



Problem Solving by Searching

Prepared by

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Problem-Solving Agents

- Intelligent agents can solve problems by searching a state space
- State-space Model
 - The agent's model of the world
 - Usually a set of discrete states
 - E.g., in driving, the states in the model could be towns/cities
- Goal State(s)
 - A goal is defined as a desirable state for an agent
 - There may be many states that satisfy the goal condition
 - E.g., drive to a town with a ski resort
 - Or just one state that satisfies the goal
 - E.g., drive to Moulvibazar
- Operators (actions, successor function)
 - Operators are legal actions that the agent can take to move from one state to another

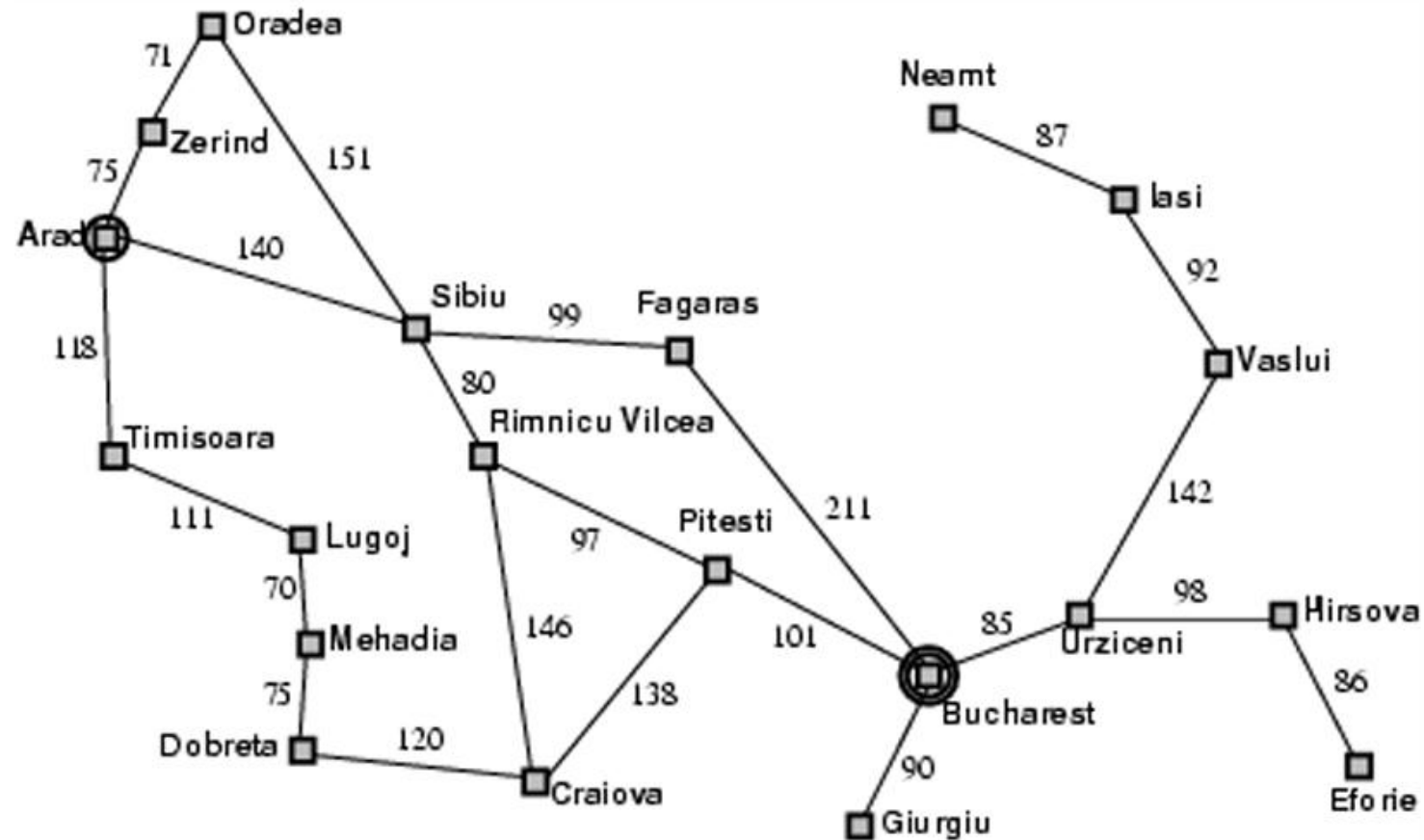
Initial Simplifying Assumptions

- The environment is **static**
 - No changes in the environment while the problem is being solved
- The environment is **observable**
- The environment and actions are **discrete**
 - (Typically assumed, but we will see some exceptions)
- The environment is **deterministic**

Example: Traveling in Romania

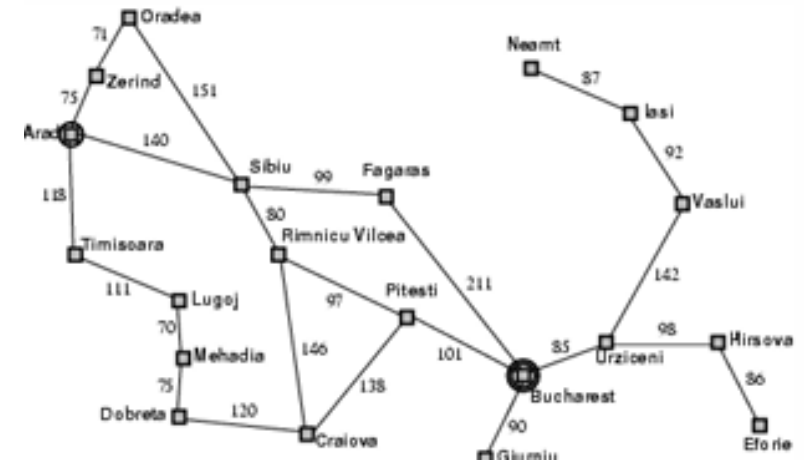
- On holiday in Romania; currently in Arad
- Flight leaves tomorrow from Bucharest
- Formulate goal:
 - be in Bucharest
- Formulate problem:
 - **states**: various cities
 - **actions/operators**: drive between cities
- Find solution
 - By searching through states to find a goal
 - sequence of cities, e.g., Arad, Sibiu, Fagaras, Bucharest
- Execute states that lead to a solution

Example: Traveling in Romania



State-Space Problem Formulation

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e.g., $S(\text{Arad}) = \{ \langle \text{Arad} \rightarrow \text{Zerind}, \text{Zerind} \rangle, ..$



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4. **path cost** (additive)
e.g., sum of distances, number of actions executed, etc.
 $c(x, a, y)$ is the step cost, assumed to be ≥ 0



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A **solution** is a sequence of actions leading from the initial state to a goal state



Example: Formulating the Navigation Problem

- Set of States
 - individual cities
 - e.g., Irvine, SF, Las Vegas, Reno, Boise, Phoenix, Denver
- Operators
 - freeway routes from one city to another
 - e.g., Irvine to SF via 5, SF to Seattle, etc
- Start State
 - current city where we are, Irvine
- Goal States
 - set of cities we would like to be in
 - e.g., cities which are closer than Irvine
- Solution
 - a specific goal city, e.g., Boise
 - a sequence of operators which get us there,
 - e.g., Irvine to SF via 5, SF to Reno via 80, etc

Abstraction

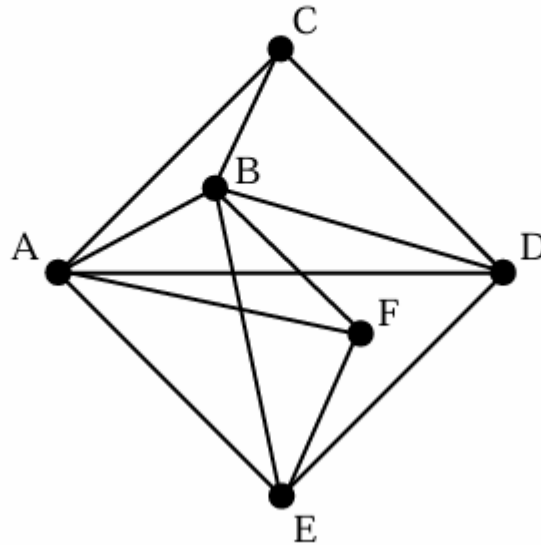
- Definition of Abstraction:
Process of removing irrelevant detail to create an abstract representation: ``high-level'', ignores irrelevant details
- Navigation Example: how do we define states and operators?
 - First step is to abstract "the big picture"
 - i.e., solve a map problem
 - nodes = cities, links = freeways/roads (a high-level description)
 - this description is an abstraction of the real problem
 - Can later worry about details like freeway onramps, refueling, etc
- Abstraction is critical for automated problem solving
 - must create an approximate, simplified, model of the world for the computer to deal with: real-world is too detailed to model exactly
 - good abstractions retain all important details

The State-Space Graph

- Graphs:
 - nodes, arcs, directed arcs, paths
- Search graphs:
 - States are nodes
 - operators are directed arcs
 - solution is a path from start S to goal G
- Problem formulation:
 - Give an abstract description of states, operators, initial state and goal state.
- Problem solving:
 - Generate a part of the search space that contains a solution

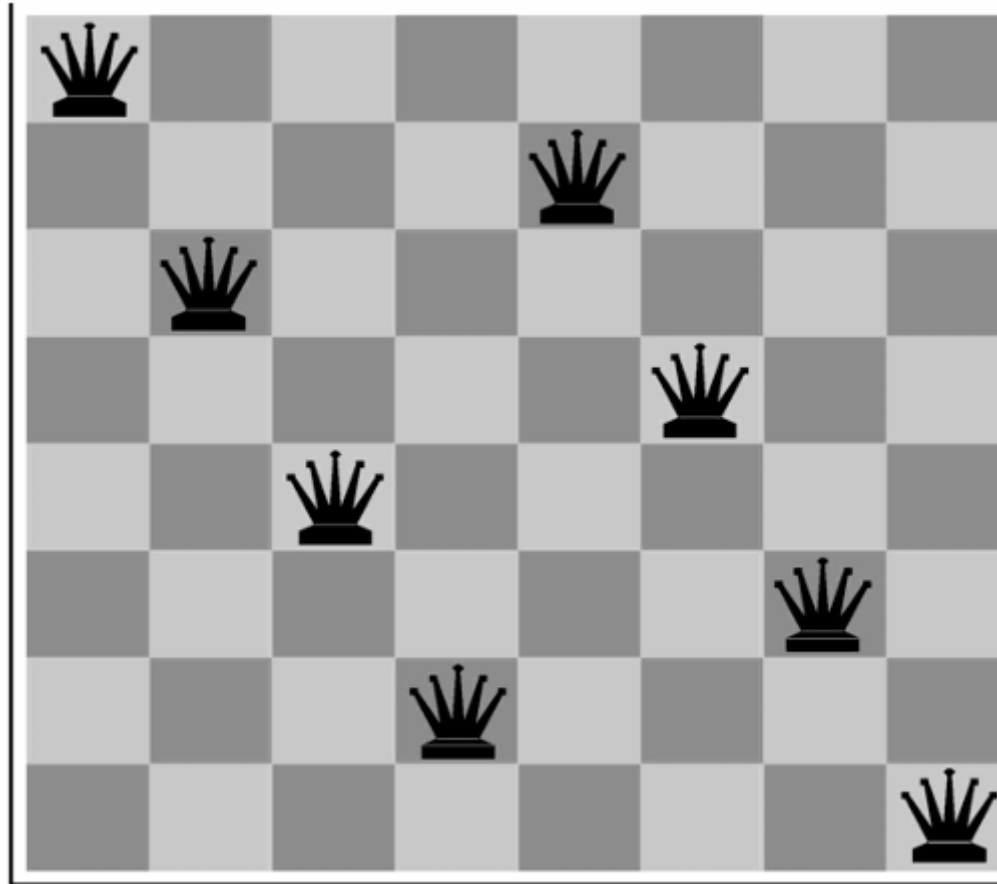
Example: The Traveling Salesman Problem

- Find the shortest tour that visits all cities without visiting any city twice and return to starting point.
- State: sequence of cities visited
- $S_0 = A$



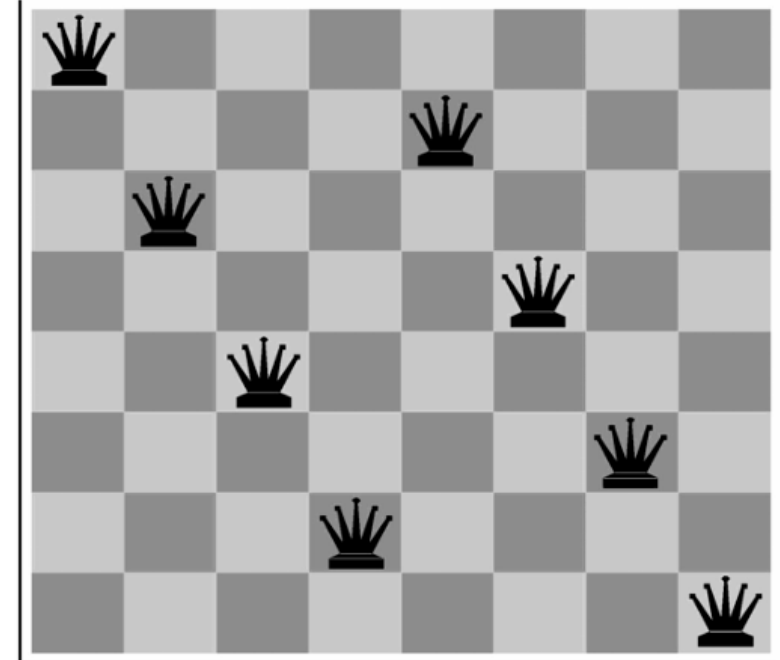
- $G =$ a complete tour

Example: 8-queens Problem



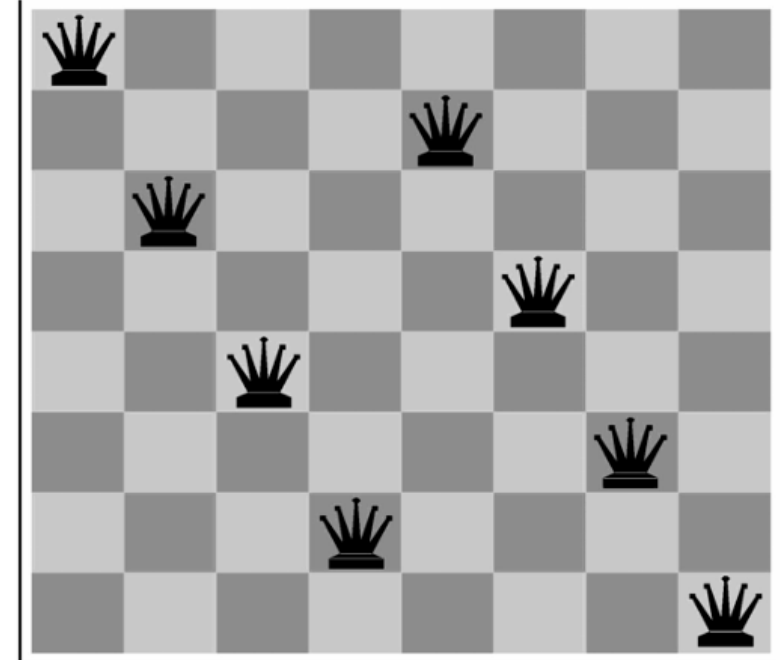
State-Space Problem Formulation

- states? -any arrangement of $n \leq 8$ queens
-or arrangements of $n \leq 8$ queens in leftmost n columns, 1 per column, such that no queen attacks any other.



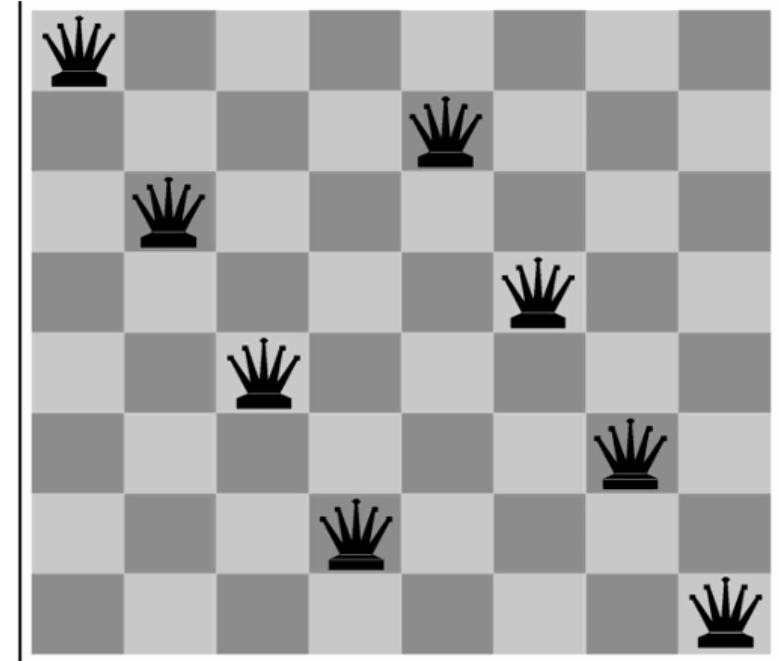
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- initial state? no queens on the board



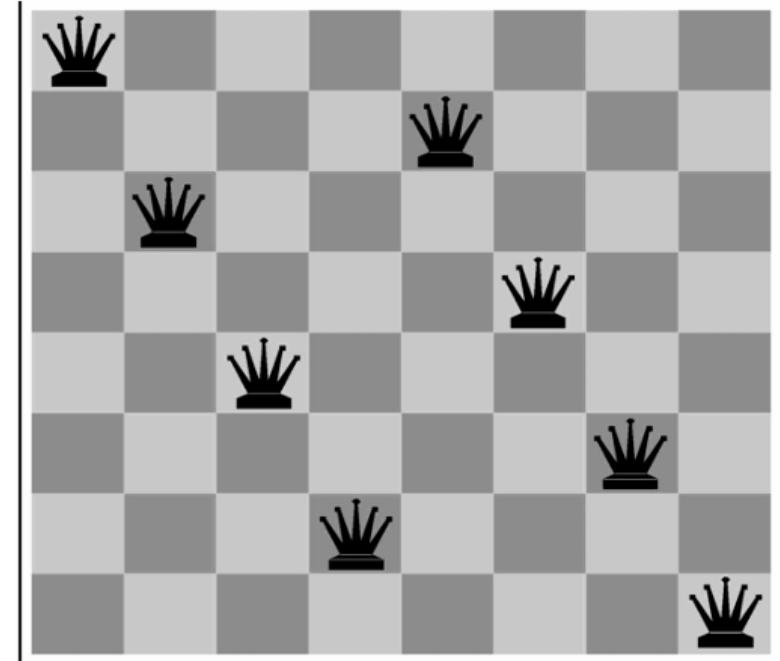
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- actions? -add queen to any empty square
-or add queen to leftmost empty square such that it is not attacked by other queens.



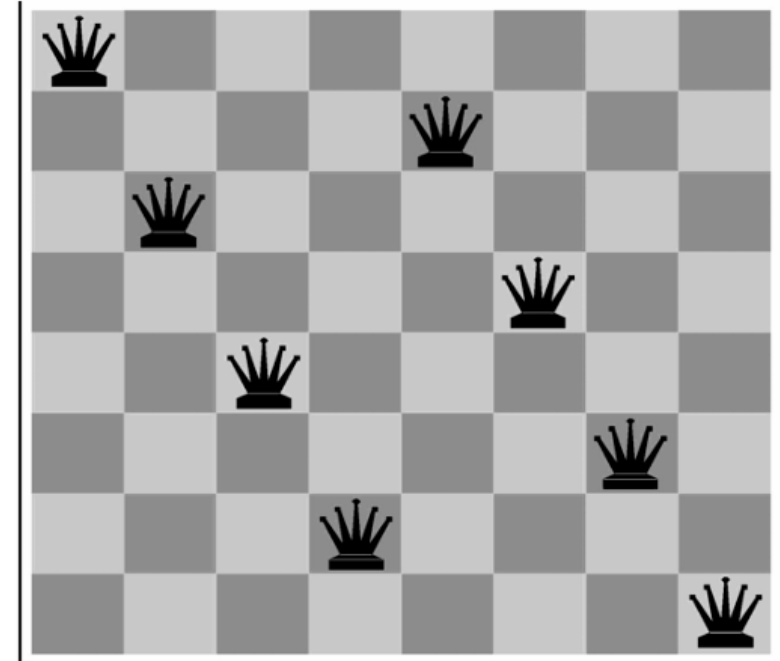
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- goal test? 8 queens on the board, none attacked.

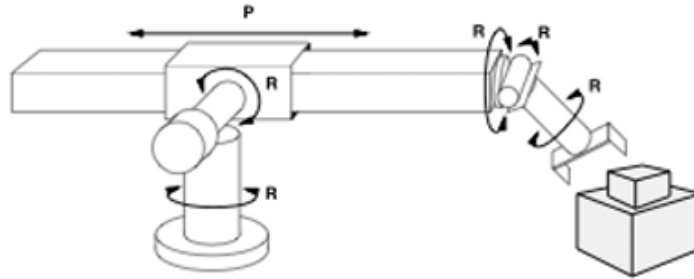


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- path cost? 1 per move

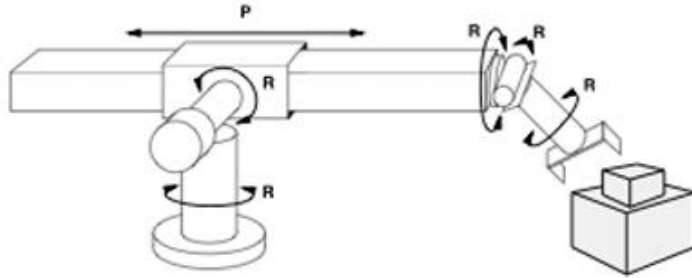


Example: Robot Assembly



- States
- Initial state
- Actions
- Goal test
- Path Cost

Example: Robot Assembly



- States: configuration of robot (angles, positions) and object parts
- Initial state: any configuration of robot and object parts
- Actions: continuous motion of robot joints
- Goal test: object assembled?
- Path Cost: time-taken or number of actions

Learning a Spam Email Classifier

- States
- Initial state
- Actions
- Goal test
- Path Cost

Learning a Spam Email Classifier

- States: settings of the parameters in our model
- Initial state: random parameter settings
- Actions: moving in parameter space
- Goal test: optimal accuracy on the training data
- Path Cost: time taken to find optimal parameters

(Note: this is an optimization problem – many machine learning problems can be cast as optimization)

Example: 8-puzzle

7	2	4
5		6
8	3	1

Start State

	1	2
3	4	5
6	7	8

Goal State

- states?
- initial state?
- actions?
- goal test?
- path cost?

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Start State

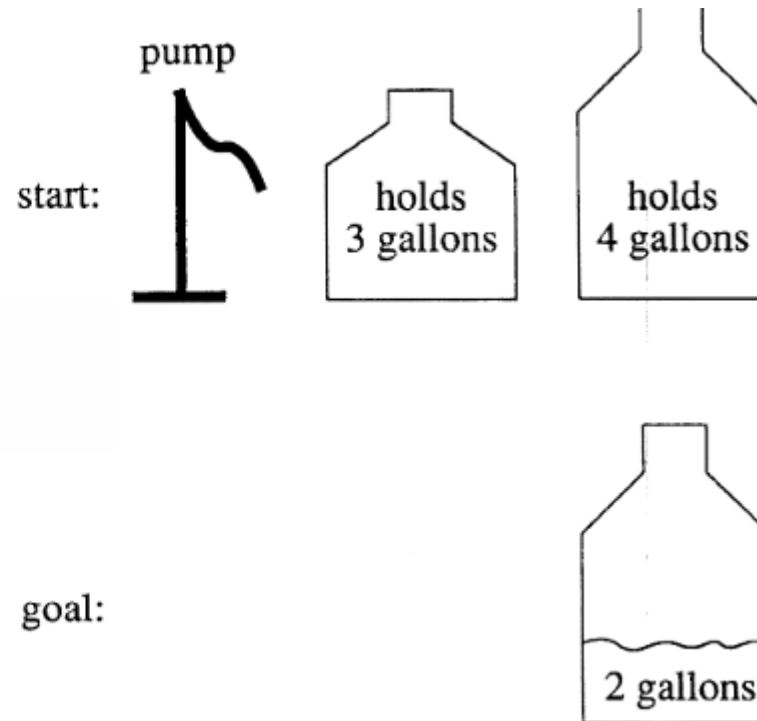
	1	2
3	4	5
6	7	8

Goal State

- states? locations of tiles
- initial state? given
- actions? move blank left, right, up, down
- goal test? goal state (given)
- path cost? 1 per move

A Water Jug Problem

- You have a 4-gallon and a 3-gallon water jug
- You have a faucet with an unlimited amount of water
- You need to get exactly 2 gallons in 4-gallon jug



Puzzle-solving as Search

- State representation: **(x, y)**
 - x: Contents of four gallon
 - y: Contents of three gallon
- Start state: **(0, 0)**
- Goal state **(2, n)**
- Operators
 - Fill 3-gallon from faucet, fill 4-gallon from faucet
 - Fill 3-gallon from 4-gallon , fill 4-gallon from 3-gallon
 - Empty 3-gallon into 4-gallon, empty 4-gallon into 3-gallon
 - Dump 3-gallon down drain, dump 4-gallon down drain

Next Topics

- Uninformed search
 - Breadth-first, depth-first
 - Uniform cost
 - Iterative deepening
- Informed (heuristic) search
 - Greedy best-first
 - A*
 - Memory-bounded heuristic search
 - And more....
- Local search and optimization
 - Hill-climbing
 - Simulated annealing
 - Genetic algorithms

Summary

- Problem-solving agents where search consists of
 - state space
 - operators
 - start state
 - goal states
- Abstraction and problem formulation