

# Autonomous Robotics

## Planning

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# Announcements

Midterm **TONIGHT** in **CS 1221**.

Grading: HW 2 is underway, everything else has been graded and returned to you.

Midterm survey. Please complete ASAP!

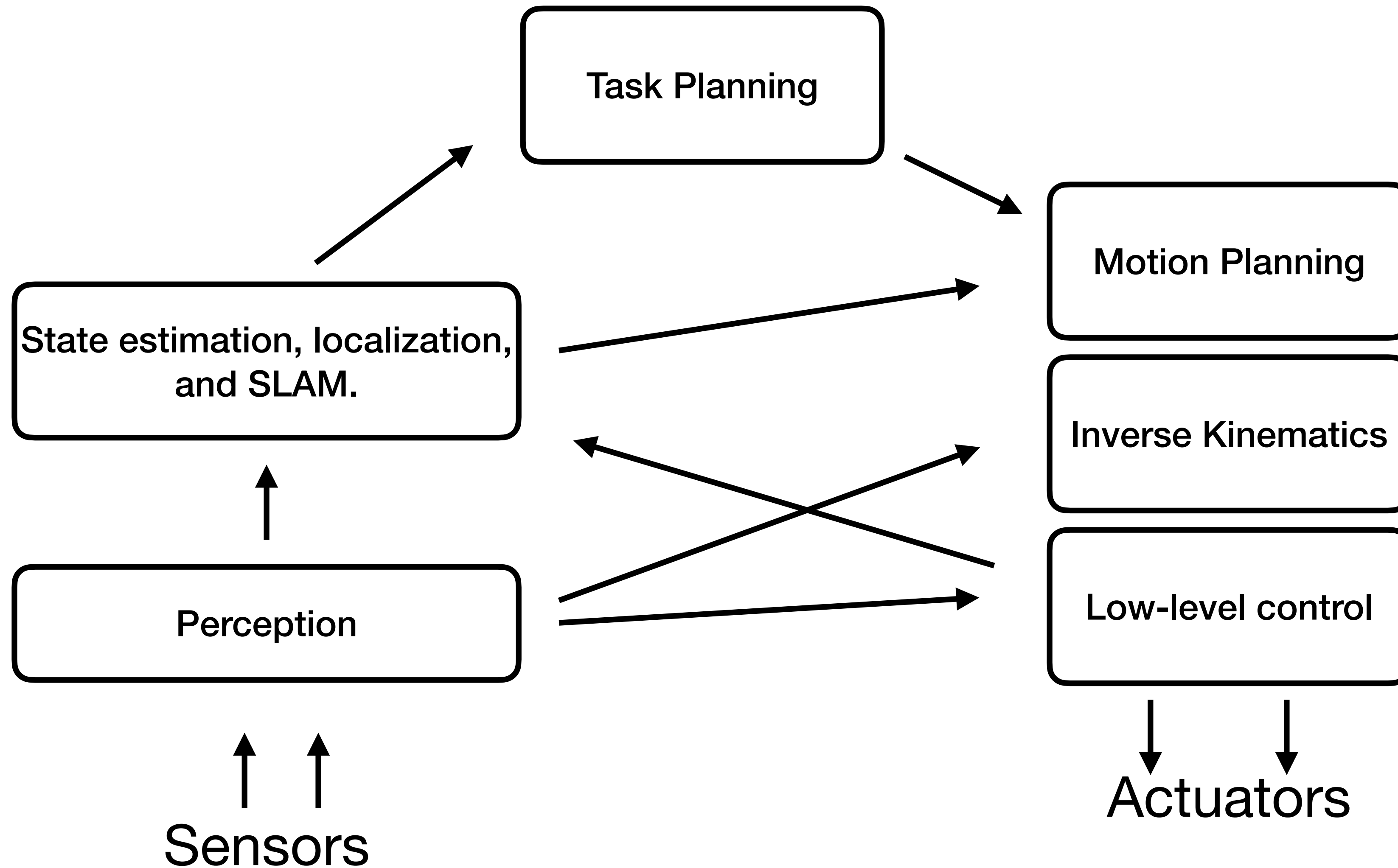
Office hours: today at 1pm

# Learning Outcomes

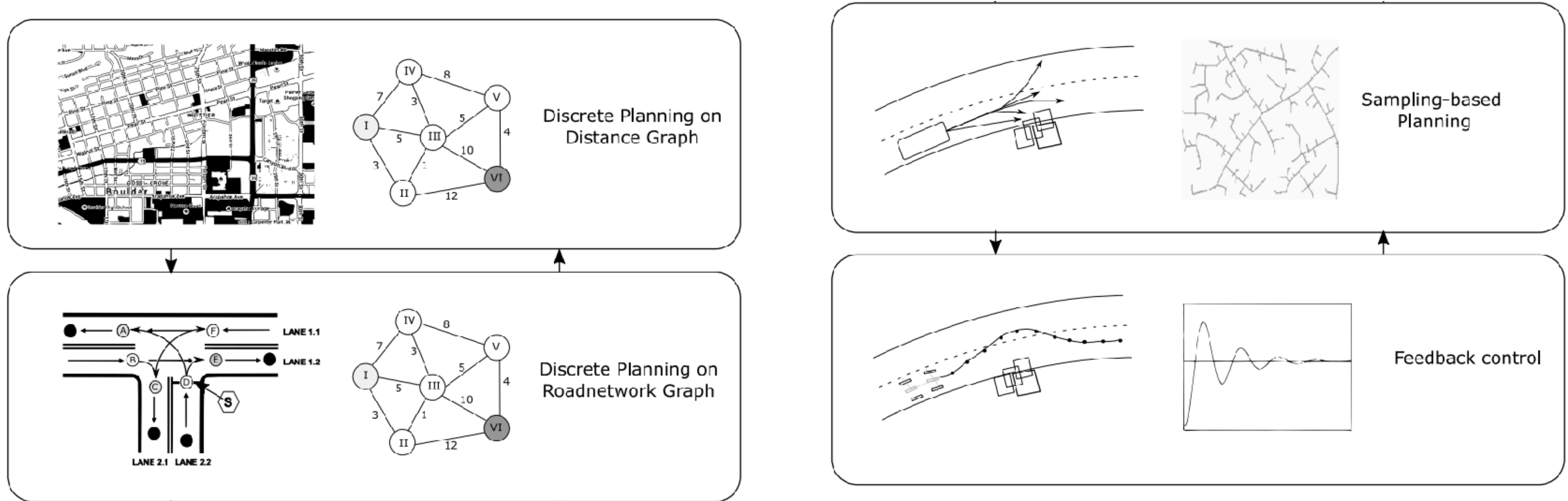
After today's lecture, you will:

- Be able to formulate planning problems in robotics.
- Be able to identify key algorithms for graph-based planning.
- Understand strengths and weaknesses of graph-based planning in robotics.

# Components so far



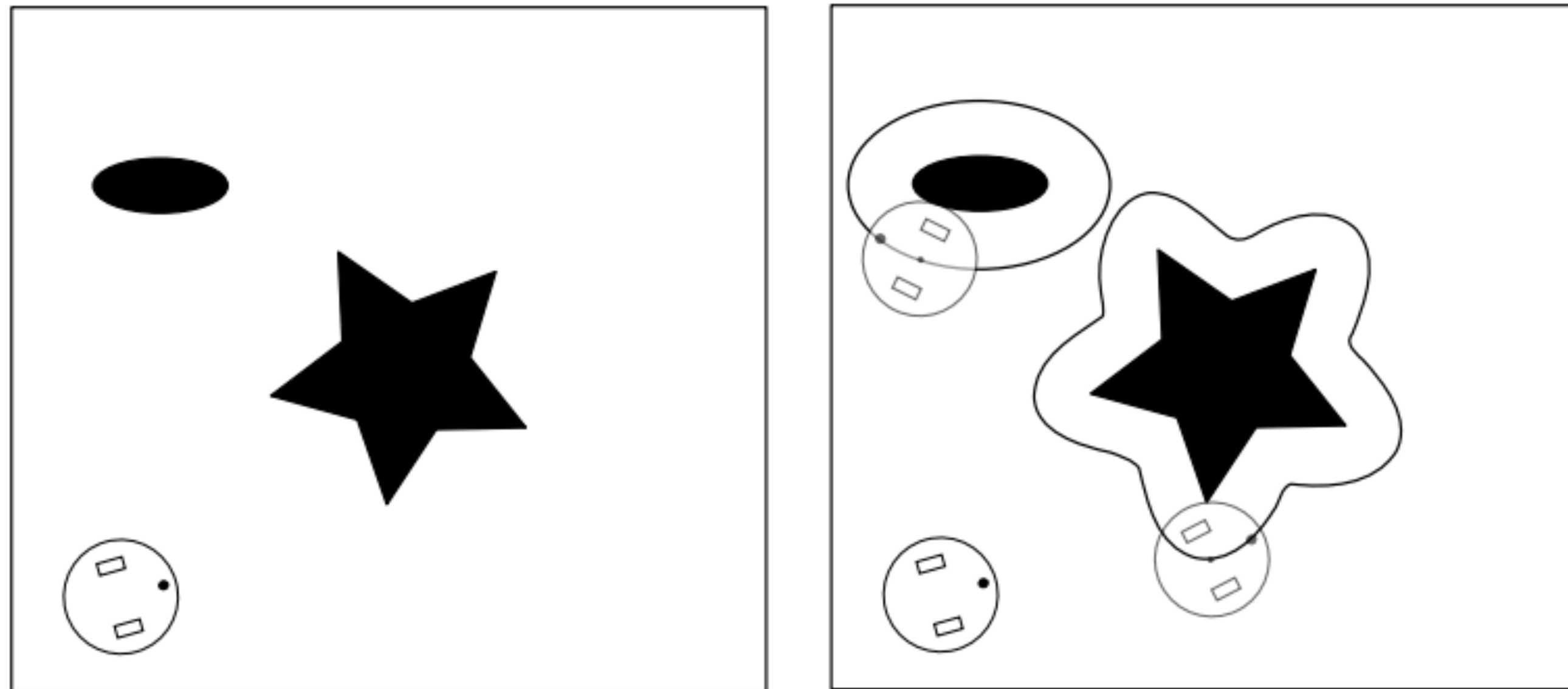
# Motion Control



# Path Planning

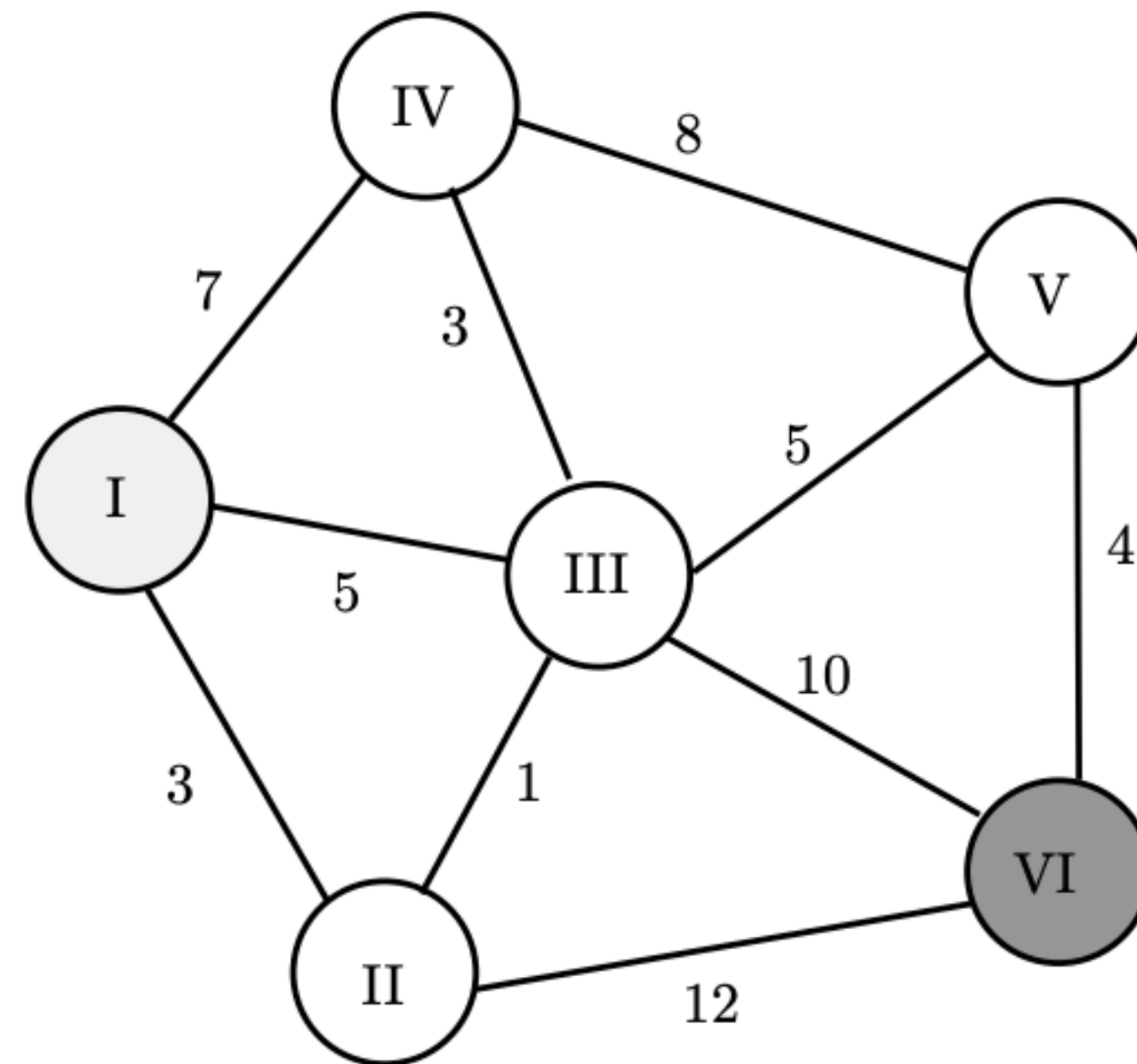
- Find a sequence of states that lead from an initial state to a goal state.
- Typically want the shortest or lowest cost path among all valid paths.
- Why useful?

# Configuration Space



# Graph-based Planning

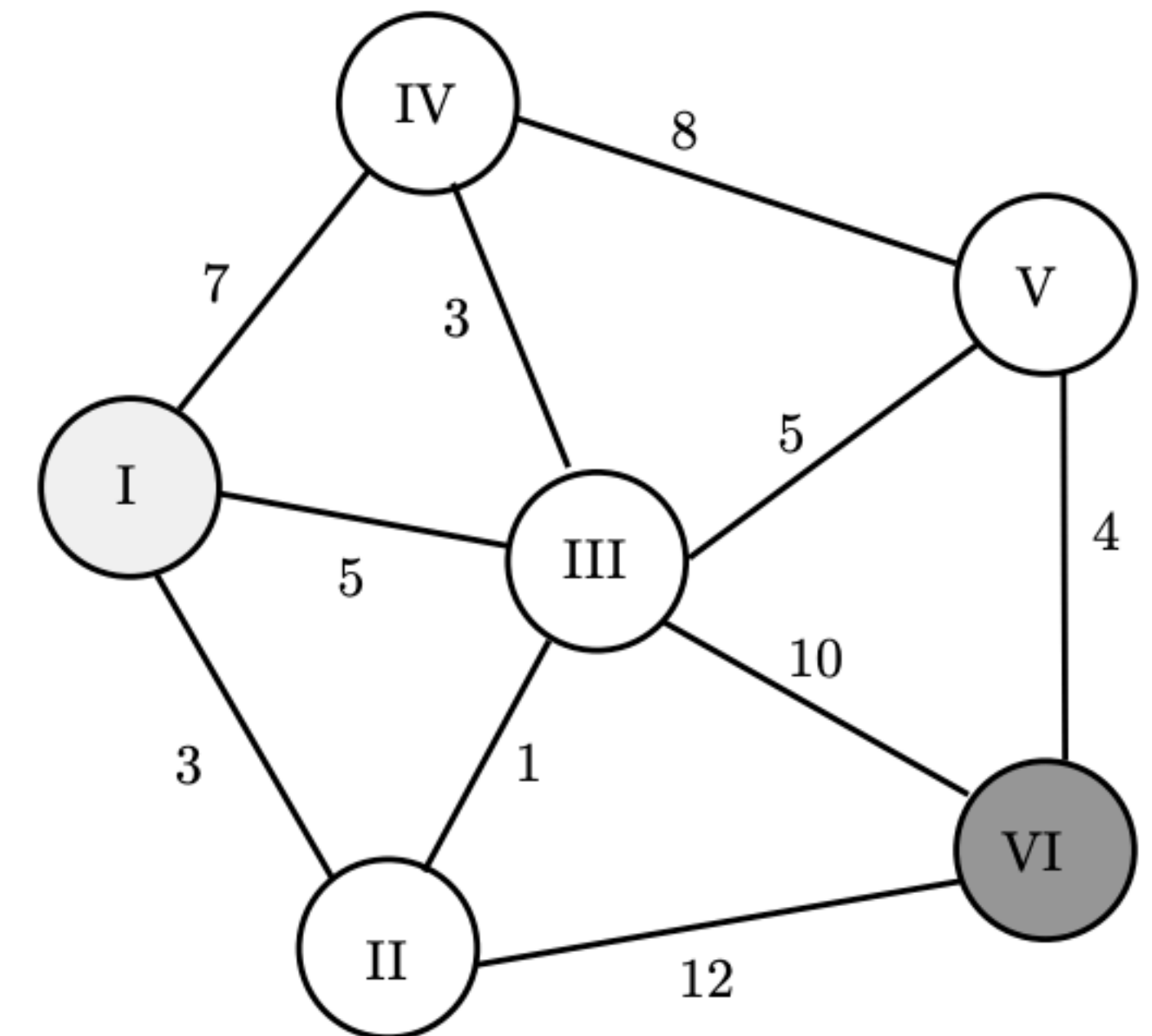
- Properties: completeness, optimality, space & time complexity.





# General Structure

- Start at one state (usually the start state).
- Add neighbors of the start state to some data structure,  $f$ .
- while  $f$  is not empty:
  - Remove a state,  $n$ , from  $f$ .
  - Check if  $n$  is the goal state.
  - If not, add the neighbors of  $n$  to  $f$ .



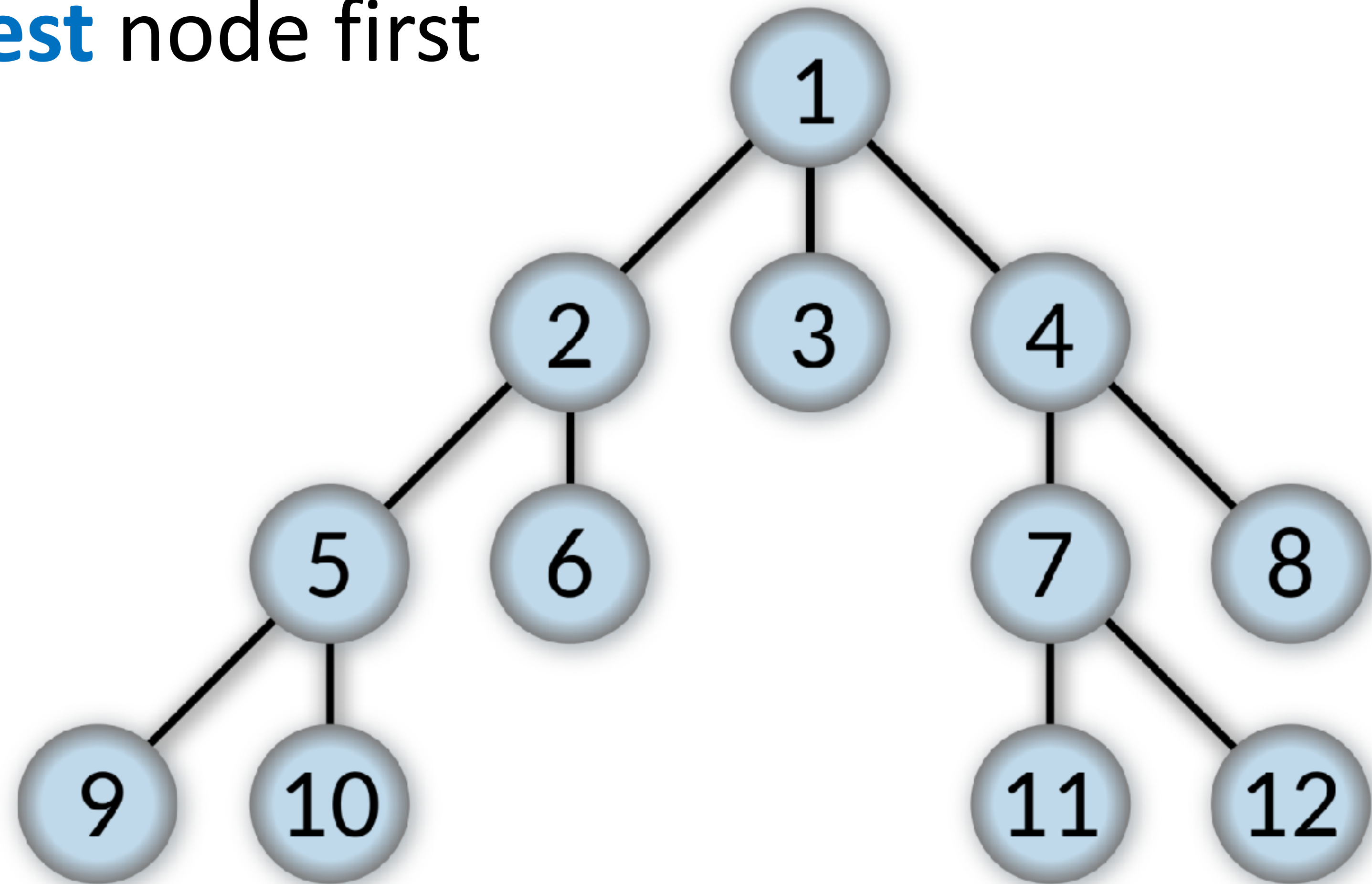
# Breadth-First Search

Recall: expand **shallowest** node first

- Data structure: queue
- **Properties:**
  - Complete
  - Optimal (if edge cost 1)
  - Time  $O(b^d)$
  - Space  $O(b^d)$

Depth

Branching Factor



# Uniform Cost Search

Like BFS, but keeps track of cost

- Expand least cost node
- Data structure: priority queue
- **Properties:**
  - Complete
  - Optimal (if weight lower bounded by  $\epsilon$ )
  - Time  $O(b^{C^*/\epsilon})$
  - Space  $O(b^{C^*/\epsilon})$

$C^*$  is optimal path cost to goal.

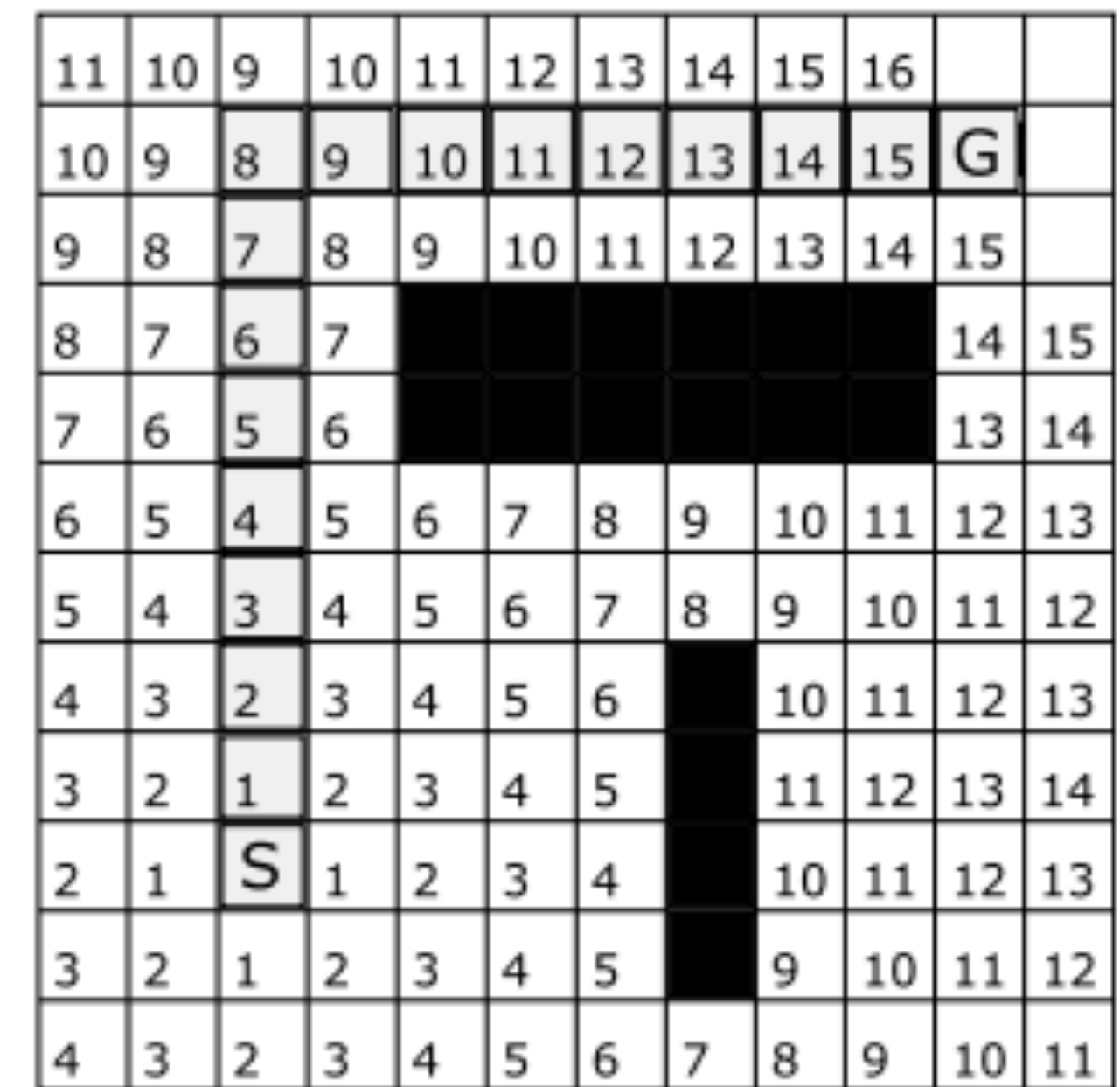
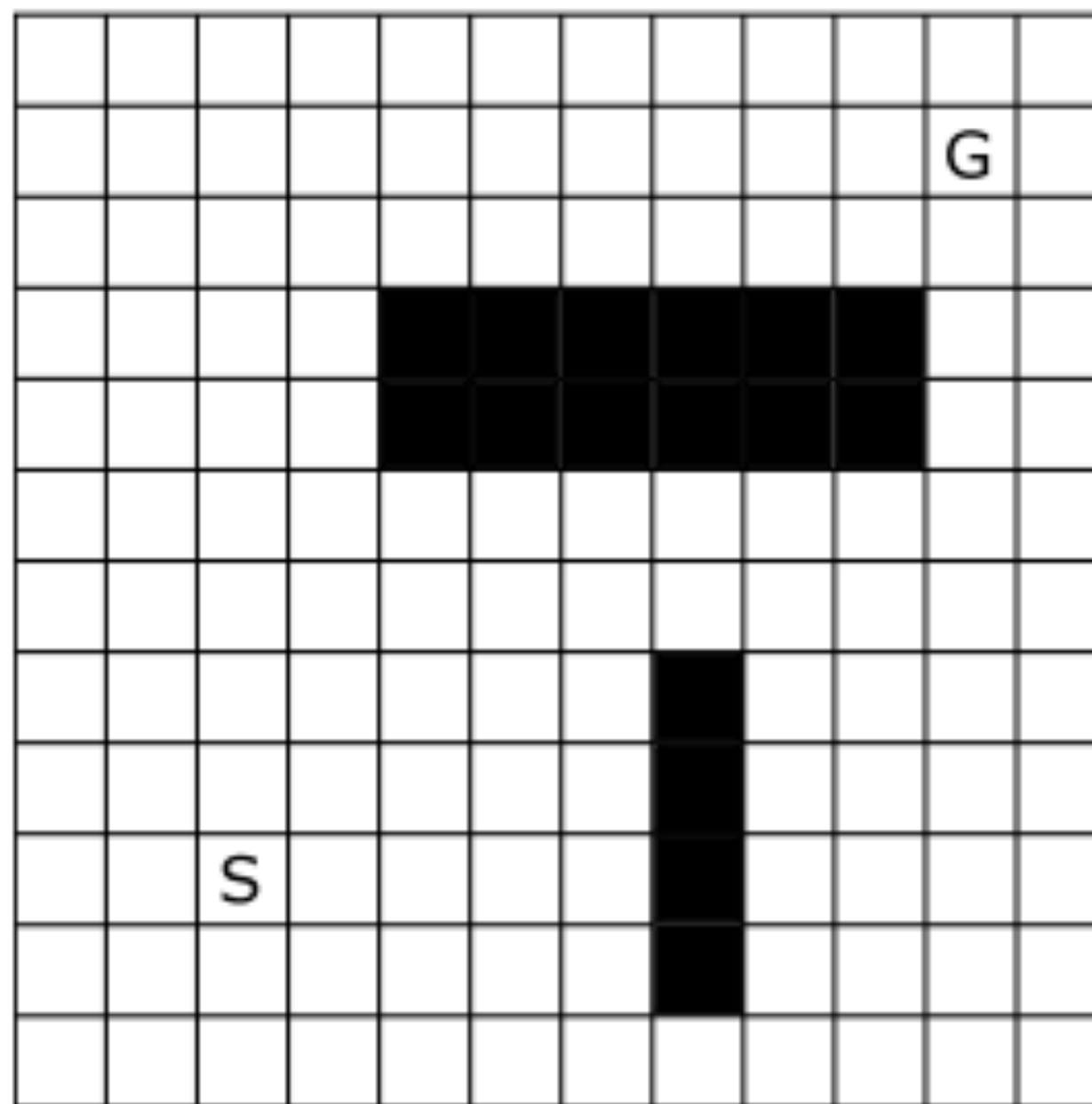
$\epsilon$  is cost of edge with smallest cost.



Credit: DecorumBY

# Dijkstra's Algorithm

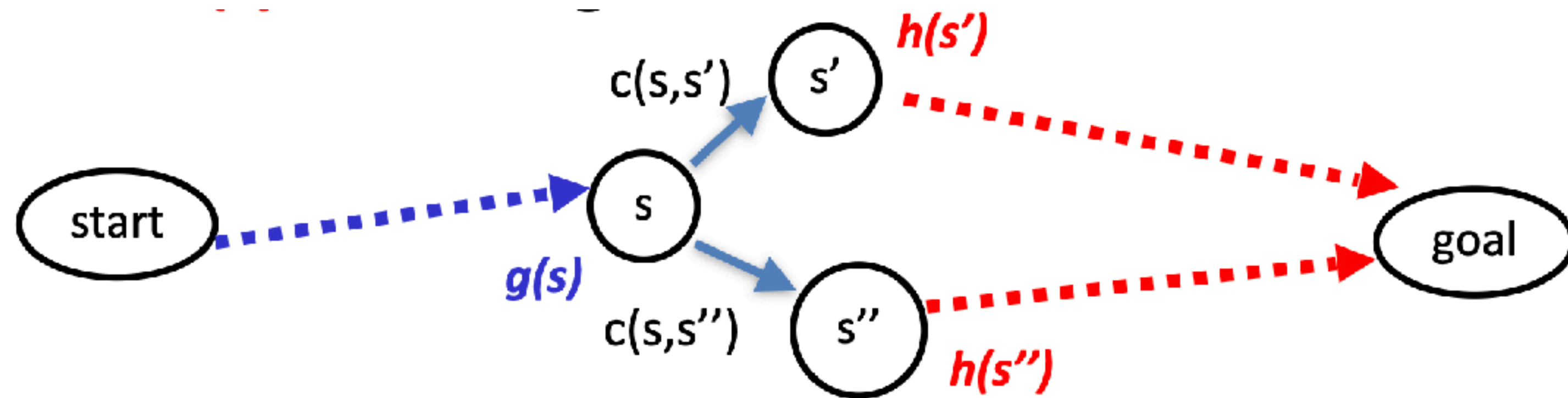
- AKA Uniform Cost Search





# A\* Search

- Use a **heuristic** function to speed-up search.
- Heuristic must be admissible: non-negative and never over-estimates the cost-to-goal.
- A\* is uniform cost search with  $g(s) + c(s, s') + h(s')$  as the cost for  $s'$ .



# A\* Search

- Use a **heuristic** function to speed-up search.

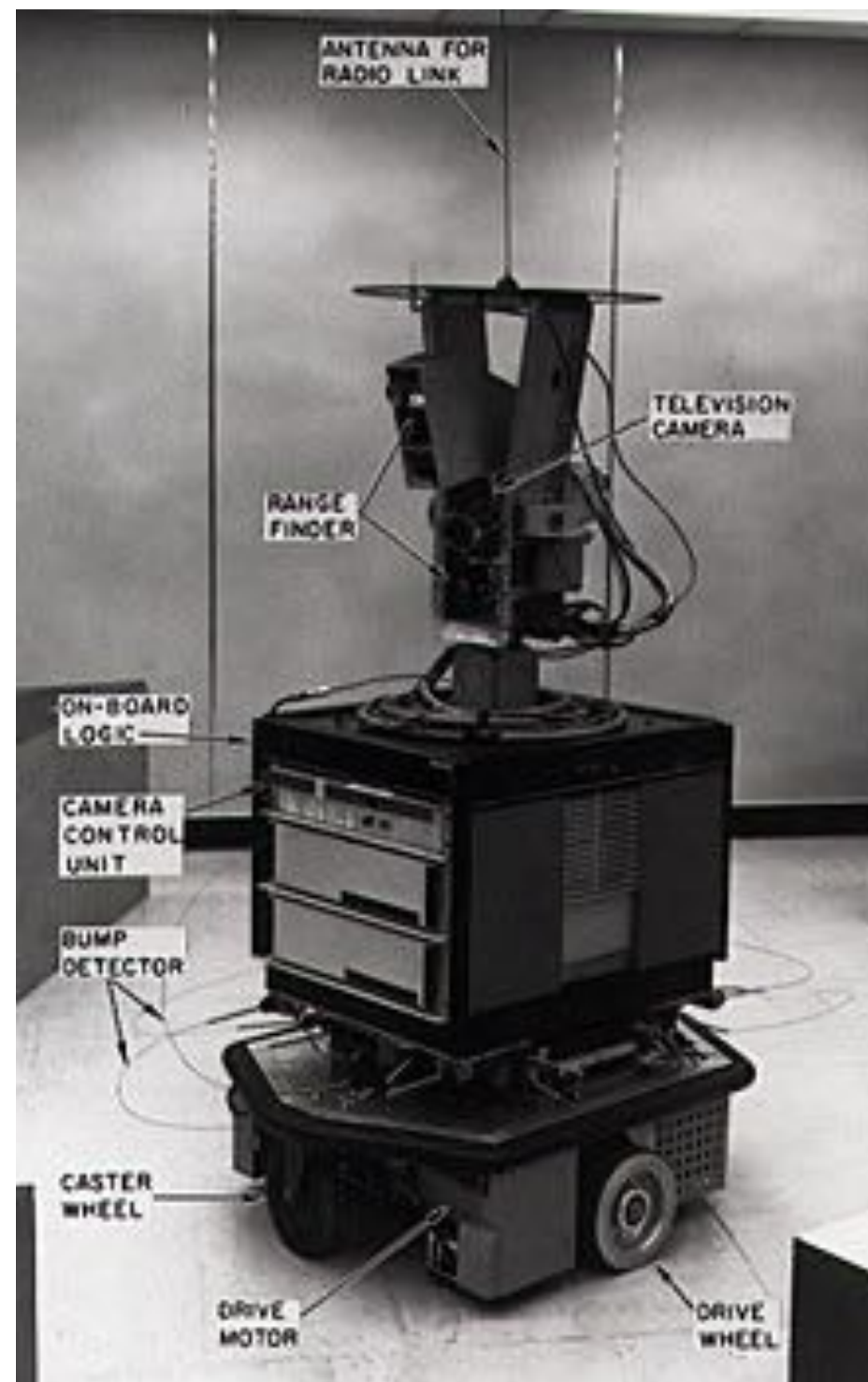
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	2+	1+	2+	3+	4+	5+					
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# A\* Search

## Origins: robots and planning



Shakey the Robot,  
1960's

Credit: Wiki



**Animation:** finding a path  
around obstacle

Credit: Wiki

# D\* Search

- Search backward from goal to start to compute shortest paths to goal.
- As the robot encounters obstacles, update the path costs.
  - Avoids full re-planning.
  - When is this useful?



# Strengths / Weaknesses of Graph Planning

- Strengths:
  - Deterministic and discrete makes it possible to proof properties like completeness.
  - Many robotics planning problems are naturally formulated as discrete planning problems.
- Weaknesses:
  - Need to discretize the state space if continuous. Then only have *resolution completeness*.
  - May require large amounts of memory or large computation time.

# Summary

- Discussed graph-based planning
- Introduced several different graph-based planning algorithms.

# Action Items

- RL reading due after Spring Break; send a reading response by 12 pm on Monday after SB.
- Midterm: tonight!