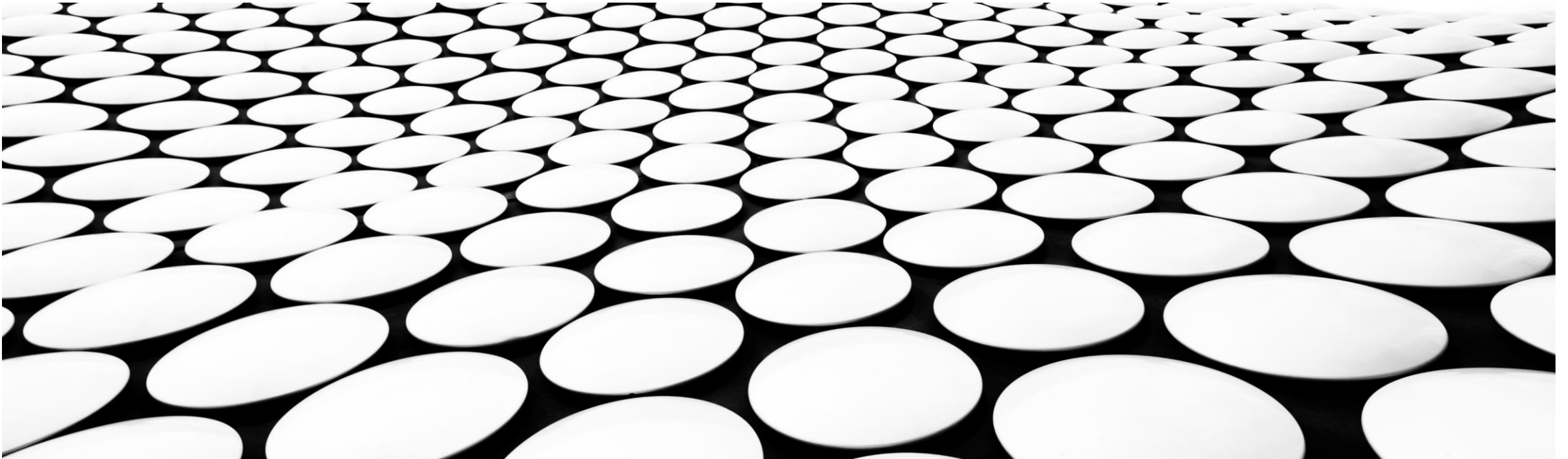


SOLUTION SPACES

BLIND AND HEURISTIC SEARCHES



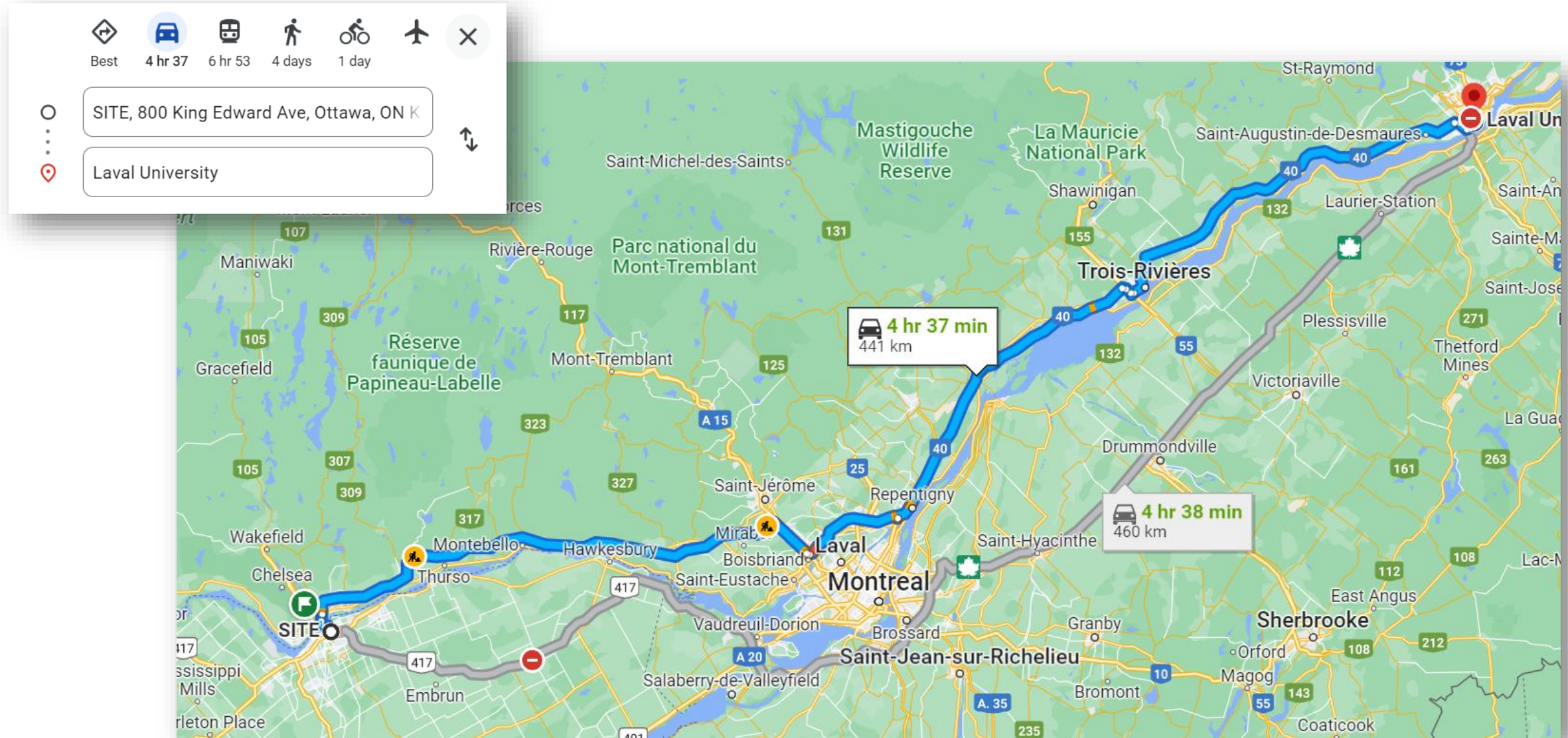
SOLUTION SPACES

- Part 1 – Examples of search problems
- Part 2 – Blind searches (review)
- Part 3 – Heuristic searches

Part 1

Types of problems

SECTOR : LOGISTICS AND TRANSPORTATION



SECTOR : LOGISTICS AND TRANSPORTATION



Roundtrip ▾ 1 traveller ▾ Economy ▾

Flying from Departing Returning

Filter by

Stops

☐ 1 stop (5) CA \$1,153

☐ 2+ stops (54) CA \$1,485

Airlines

☐ Air Canada (33) CA \$1,485

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☐ Lufthansa (10) CA \$1,603

☐ Swiss International Air Lines (9) CA \$1,485

☐ Delta (4) CA \$3,307

☐ KLM (3) CA \$5,328

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Travel and baggage

☐ Seat choice included CA \$1,263

☐ Carry-on bag included CA \$1,153

☐ No cancel fee CA \$2,509

Choose departing flight > Choose returning flight > Review your trip

Flexible dates
Compare prices for nearby days ▾

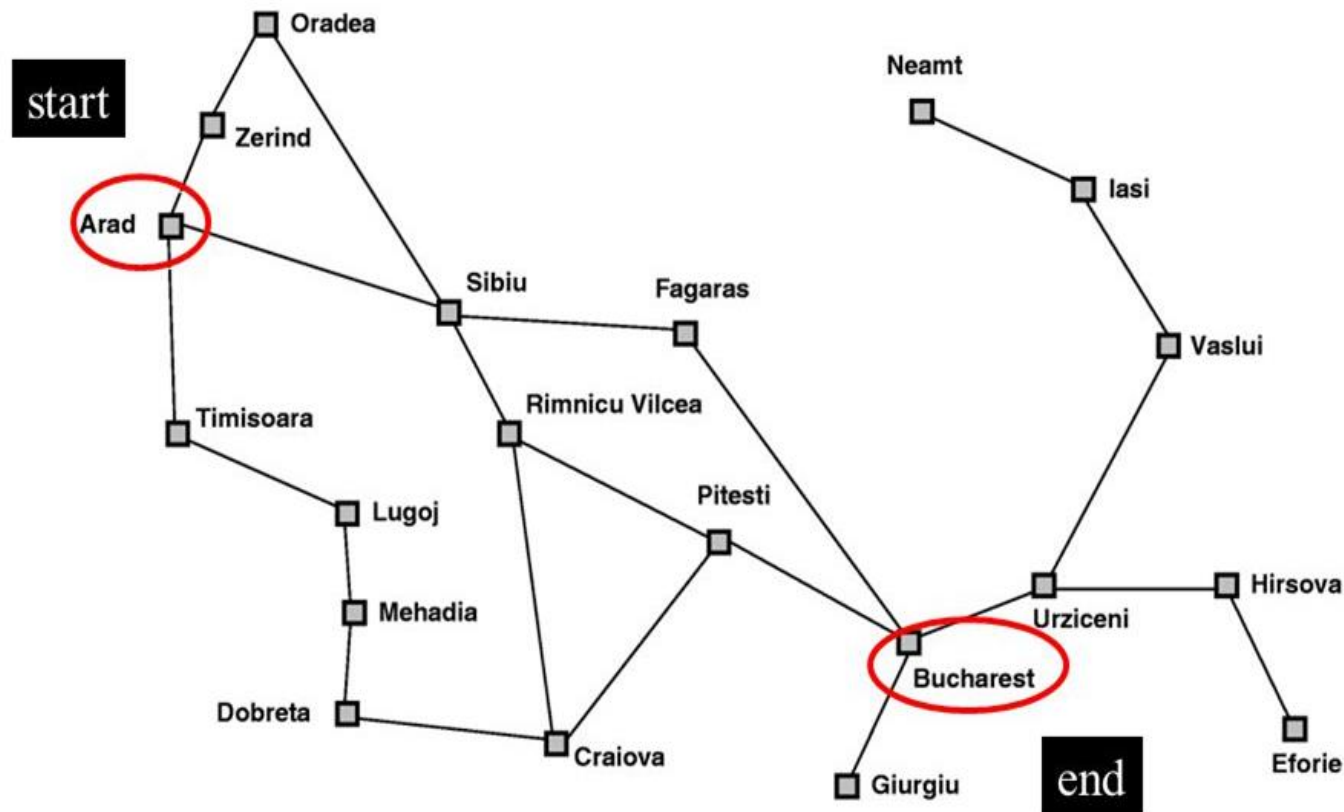
Prices displayed include taxes and may change based on availability. You can review any additional fees before checkout. Prices are not final until you complete your purchase.

Sort by
Price (Lowest) ▾

6:20 PM - 9:00 AM ⁺² Ottawa (YOW) - Barcelona (BCN) United • United 3477 operated by Republic Airways DBA United Express	32h 40m (1 stop) 23h 20m in Newark (EWR)	CA \$1,153 Roundtrip per traveller 1 left at
Carry-on included		
6:00 PM - 7:15 PM ⁺¹ Ottawa (YOW) - Barcelona (BCN) Multiple airlines	19h 15m (2 stops) 1h 37m in Toronto (YYZ) • 7h 5m in Zürich (ZRH)	CA \$1,485 Roundtrip per traveller
Carry-on included		
6:00 PM - 7:15 PM ⁺¹ Ottawa (YOW) - Barcelona (BCN) Swiss International Air Lines • Swiss International Air Lines 4680 and 4641 operated by Air Canada	19h 15m (2 stops) 1h 37m in Toronto (YYZ) • 7h 5m in Zürich (ZRH)	CA \$1,485 Roundtrip per traveller 1 left at
Carry-on included		

AI textbook typical path search problem

Arad to Bucharest



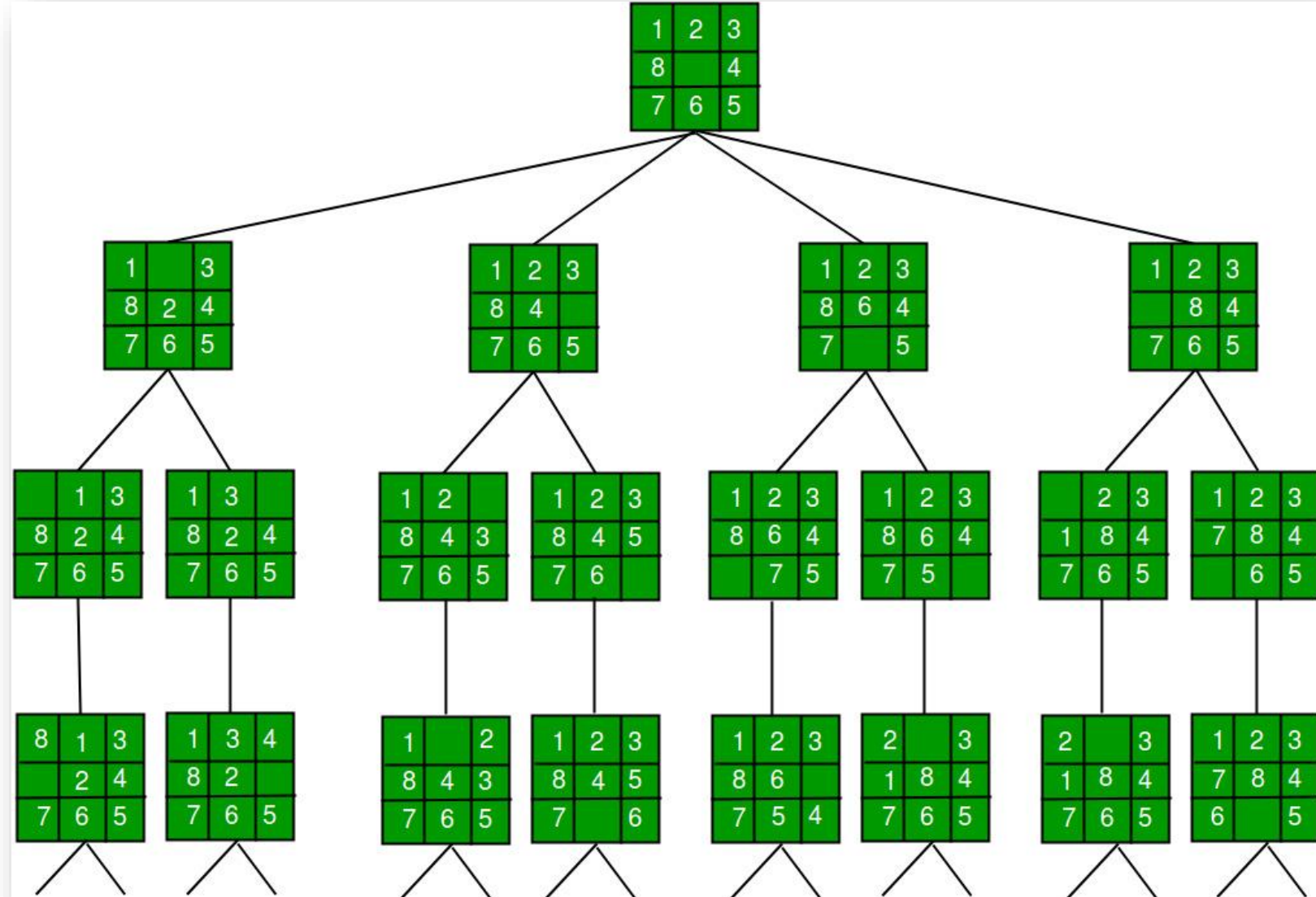
Solutions:

- A-Z-O-S-F-B
- A-Z-O-S-R-P-B
- A-Z-O-S-R-C-P-B
- A-T-L-M-D-C-P-B
- A-T-L-M-D-C-R-P-B
- ...

Game – 8 puzzle

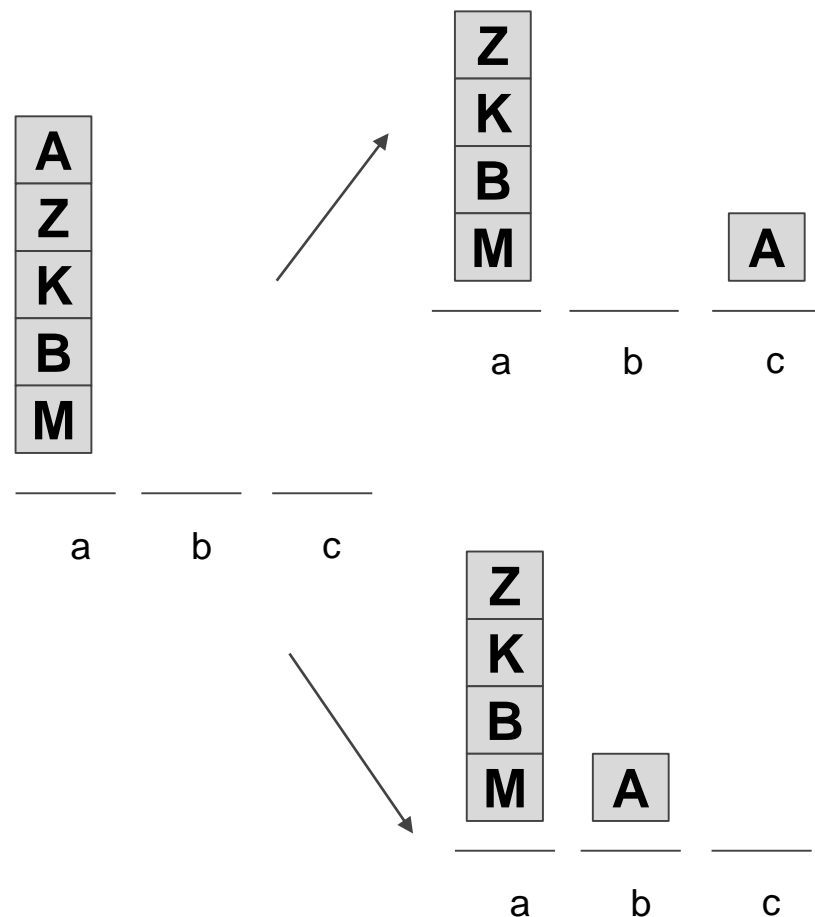
Final
configuration

1	2	3
5	8	6
	7	4

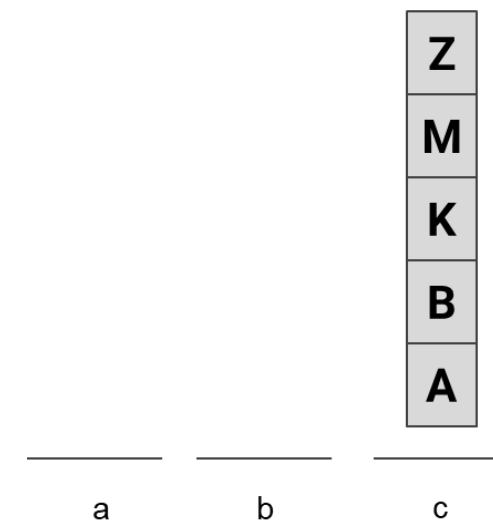


Simple robotics (bloc movement) problem

Search space for actions
from an initial to a final
state



Final state



Transforming a statement into a search problem

Sometimes, the most difficult is expressing a description as a search problem

Example: Water Jug Problem

Consider the following problem:

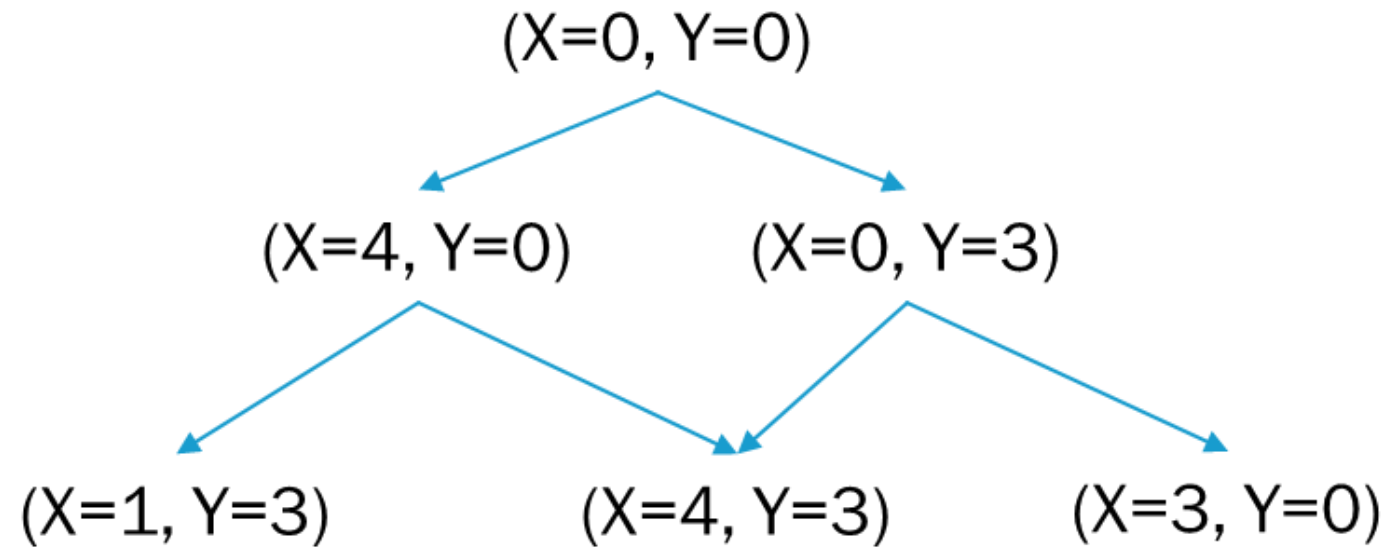
A Water Jug Problem: You are given two jugs, a 4-gallon one and a 3-gallon one, a pump which has unlimited water which you can use to fill the jug, and the ground on which water may be poured. Neither jug has any measuring markings on it. How can you get exactly 2 gallons of water in the 4-gallon jug?

X = 4-gallon jug

Y = 3-gallon jug

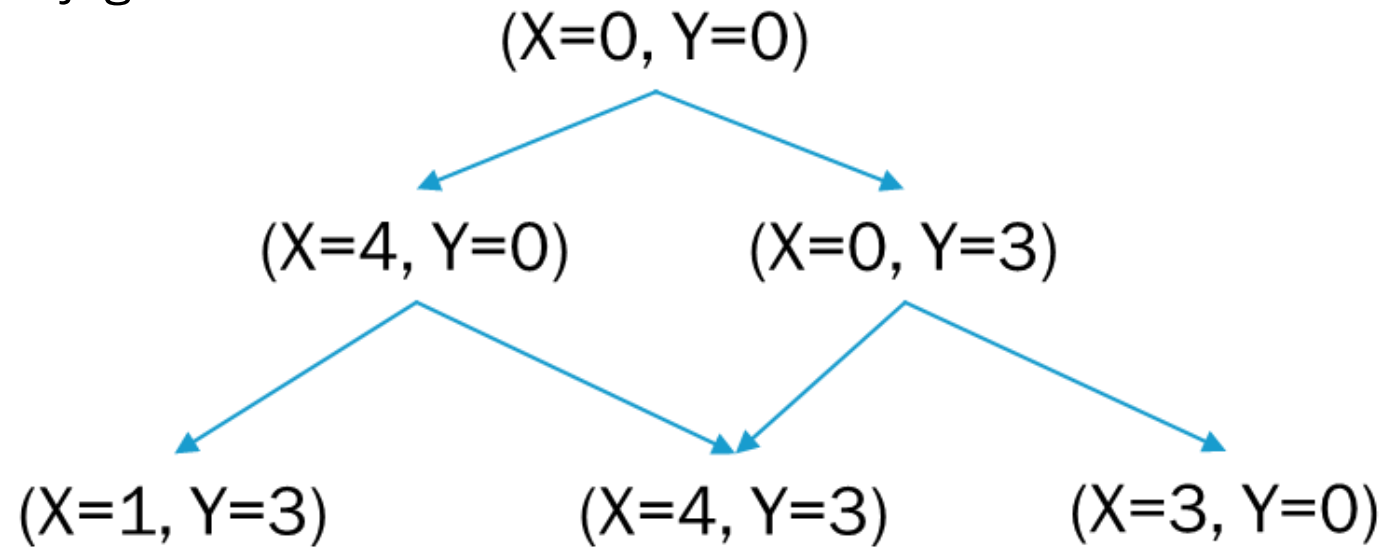
Nodes are states such that $(X=1, Y=2)$ expresses the content of jugs X and Y

Edges are actions from one state to the other.



X = 4-gallon jug

Y = 3-gallon jug



How would you express the end goal?

Scheduling problem

teacher	min	max
Peter	3	6
Jane	3	4
Anne	2	5
Yan	2	4
Dave	3	4
Mary	1	6

Each professor must teach one hour.

A single room is available.

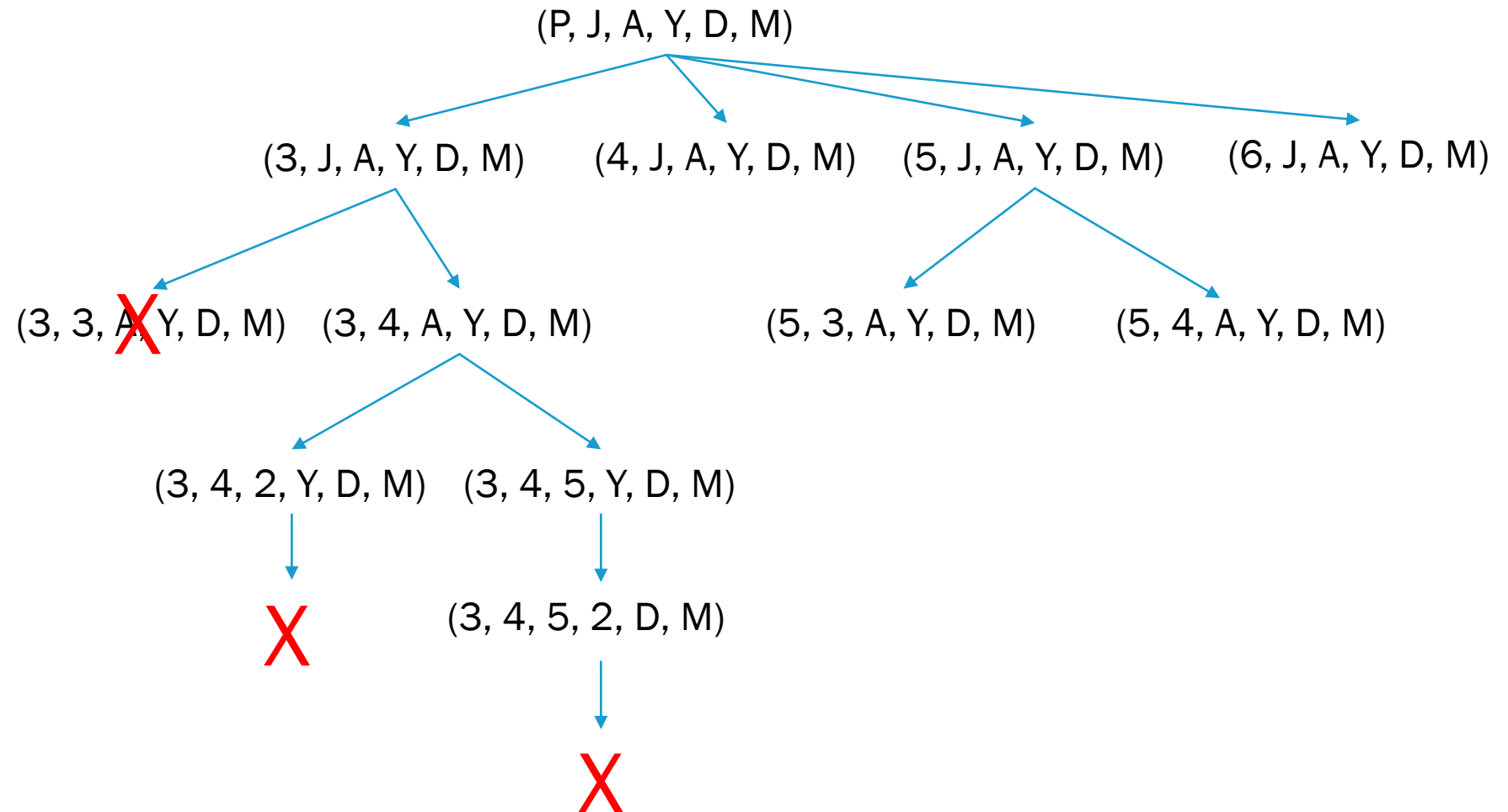
Each professor has restrictions on when they can teach.



Transform « Assign a time to each professor » as a search problem

Scheduling problem

teacher	min	max
Peter	3	6
Jane	3	4
Anne	2	5
Yan	2	4
Dave	3	4
Mary	1	6



Scheduling problem

teacher	min	max
Peter	3	6
Jane	3	4
Anne	2	5
Yan	2	4
Dave	3	4
Mary	1	6

Search space is sometimes restricted by hard constraints, we can use them to speed up the search

(P, J, A, Y, D, M)

Solutions:

(6,3,5,2,4,1) ou (6,4,5,2,3,1)

Goal of algorithms :

- Searching for any solution
- Searching for a « good-enough » solution
 - Limited by processing time
 - Limited by number of actions in solution
 - Provided with a threshold (e.g. maximum time for an itinerary)
- Searching for an optimal solution:
 - Find the best solution.
- Search for all valid solutions.
- Detect where there is no solution.

What would be the goal for each problem presented?

- Suggested itineraries (Google Maps or other services)
- Suggested flight itineraries
- 8-puzzle game
- Manipulating a robot arm to move blocks
- Set of operations for filling a vase
- Assigning teachers to a class



IN SUMMARY

- Examples of search problems
- Characteristics of search problem solutions

Part 2

Blind searches

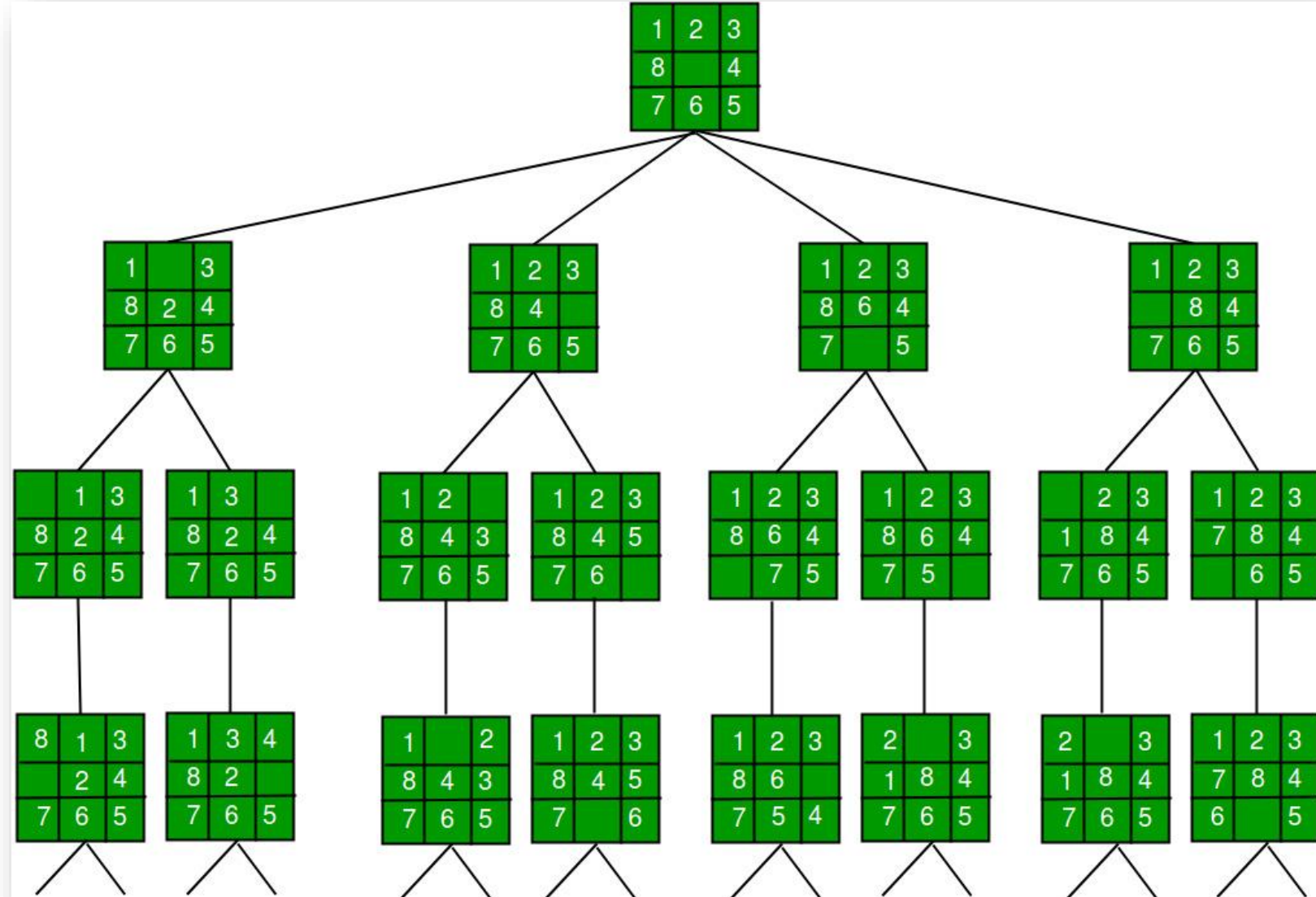
What characterizes a blind search?

- Representation of the space in the form of a directed graph (nodes/states + edges).
- No knowledge of the domain.
- No forward view, except for the list of neighboring nodes
- Memory of visited states/nodes.
- Memory of path used to visit the states.
- Ability to recognize the end state.

Game – 8 puzzle

Final
configuration

1	2	3
5	8	6
	7	4

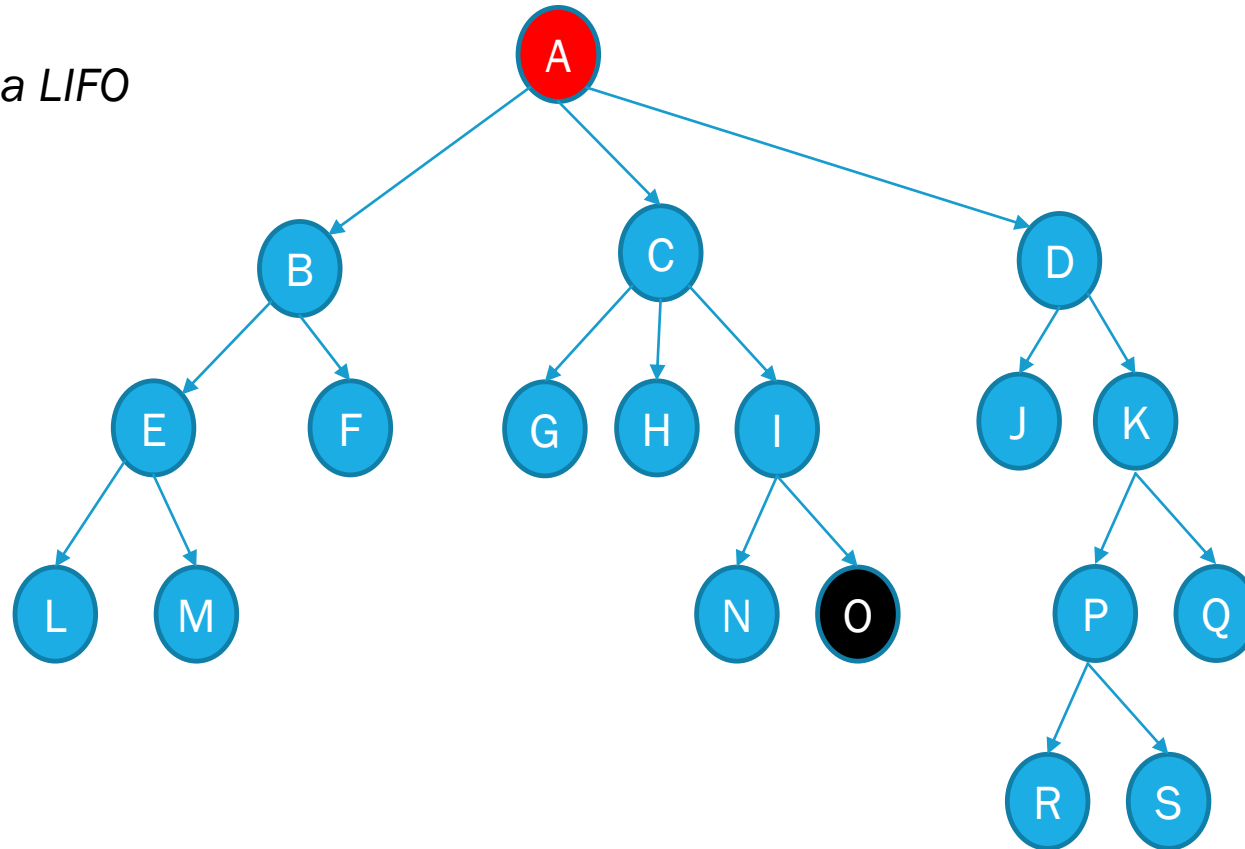


Algorithms

- Depth-first search
- Breadth-first search
- Lowest-cost first search

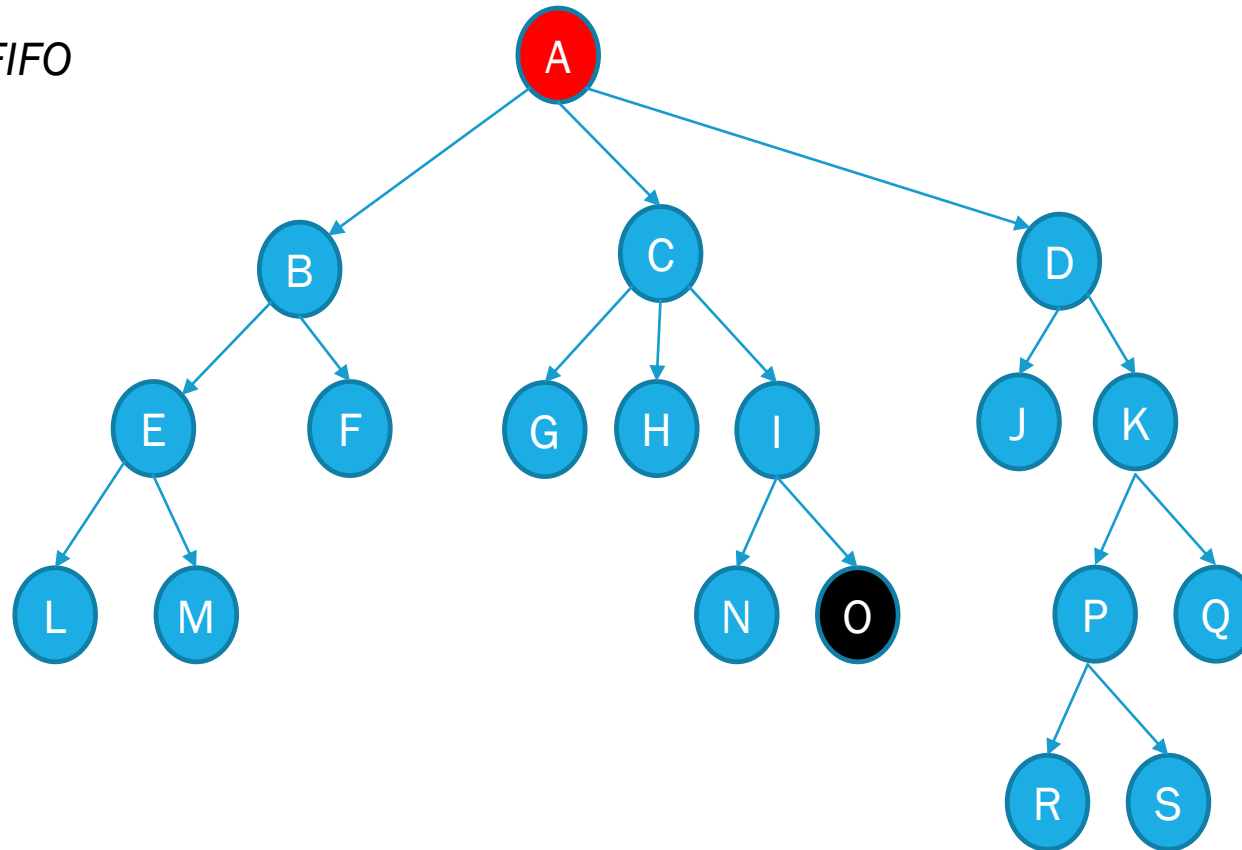
Depth-first Search

Implemented as a LIFO



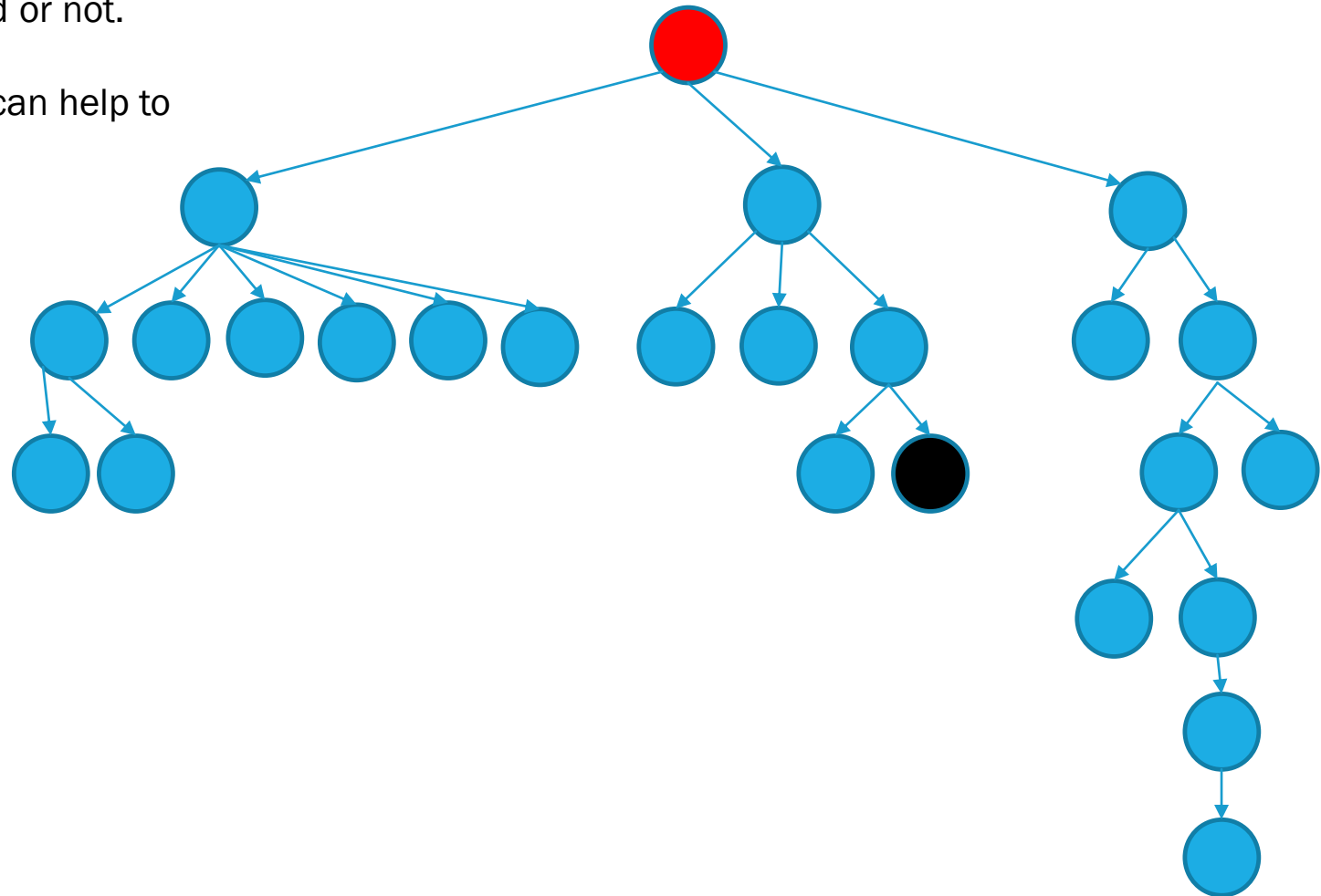
Breadth-first search

Implemented as a FIFO



Which to choose?

- Each approach can be problematic depending on whether the tree (or graph) is balanced or not.
- A minimum knowledge of the domain can help to know the topology of the graph.

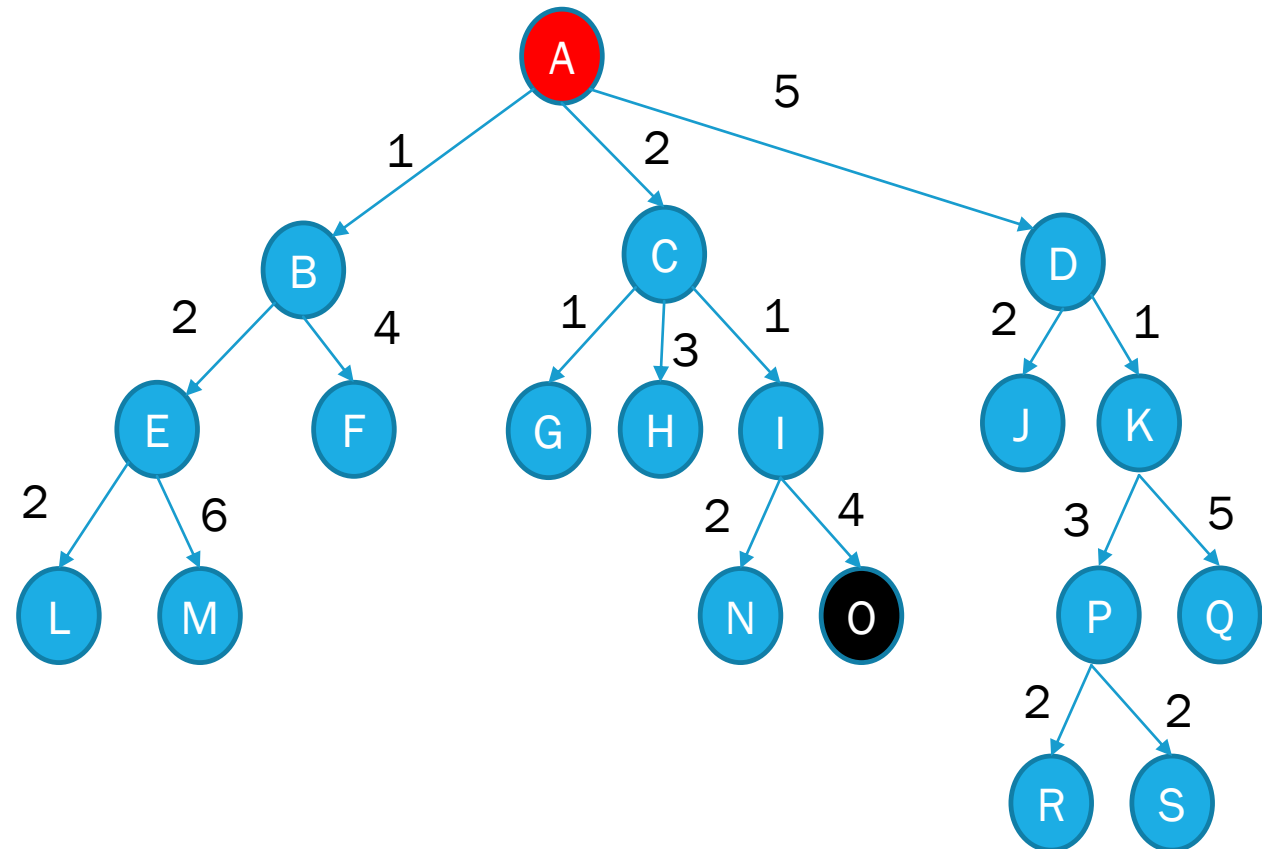


Lowest-cost first search

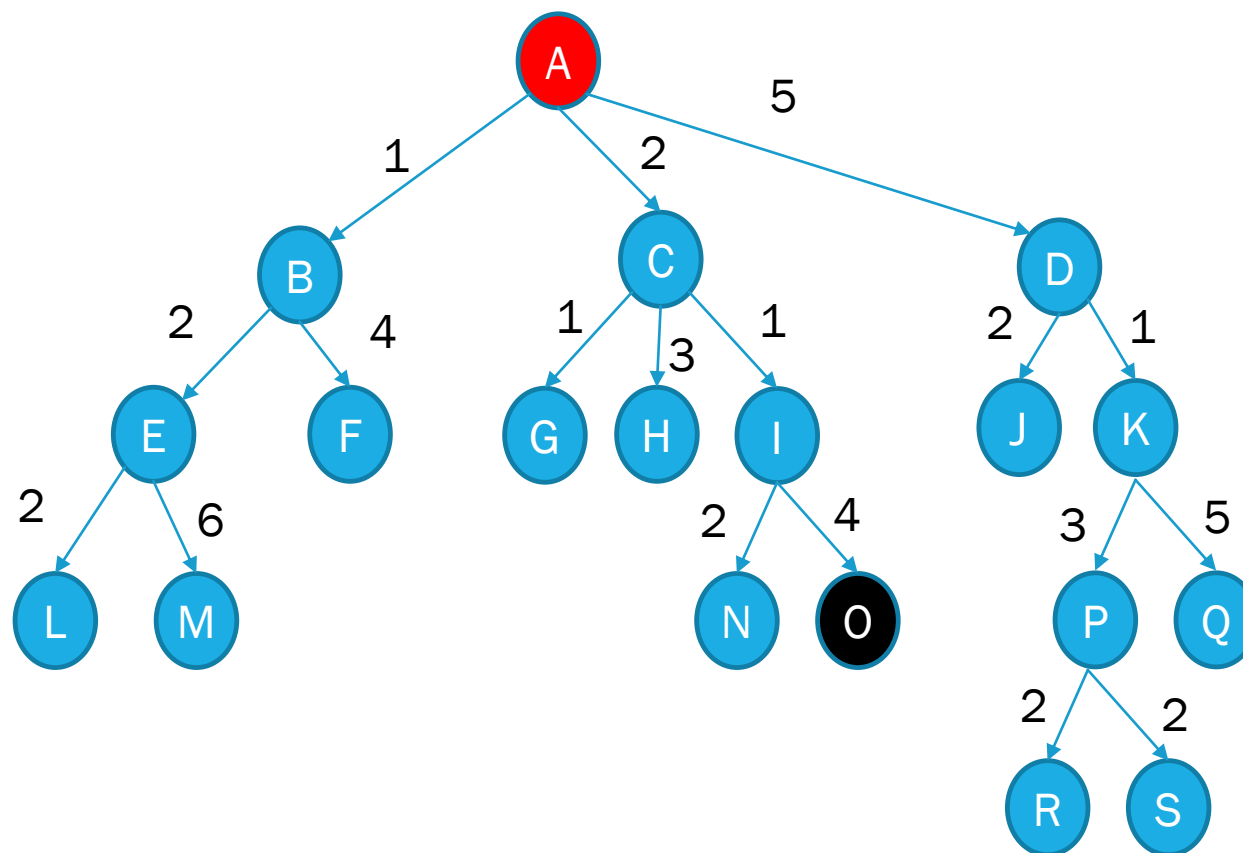
Contrarily to depth-first or breadth-first, the edges are not of uniform cost.

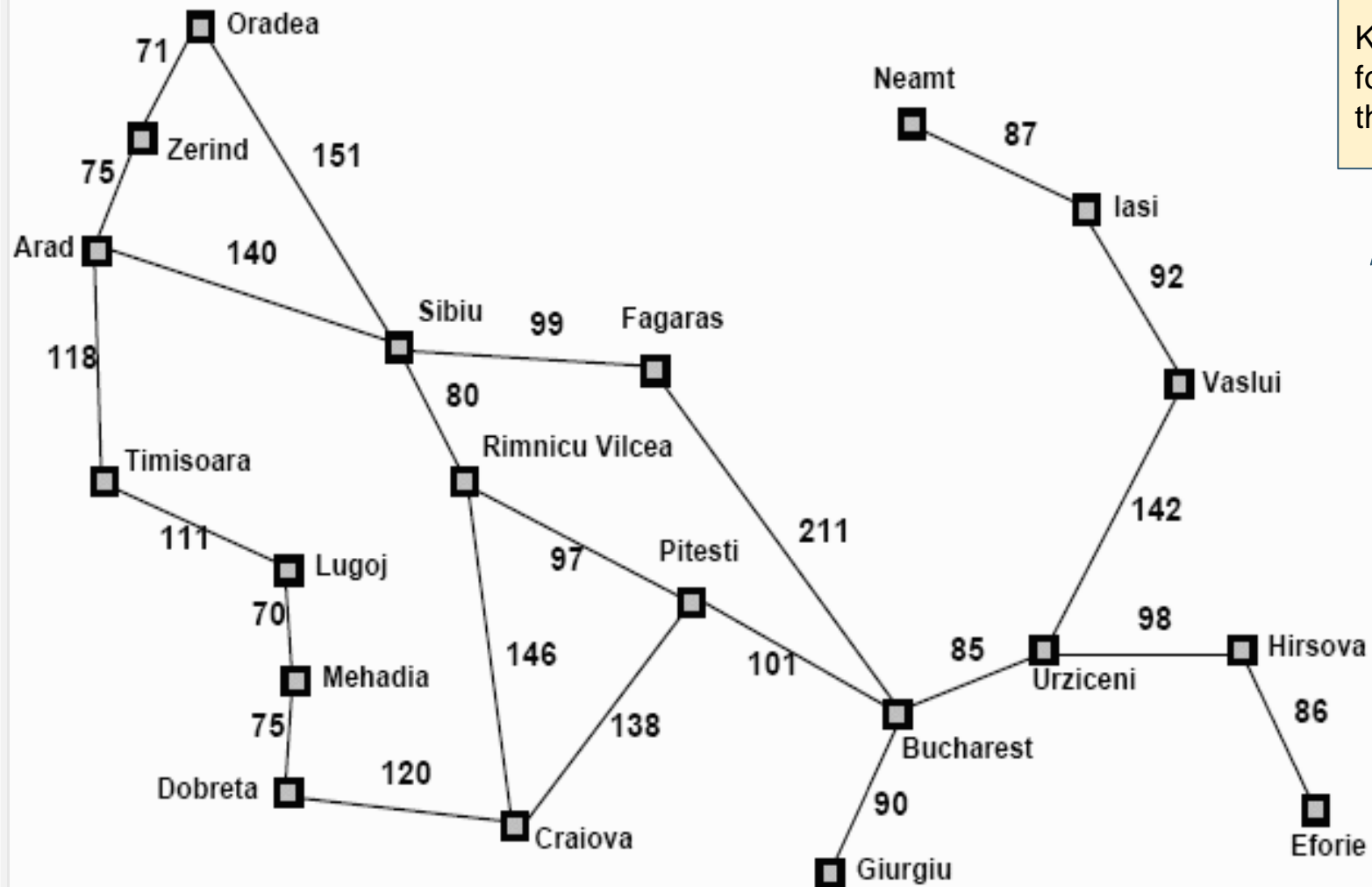
Search for *OPTIMAL* solution.

ATTENTION: The “lowest-cost” used is the cost of the path done so far.



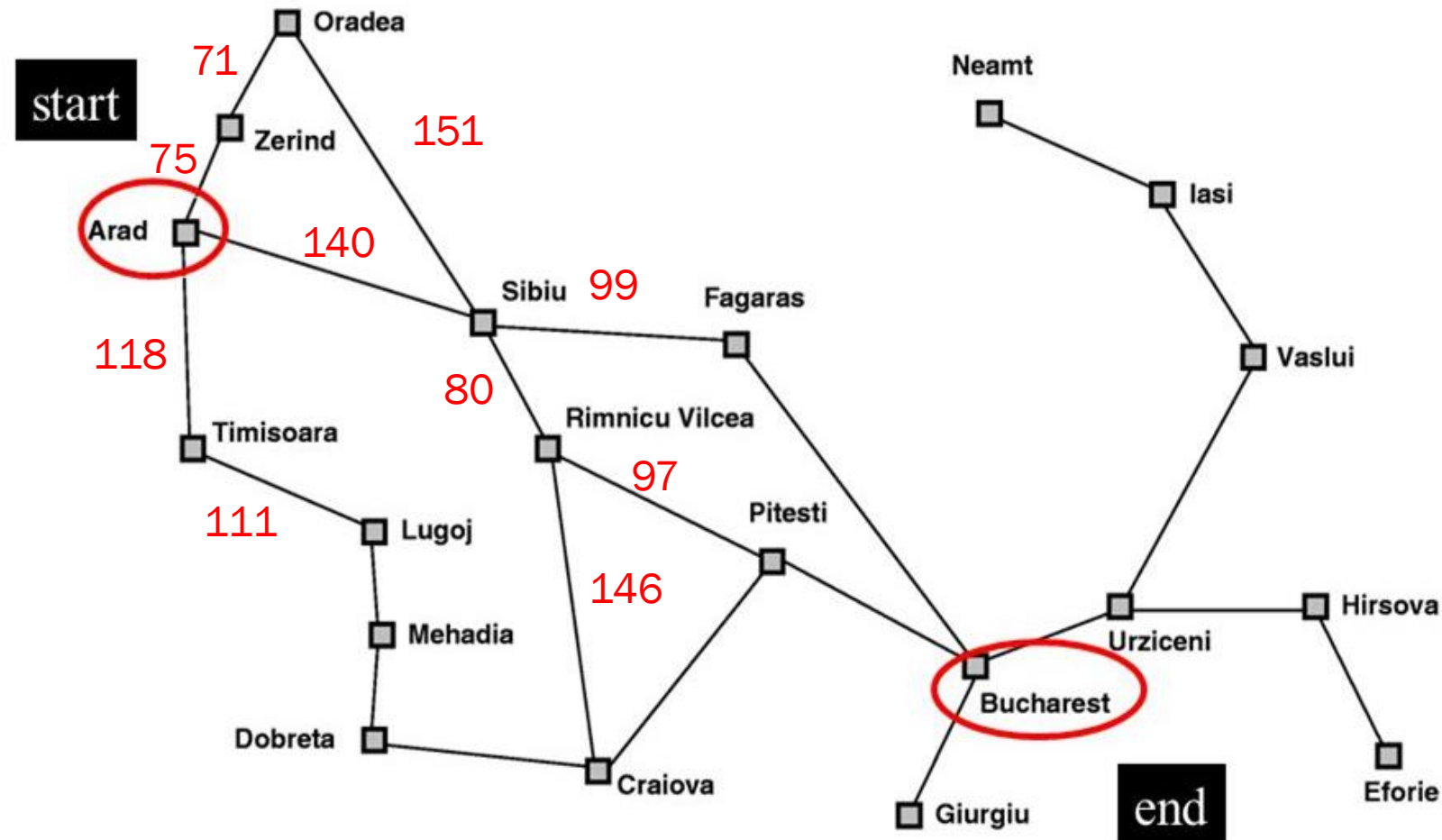
Lowest-cost first search





Knowledge of path followed so far (not the upcoming one).

Arad to Bucharest



Continue the search



IN SUMMARY

- Definition of blind search
- Three algorithms:
 - Depth-first search
 - Breadth-first search
 - Lowest-cost-first search

Part 3

Heuristic Searches

Chapter 3, Searching for Solutions, **Section 3.6 Heuristic Search**, from
Artificial Intelligence, Foundations of Computational Agents

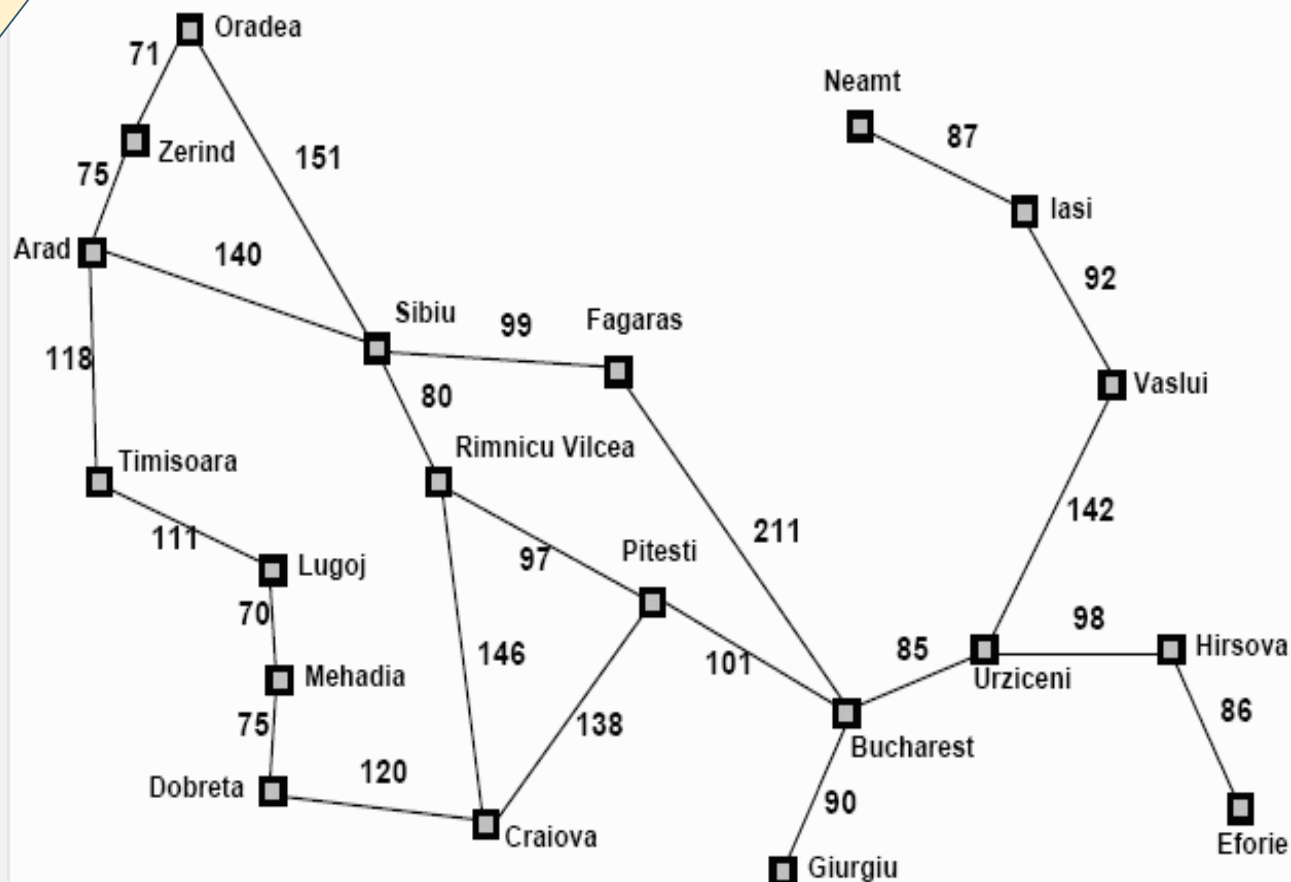


A heuristic search considers **knowledge of the problem** to explore **some** (not all) successors of the current state. This means pruning the state space, gaining speed, but perhaps missing the solution!

As opposed to blind search, a heuristic search has a “look-ahead” method it can use to **estimate how close a state is to the goal**.

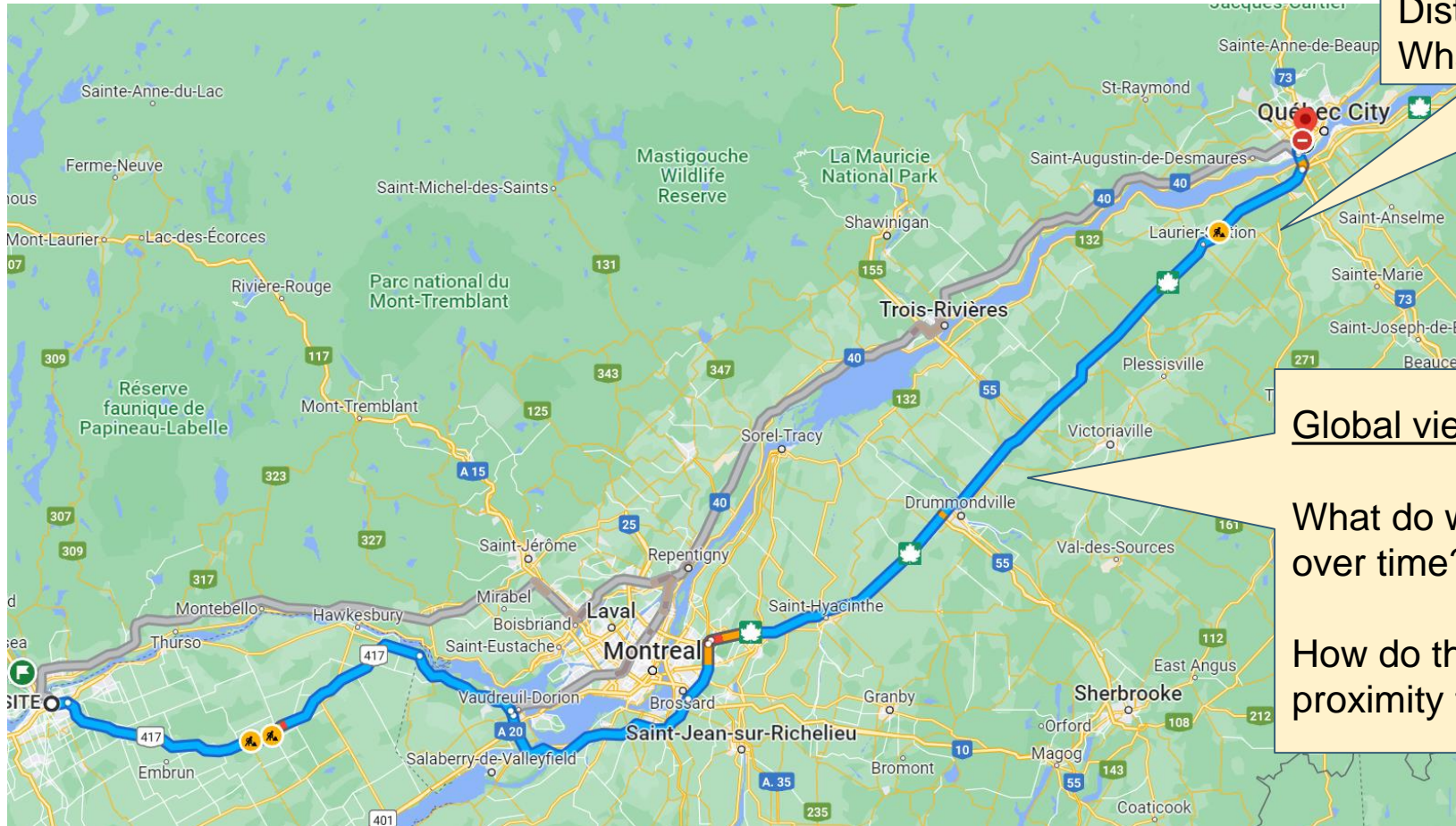
Local view:
Distance to next city.

Global view:
Underestimate. Straight line distance.



Straight-line distance
to Bucharest

Arad	366
Bucharest	0
Craiova	160
Dobreta	242
Eforie	161
Fagaras	178
Giurgiu	77
Hirsova	151
Iasi	226
Lugoj	244
Mehadia	241
Neamt	234
Oradea	380
Pitesti	98
Rimnicu Vilcea	193
Sibiu	253
Timisoara	329
Urziceni	80
Vaslui	199
Zerind	374



Local view:

Distance to next city.
What else??

Global view:

What do we know from statistics gathered over time?

How do those help provide an estimate of the proximity to the goal?

Important factor in route planning.
What does the delivery robot sees and/or knows?

Local: its position and the surrounding rooms

Global: full floor plan

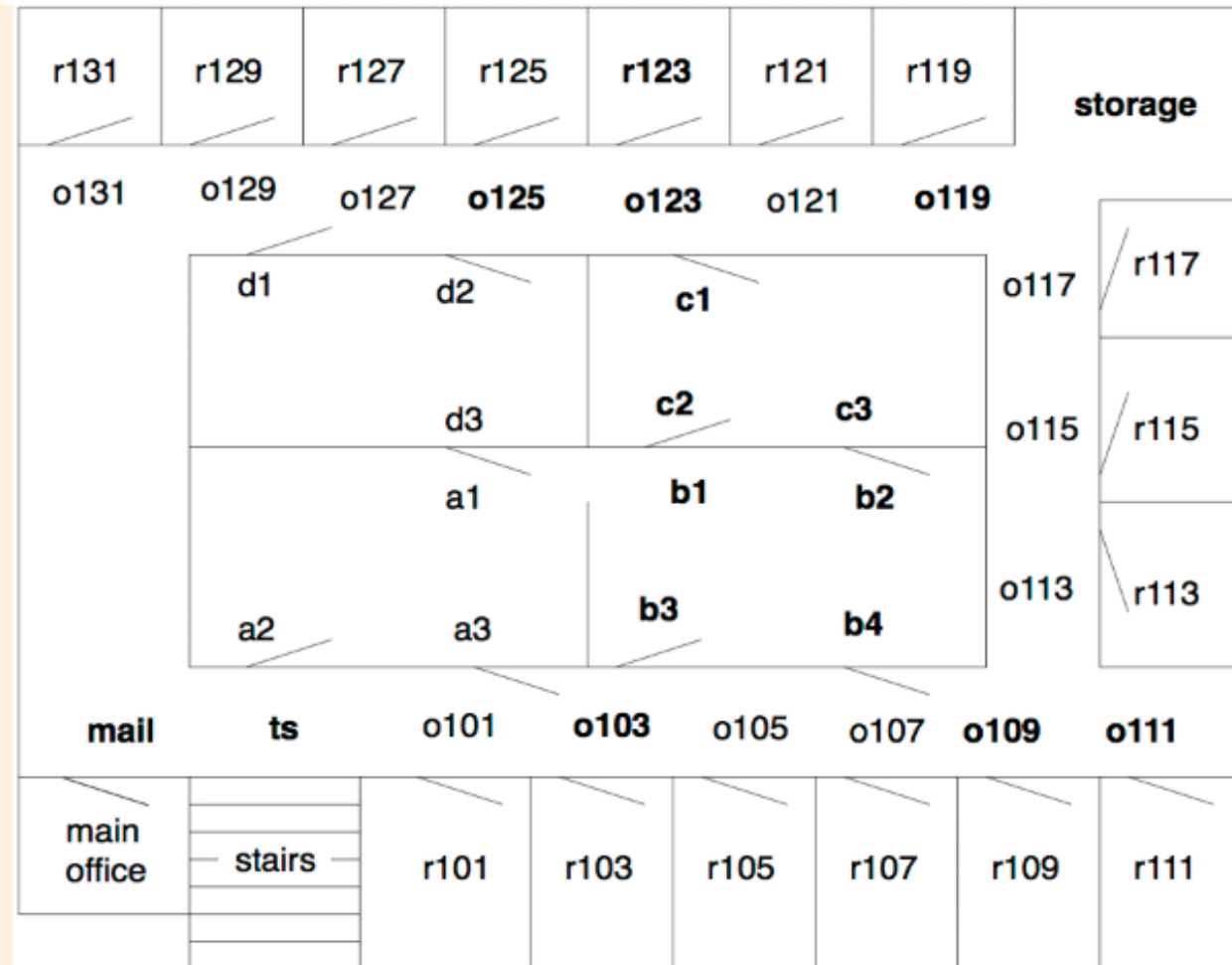
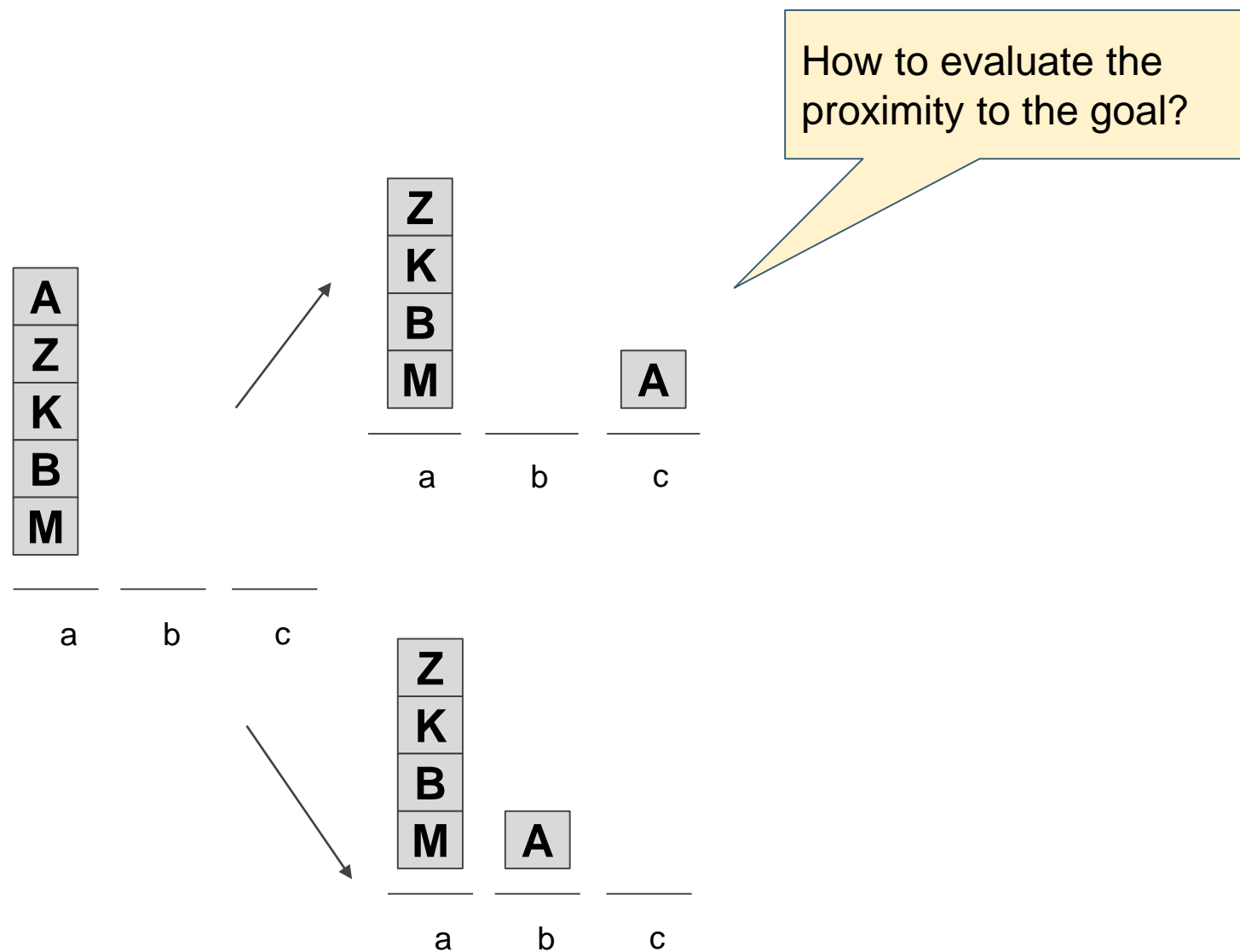
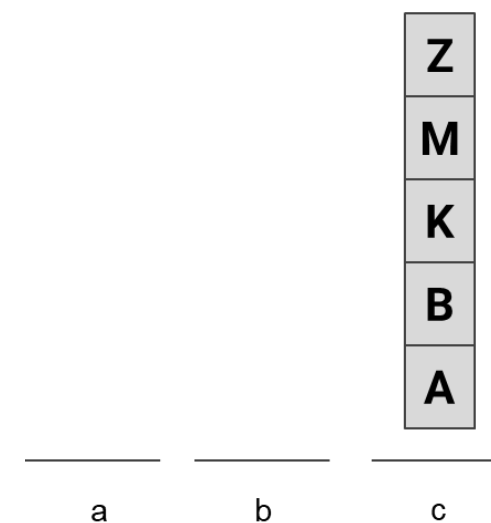
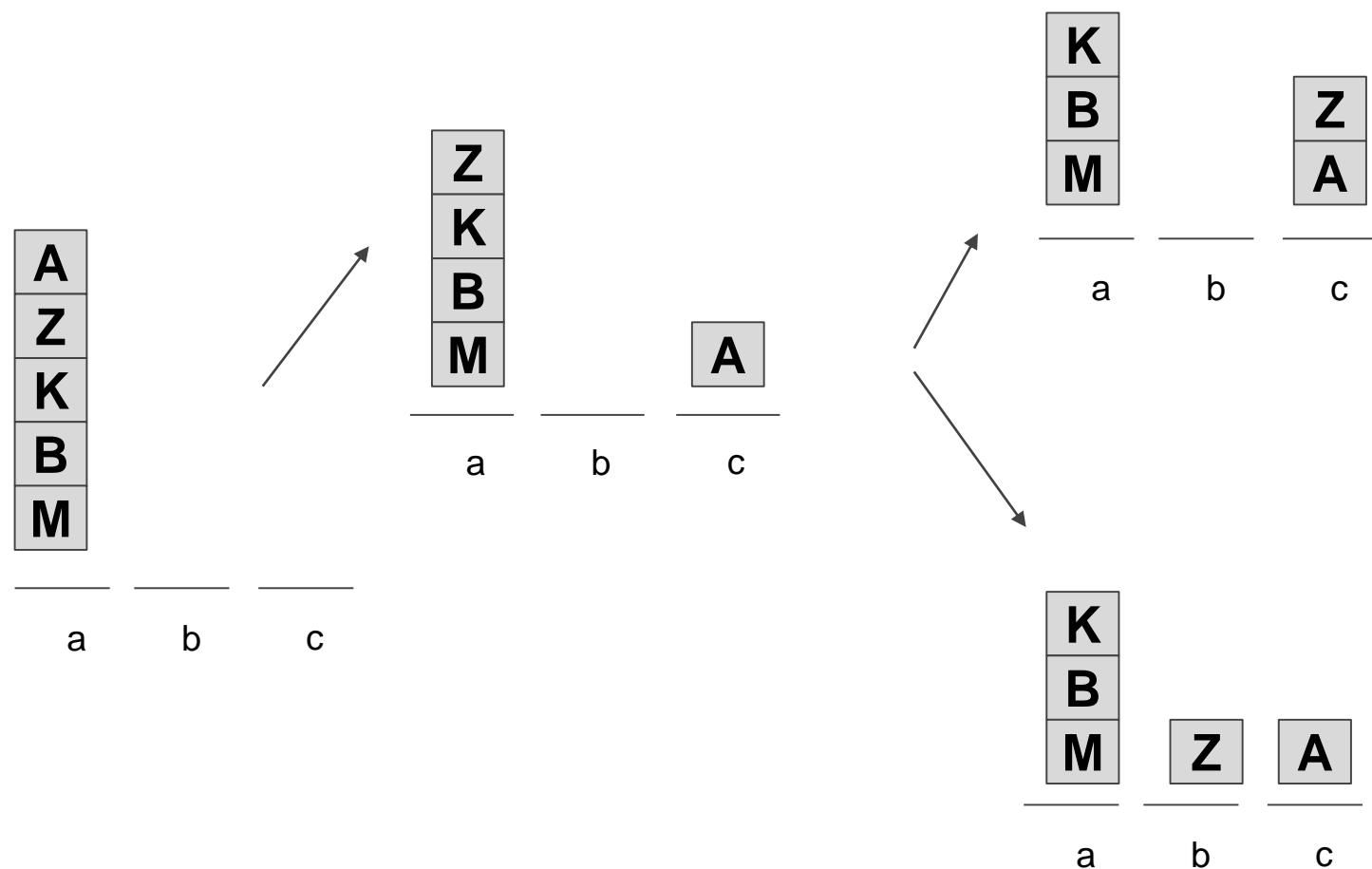


Figure 3.1: The delivery robot domain with interesting locations labeled

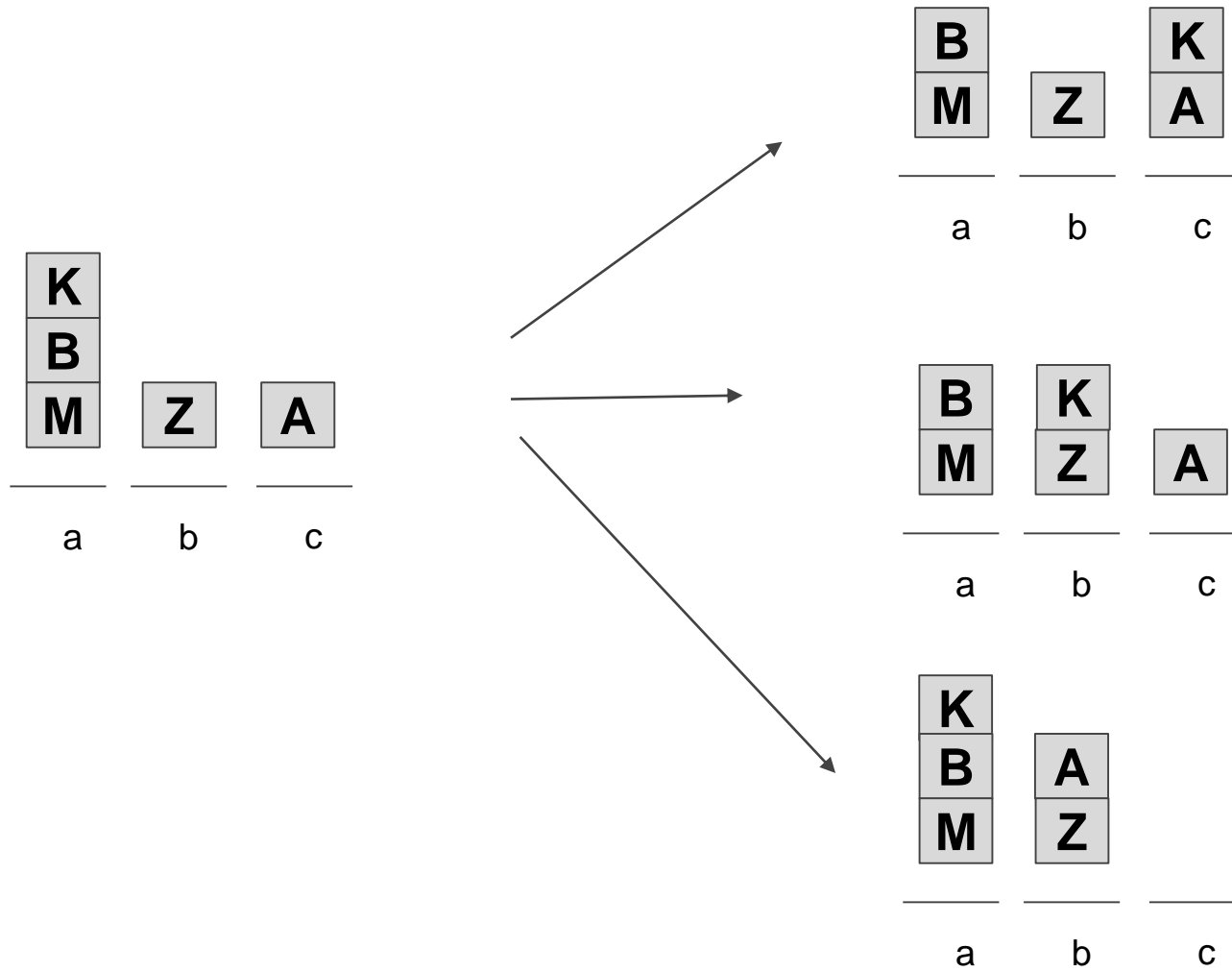


Final state





A good “heuristic”
would provide a
proximity to the goal.

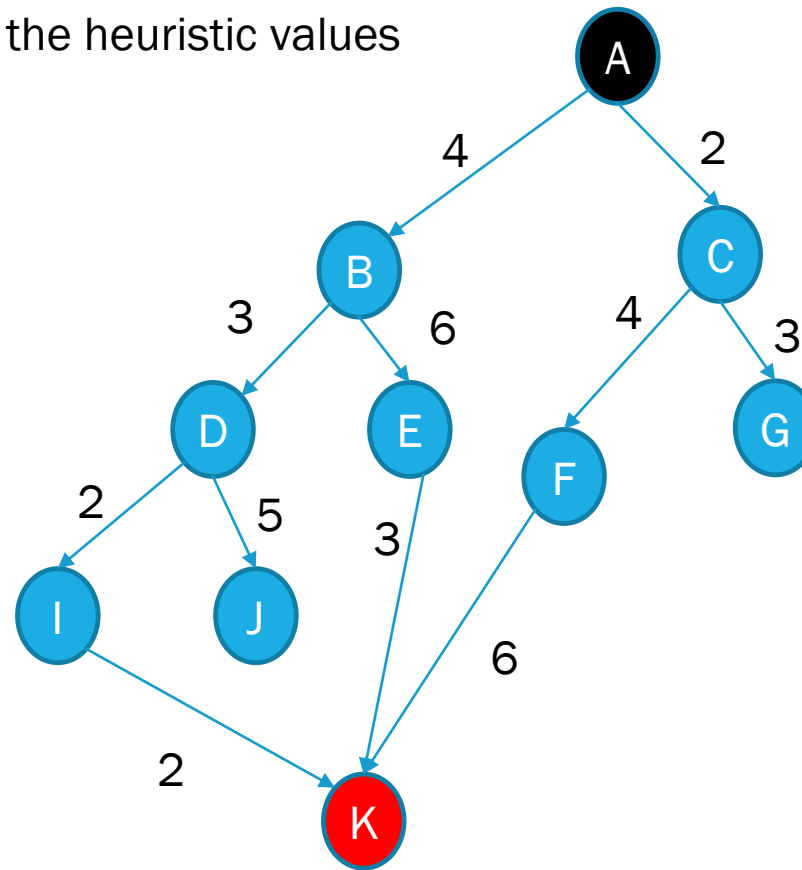


Algorithms

- Best-first search
- A*

Best-First Search

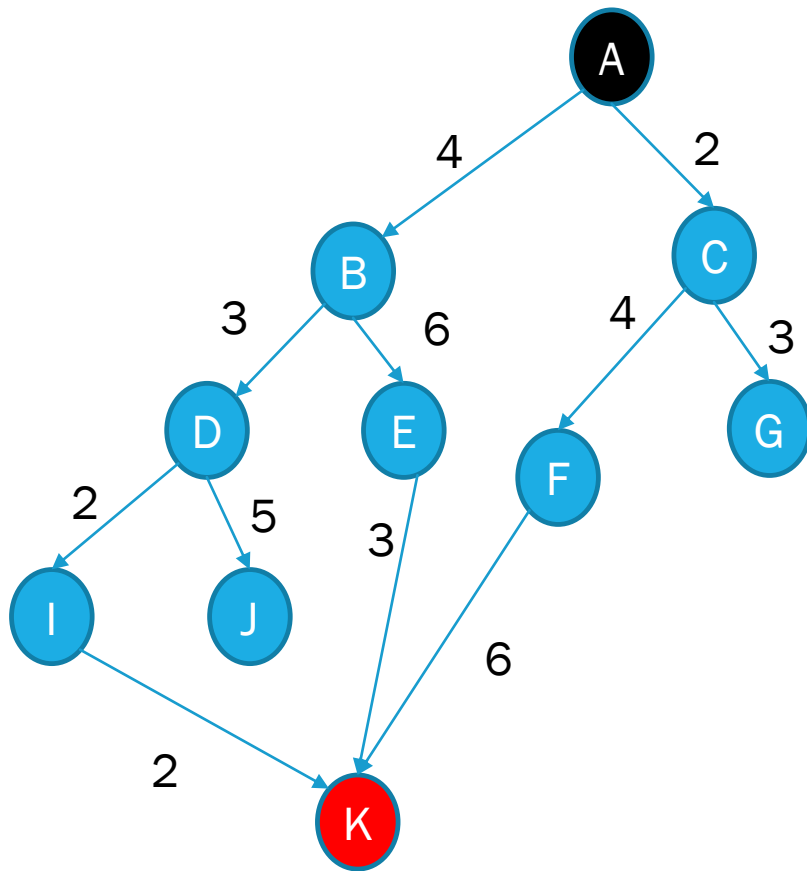
- Non-optimal.
- This algorithm completely trusts the heuristic values



Estimated distance to K

$H(A) = 10$
 $H(B) = 7$
 $H(C) = 8$
 $H(D) = 4$
 $H(E) = 3$
 $H(F) = 6$
 $H(G) = 20$
 $H(I) = 2$
 $H(J) = 20$

Best-First Search



Estimated distance to K

$H(A) = 10$
 $H(B) = 7$
 $H(C) = 8$
 $H(D) = 4$
 $H(E) = 3$
 $H(F) = 6$
 $H(G) = 20$
 $H(I) = 2$
 $H(J) = 20$

Opening order :

A --- B(7), C(8)
 B -- D(4), E(3)
 E -- K
 K

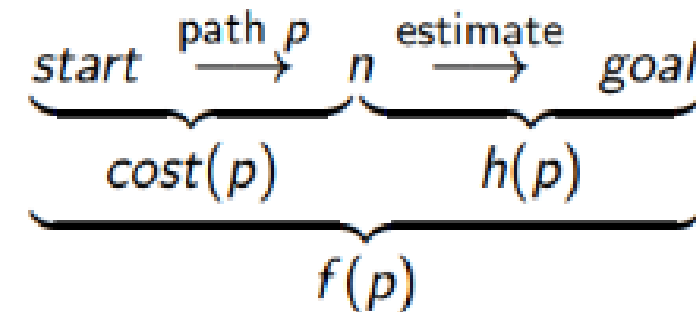
A* algorithm

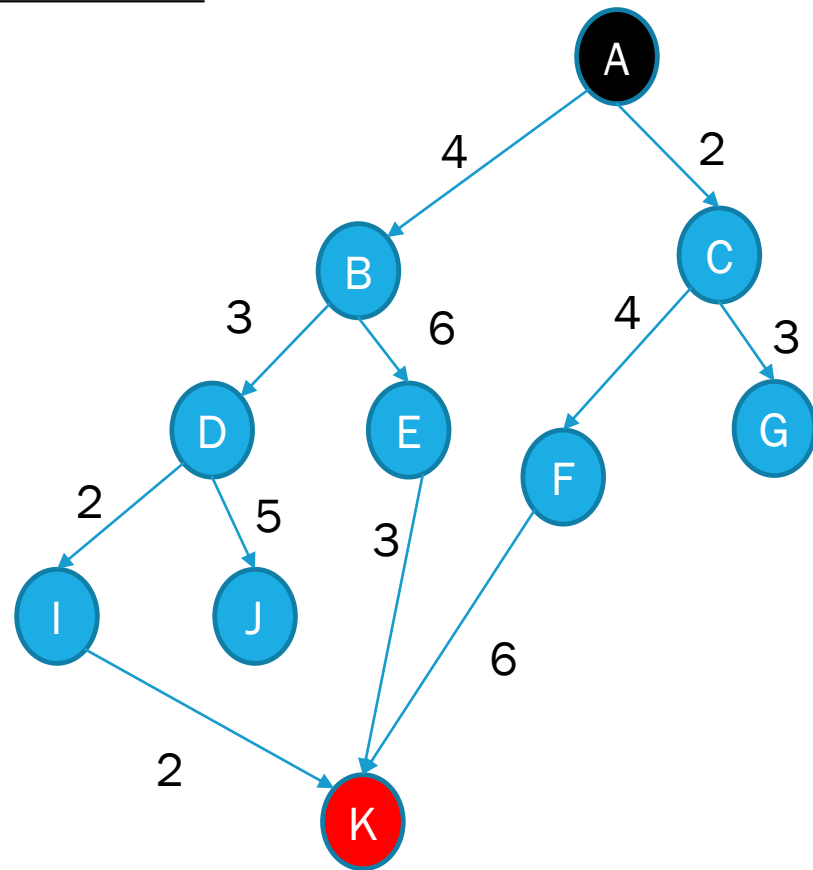
Optimal solution.

A* search combines the lowest-cost search and the best-first search. It looks behind and in front.

The evaluation function for the choice of the path to pursue on the frontier becomes:

For A to lead to an optimal solution, $h(p)$ must be an underestimate.*



A* Search

Estimated
distance to K

$$H(A) = 10$$

$$H(B) = 7$$

$$H(C) = 8$$

$$H(D) = 4$$

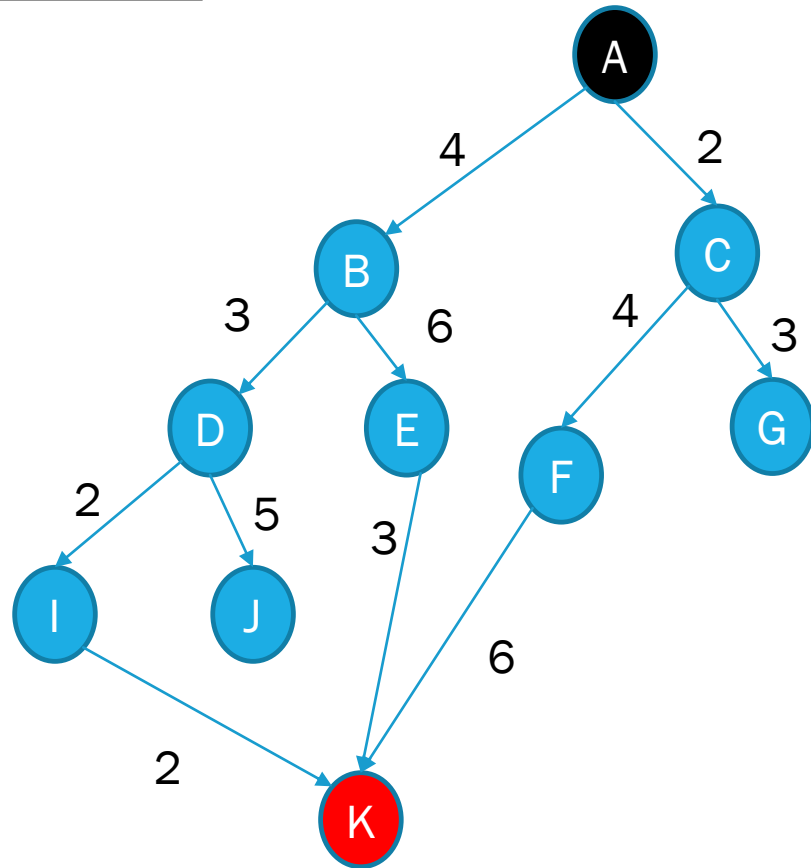
$$H(E) = 3$$

$$H(F) = 6$$

$$H(G) = 20$$

$$H(I) = 2$$

$$H(J) = 20$$

A* Search

Estimated distance to K

$$H(A) = 10$$

$$H(B) = 7$$

$$H(C) = 8$$

$$H(D) = 4$$

$$H(E) = 3$$

$$H(F) = 6$$

$$H(G) = 20$$

$$H(I) = 2$$

$$H(J) = 20$$

Opening order:

A --- B(4+7), C(2+8)

C -- F(2+4+6), G(2+3+20)

B -- D(4+3+4), E(4+6+3)

D - I (4+3+2+2), J(4+3+5+20)

I - K (4+3+2+2)

Path: A-B-D-I-K



IN SUMMARY

- Definition of heuristic search
- Presentation of two algorithms:
 - Best-first Search
 - A*



SOLUTION SPACES

- Part 1 – Examples of search problems
- Part 2 – Blind searches (review)
- Part 3 – Heuristic searches