

UIT2504 Artificial Intelligence

Problem Solving Agents

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Introduction

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 - Given a map of cities, find a shortest Hamiltonian Circuit (Traveling Salesperson Problem)

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 - Given n objects of known weights w_1, w_2, \dots, w_n and values v_1, v_2, \dots, v_n and a knapsack of capacity W , find the most valuable subset of the items that fit into the knapsack (Knapsack Problem)

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- Is there any common approach to solve such problems? — general purpose problem solving approach

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- “Formulate” the problem in “state space” and “search” for a “solution”

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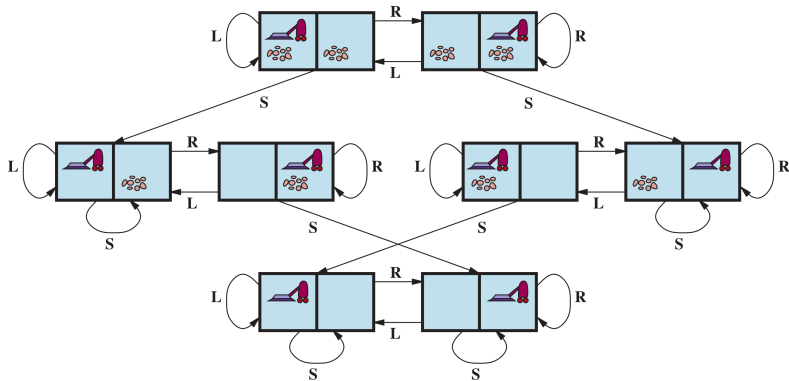
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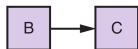
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- There is an “initial” state for the system and some “goal” states to terminate

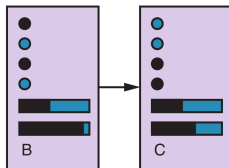
State-Graph



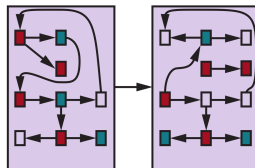
Recall: Granularity of state definition



(a) Atomic



(b) Factored



(c) Structured

Illustration: 8-Puzzle

3	2	7
5	8	
1	4	6

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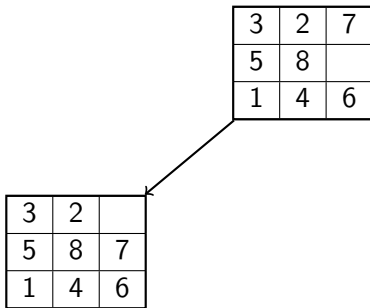


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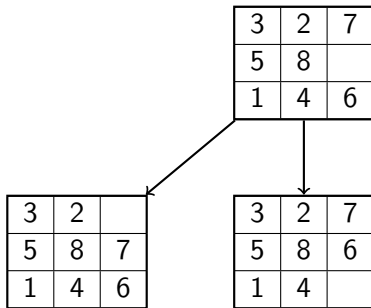


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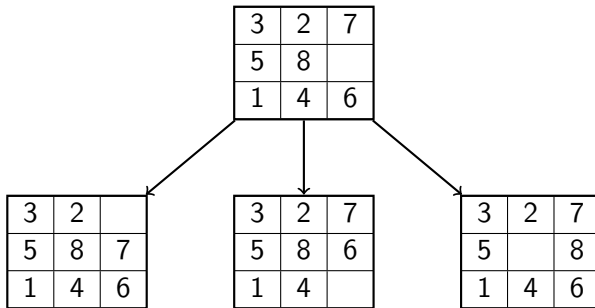


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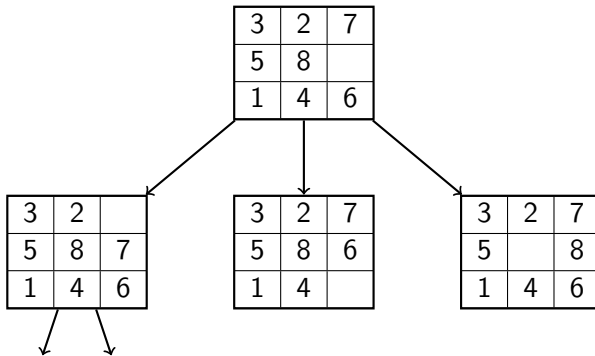


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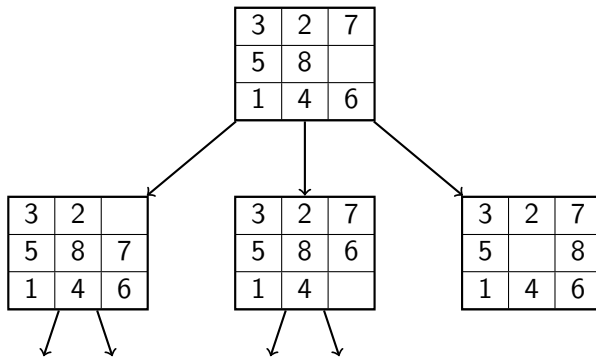


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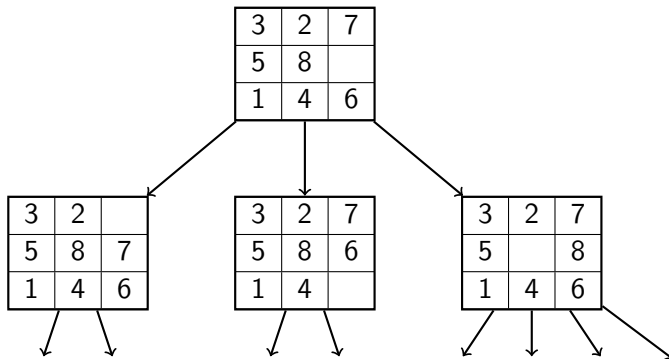
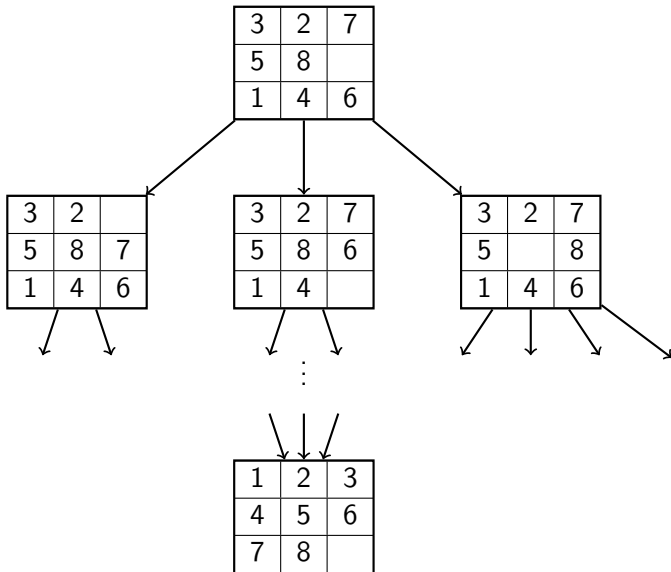


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- In some cases, goal state itself is a solution!

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 - An **action cost function** that gives cost of applying an action in a given state **Path cost** — sum of all the costs of actions from initial state to a goal state

Example: 8-Puzzle

- *State:*

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- *State*: Arrangement of eight tiles on a 3×3 grid

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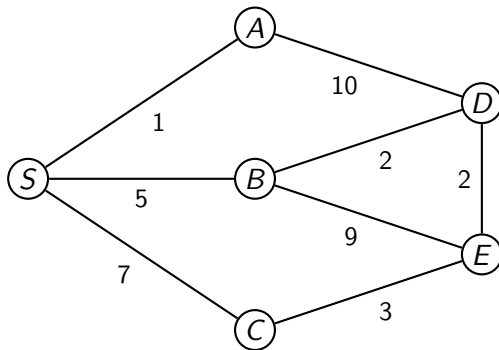
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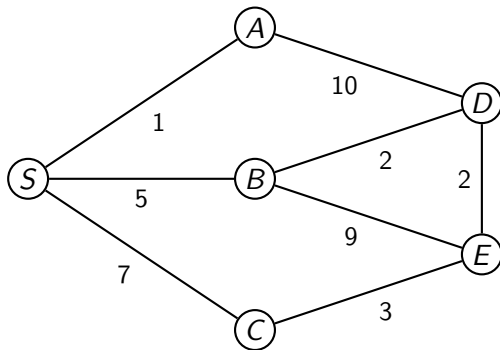
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- *Action cost*: unit cost for each action

Example: Route finding problem



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Find a route from S to E

Example: Route finding problem

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- *Goal test*: Current city matches the destination
- *Action cost*: Cost associated with the road taken

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- *Goal test*: 8-queens on a chess board — none attacked

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- How many paths are there in the search tree?

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- Only 2057 possible sequences!!!

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- **Complete state formulation** — only one state is kept in memory — and it is iteratively improved

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 - Choose and remove a state x from the working set
 - If it is a goal state, return solution
 - Else, expand x and add the successor states $S(x)$ to the working set

- Uninformed:
 - Depth-First
 - Breadth-First
 - Depth-Limited
 - Bi-Directional Search
- Informed (Heuristics):
 - Best-first Greedy
 - A^*
 - Local Search Strategies
- Constraint Satisfaction

Performance Measures

- Completeness
- Time Complexity
- Space Complexity
- Optimality

Questions?

- Read Chapter 3