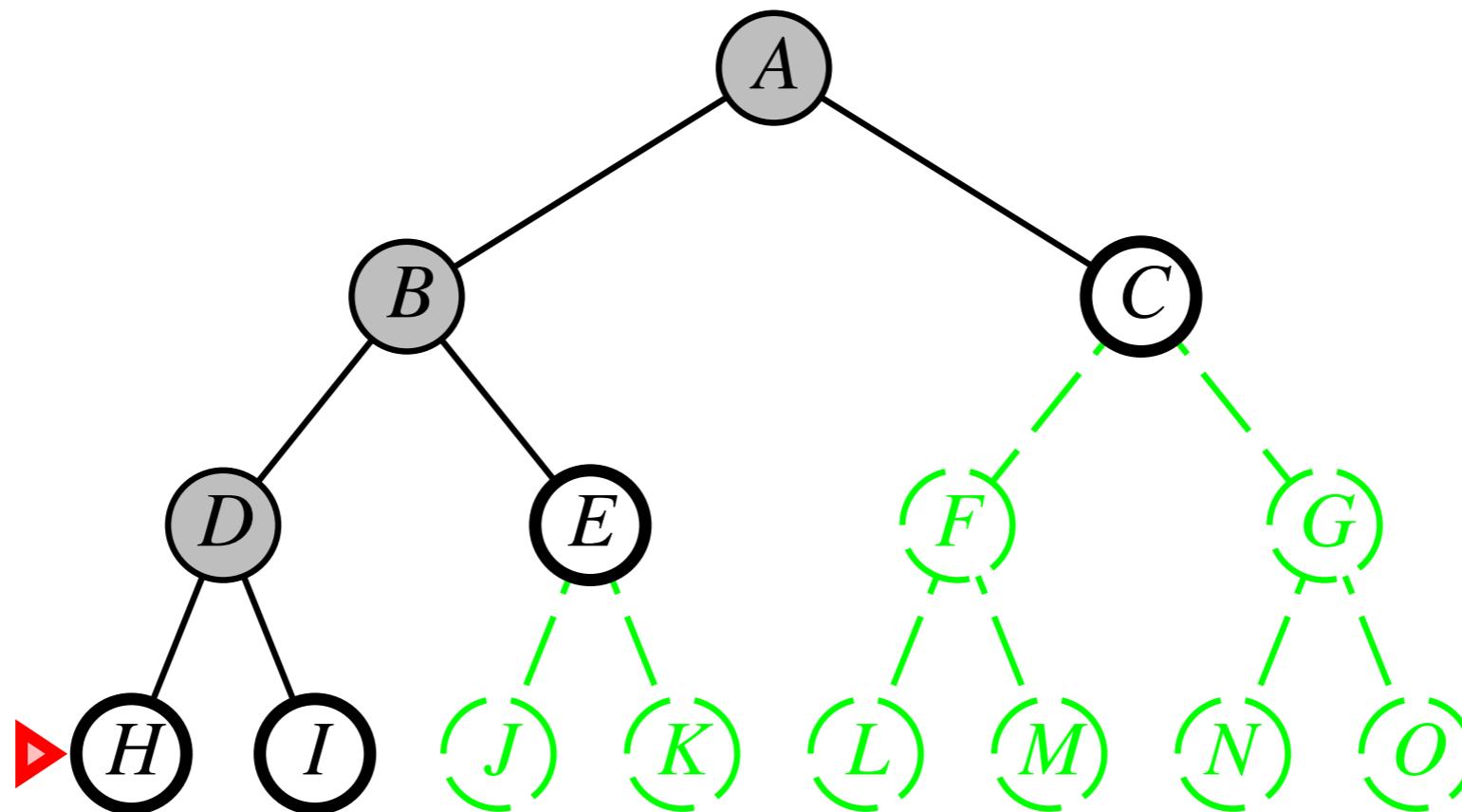
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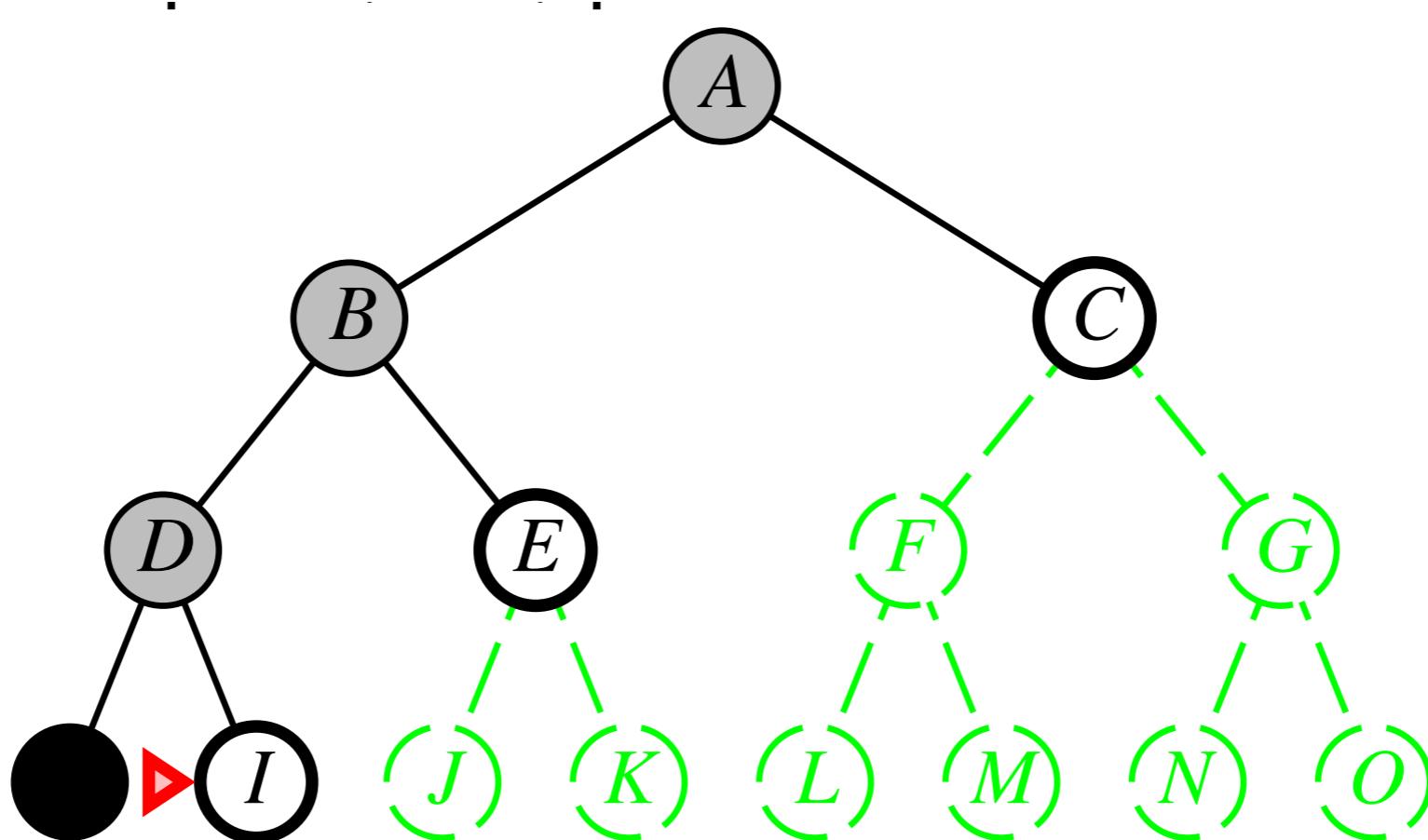
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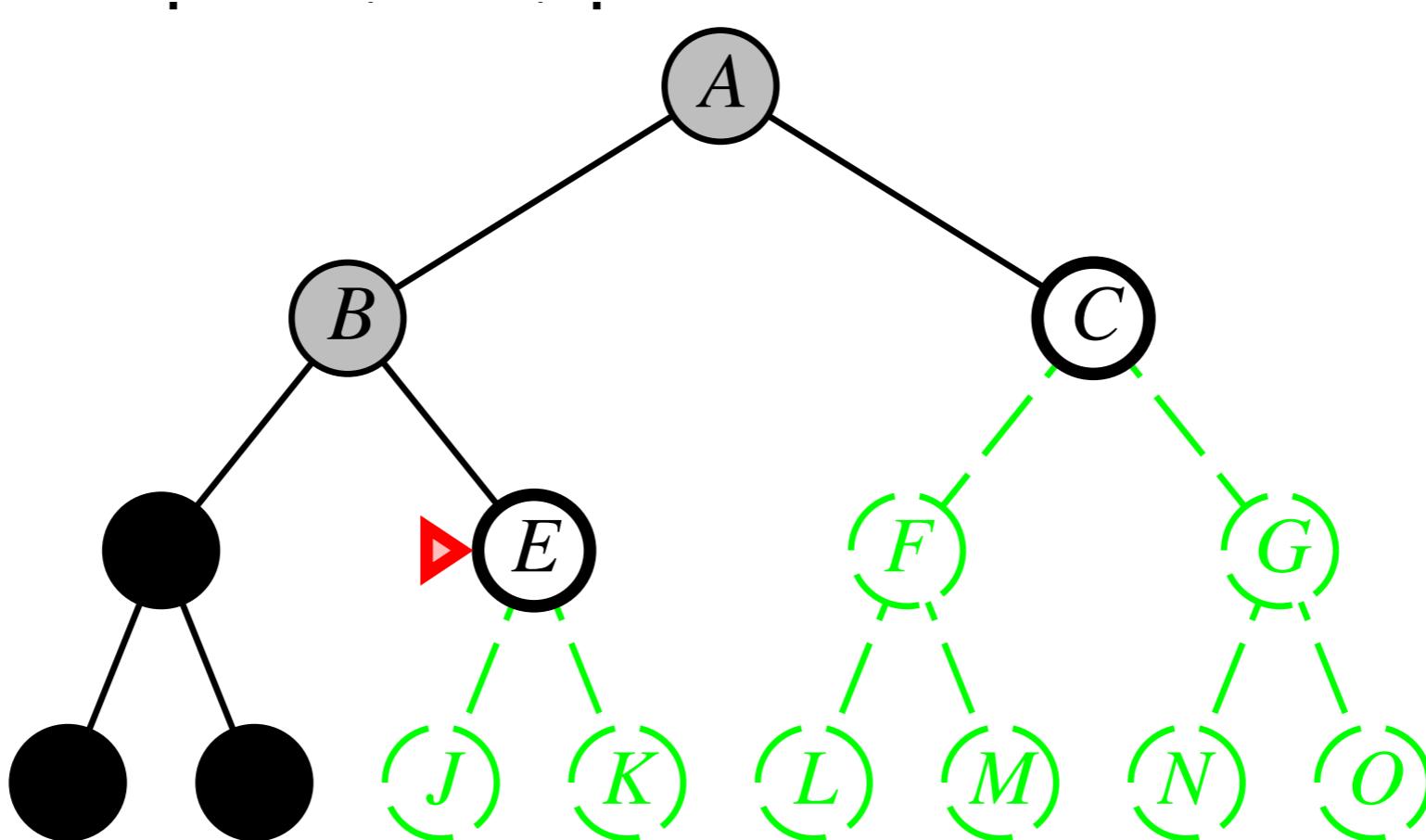
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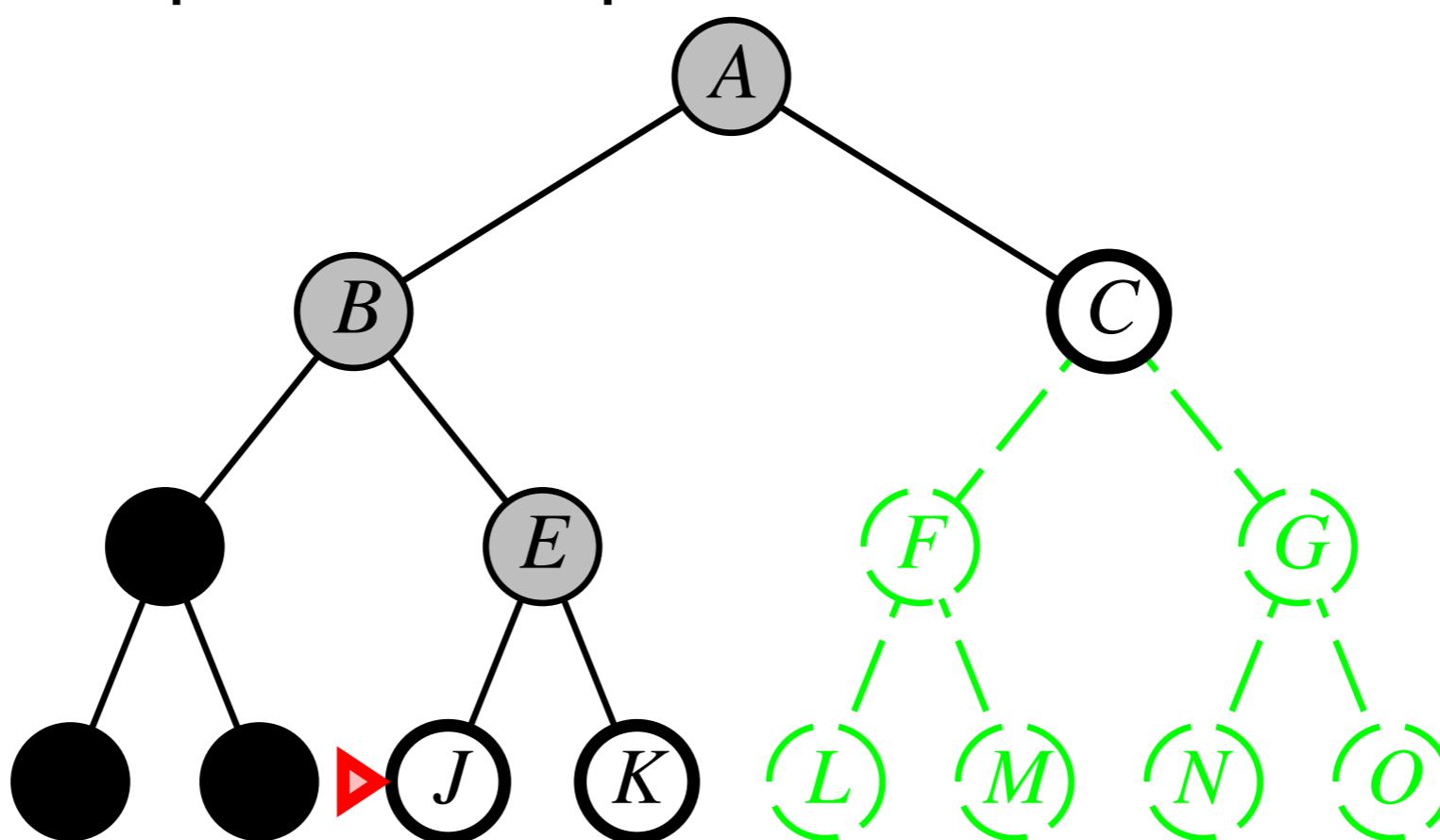
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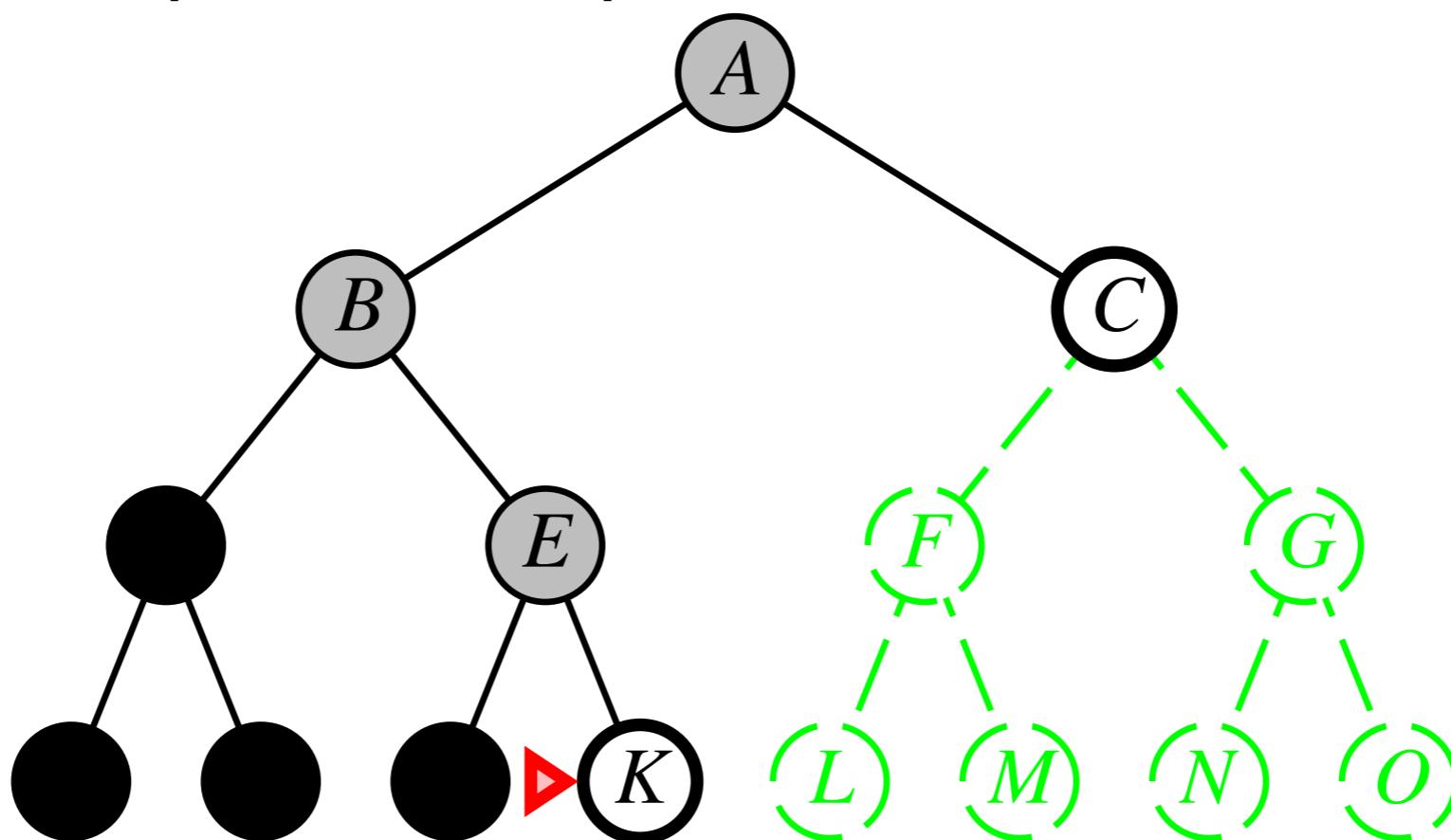
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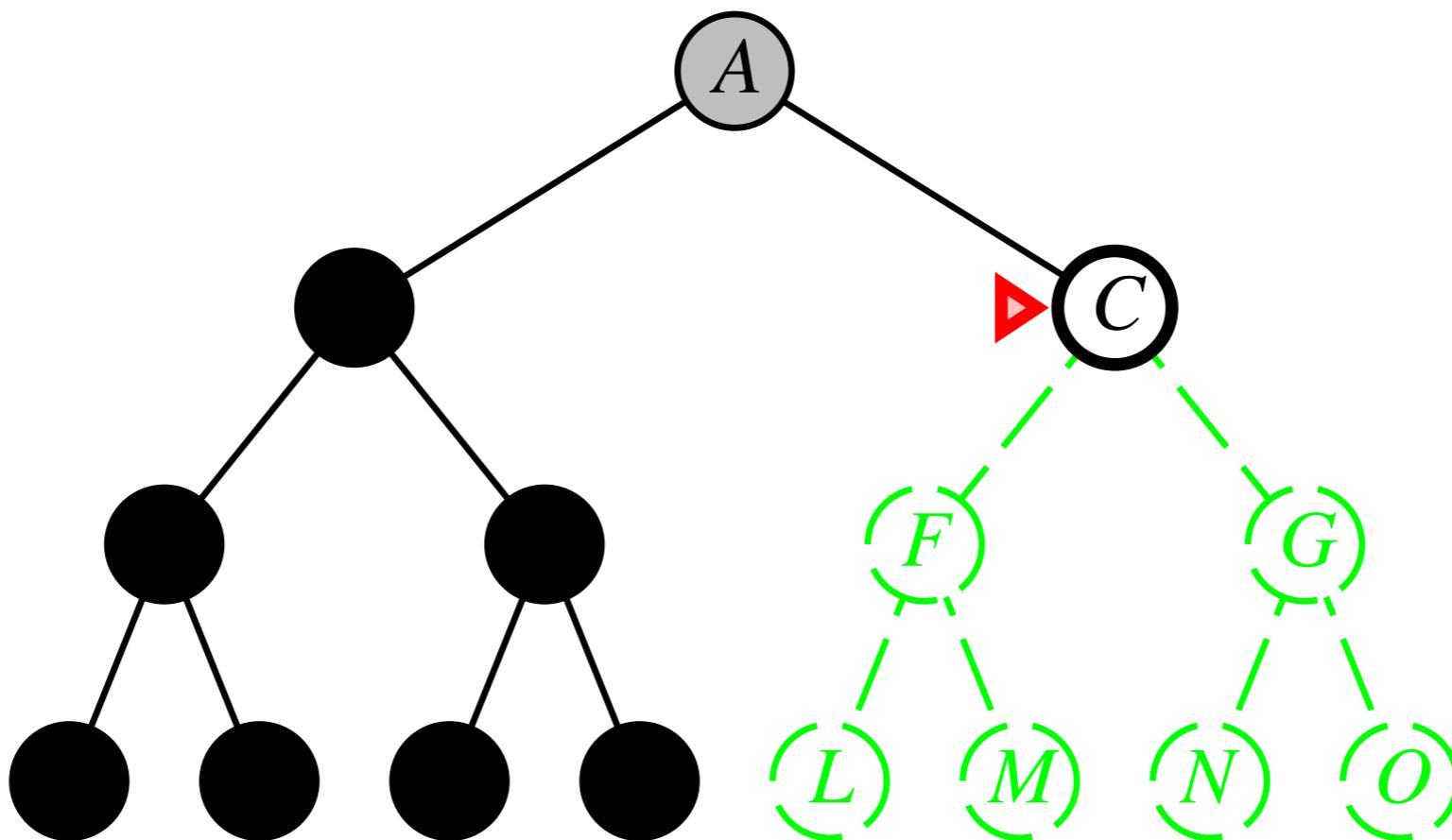
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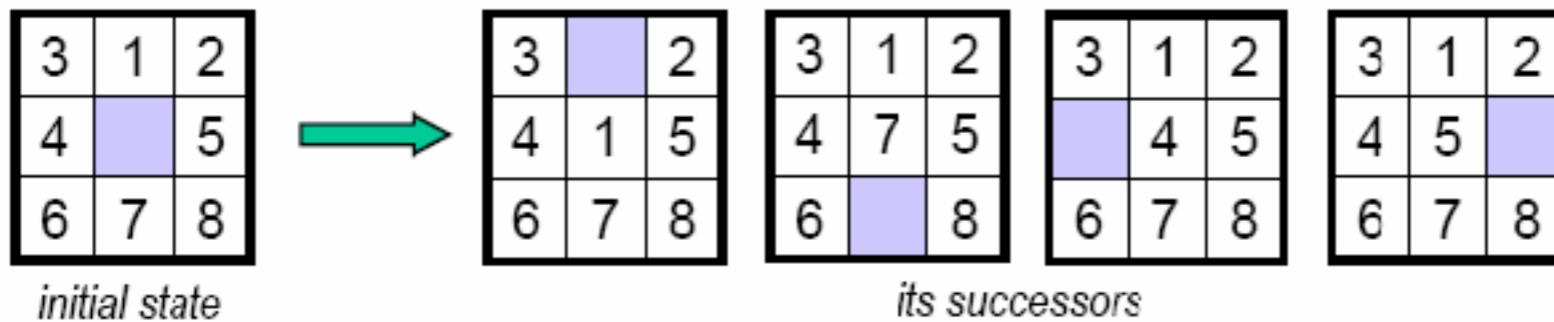
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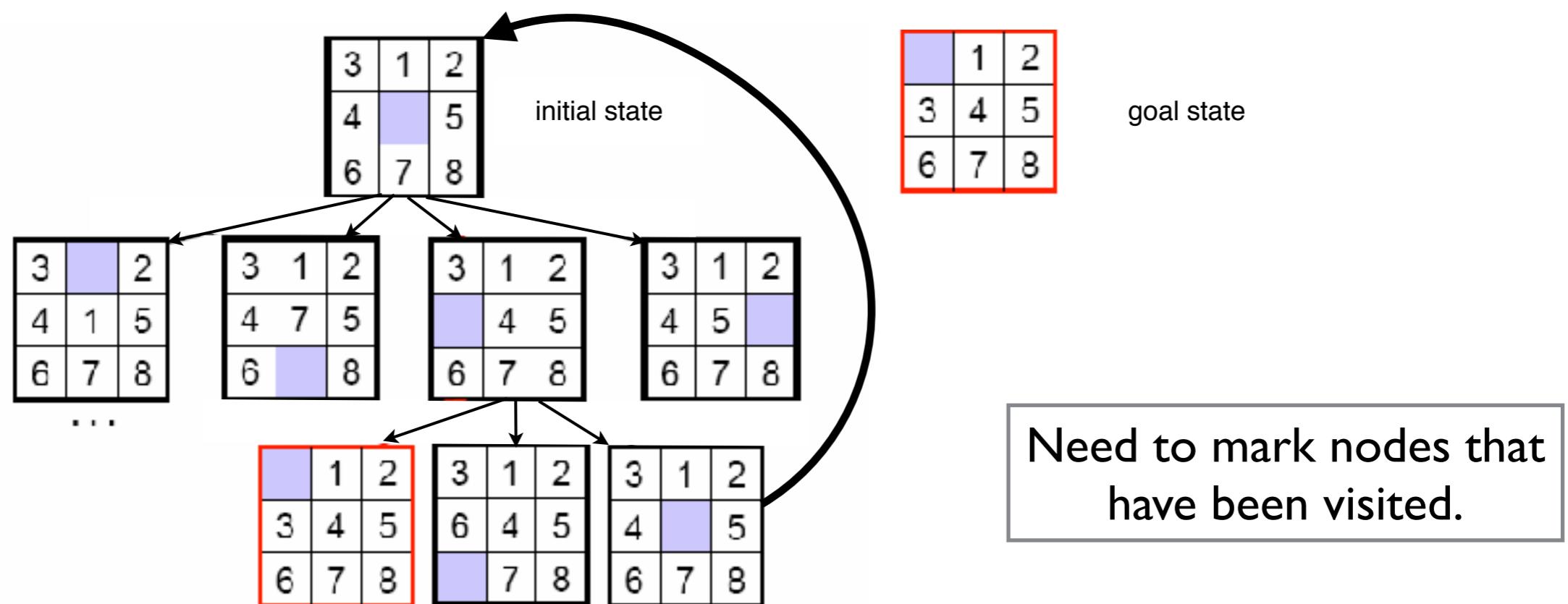


# What about loops?

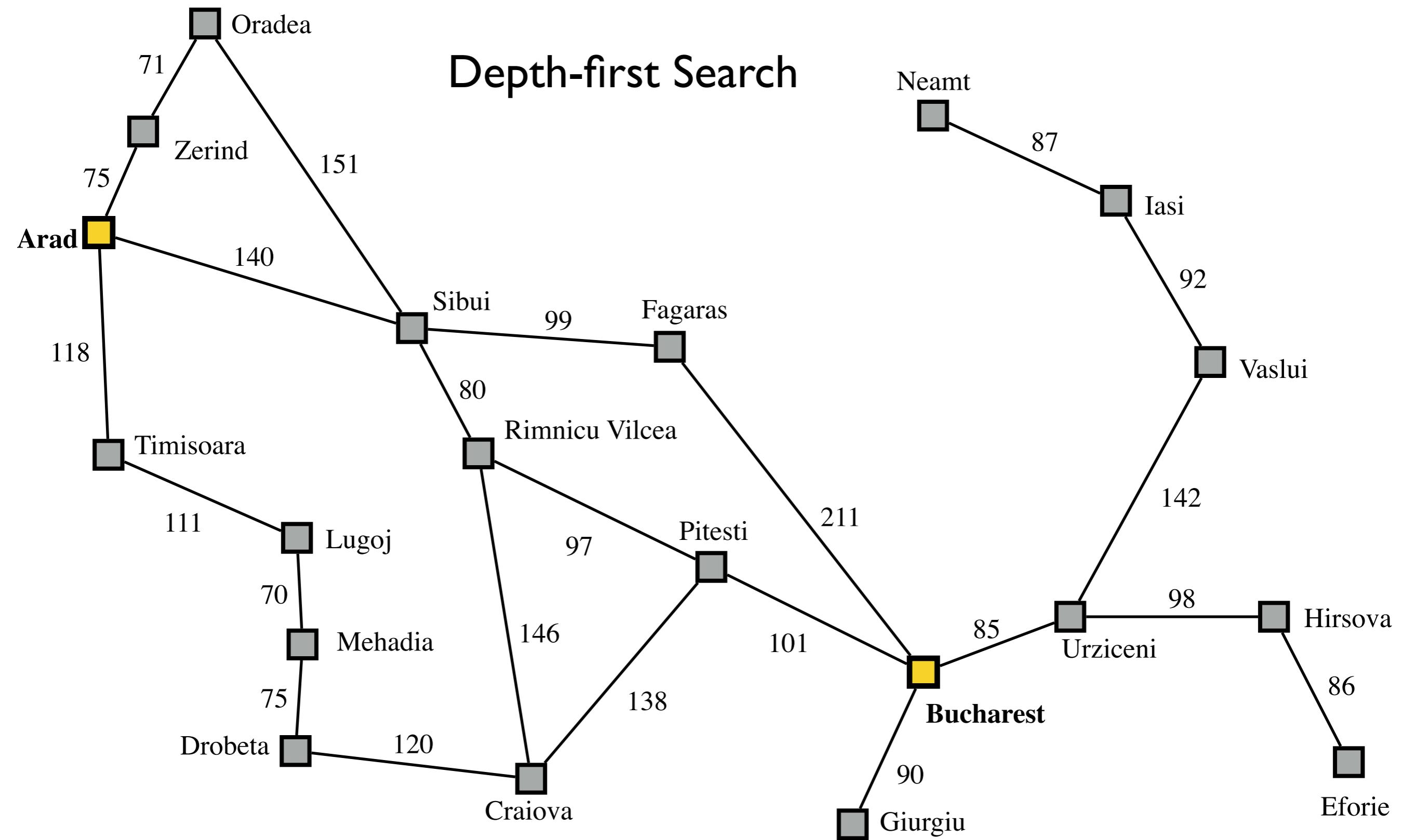
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- We can employ different search strategies to find the goal state

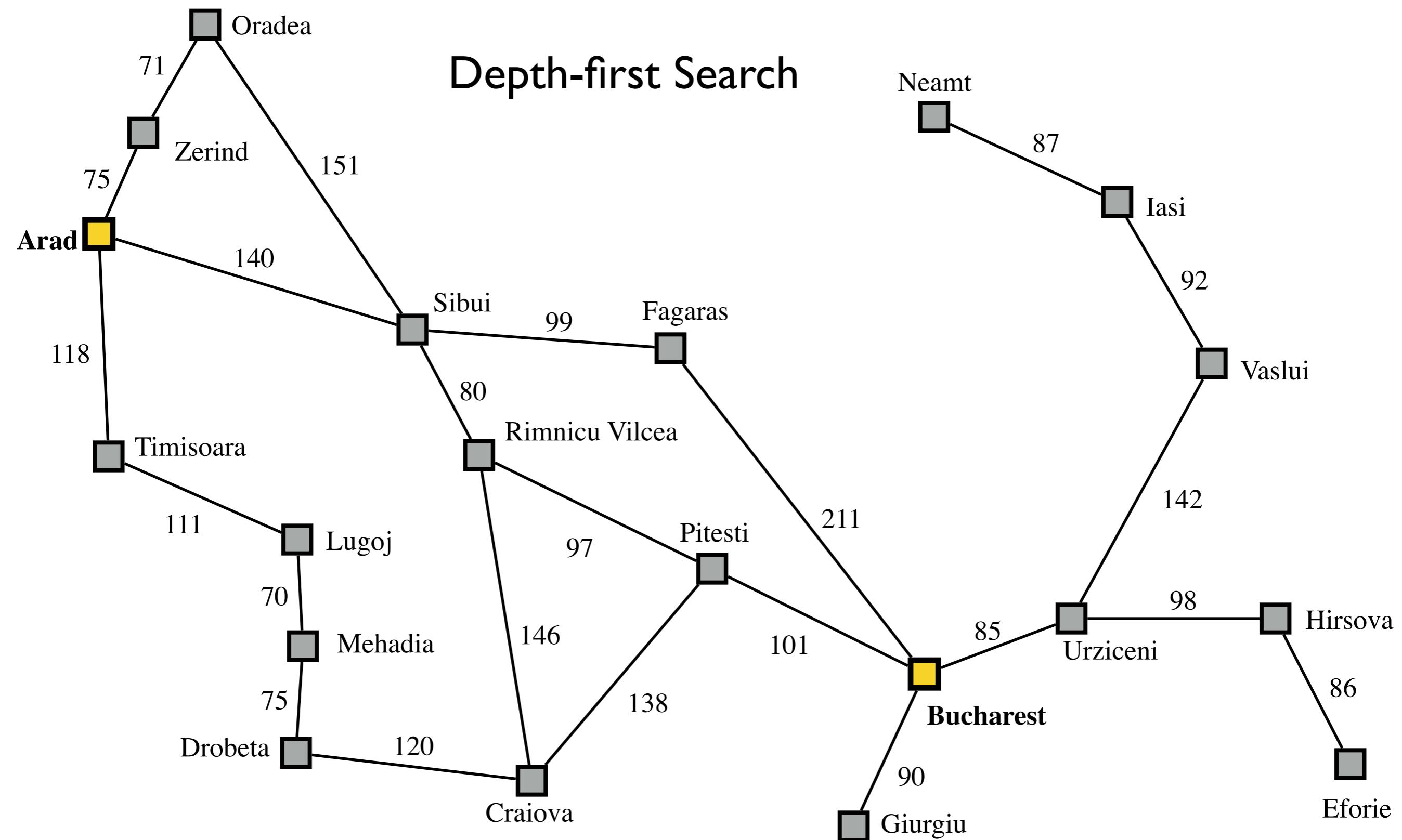


## Depth-first Search



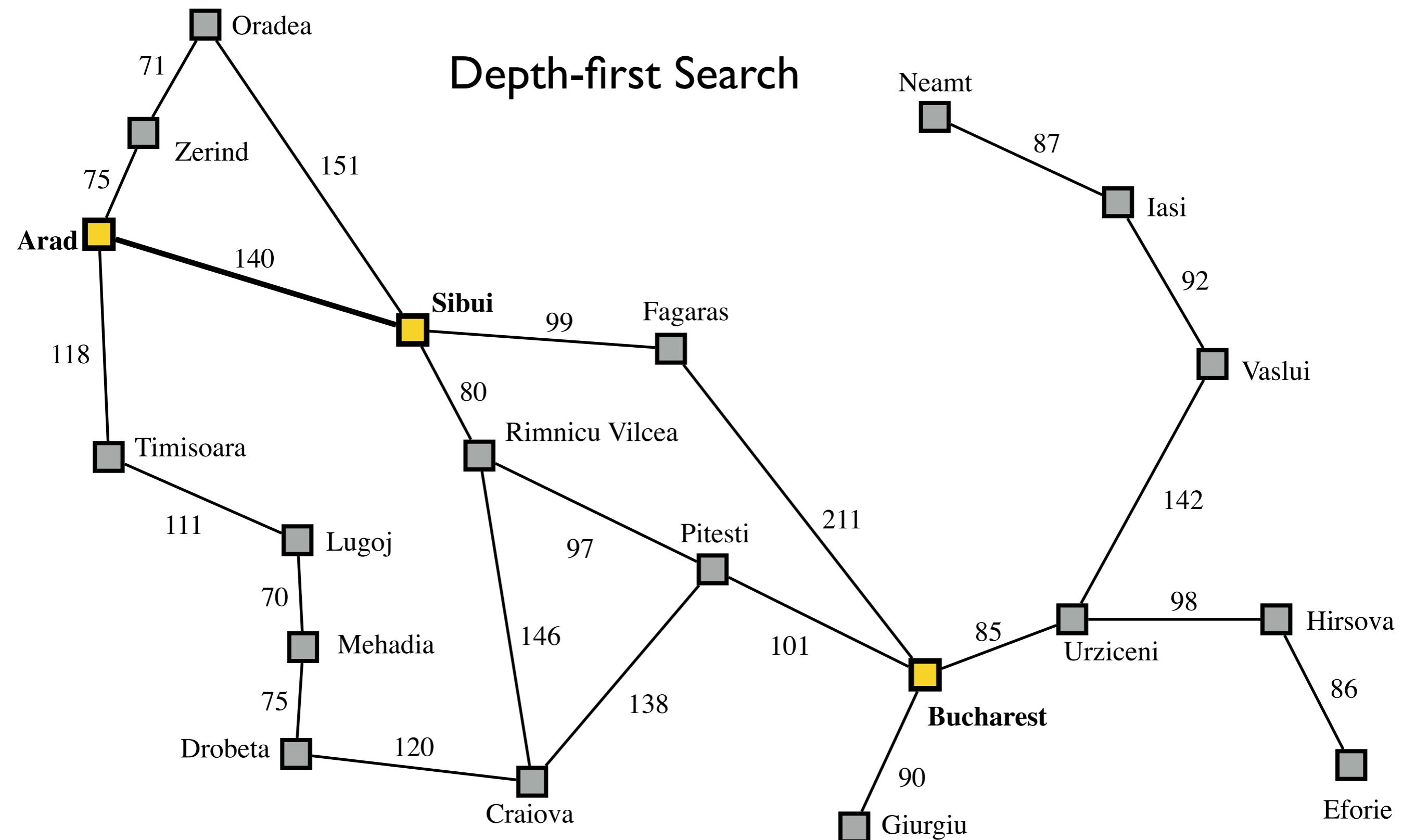
Ignore the edge costs for now: we're only trying to find the goal.

## Depth-first Search



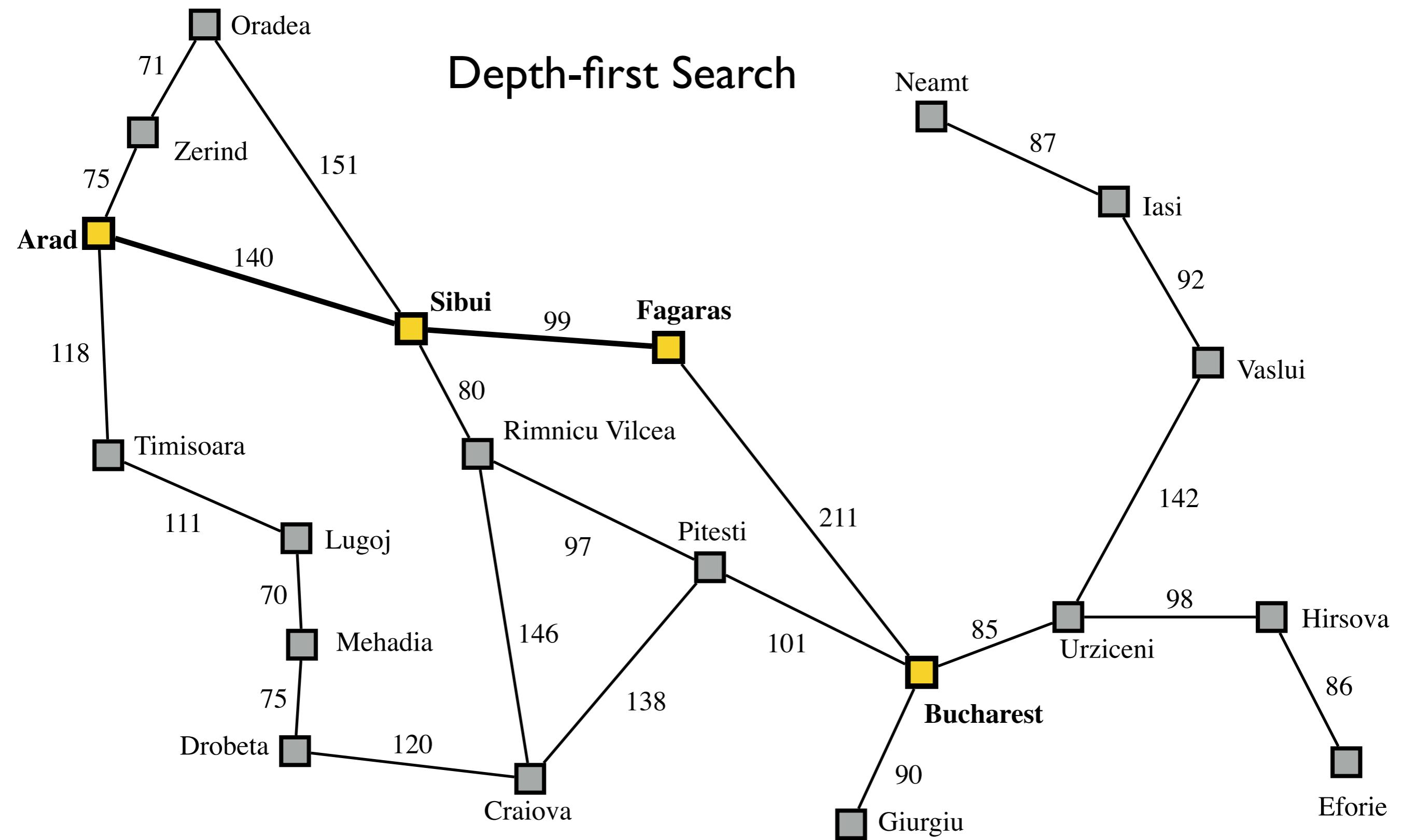
In absence of knowledge, node expansion order is arbitrary, i.e. alphabetical.

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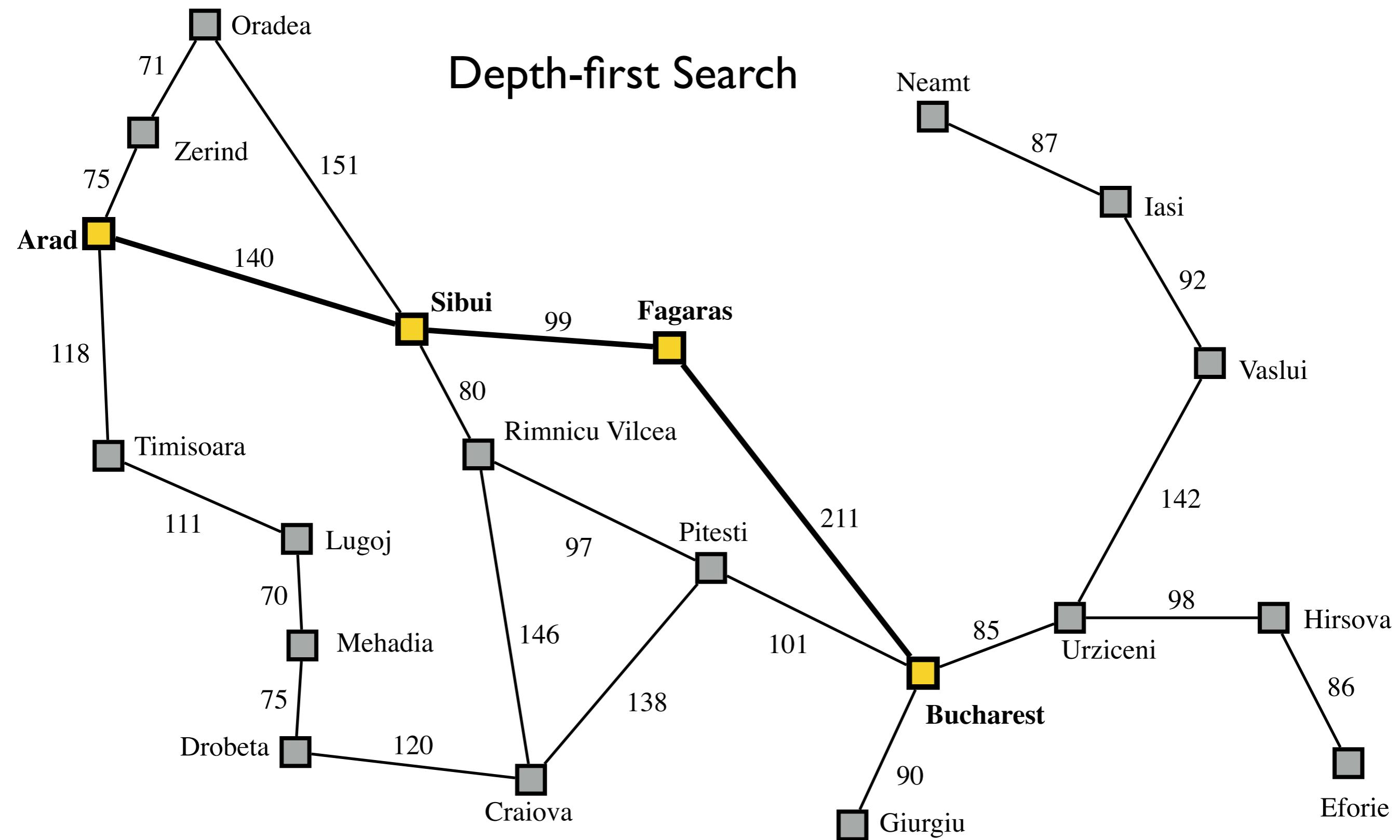
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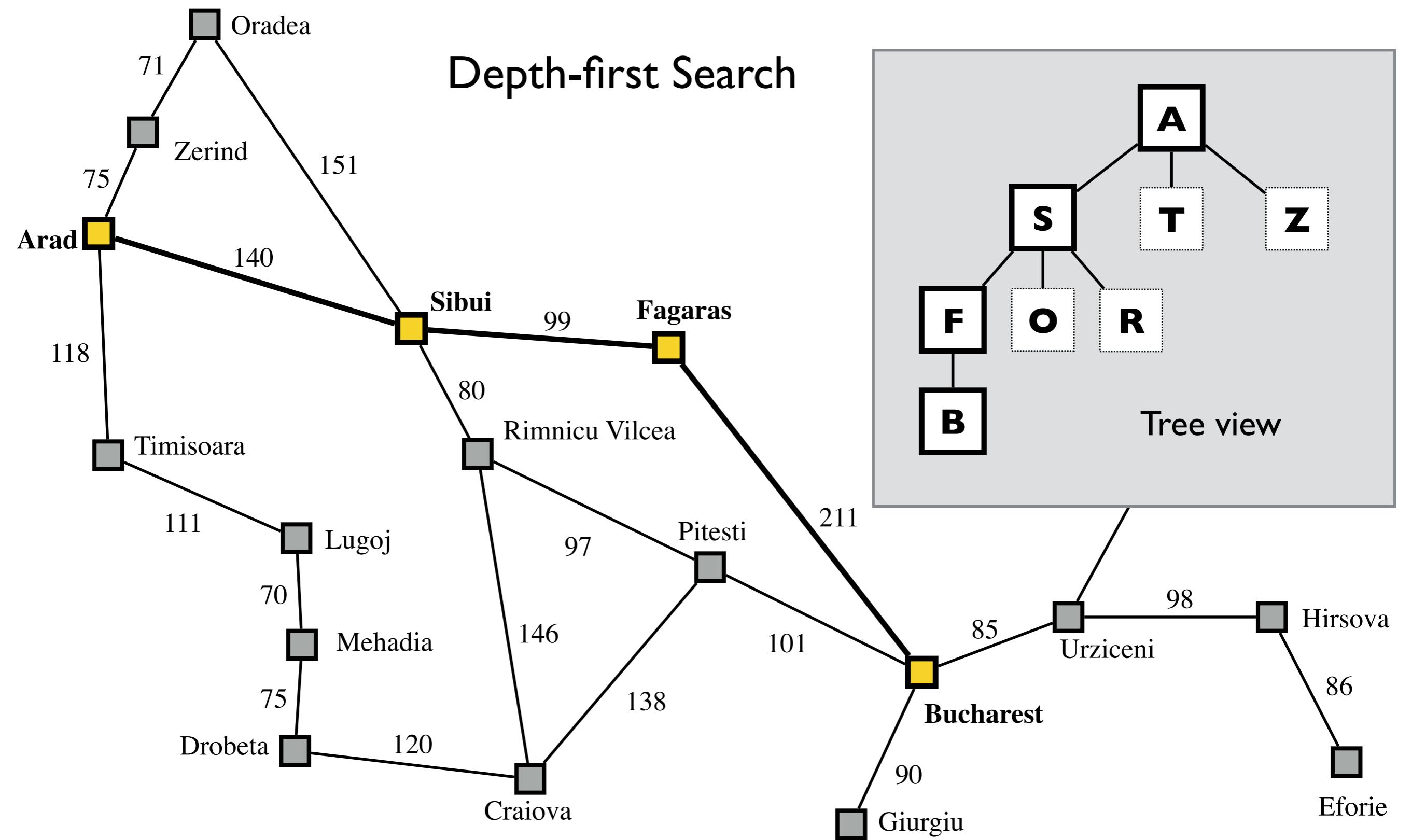
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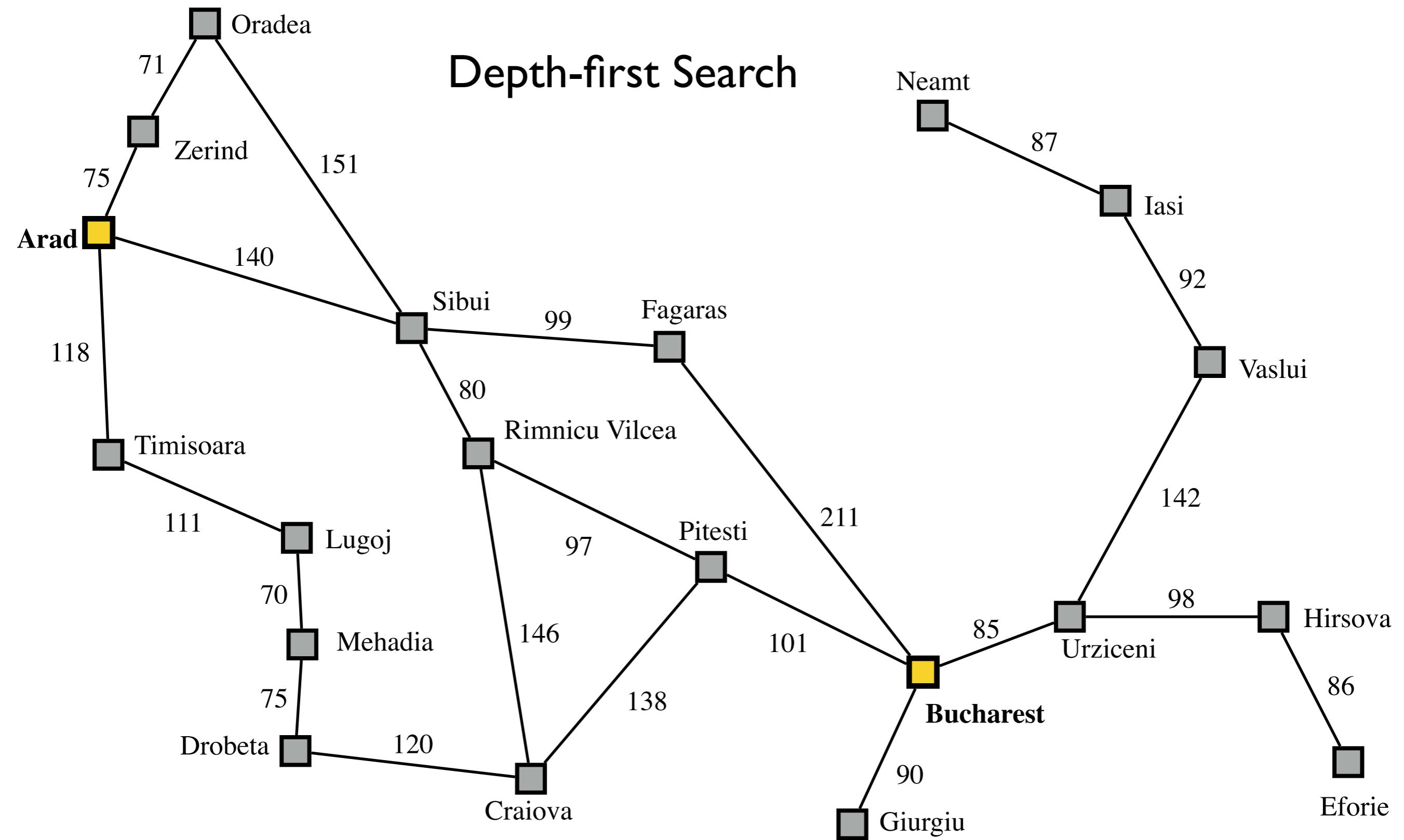
We lucked out!

## Depth-first Search



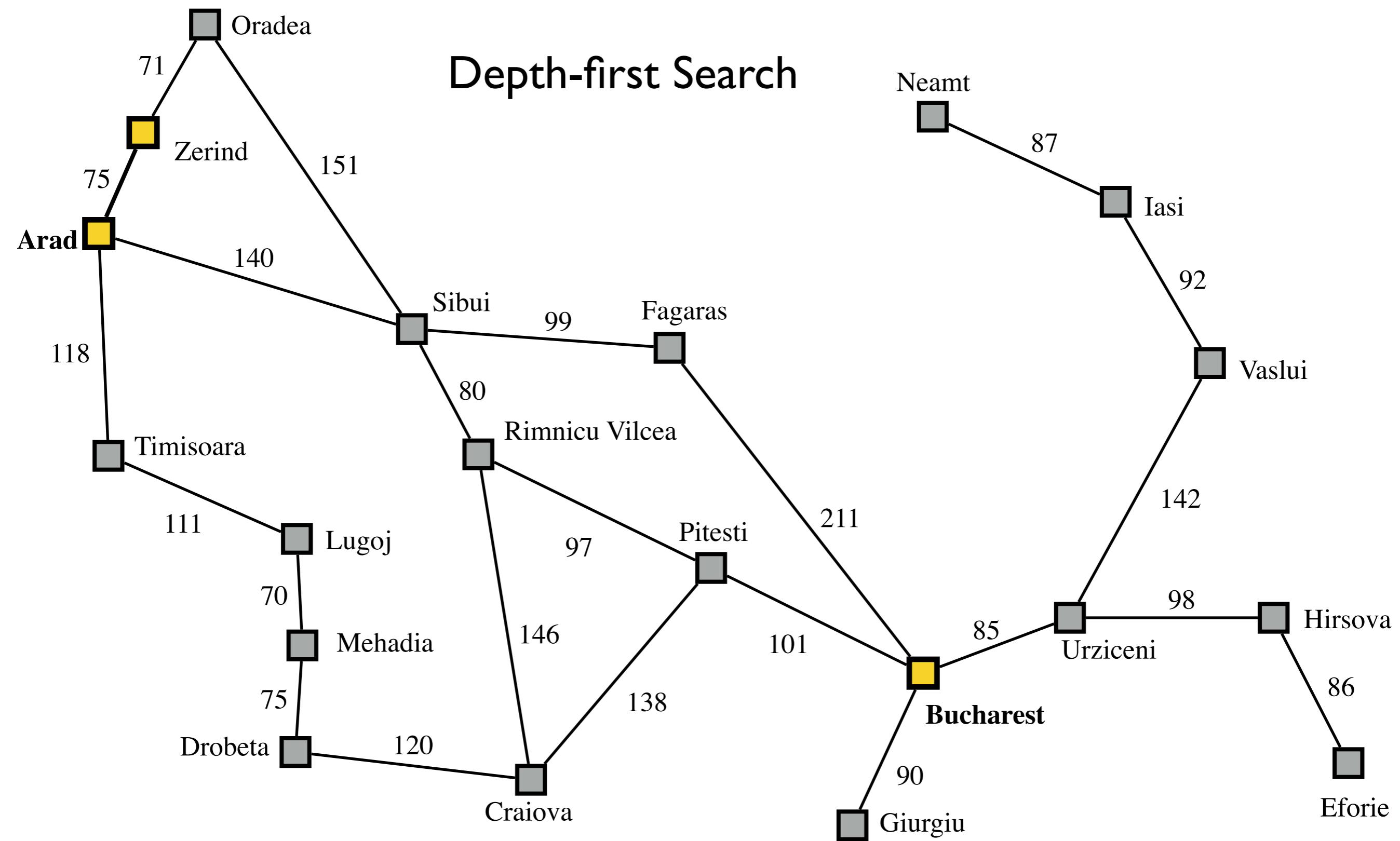
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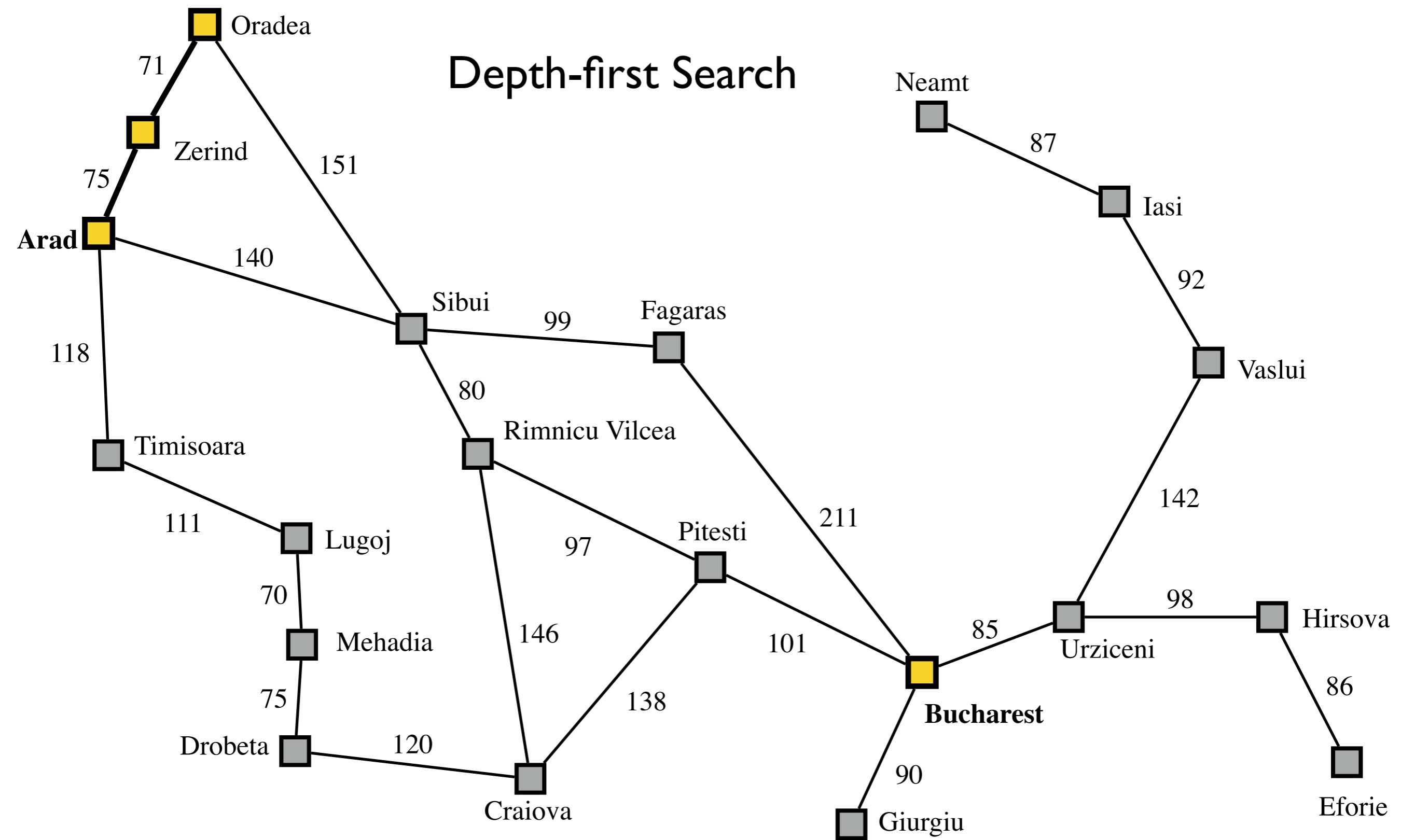
But what if we did reverse-alphabetical expansion?

## Depth-first Search



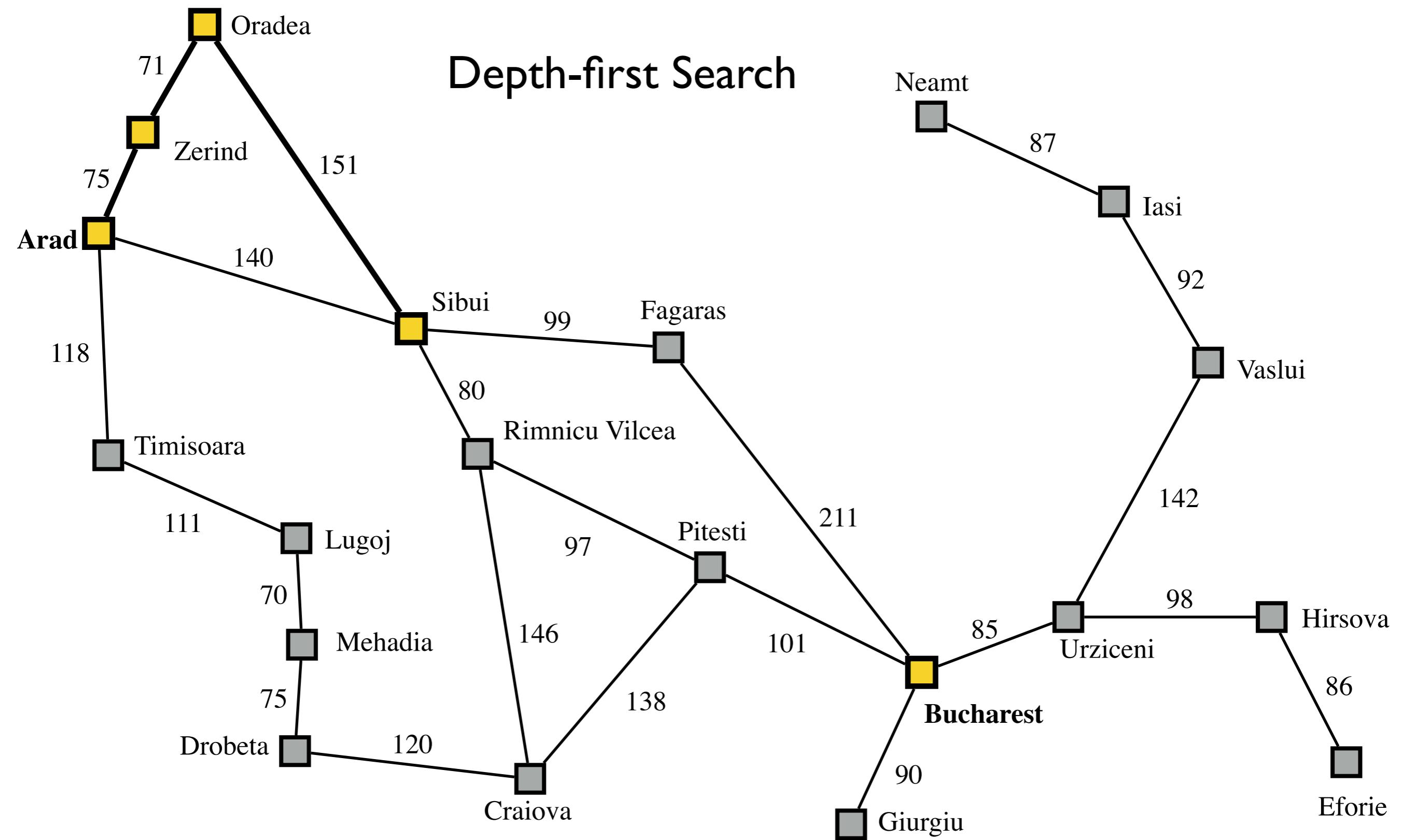
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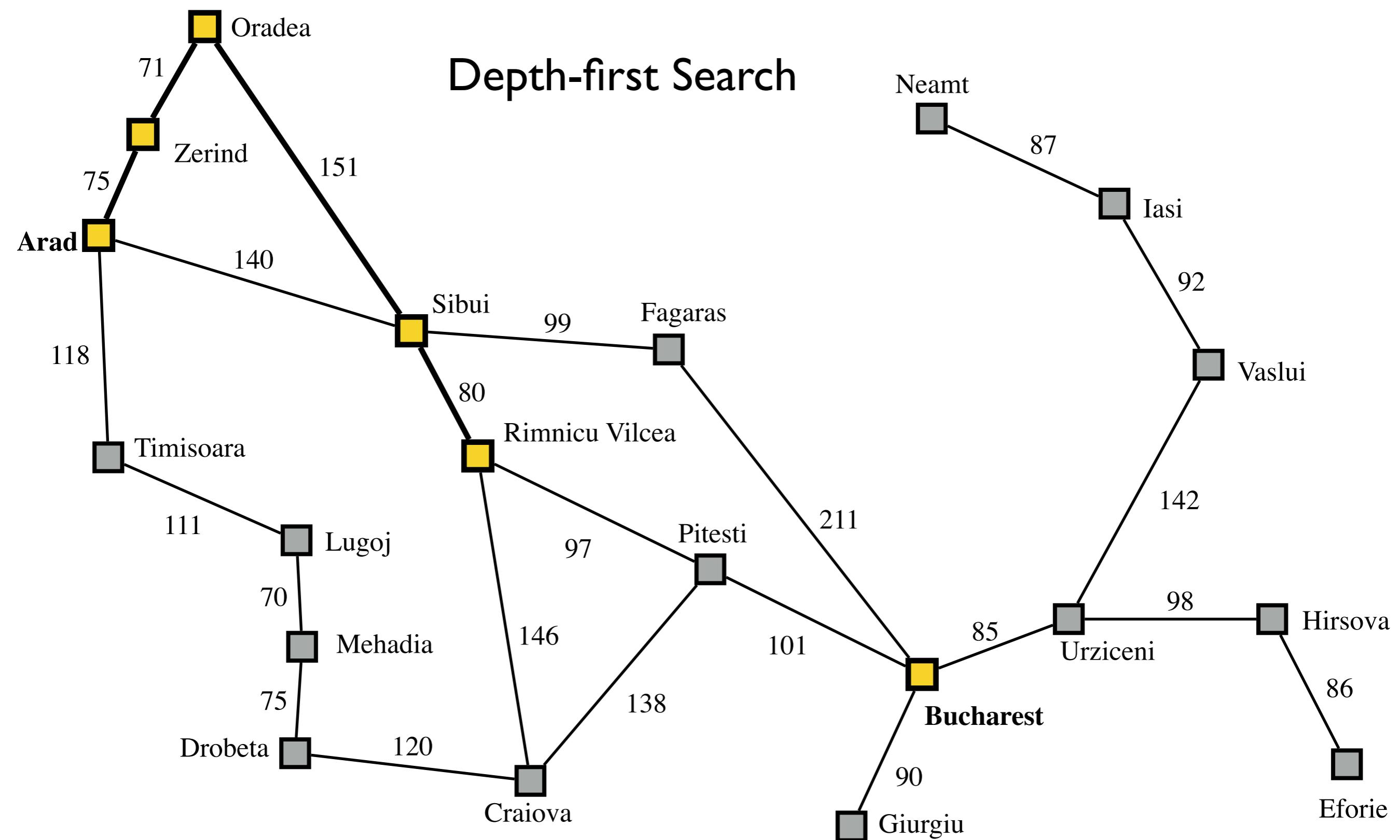
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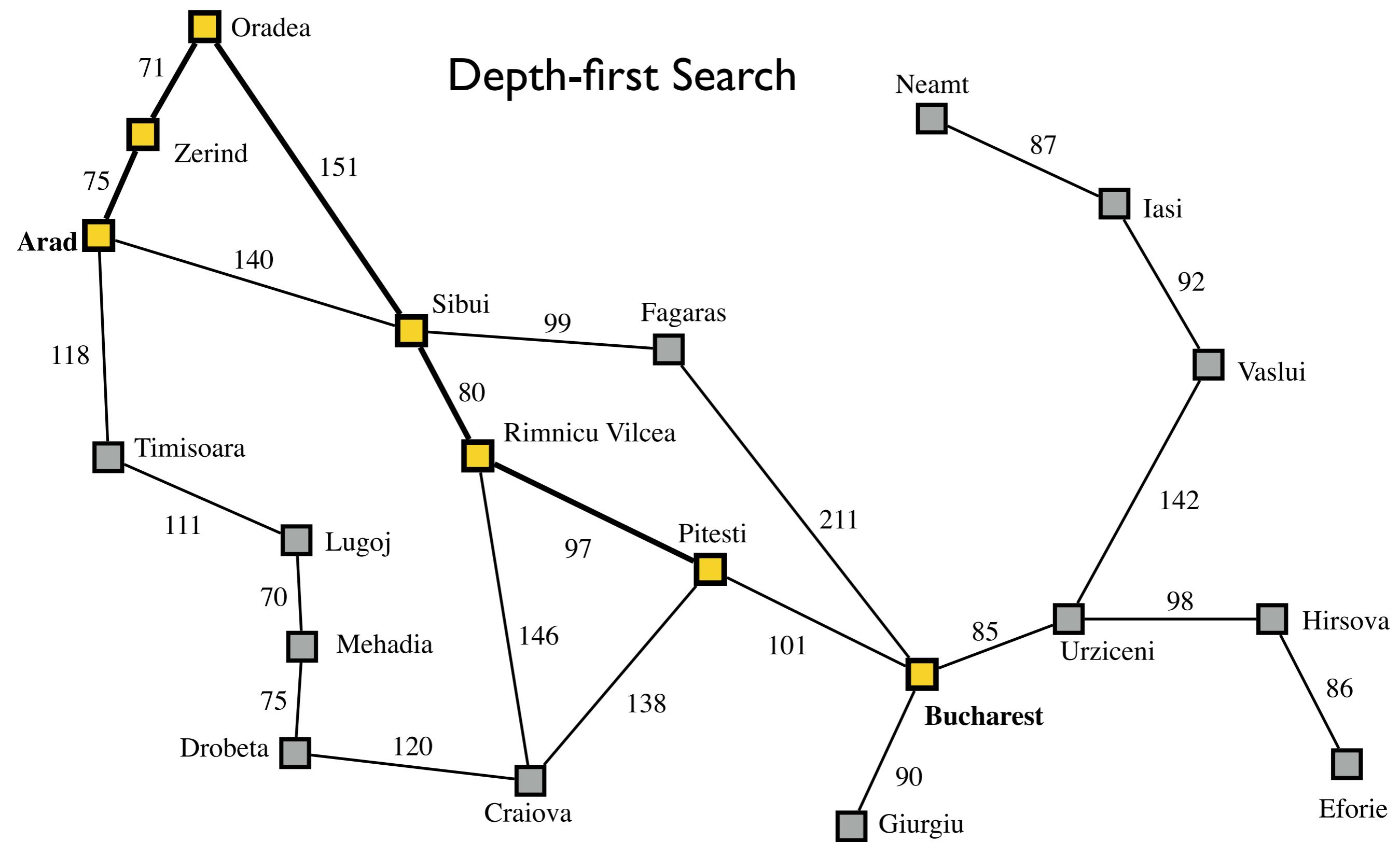
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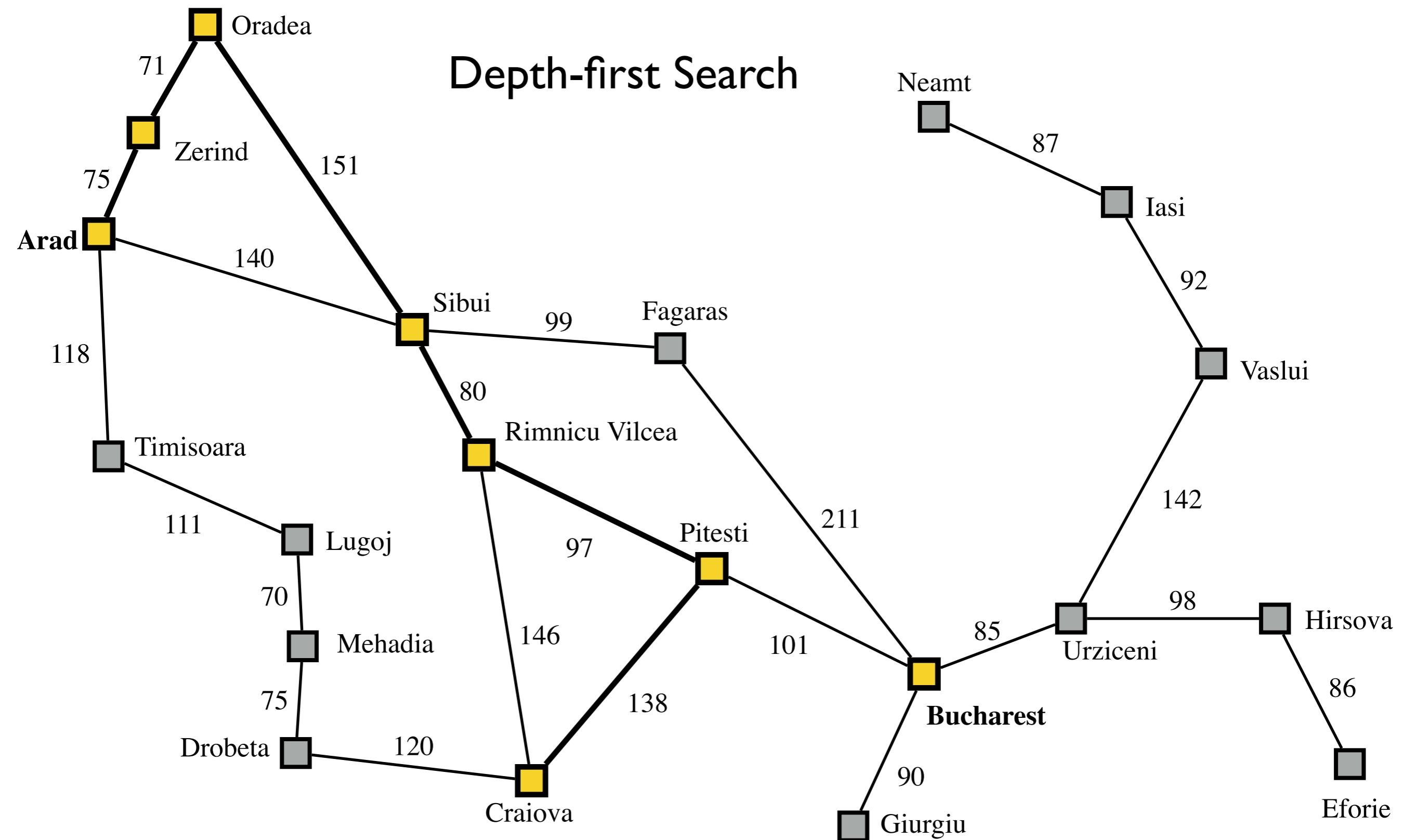
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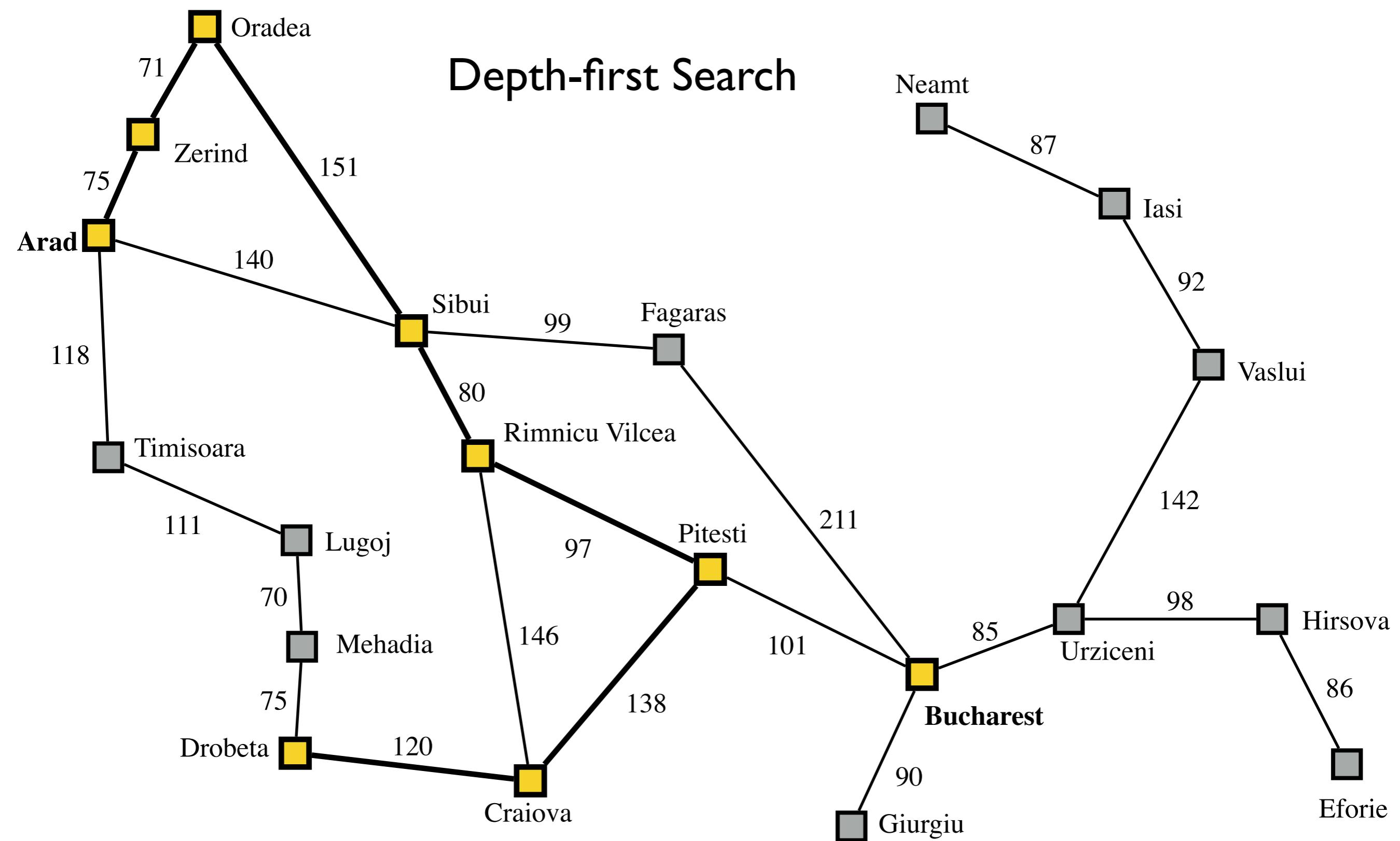
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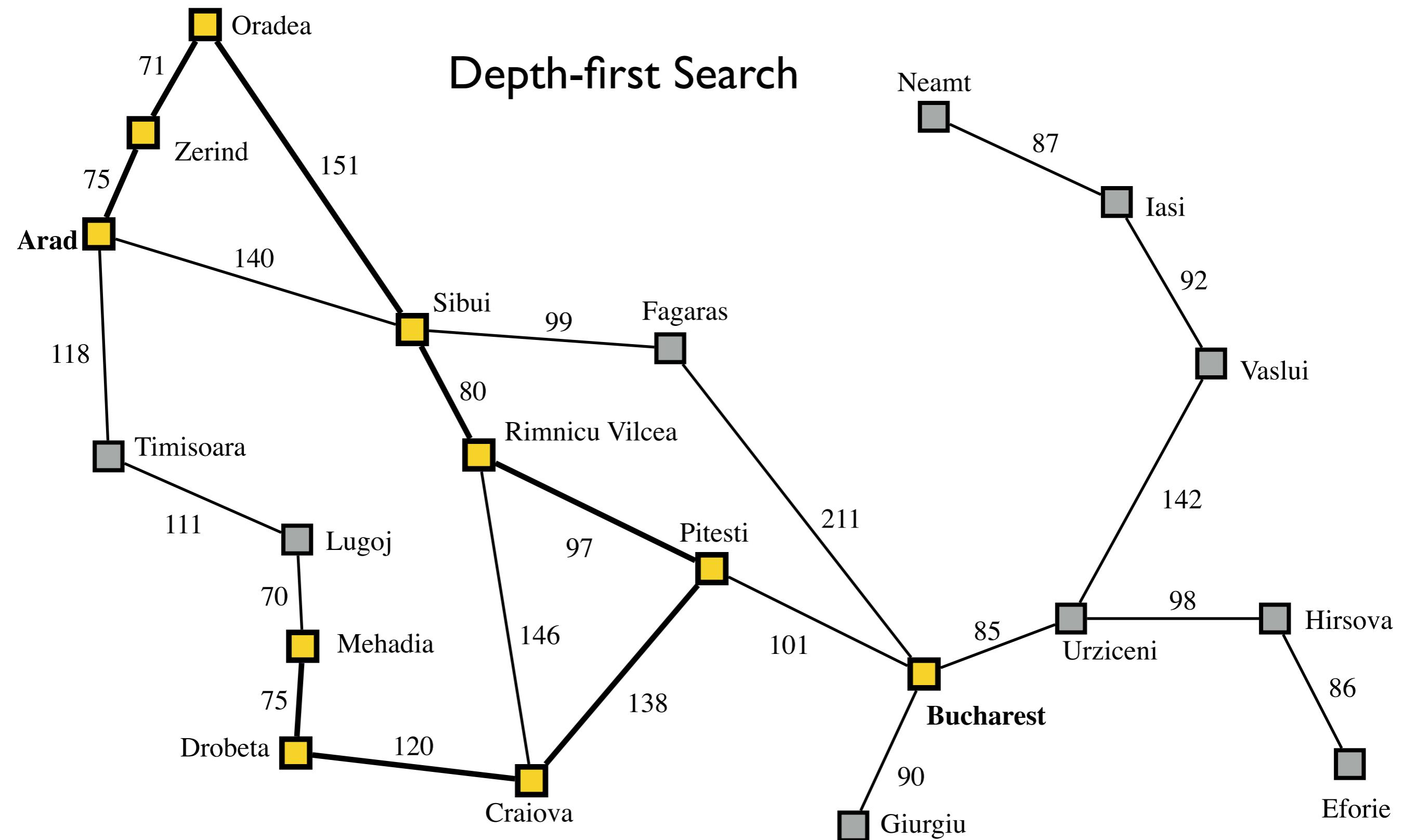
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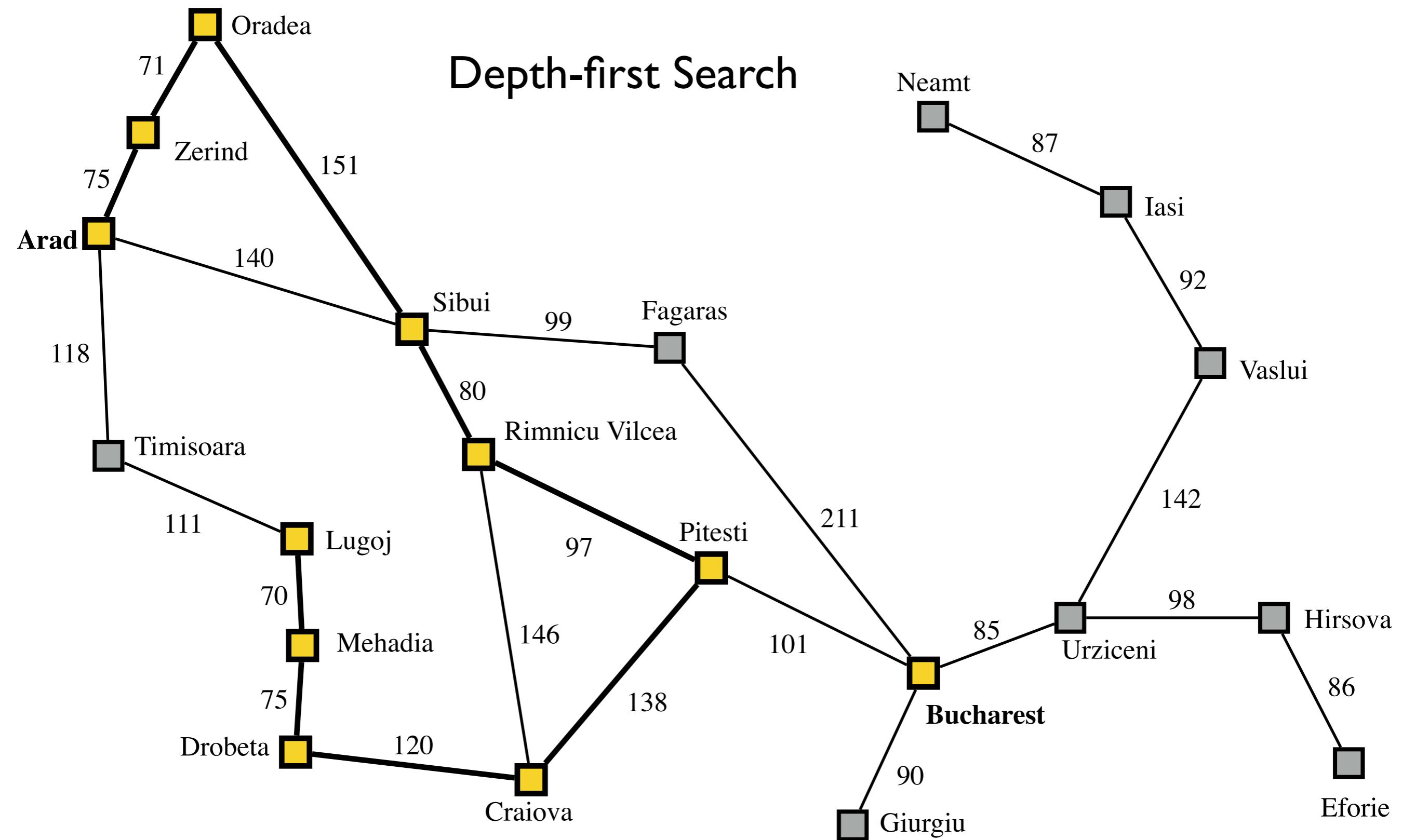
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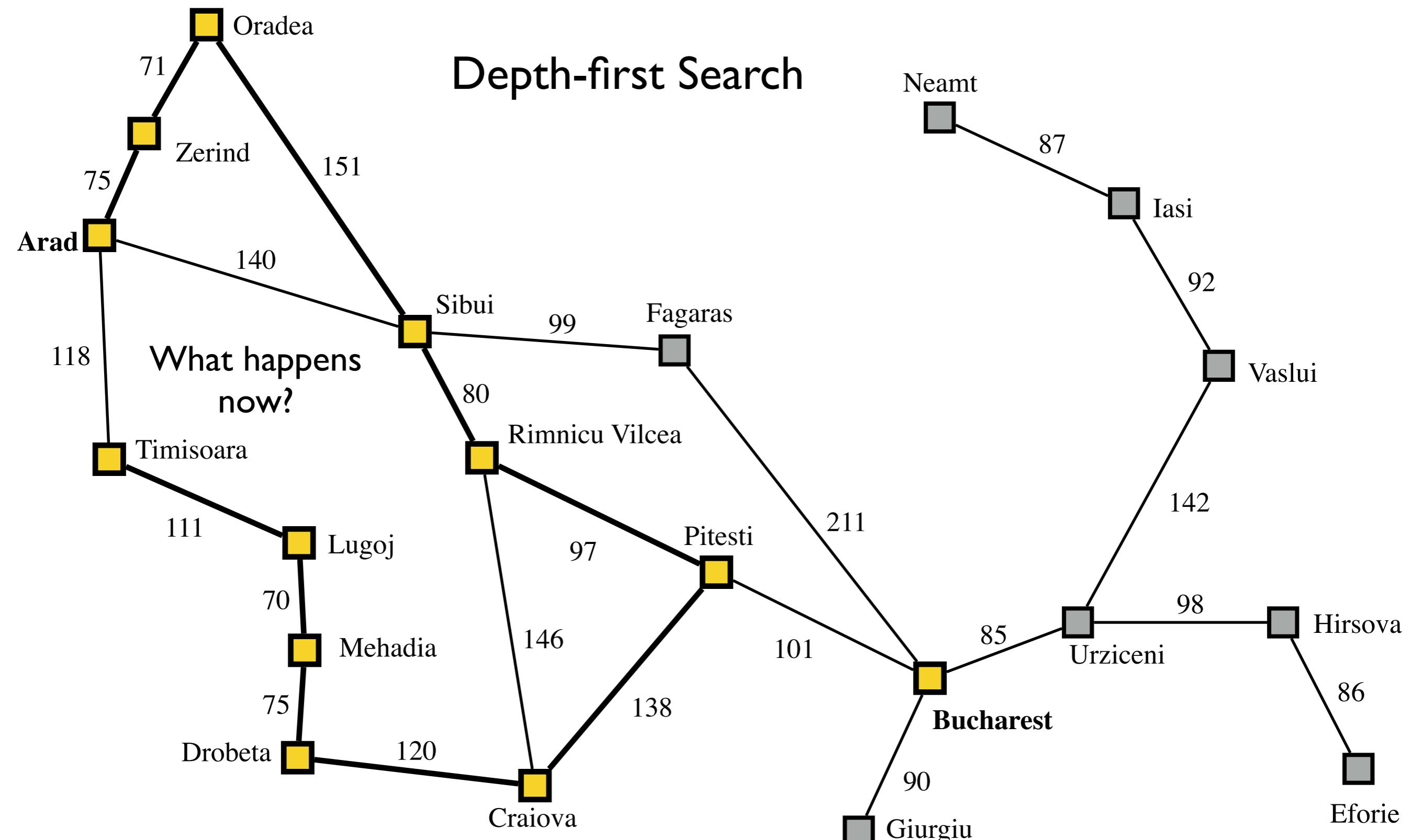
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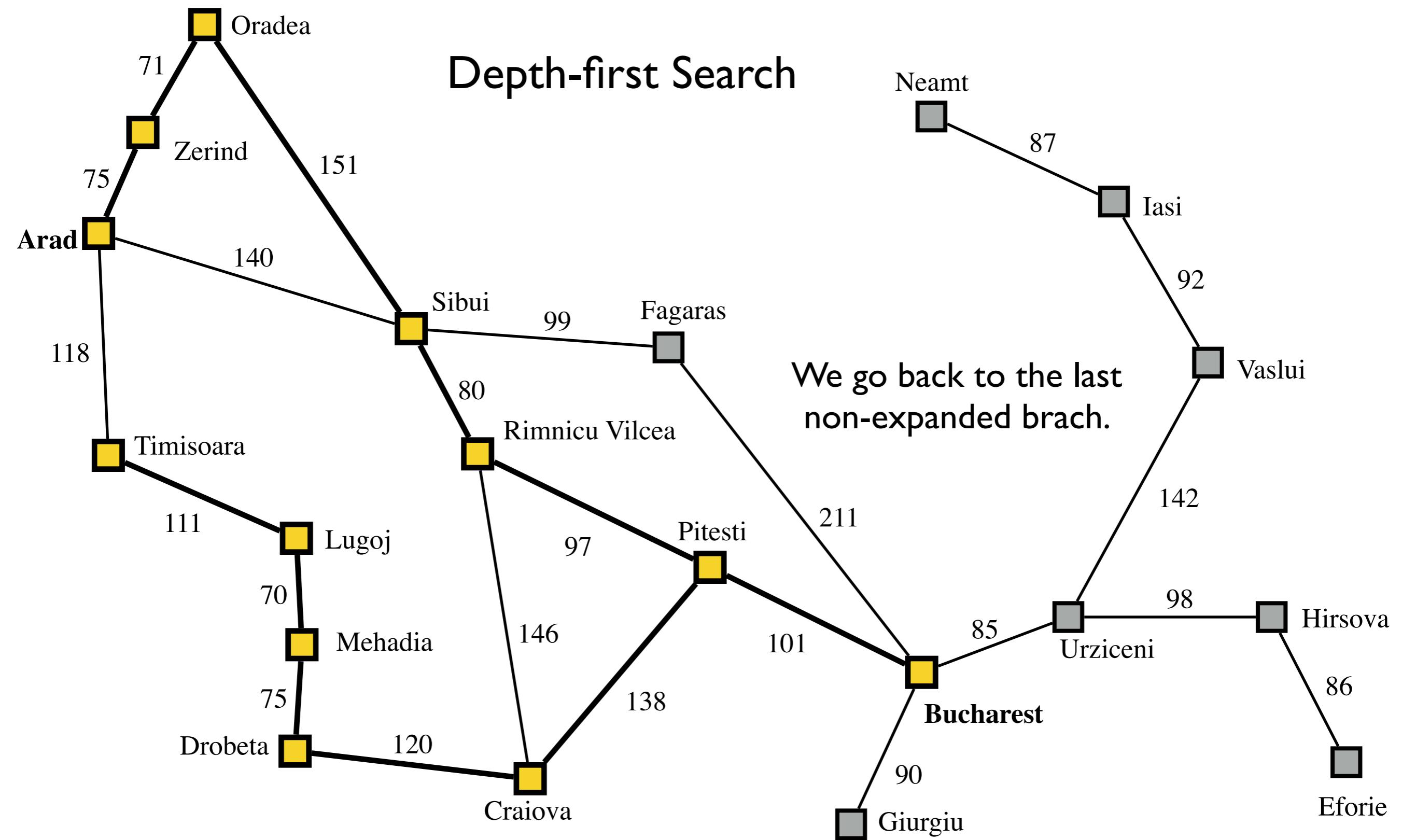
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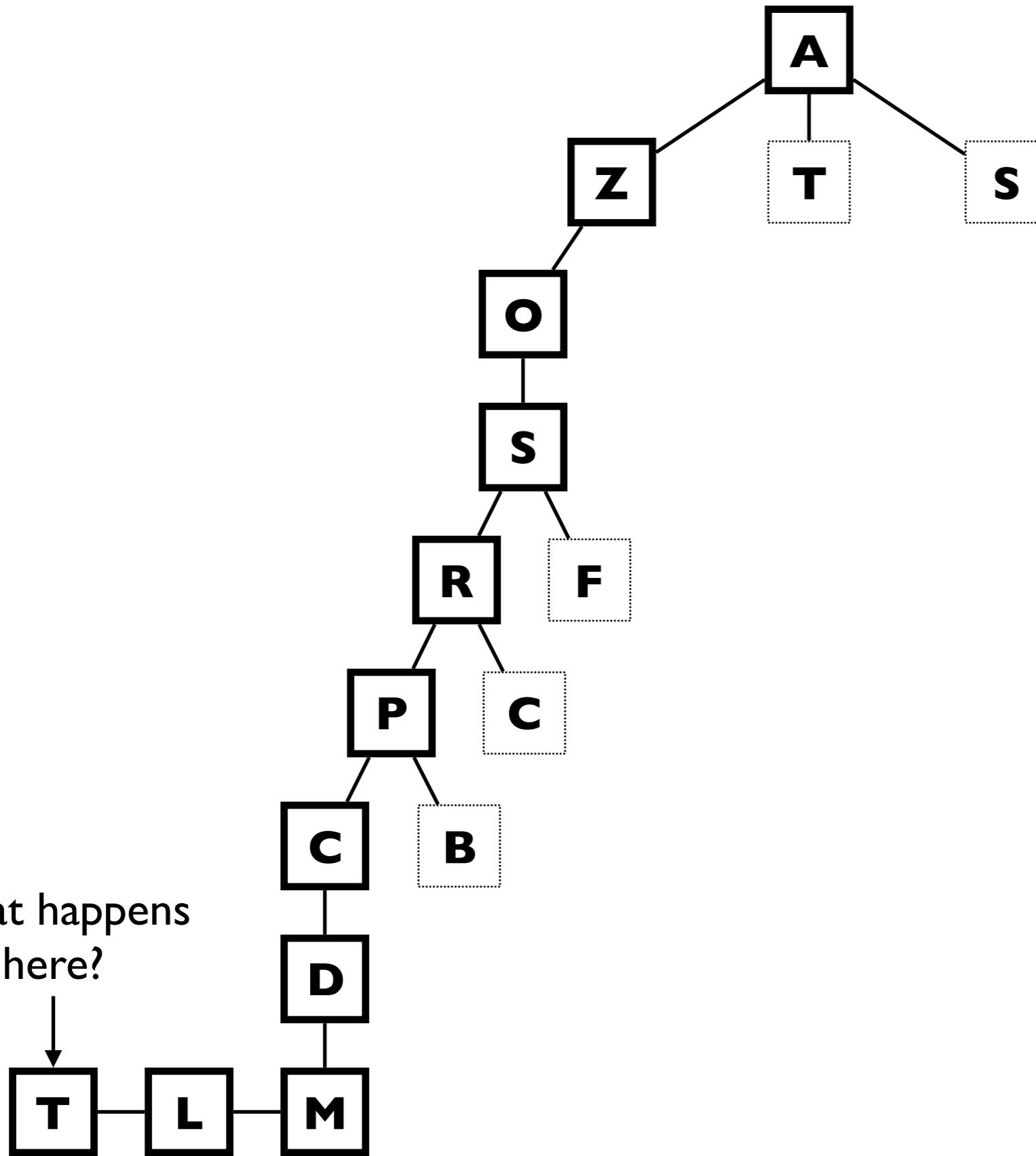
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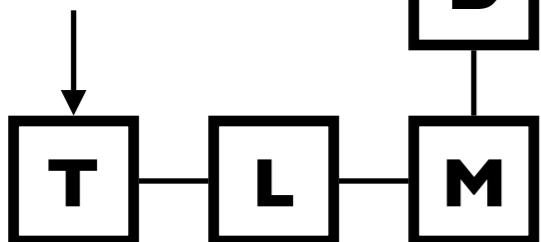


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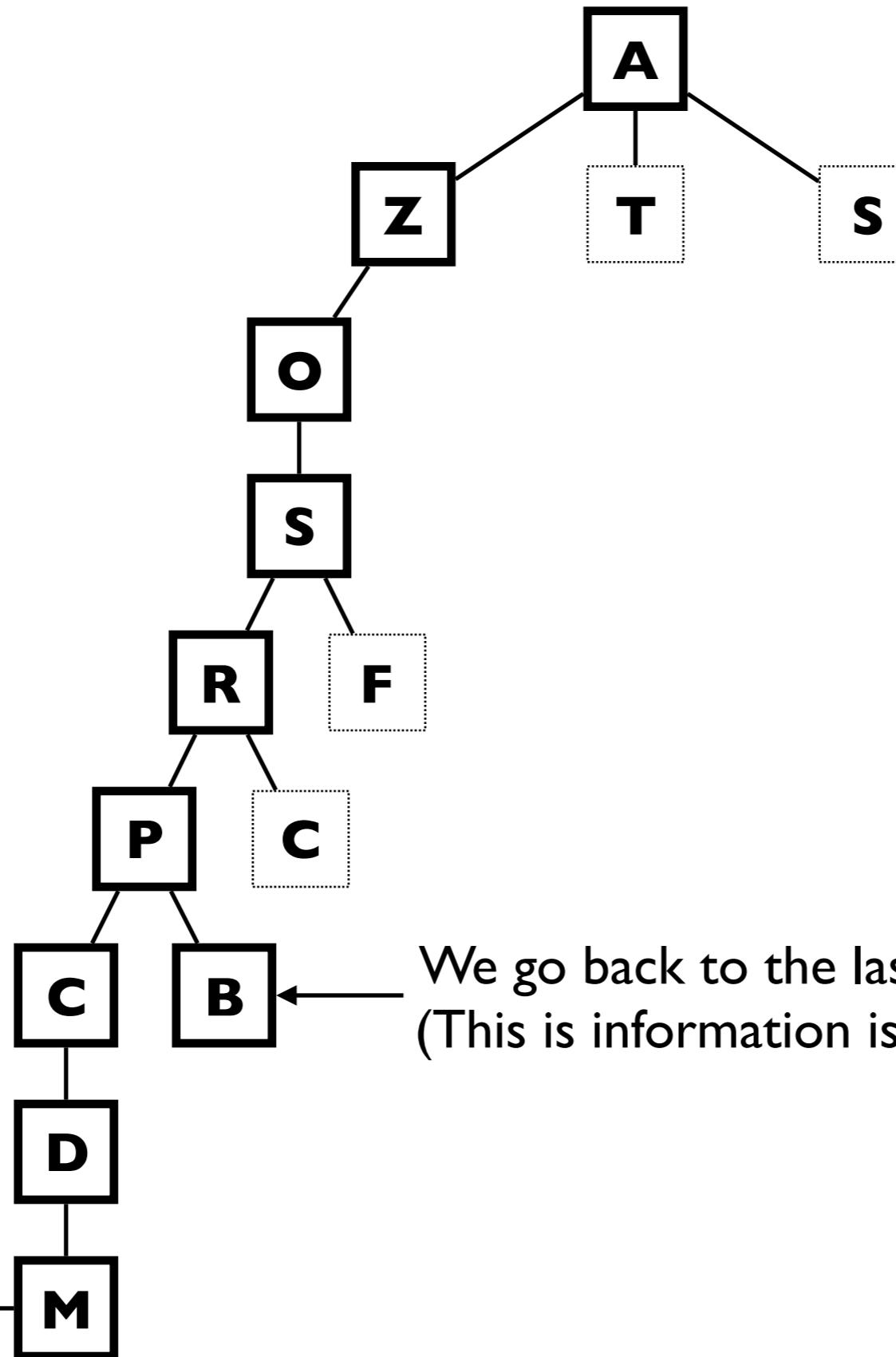
# Tree view of DFS (reverse-alphabetical expansion)



What happens  
here?



# Tree view of DFS (reverse-alphabetical expansion)



# Generic search function

**function** Tree-Search(*problem*, *strategy*) **returns** solution or failure

  initialize tree using initial state of *problem*

**loop**

**if** no candidates for expansion **return** failure

    choose leaf node for expansion using *strategy*

**if** node contains goal state **return** solution

**else** expand node and add resulting nodes to search tree

## Depth-limited search

- incorporate depth limit in depth-first search
- $L$  = depth limit, ie nodes at depth  $L$  are not expanded
- Complete if  $L \geq d$
- Still not optimal, because DFS isn't optimal.
- Time is  $O(b^L)$
- Space is  $O(bL)$

# Recursive implementation of Depth-limited search

```
function DEPTH-LIMITED-SEARCH(problem, limit) returns soln/fail/cutoff  
    RECURSIVE-DLS(MAKE-NODE(INITIAL-STATE[problem]), problem, limit)
```

```
function RECURSIVE-DLS(node, problem, limit) returns soln/fail/cutoff
```

```
    cutoff-occurred?  $\leftarrow$  false  
    if GOAL-TEST(problem, STATE[node]) then return node  
    else if DEPTH[node] = limit then return cutoff  
    else for each successor in EXPAND(node, problem) do  
        result  $\leftarrow$  RECURSIVE-DLS(successor, problem, limit)  
        if result = cutoff then cutoff-occurred?  $\leftarrow$  true  
        else if result  $\neq$  failure then return result  
    if cutoff-occurred? then return cutoff else return failure
```

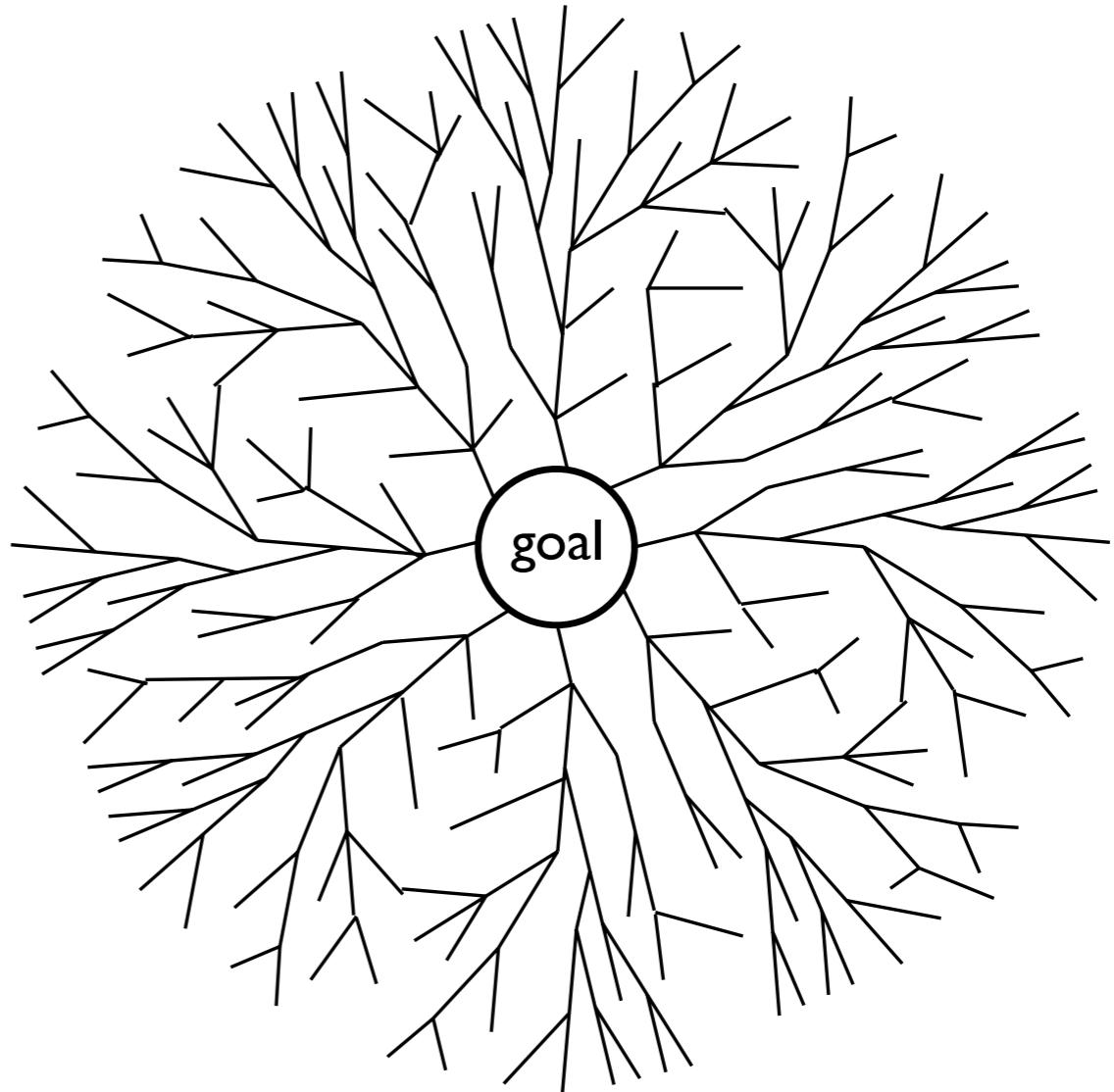
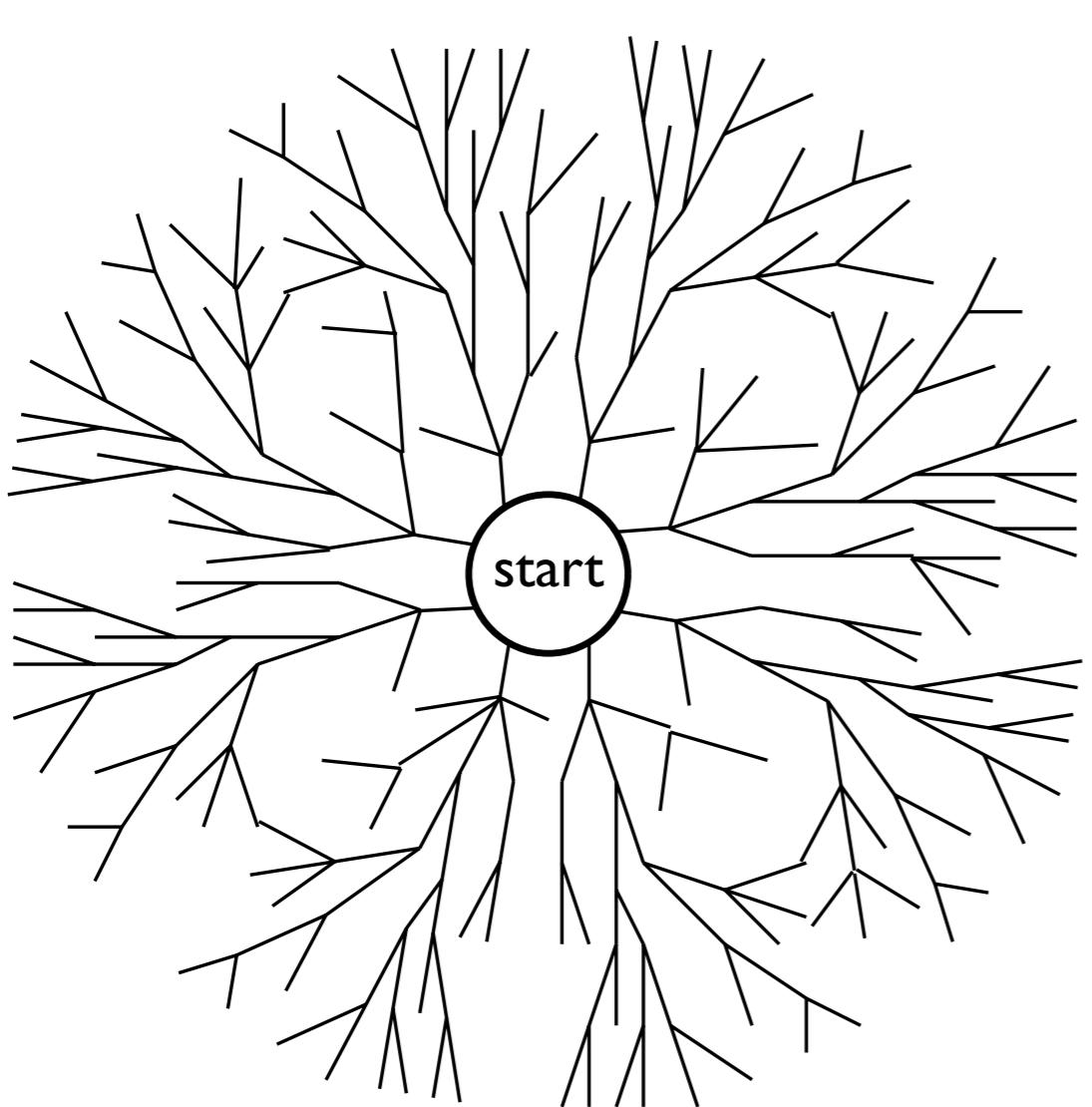
# Iterative deepening search

- depth-limited search with gradually increasing depth limit

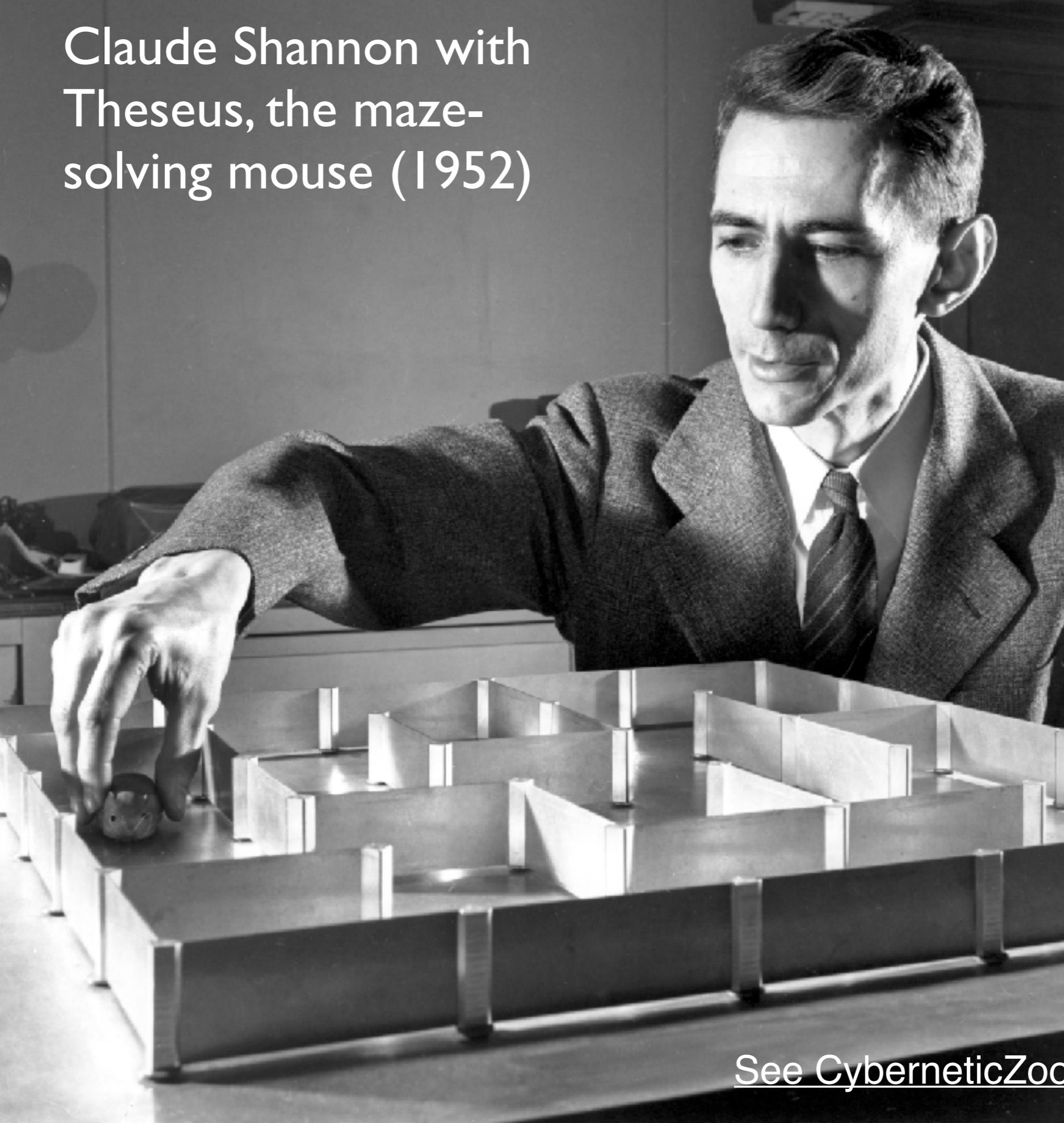
```
function ITERATIVE-DEEPENING-SEARCH(problem) returns a solution
inputs: problem, a problem
for depth  $\leftarrow 0$  to  $\infty$  do
    result  $\leftarrow$  DEPTH-LIMITED-SEARCH(problem, depth)
    if result  $\neq$  cutoff then return result
end
```

# Bi-directional search

- perform two simultaneous searches: one from start, one from goal
- stop when search paths meet
- Complexity  $O(b^{d/2}) \ll O(b^d)$  (checking constant time with hash table)



Claude Shannon with  
Theseus, the maze-  
solving mouse (1952)



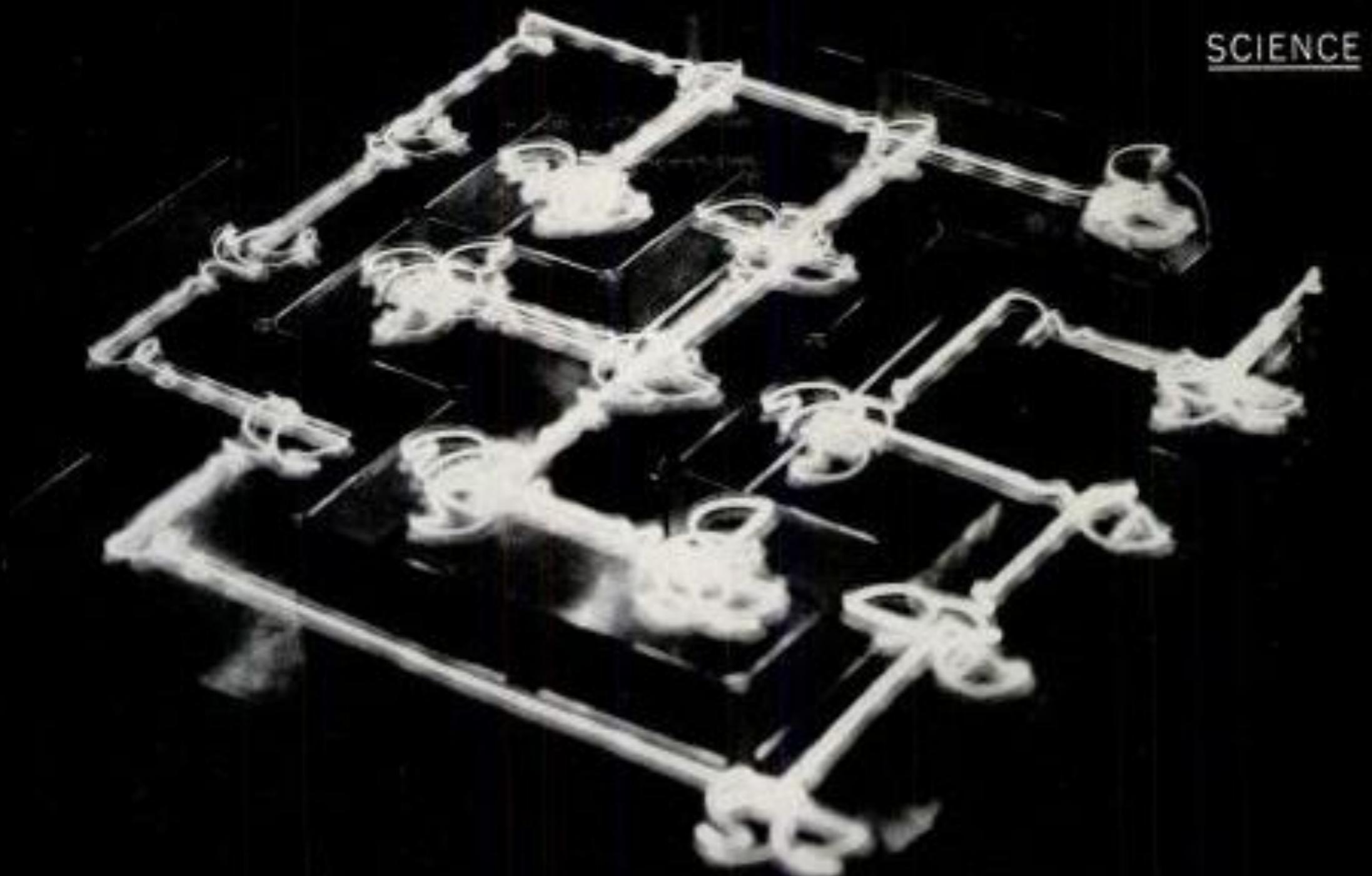
[See CyberneticZoo.com article](#)

# Theseus algorithm:

- Trémaux's algorithm:
  - unroll a ball of string to backtrace
  - mark locations visited to avoid looping
  - done when no options remain
- equivalent to depth first search
- an efficient way to find a way out of a maze
- Theseus the mouse was named after the mythical Greek hero Theseus who entered Labyrinth to kill the Minotaur
- Theseus used a ball of string to find his way back out

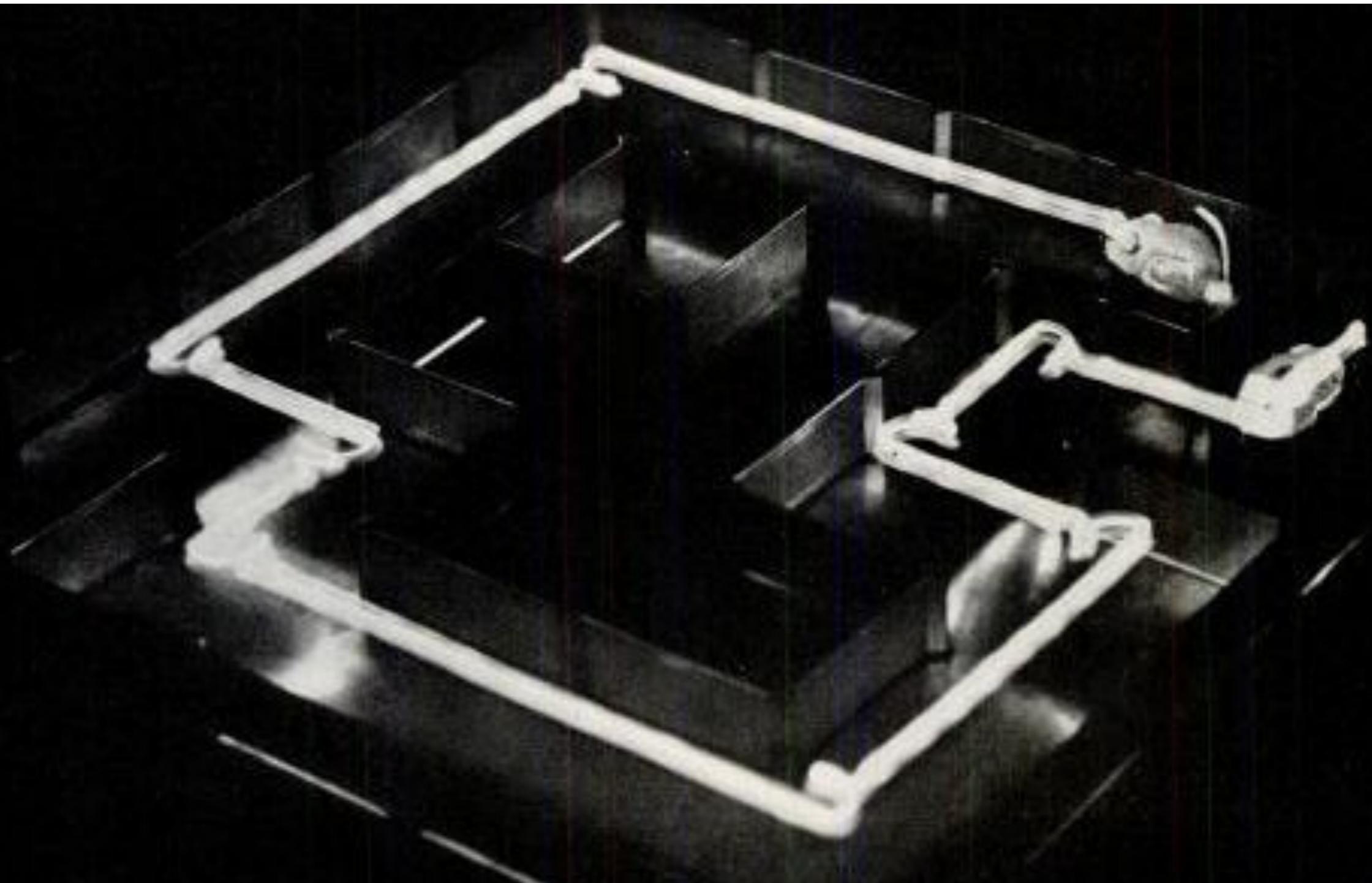


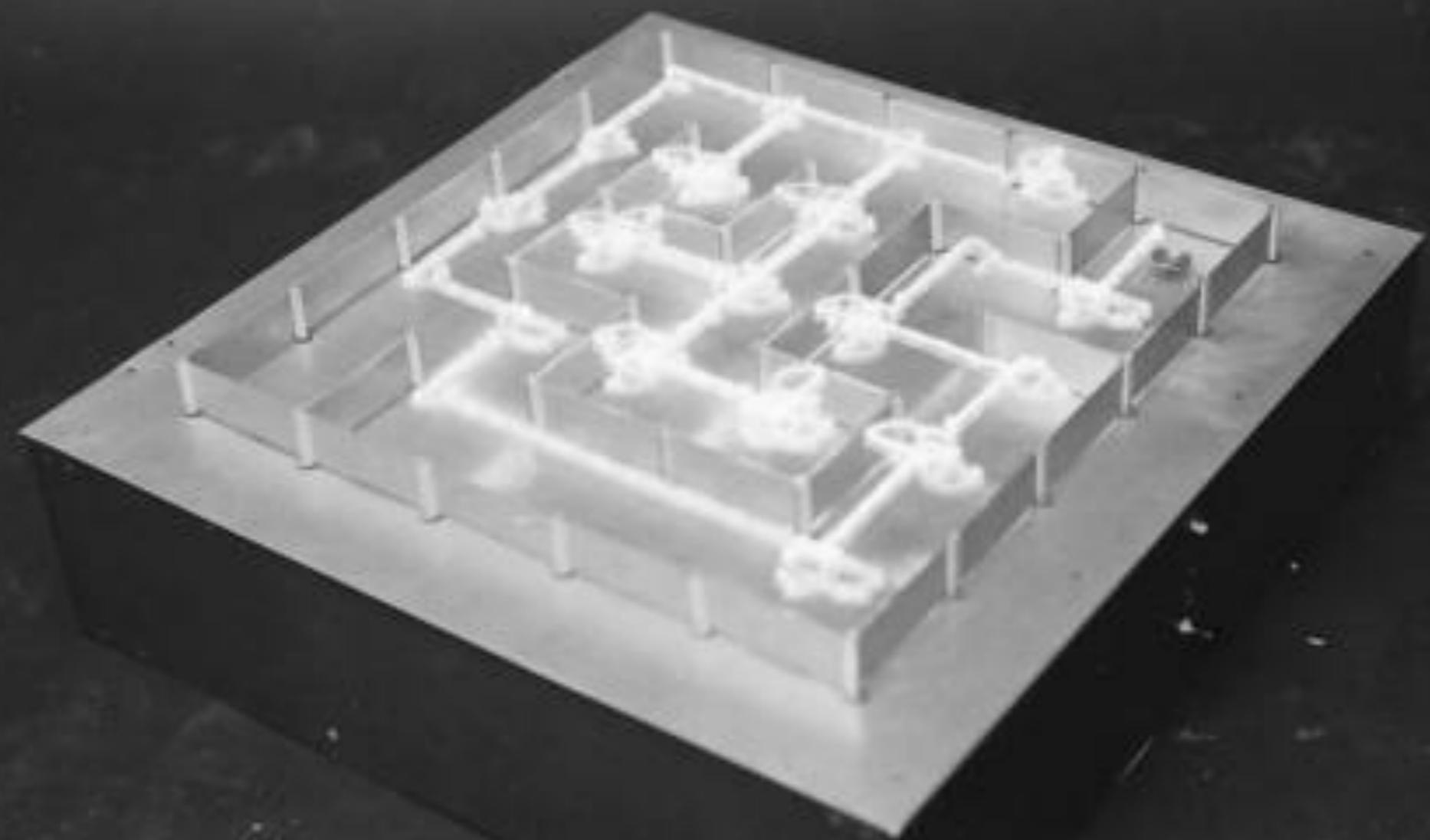
From 1952 *Life* magazine article: trace of Theseus' first pass

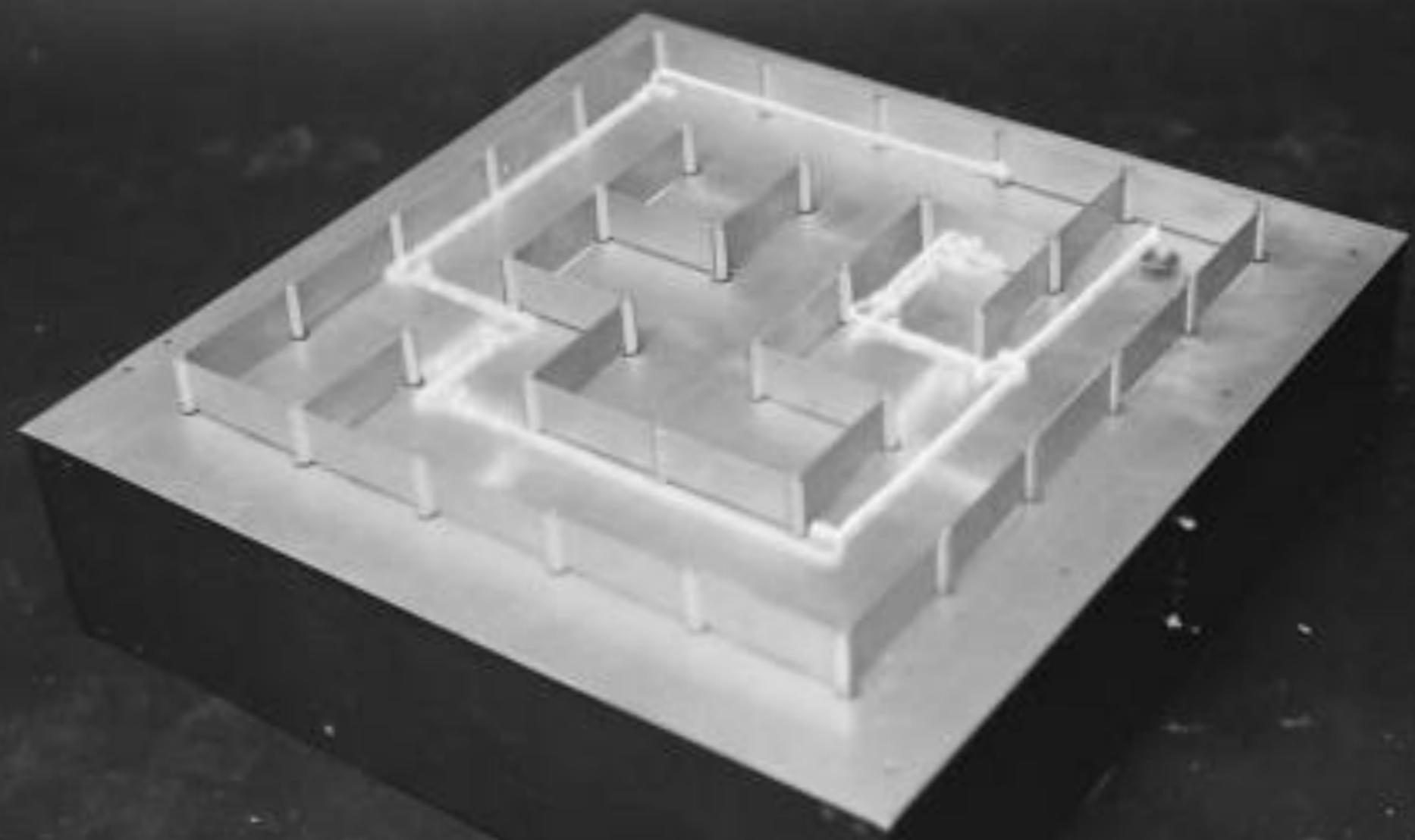


SCIENCE

Trace of Theseus' second pass, after learning









## Demonstration of Early Machine Learning with "Theseus"

By: Claude Shannon

*"Father of Information Theory"* AT&T Bell Labs

<https://www.youtube.com/watch?v=vPKkXibQXGA>

