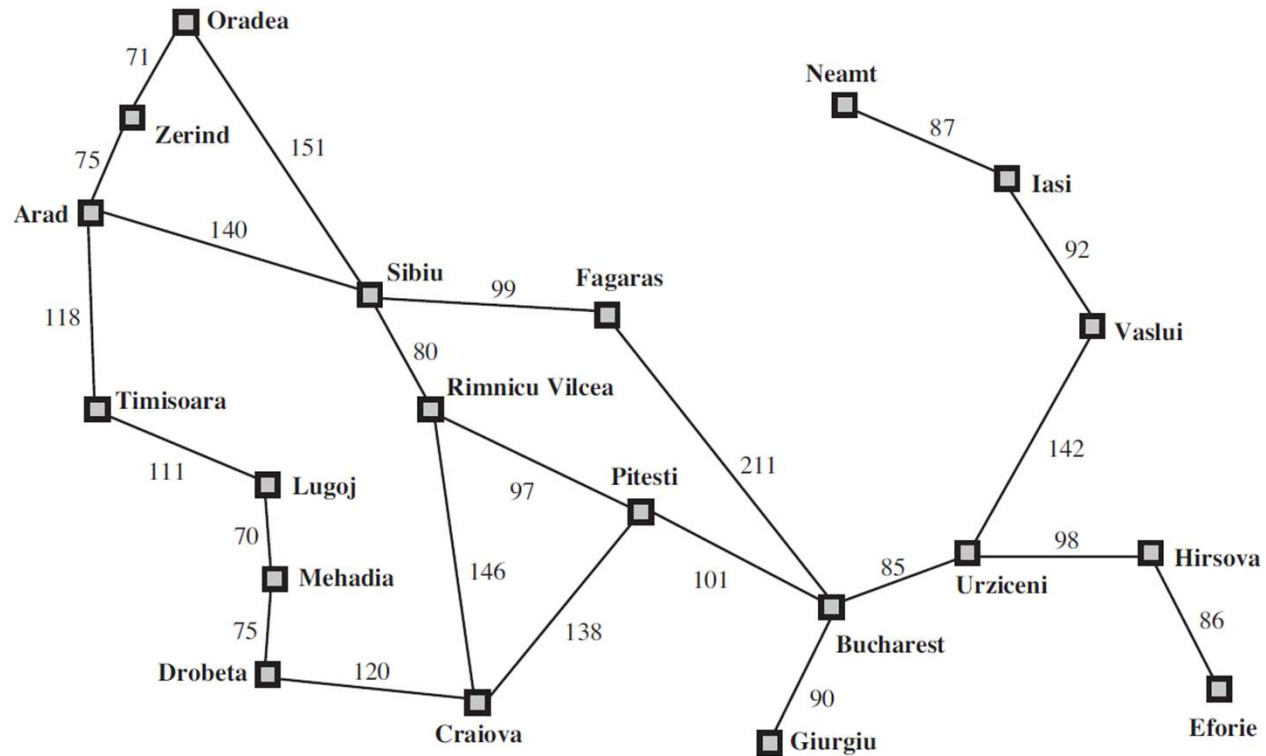


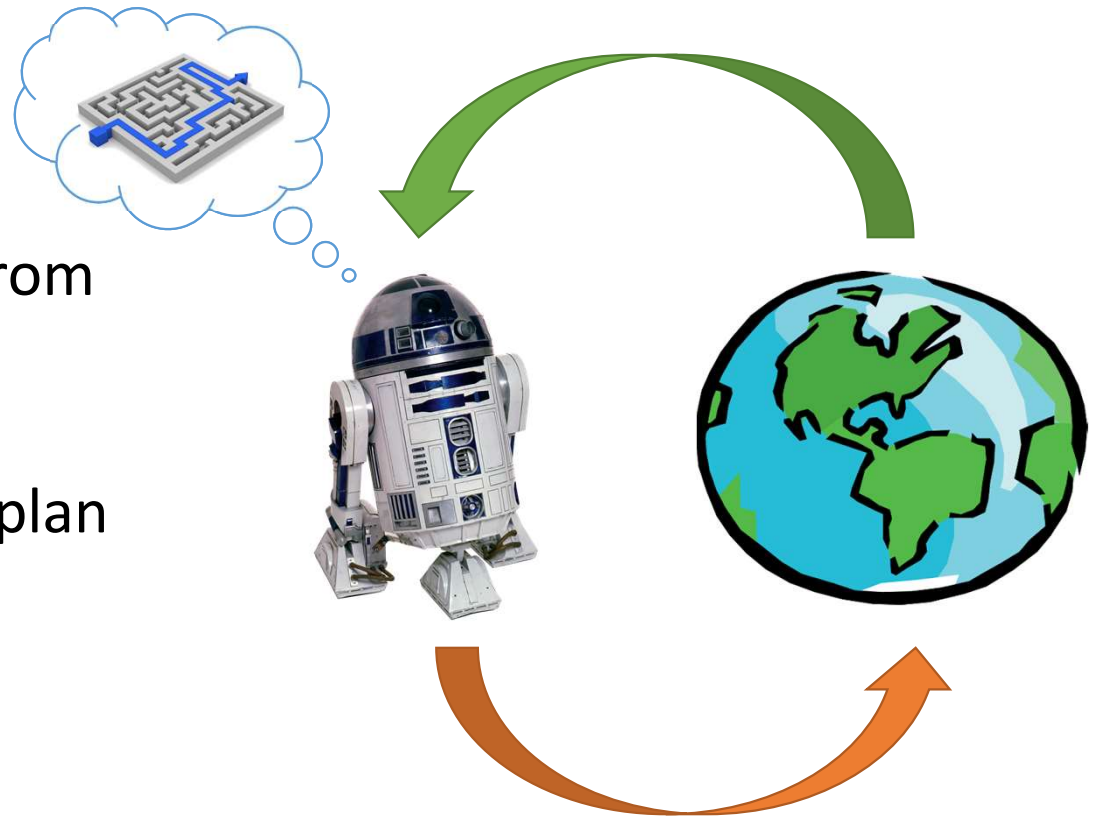
EECE 5550: Mobile Robotics



Lecture 15: Planning

The Central Dogma of Robotics: Sense → Think → Act

- **Sense:** Process **sensor data** to construct a model of the world
- **Think:** Construct a **plan** to move from the current state to the goal state
- **Act:** **Control actuators** to execute plan



The Story So Far

Mathematical foundations →

Computational tools →

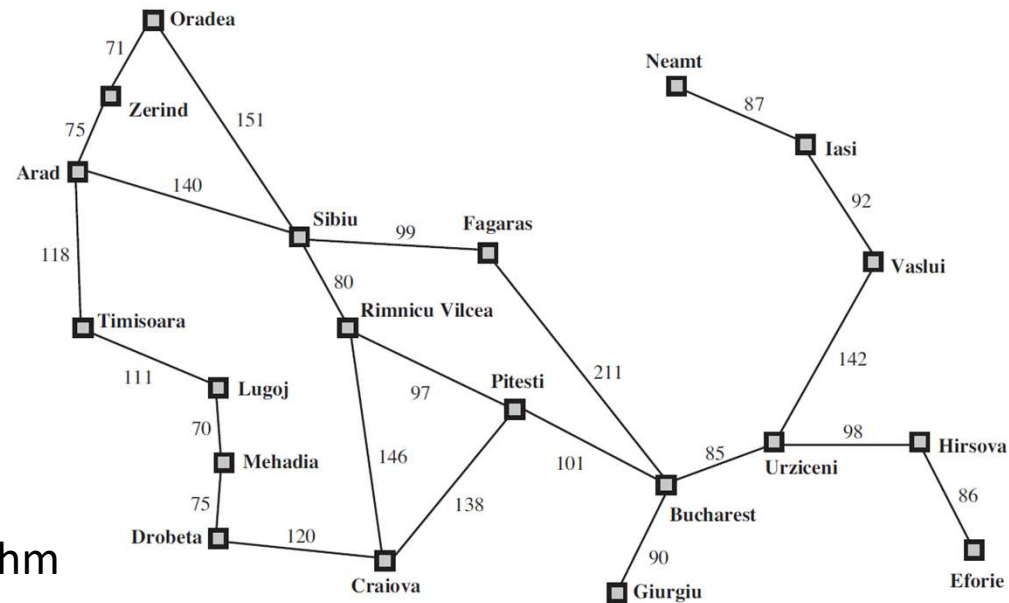
Sense (perception) →

This week: Think (plan) →

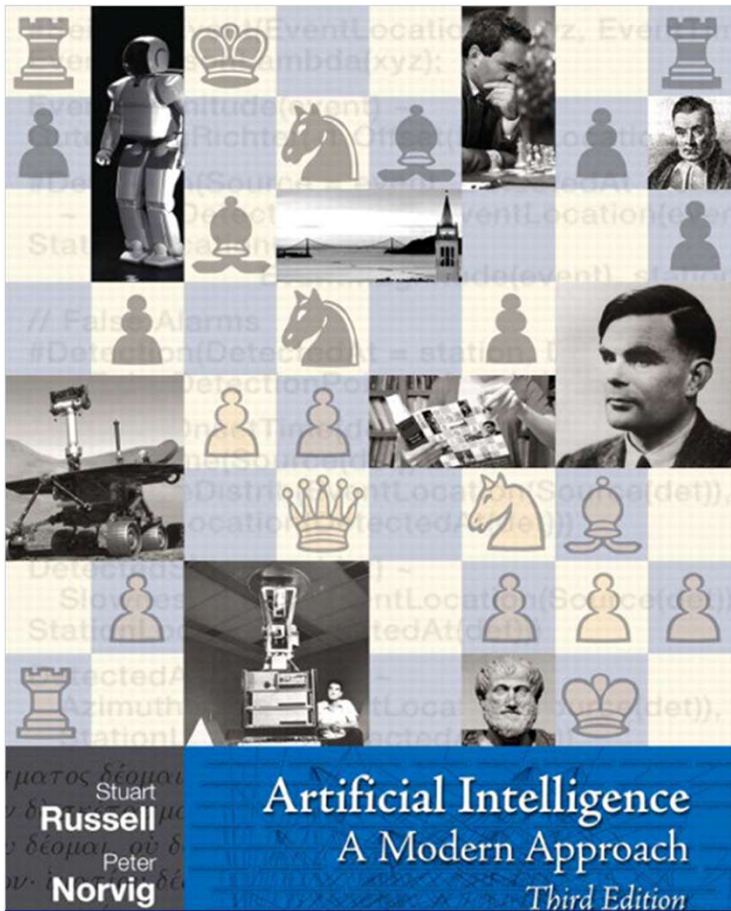
Week	Topics (tentative)
1	Coordinate transformations & geometry
2	Lie groups & probability theory
3	Computational tools: Linux, Git, Ros
4	Sensing, kinematics & computer vision
5	Probabilistic robotics & Bayesian filtering
6	Robotic mapping & localization
7	SLAM & optimization
8	Planning & graph search
9	Feedback, optimal, and model-predictive control
10	Planning under uncertainty
11	Applications: Robotic exploration
12	Guest lectures: research frontiers
13	Final presentations

Plan of the day 😊

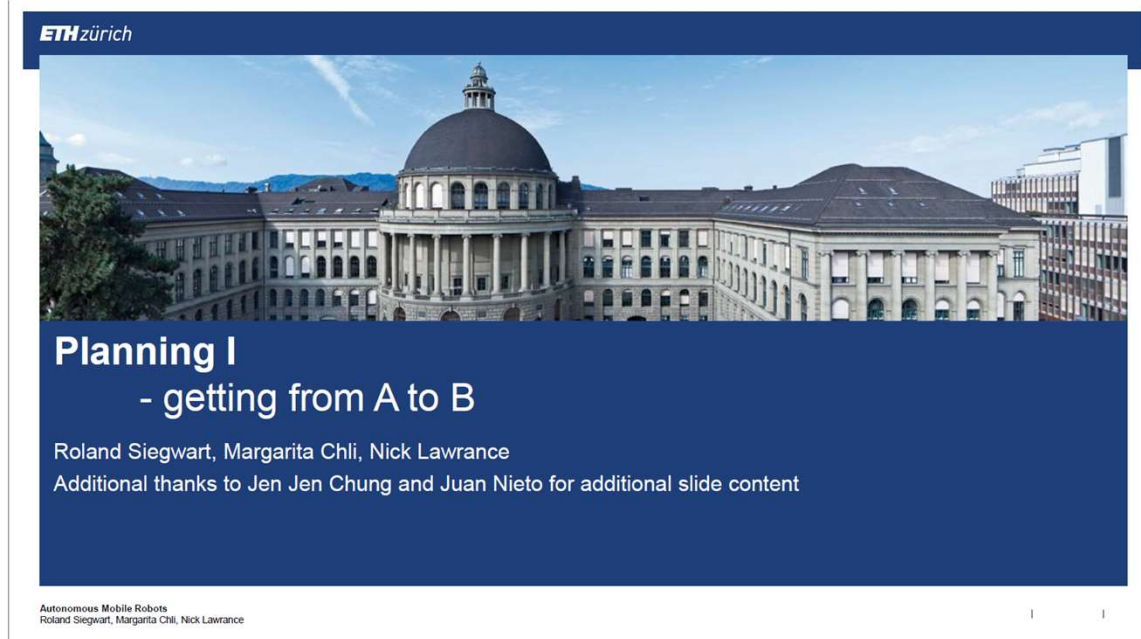
- Introduction to planning
- Formulation of a planning problem
- Planning as graph search
- Four canonical graph search algorithms
 - Breadth-first search
 - Depth-first search
 - Searching for *shortest paths*: Dijkstra's algorithm
 - **Informed search**: A* search



References



Chapter 3 of “Artificial Intelligence: A Modern Approach”

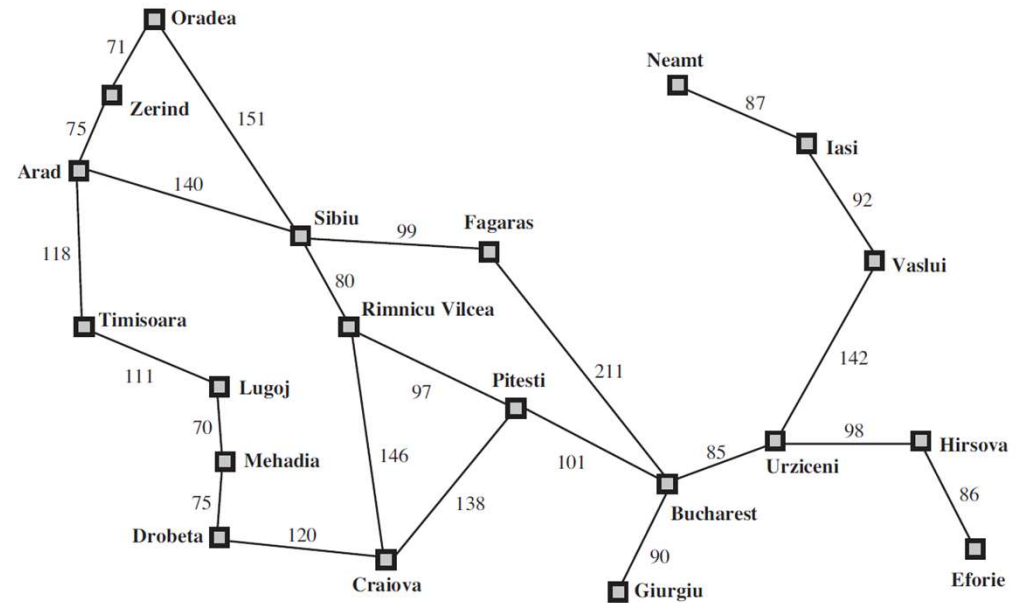


Lecture “Planning I” from ETH Zurich’s Autonomous Mobile Robots course

What is “Planning”?

Intuitively: How do I get from A to B?

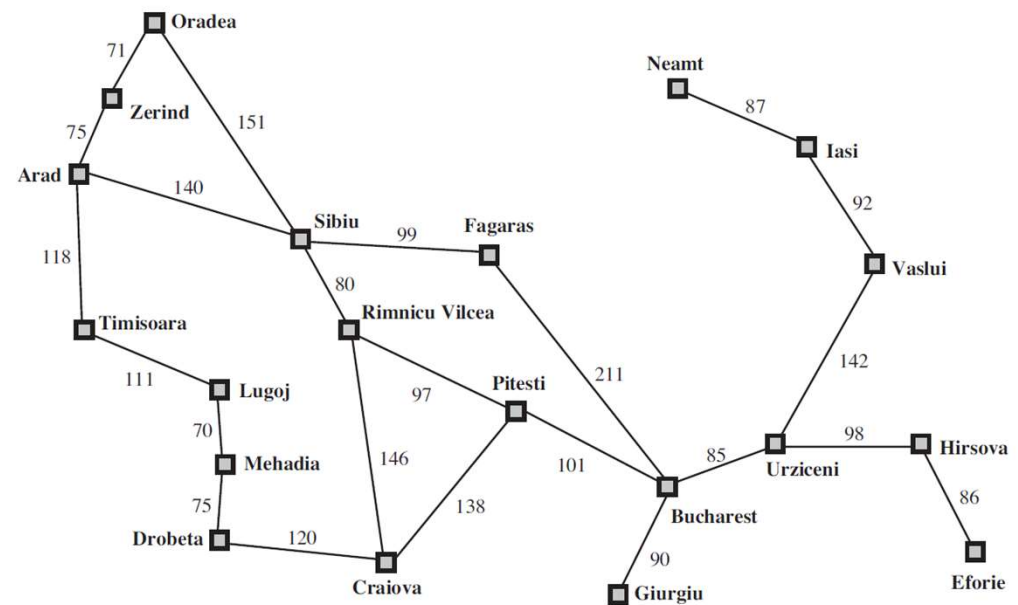
A bit more precisely: Determine a **sequence of actions** that will drive the world from an *initial state* to a *goal state*.



Defining a planning problem

We must specify the following elements:

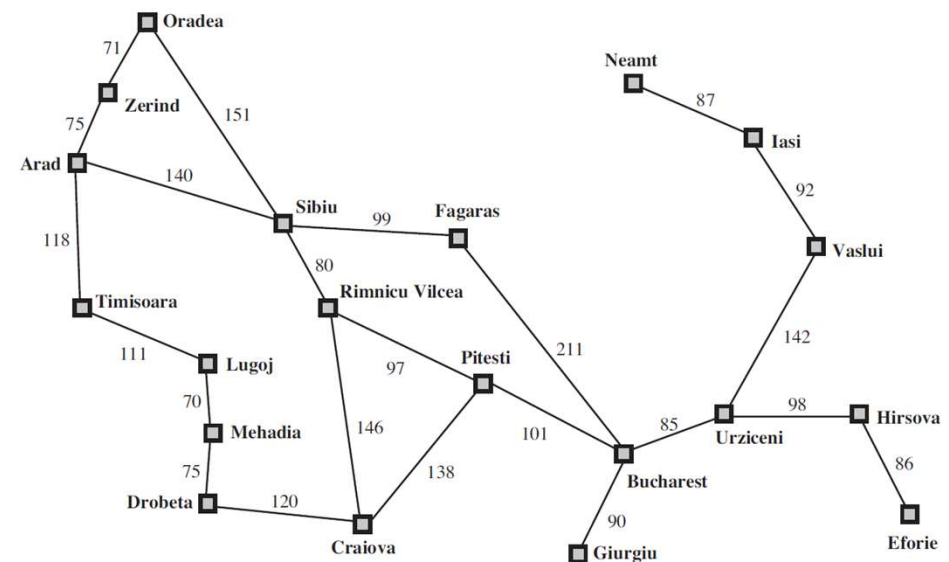
1. **State space** X : possible states of the world
2. Initial state $x_0 \in X$
3. **Actions**: function $A(x)$ returns the set of actions available at each state $x \in X$
4. **Transition model**: function $R(x,a)$ describes the *successor* state achieved by applying action a in state x .
5. **Goal test**: $G(x)$ returns true/false to indicate whether we have reached a goal
6. **Cost**: $C(x,a)$ of applying action a in state x .



Solutions of a planning problem

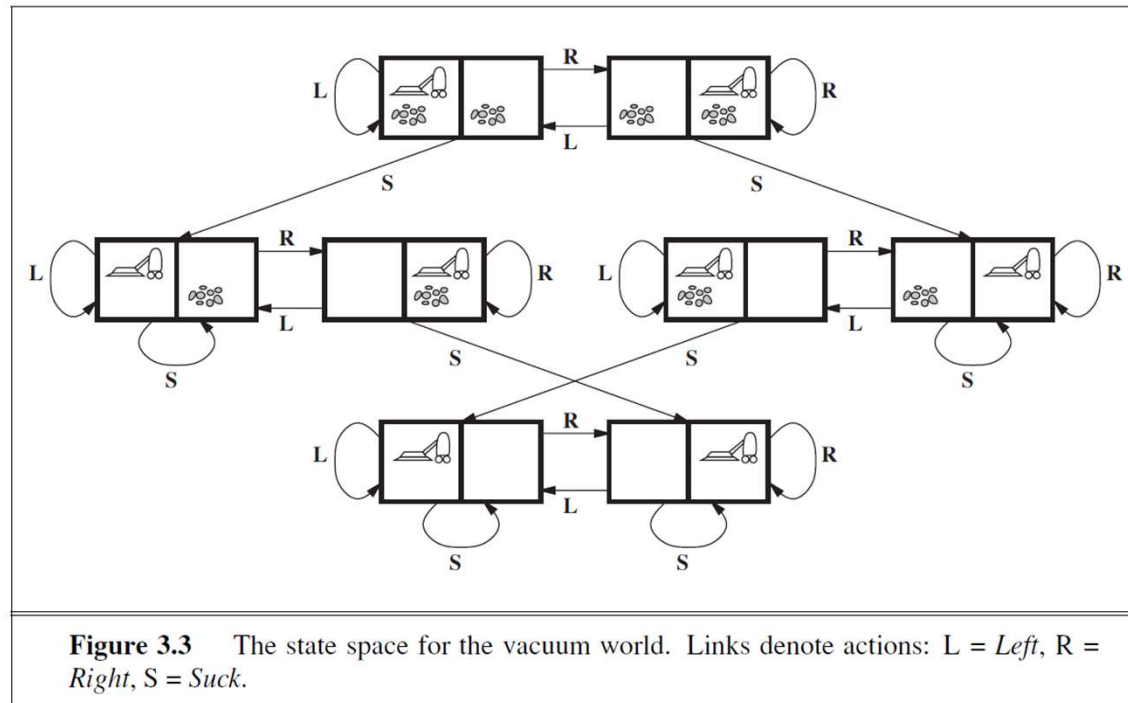
Given a planning problem $P = (X, x_0, A, R, G, C)$:

- A *solution* is a *sequence of actions* a_1, a_2, a_3, \dots that leads from the initial state x_0 to a goal state (a state satisfying $G(x) = \text{true}$).
- An *optimal solution* is a solution attaining the *minimum possible cost*.



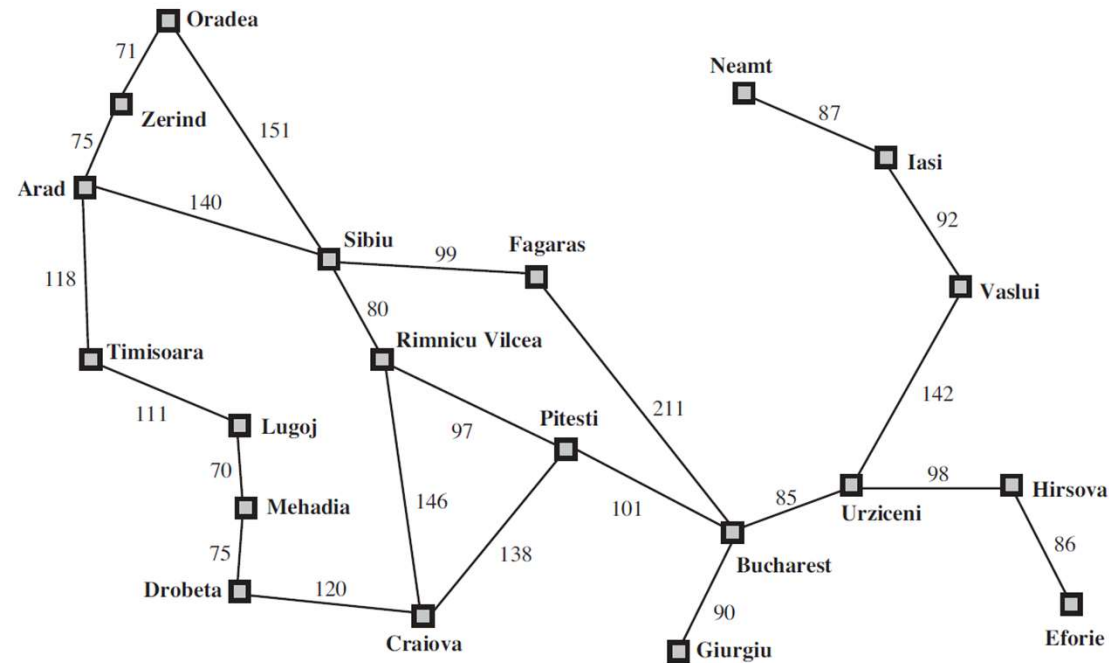
Toy example: Vacuum world

- **States:**
 - 2 locations (each of which may contain dirt)
 - Agent location
- **Initial state:** Any
- **Actions:** Left, right, suck
- **Transition model:** As expected (see diagram)
- **Goal test:** No dirt remains in any square
- **Cost:** Each action costs 1



Real-world example: Route-finding

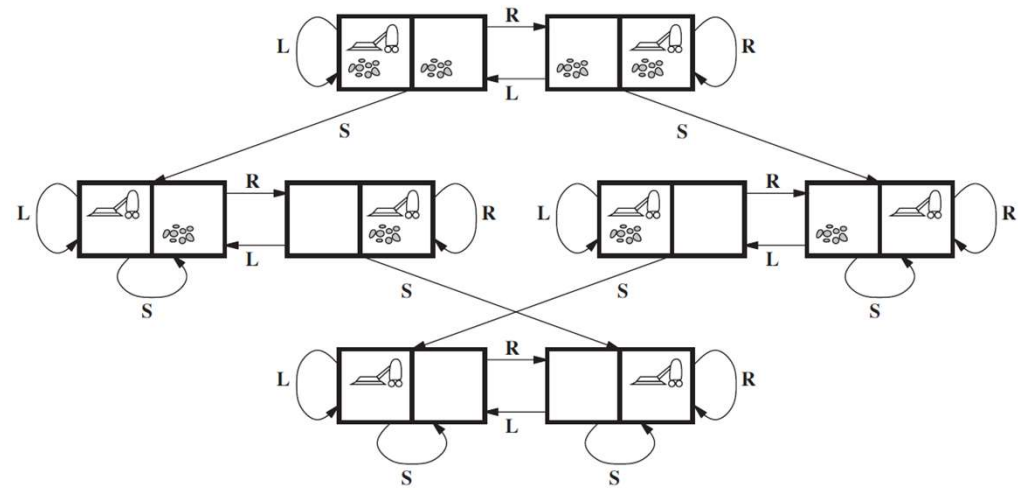
- **States:** Specified set of locations (e.g. cities)
- **Initial state:** Any
- **Actions:** Following any edge (link) between current location and a neighboring location
- **Transition model:** As expected (arrive in the neighboring city)
- **Goal test:** Have you arrived in the goal city?
- **Cost:** Several possible choices:
 - **Money:** Price of tickets, gas, etc.
 - **Time:** Elapsed travel time via the given route



Solving a planning problem

Basic insight: We can model each planning problem $P = (X, x_0, A, R, G, C)$ as a **weighted directed graph** $G = (X, E, w)$, where:

- Vertices of G are the *states* X
- Edge set E contains $i \rightarrow j$ iff there is an *action* $a \in A(i)$ for which $j = R(i, a)$.
- The weight $w(i, j)$ of an edge $(i, j) \in E$ is just the cost $C(i, j)$.



Therefore: We can recast **planning** as **graph search**!

- **Solution** of planning problem $P \Leftrightarrow$ **path** from initial state x_0 to goal state in G
- **Optimal solution** of $P \Leftrightarrow$ **minimum-cost path** from x_0 to goal state in G

Payoff: We know how to search graphs efficiently [thanks CS 😊!]

Intermission

(over to “Planning I: Graph Search Methods” ...)