# **CMPUT 397 Reinforcement Learning:**

# Introduction

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## Goal is a compact way of describing intelligent behaviors



#### A gigantic granite boulder



#### A cat catching a ladybug

(A goal-achieving system)

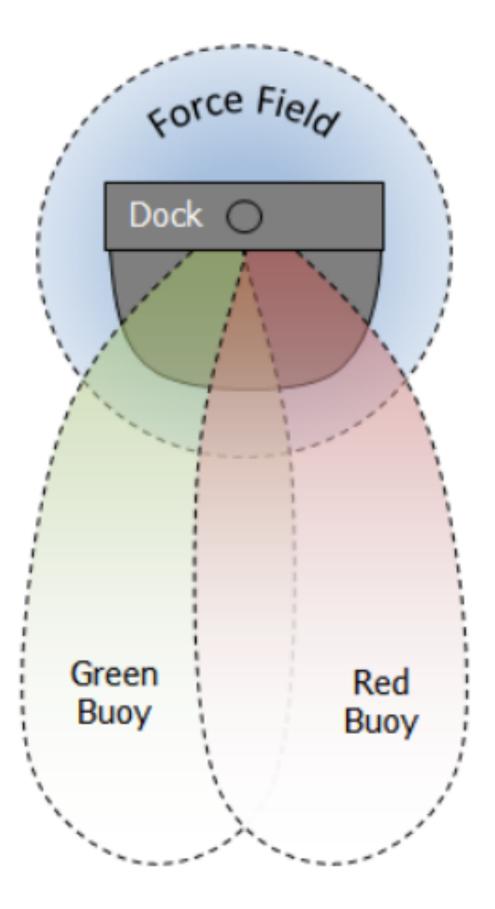
Intelligence is the computational part of the ability to achieve goals in the world

# Al is the study of goal-achieving systems

# Consider the goal of docking to a charging station



#### **Dock beam configuration**



## Al systems are conventionally hand-engineered

#### If perceive situation/state S; then choose action A

Decision-making can be seen as a state-to-action mapping known as a *policy* 

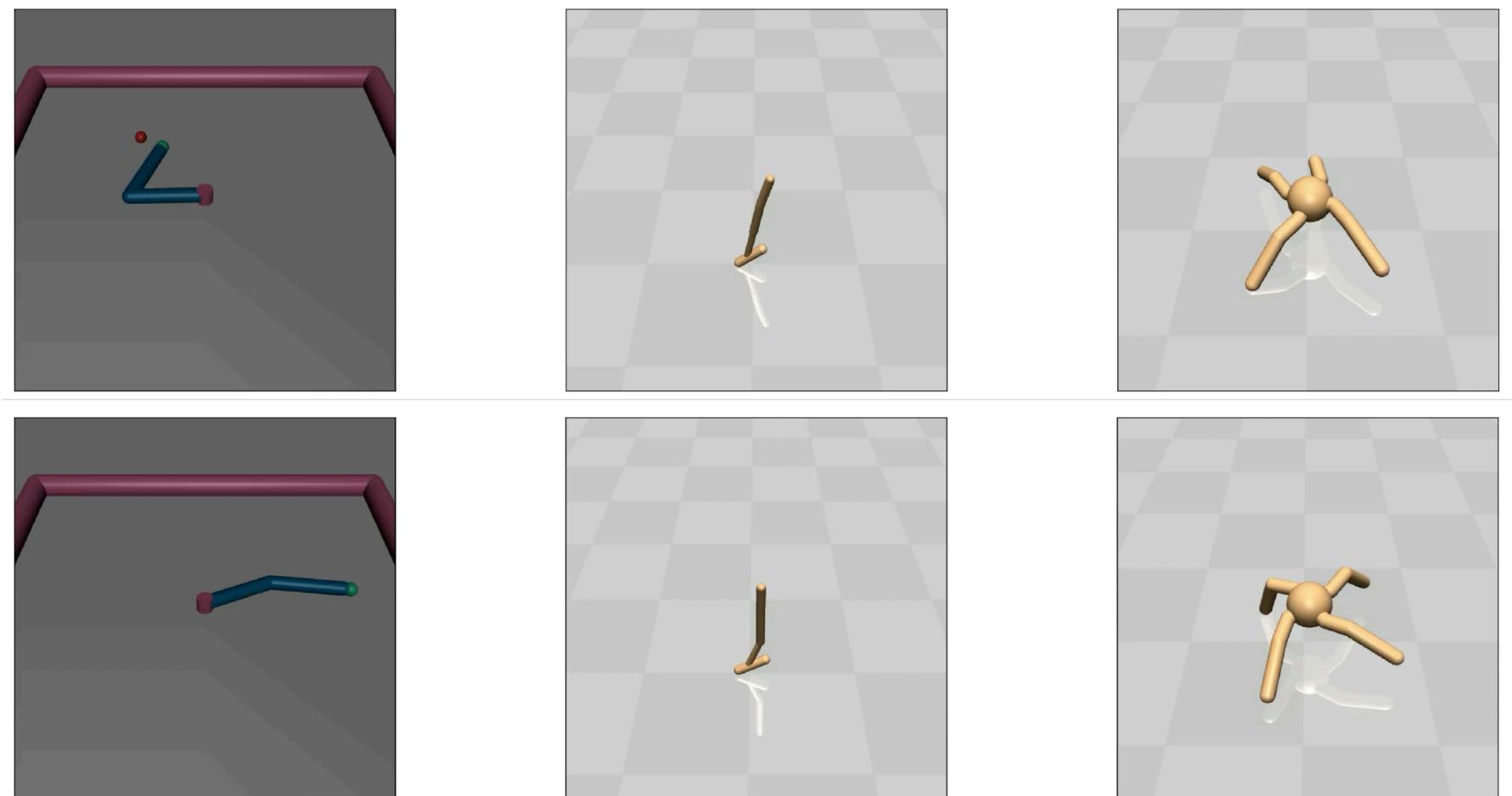
Conventionally, such maps are pre-determined, e.g., through hand-engineering

# The docking behavior of a scripted agent provided by the manufacturer

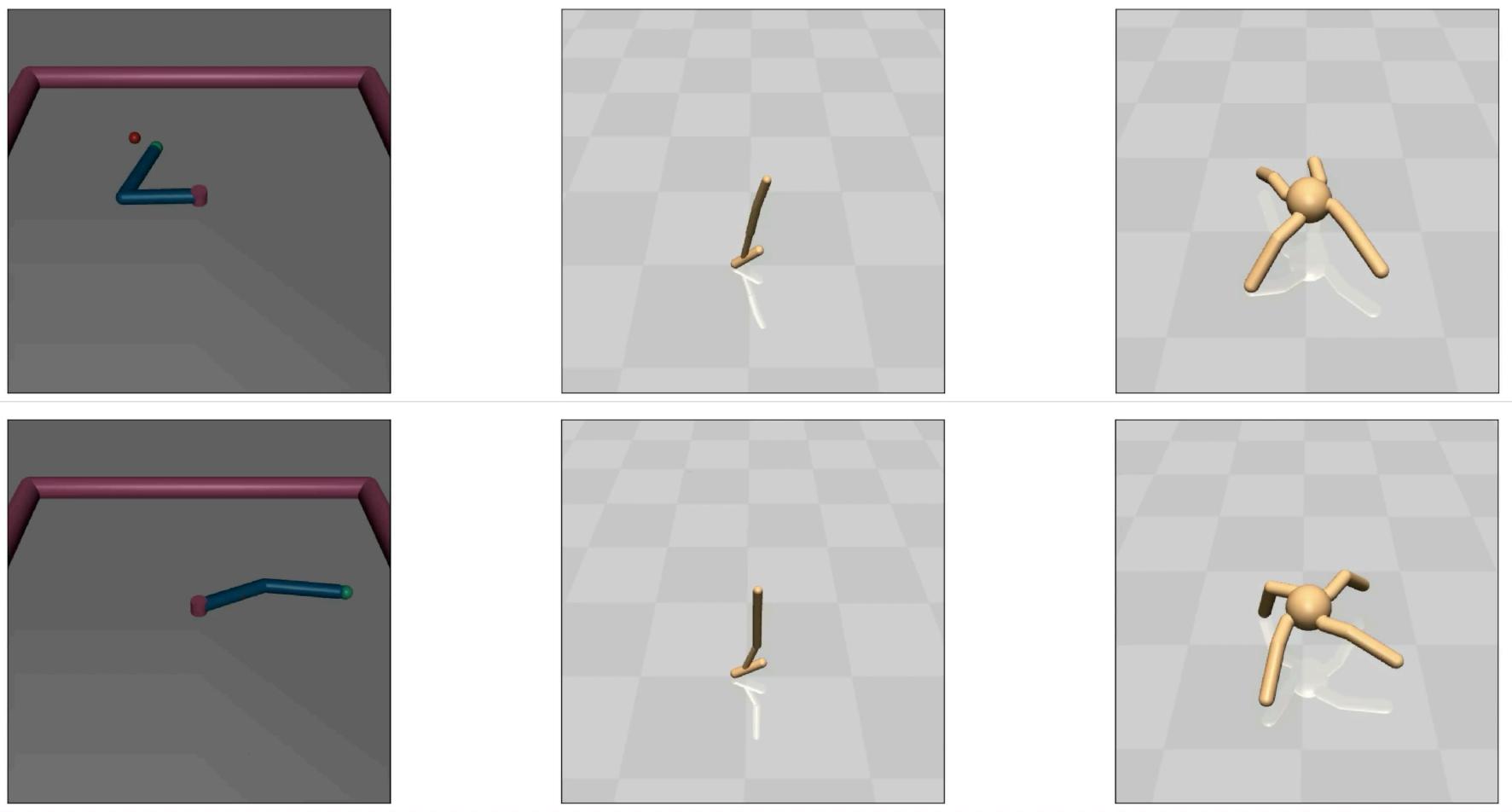


# The scope for decision making is numerous. Who should build the policy?

Initial behavior (random map)



After learning the policy



#### Same mechanism used to learn the policy in all three cases

# At Kindred, we developed a robot learning platform to show the generality of RL systems using physical robots

**Initial behavior** 

 $\bigcirc$ 



Learned behavior

 $\bigcirc$ 

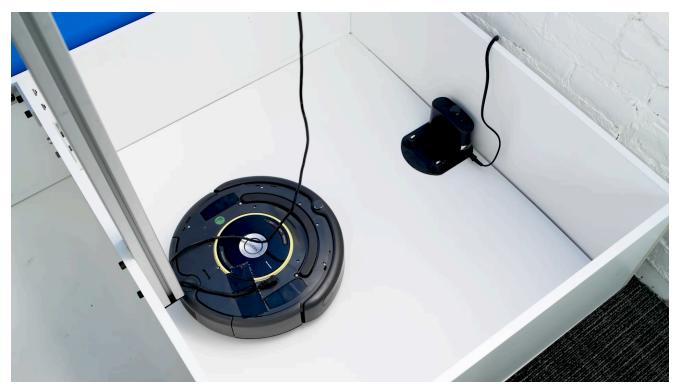
Learned behavior



#### https://github.com/kindredresearch/SenseAct

#### Initial behavior

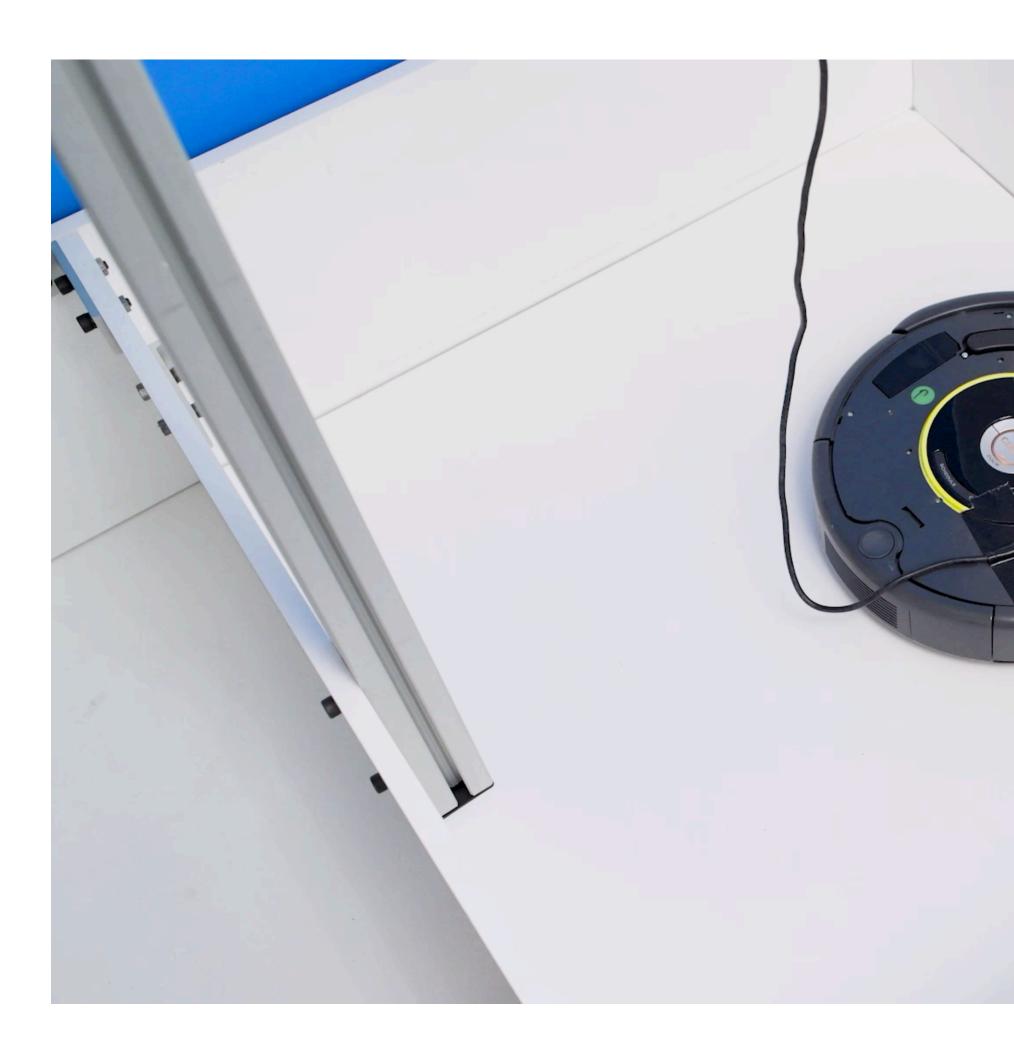
Initial behavior







## The docking behavior of a learned policy



#### Resetting

# Learning to dock reproduced by students in CMPUT 652: RL with Robots (Fall 2019)



Archit Sakhadeo, Parash Rahman, Hager Radi, Mohamed Elsayed

#### This Course

- In this course, we will develop the conceptual understanding that builds up to algorithms for prediction and control learning e.g., temporal-difference learning, Q learning
- We will learn about the technical frameworks for these algorithms e.g., Bandits and Markov Decision Processes
- A clear understanding of probabilities and expectations is required

#### Instruction Team

- $\checkmark$
- TAs (graduate students doing RL research):  $\checkmark$ 
  - **Banafsheh Rafiee**
  - Xutong Zhao -
  - Shivam Garg -

# Rupam Mahmood (Faculty @UofA, RLAI, Amii, CIFAR, Kindred)



#### Use the course discussion feature on eClass $\checkmark$

#### Meet with the instruction team during office hours $\checkmark$

#### Prerequisites

- Some comfort or interest in thinking abstractly and with  $\checkmark$ mathematics
- Elementary statistics, probability theory  $\checkmark$ 
  - conditional expectations of random variables
- Basic linear algebra: vectors, vector equations, gradients  $\checkmark$
- Programming skills (Python)  $\checkmark$



- $\checkmark$ R Sutton and A Barto, MIT Press.
  - available freely online: http://incompleteideas.net/book/the-book-2nd.html

Readings will be from: Reinforcement Learning: An Introduction, by

## **Course Information**

- Github pages: <u>https://armahmood.github.io/rlcourse/</u>  $\checkmark$ 
  - Syllabus
- Course eClass page:  $\checkmark$
- Coursera RL Specialization:  $\checkmark$ 
  - Videos, assignments & project

#### updated schedule containing slides, assignment links & deadlines

#### discussions, questions, announcements & course information



## **Coursera RL Specialization**

- ✓ We have our own private session, instruction on registering @ eClass
- RL Specialization has four courses
- Each course divided into 4-to-5 weeks
- To avoid confusions, we refer to Coursera Courses as mini-courses and Coursera weeks as modules
- The Markov Decision Processes covered in Coursera Course 1 and week 2 is referred to as mini-course 1, module 2

## **Coursera RL Specialization (continued)**

- Mini-course 1: Fundamentals of RL (4 modules)  $\checkmark$
- Mini-course 2: Sample-based learning methods (4 modules: 2-5)  $\checkmark$
- Mini-course 3: Prediction and Control with Function Approximation  $\checkmark$ (4 modules)
- Mini-course 4: Capstone project (4 modules)  $\checkmark$



### How We Use Coursera RL Specialization

- Each week starting from next will be based on one module
- Each module has videos, 1 practice quiz, & 1 graded assignment
- Practice quiz is usually due on Sunday the week before
- Graded assignment is usually due on Friday of the week for the module
- ✓ For example, next week is K-armed bandit (mini-course 1, module 1)
- ✓ Its practice quiz due on Jan 12 (Sun), its assignment due on Jan 17 (Fri)
- Capstone modules will not run in-class but will have a deadline



- Practice quizzes (80% pass, 10 out of 11) 10%  $\checkmark$
- Assignments (graded quizzes/notebooks on Coursera) 30%  $\checkmark$
- Midterm exam 20%  $\checkmark$
- Final exam 30%  $\checkmark$
- Project 10%  $\checkmark$

## More on Practice Quizzes and Assignments

- All practice quizzes and assignments have five attempts
- The surest way to do well in practice quizzes is to
  - watch the lecture videos (at most 1 hour of time)
  - complete the readings
- Assignments are graded quizzes or notebooks



#### Grades are not based on a curve $\checkmark$

- You can see your approximate ranking in eClass throughout the  $\checkmark$ course
- Letter grades are provided by ranges of percentages  $\checkmark$

#### Collaboration

- Working together to solve the problems is encouraged
- But you must write-up your answers individually
- Do not take written notes during discussions
- You must acknowledge all the people you talked with in solving the problems

## **Academic Integrity**

The University of Alberta is committed to the highest standards of  $\checkmark$ policies of the University in this respect. Students are particularly urged to familiarize themselves with the provisions of the Code of Student Behavior (online at www.ualberta.ca/secretariat/ and can result in suspension or expulsion from the University.

academic integrity and honesty. Students are expected to be familiar with these standards regarding academic honesty and to uphold the appeals.htm) and avoid any behavior which could potentially result in suspicions of cheating, plagiarism, misrepresentation of facts and/or participation in an offence. Academic dishonesty is a serious offence



- Typically Friday noons @ CSC 3-33  $\checkmark$
- Free Pizzas  $\checkmark$
- Great AI topics and speakers  $\checkmark$

