

# The Planning Problem *Applied To Autonomous Driving*

#### Given:

- 1. An <u>initial state</u> of the world => The current car pose & velocity
- 2. A set of <u>available actions</u>, their requirements, and their effects => Safe driving actions (steering, throttle)
- 3. A goal state => Driving destination

## Compute:

A <u>valid sequence of actions</u> that starts from the initial state and terminates at the goal state => Plan = sequence of driving actions





# Planning Via Search (Revision)

- 1. Enumerate all possible actions available, and the resulting states
- 2. Check if goal state reached
- 3. If not, for every possible outcome, repeat step 1 for all new states

# Planning Via Search (Revision)

- 1. Enumerate all possible actions available, and the resulting states
- 2. Check if goal state reached
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Nope, can't do that.

#### **Problems:**

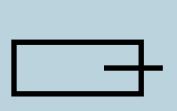
- States are continuous!
- Actions are continuous!



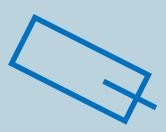


## Planning With Continuous Actions

How can we plan for a continuous sequence of motions to take the car from the start to the goal, while avoiding all obstacles?







# FAKE NEWS Motion Planning "The piano mover's problem" a.k.a. Let's help Ross plan for how to move his couch up the stairs





# Motion Planning Using Rapidly Exploring Random Trees

- 1. Randomly sample a state
- 2. Try to get there from the closest known pose
  - 1. If success, expand tree
  - 2. If collision, discard new pose
- 3. Repeat 1, 2 until goal reached

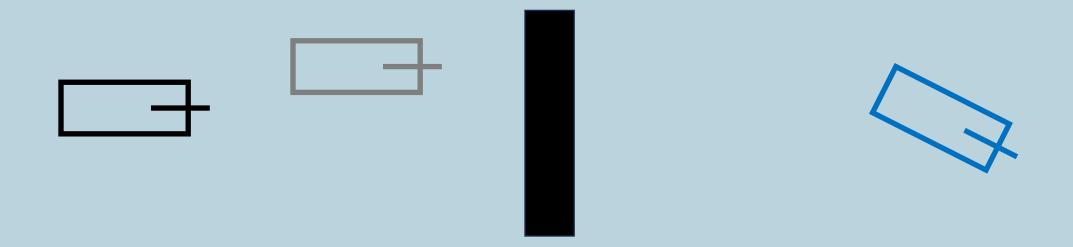
LaValle, Steven. "Rapidly-exploring random trees: A new tool for path planning." *Research Report 9811* (1998).

LaValle, Steven, and Kuffner, James. "Randomized kinodynamic planning." *The international journal of robotics research* 20.5 (2001): 378-400.





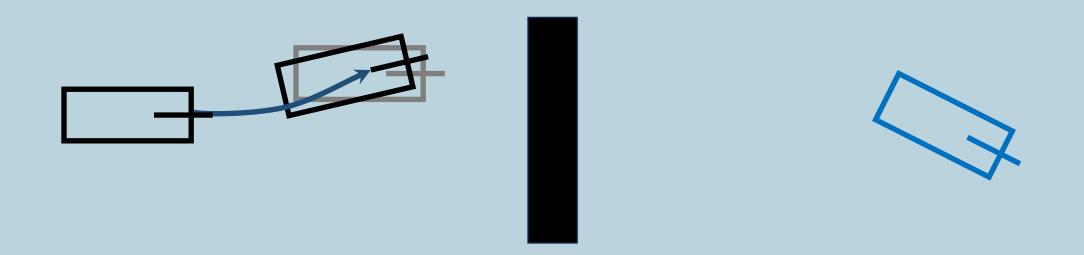
# 1. Randomly sample a state







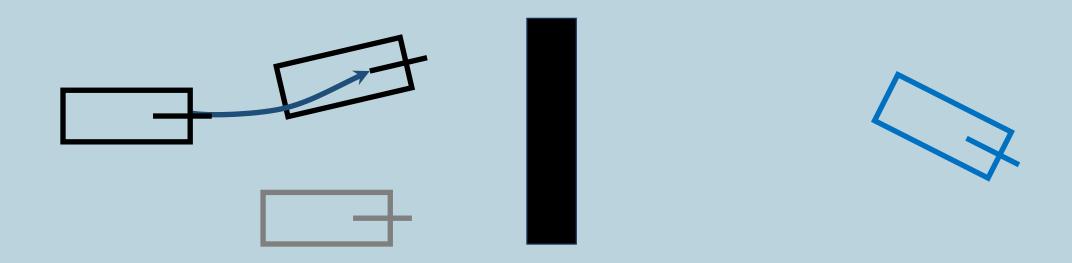
## 2. Try to get there from closest known pose







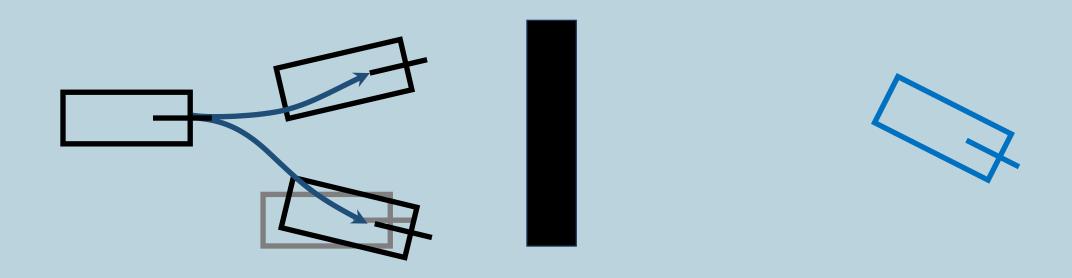
# Repeat 1: Randomly sample a state







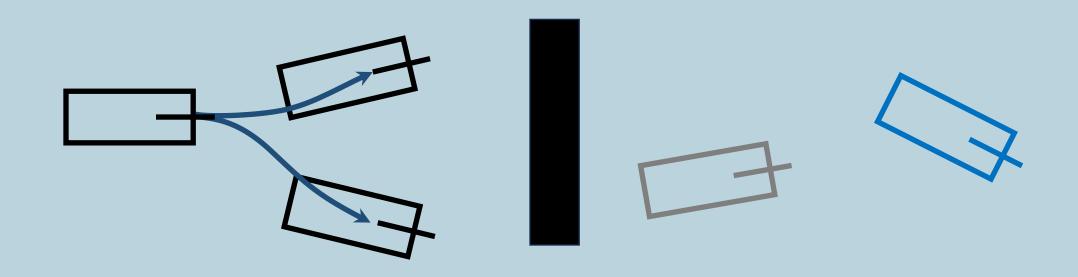
# 2. Try to get there from closest known pose







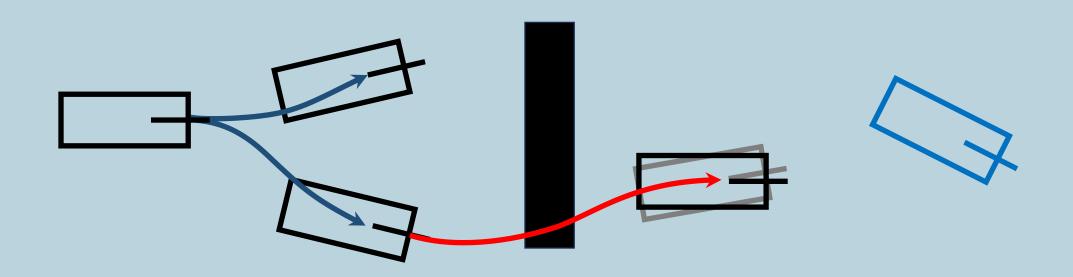
# Repeat 1: Randomly sample a state







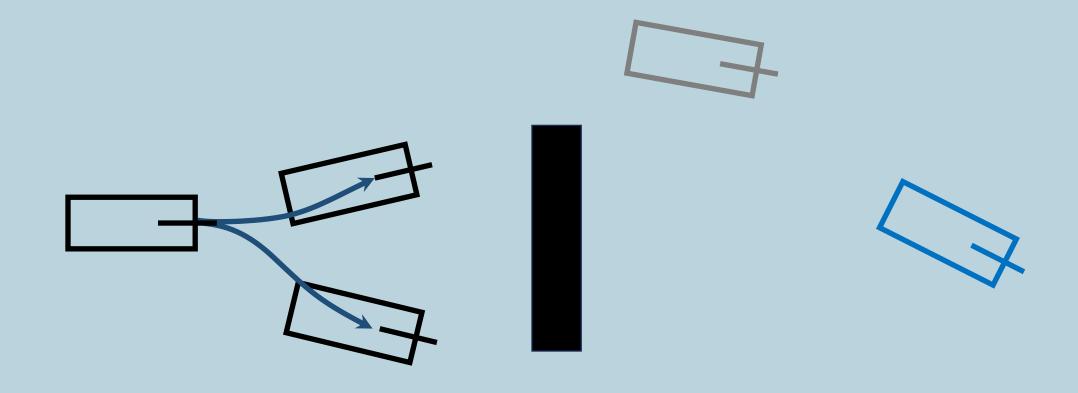
## 2. Try to get there from closest known pose







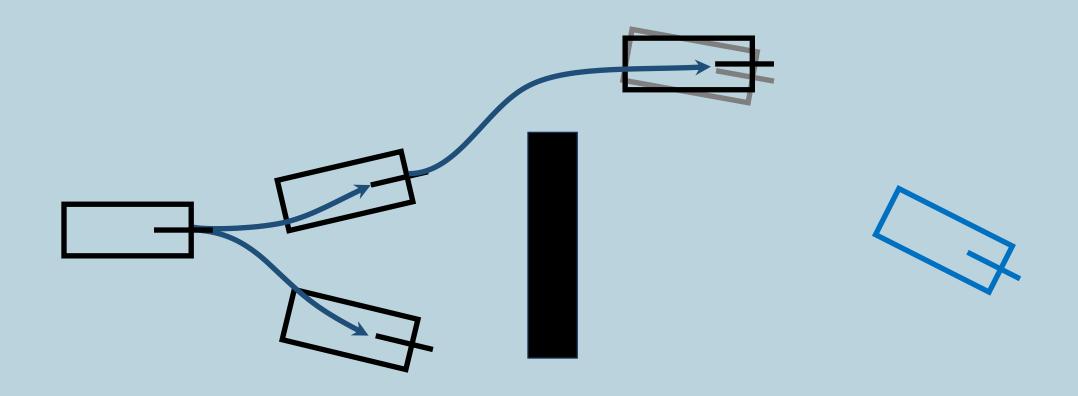
# Repeat 1: Randomly sample a state





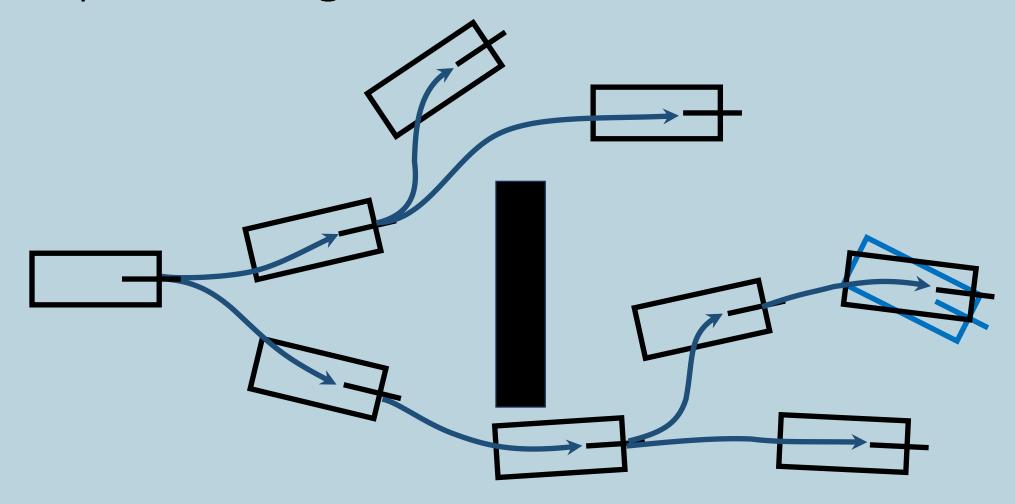


## 2. Try to get there from closest known pose



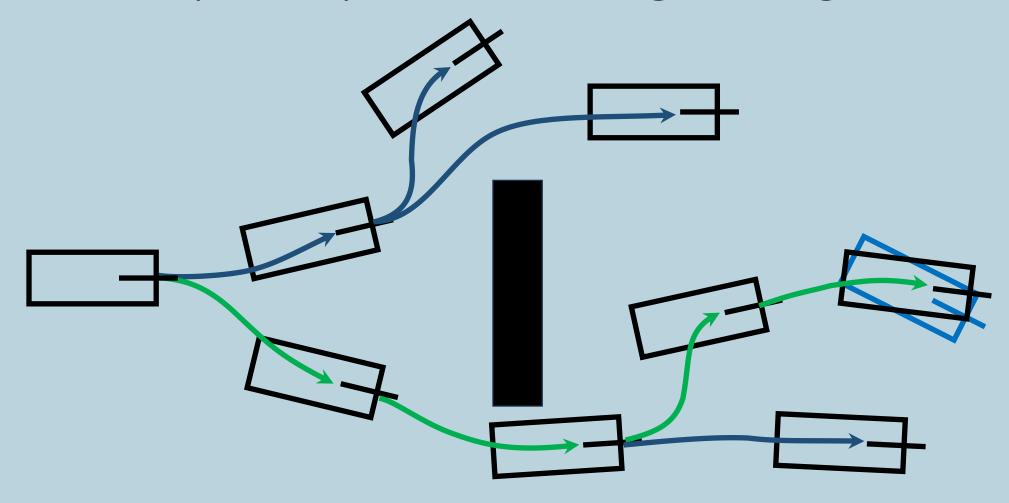


# Repeat until goal reached



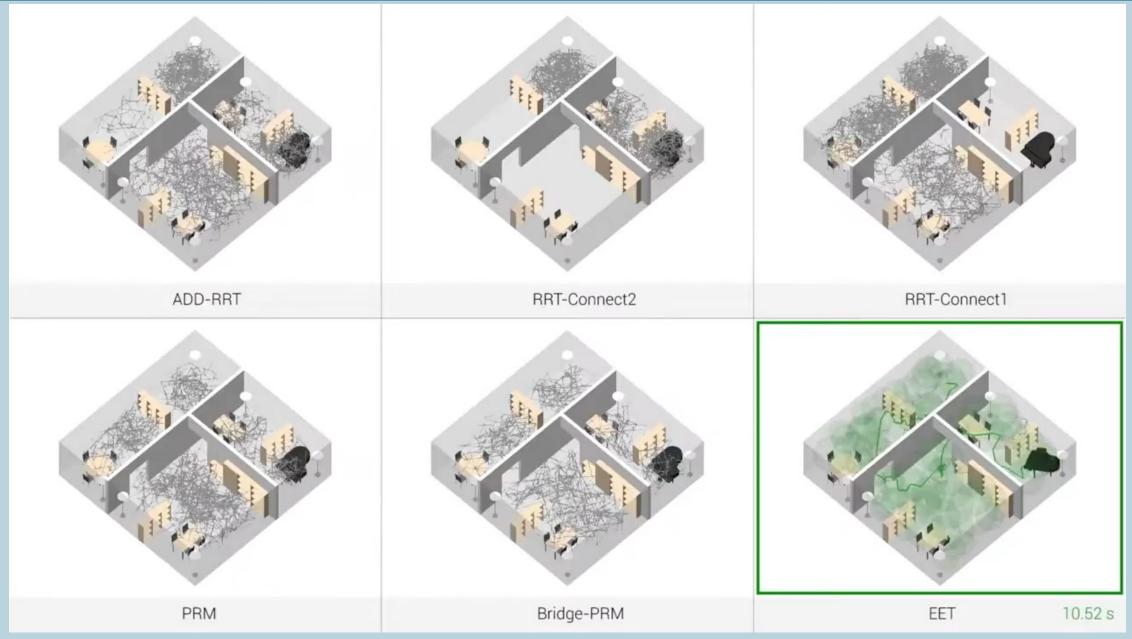


# Extract plan by backtracking from goal to start



















## Revision: The Planning Problem

#### Given:

- 1. An *initial state* of the world
- 2. A set of *available actions*, their requirements, and their effects
- 3. A *goal state*
- 4. [Optionally] *Costs* associated with each action

## Compute:

A <u>valid sequence of actions</u> (the <u>plan</u>) that starts from the initial state and terminates at the goal state [with fewest actions / minimum cost]





What if you don't know everything? E.g., What's behind a box before pulling it

Given:

1. An *initial state* of the world

- 2. A set of *available actions*, their requirements, and their effects
- 3. A *goal state*
- 4. [Optionally] *Costs* associated with each action

### Compute:

A <u>valid sequence of actions</u> (the <u>plan</u>) that starts from the initial state and terminates at the goal state [with fewest actions / minimum cost]





#### Given:

- 1. An *initial state* of the world
- 2. A set of *available actions*, their requirements, and their effects

What if this is hard to predict?

E.g., Driving at high speed on ice

- 3. A *goal state*
- 4. [Optionally] *Costs* associated with each action

### Compute:

A *valid sequence of actions* (the *plan*) that starts from the initial state and terminates at the goal state [with fewest actions / minimum cost]





#### Given:

- 1. An *initial state* of the world
- 2. A set of *available actions*, their requirements, and their effects
- 3. A *goal state*

What if this is ill-specified?
E.g., Plan an awesome hiking trip

4. [Optionally] **Costs** associated with each action

## Compute:

A <u>valid sequence of actions</u> (the <u>plan</u>) that starts from the initial state and terminates at the goal state [with fewest actions / minimum cost]





#### Given:

- 1. An *initial state* of the world
- 2. A set of *available actions*, their requirements, and their effects
- 3. A goal state

E.g., Social costs of actions

What if it is hard to specify?

4. [Optionally] *Costs* associated with each action

## Compute:

A <u>valid sequence of actions</u> (the <u>plan</u>) that starts from the initial state and terminates at the goal state [with fewest actions / minimum cost]





## Summary

- The planning problem
- Three applications of planning
  - Symbolic planning
  - Adversarial planning
  - Motion planning
- Three approaches to planning
  - Search + heuristics
  - Adversarial search + heuristics + learning
  - Rapidly Exploring Random Trees
- Open research problems in planning



