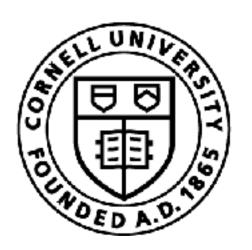
# CS 4756/5756: Robot Learning



## Sanjiban Choudhury









Ð	(a	m	р	les	

"Explain quantum computing in simple terms" →	Remer earlie
"Got any creative ideas for a 10 year old's birthday?" →	Allows us
"How do I make an HTTP request in Javascript?" →	Trained t

Free Research Preview: ChatGPT is optimized for dialogue. Our goal is to make AI systems more natural to interact with, and your feedback will help us improve our systems and make them safer.

#### ChatGPT

4

Capabilities

embers what user said er in the conversation

user to provide follow-up corrections

to decline inappropriate requests

#### ≙

Limitations

May occasionally generate incorrect information

May occasionally produce harmful instructions or biased content

Limited knowledge of world and events after 2021

>



••	😑 📄 animat
<b>4</b> ►	animate_double_pendulum.py
1	import numpy as np
2	<pre>import matplotlib.pyplot as plt</pre>
3	<pre>from matplotlib.animation import FuncAn</pre>
4	
5	<pre># Define the equations of motion for th</pre>
6	<pre>def equations_of_motion(y, t, L1, L2, m</pre>
7	th1, th2, dth1, dth2 = $y$
8	dydt = [dth1,
9	dth2,
10	(-g*(2*m1 + m2)*np.sin(th1) )*m2*(dth2**2*L2 + dth1 np.cos(2*th1 - 2*th2)))
11	(2*np.sin(th1 - th2)*(dth1* **2*L2*m2*np.cos(th1 - ))]
12	return dydt
13	
14	# Set up the initial conditions and oth
15	y0 = [np.pi/2, np.pi/2, 0, 0]
16	L1 = 1
17	L2 = 1
18	m1 = 1
19	m2 = 1
20	g = 9.81
21	
22	# Solve the equations of motion using o
23	<pre>from scipy.integrate import odeint</pre>
24	t = np.linspace(0, 10, 1000)
25	<pre>sol = odeint(equations_of_motion, y0, t</pre>
26	Jose Gallie (cquarizons_or_morizon) joj c
27	# Animate this pendulum

te\_double\_pendulum.py

#### UNREGISTERED

all a sea and an annual

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nimation

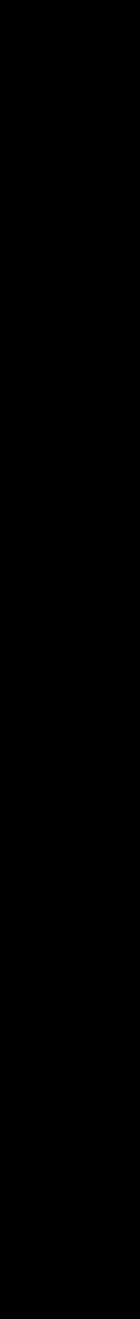
ne double inverted pendulum n1, m2, g):

) - m2\*g\*np.sin(th1 - 2\*th2) - 2\*np.sin(th1 - th2 l\*\*2\*L1\*np.cos(th1 - th2)))/(L1\*(2\*m1 + m2 - m2\* ), k\*2\*L1\*(m1 + m2) + g\*(m1 + m2)\*np.cos(th1) + dth2 th2)))/(L2\*(2\*m1 + m2 - m2\*np.cos(2\*th1 - 2\*th2)

ner parameters

deint

:, args=(L1, L2, m1, m2, g))



	-ò-	47	$\bigtriangleup$	
	Examples	Capabilities	Limitations	
"E)	plain quantum computing in simple terms" →	Remembers what user said earlier in the conversation	May occasionally generate incorrect information	
"Ge	ot any creative ideas for a 10 year old′s birthday?" →	Allows user to provide follow- up corrections	May occasionally produce harmful instructions or biased content	
	"How do I make an HTTP request in Javascript?" →	Trained to decline inappropriate requests	Limited knowledge of world and events after 2021	
Help me complete this code to animate a double inverted pendulum				
import matplotlib.pyplot as plt from matplotlib.animation import FuncAnimation				
# Define the equations of motion for the double inverted pendulum def equations_of_motion(y, t, L1, L2, m1, m2, g):			<b>₽</b>	

#### ChatGPT

ChatGPT Jan 9 Version. Free Research Preview. Our goal is to make AI systems more natural and safe to interact with. Your feedback will help us improve.







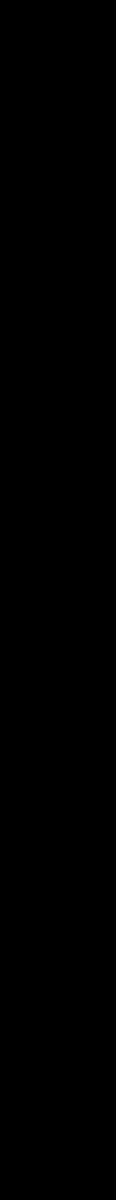


#### "Voyage through Time" is my first artpiece using blown away with the pos

# Al tools that are OPEN!

seed_	and_prompt_	sequence = [
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	6573, 'H	ID photo of a large amount of
	1791, 'e	arly planet formation in the
	9973, 't	he Hadean earth was bombarde
	736 <b>, '</b> p	anoramic view of earth with
	3639, 'h	ydrothermal vents at the bot
	3559, 'b	acteria under a microscope',
	4724, 'b	acteria under a microscope',
	3359, 'a	mmonites floating in the oce
	6344, 't	he first reptile to leave th
	6344, 't	he first reptile to leave th
	6813 <b>, '</b> m	assive brachiosaurus walking
	6678, 't	he exctinction of the dinosa
	7450, 's	mall mammals thriving in a c
	9766, 's	mall, prehistoric mammals li
	5009, 'g	roup of monkeys in the fores
	7287, 'H	ID photograph of neanderthal,
	6008 <b>,</b> 'c	ave painting',
	208, 'c	avemen tribe gathered around
	2222, 'm	aasai tribe hunting on the s
	571, 'h	omo sapiens using stone tool
	632 <b>,</b> 'a	small, tribal village with
	1332, 'a	t the dawn of civilization,
	2496, 'a	ncient egypt, the first mass
	1869, 't	he height of the roman empir:
	7559, 'm	edieval town square',
	1265, 'm	edieval city',
	6628, 't	he skyline of New York city'

```
nothing, just darkness',
he big bang',
of spiral galaxies',
he solar system',
ded with asteroids and massive volcanic eruptions',
 ocean surrounding newly formed land and volcanos',
ottom of the ocean',
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the ocean and crawl onto the land',
ng amidst a green mountain range',
saurs be a huge meteorite',
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living in the jungle',
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l, the first man',
nd a fire at night looking at the stars',
savanna with spears',
ols',
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ire, incredible architecture, by Greg Rutkowski',
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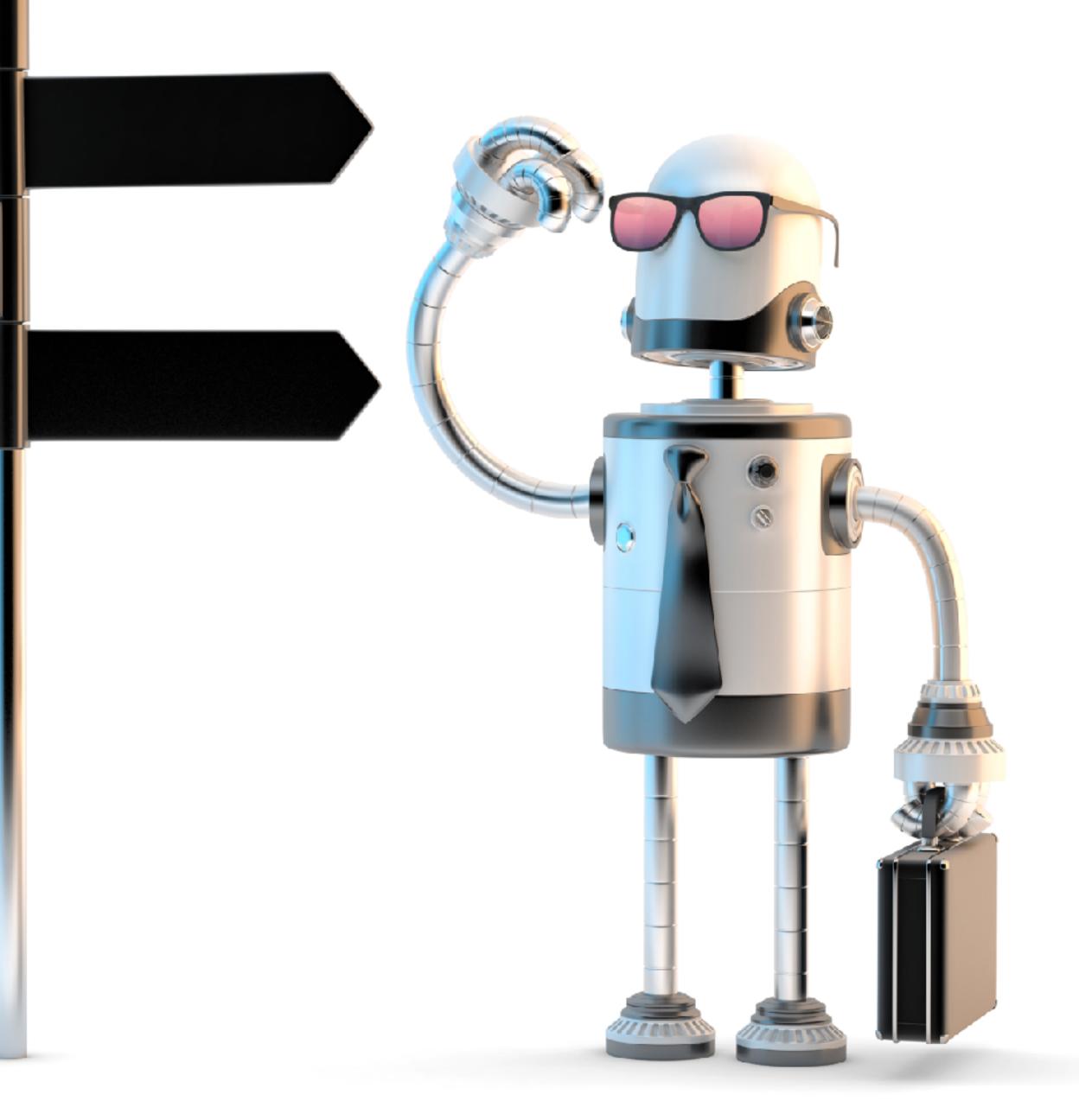


"Voyage through Time" is my first artpiece using blown away with the pos

# Al tools that are OPEN!

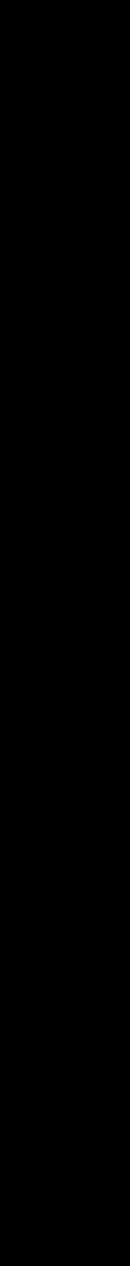


# Where are the robots?





## Robots are not far behind!



## Robots are not far behind!





#### Self-driving companies going driverless ...





#### Boston Dynamics are starting to sell their robots ...

## Robots are not far behind!



### Drones are getting more reliable ...

## Robots are not far behind!



# ... robots are not in millions of homes yet.

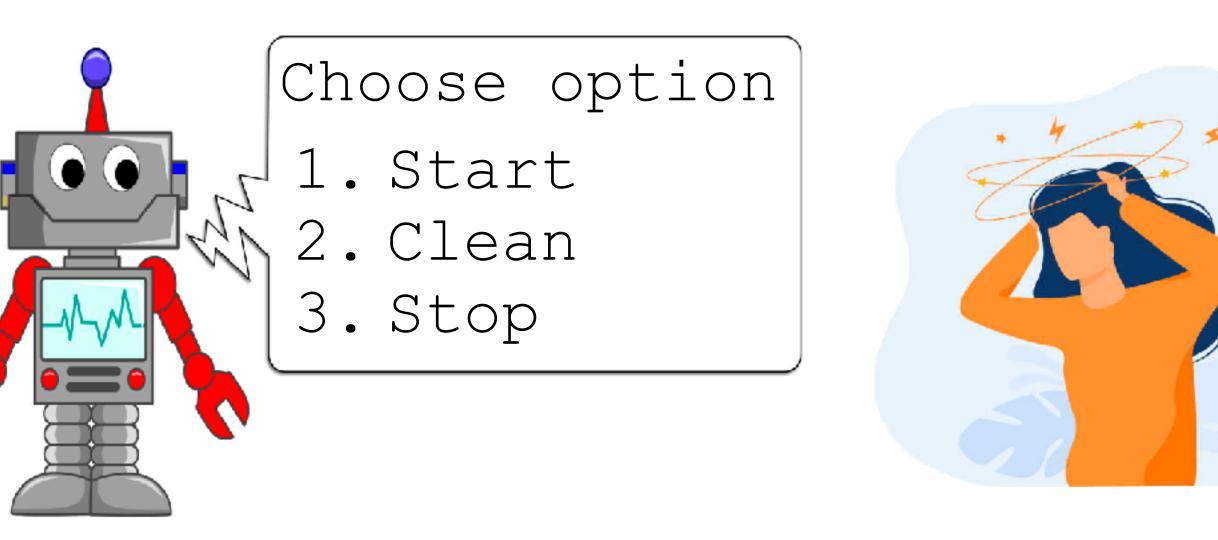


But...

## The way we program robots today is ... rigid!



#### Engineers hand-craft behaviors



Ship robot

Frustrate users!

Not flexible enough to be used by everyday users for everyday tasks

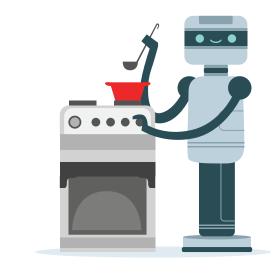








## This restricts robots to a CLOSED world

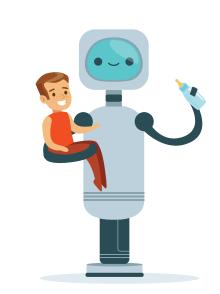


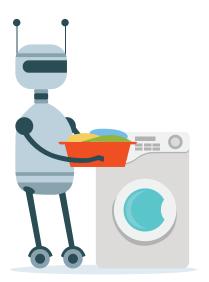


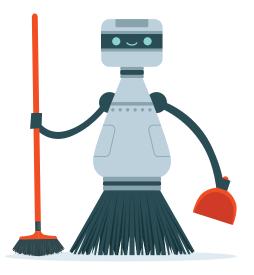














#### The Dream



#### Reality





# How can we get robots out of the factory into the OPEN WORLD?

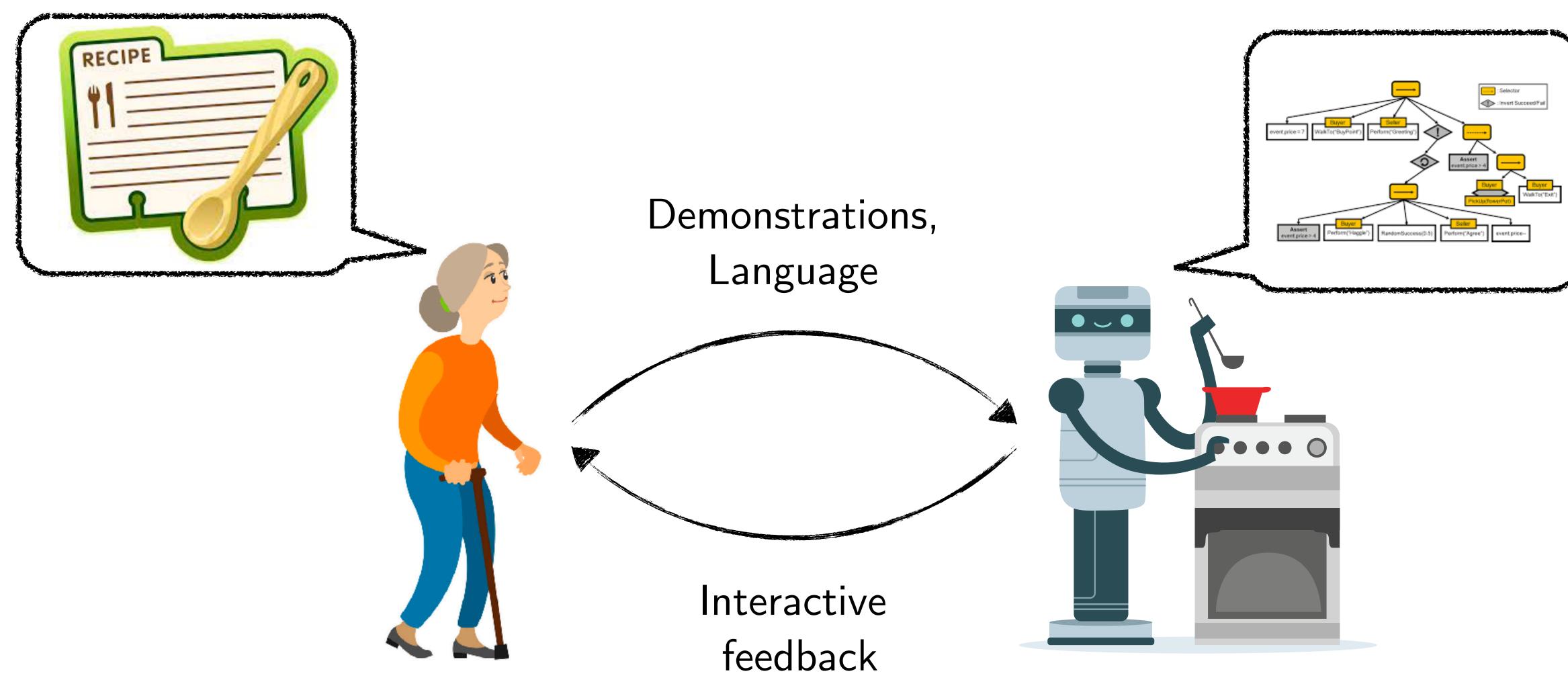








# Build robot apprentice to help grandma!



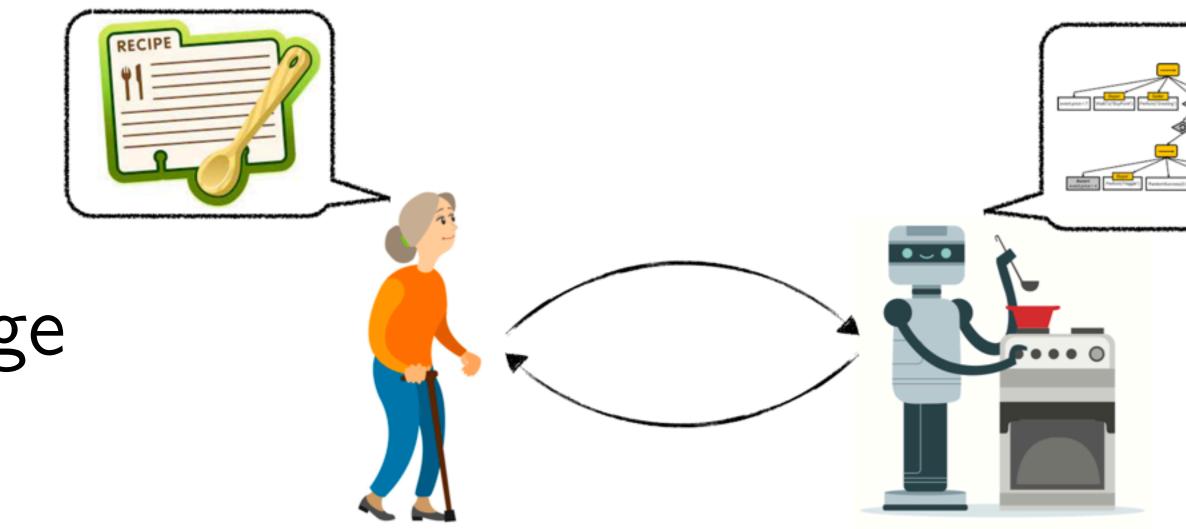


## Think-Pair-Share

## Think (30 sec): Think of ALL the challenges to building such a robot

#### Pair: Find partners

# Share (45 sec): Partners exchange ideas









# Learn from interactions from both humans and the world

## How should robots learn from interactions?







## WHY this course?















Take any robot application



Formulate as a Markov Decision Problem (MDP)



## Solve MDPs using an all-purpose toolkit

(Imitation/Reinforcement learning, Model based/free)

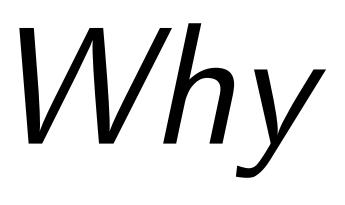












# Why I work on robots

## To better understand humans ...







#### Undergrad: First robot soccer team in India!

#### Learn strategies like humans?





#### Carnegie Mellon THE ROBOTICS INSTITUTE

#### PhD: Full-scale autonomous helicopter flight



#### Fly like a human?









#### PostDoc: Mobile manipulator in the wild



#### Manipulate unknown objects like humans?

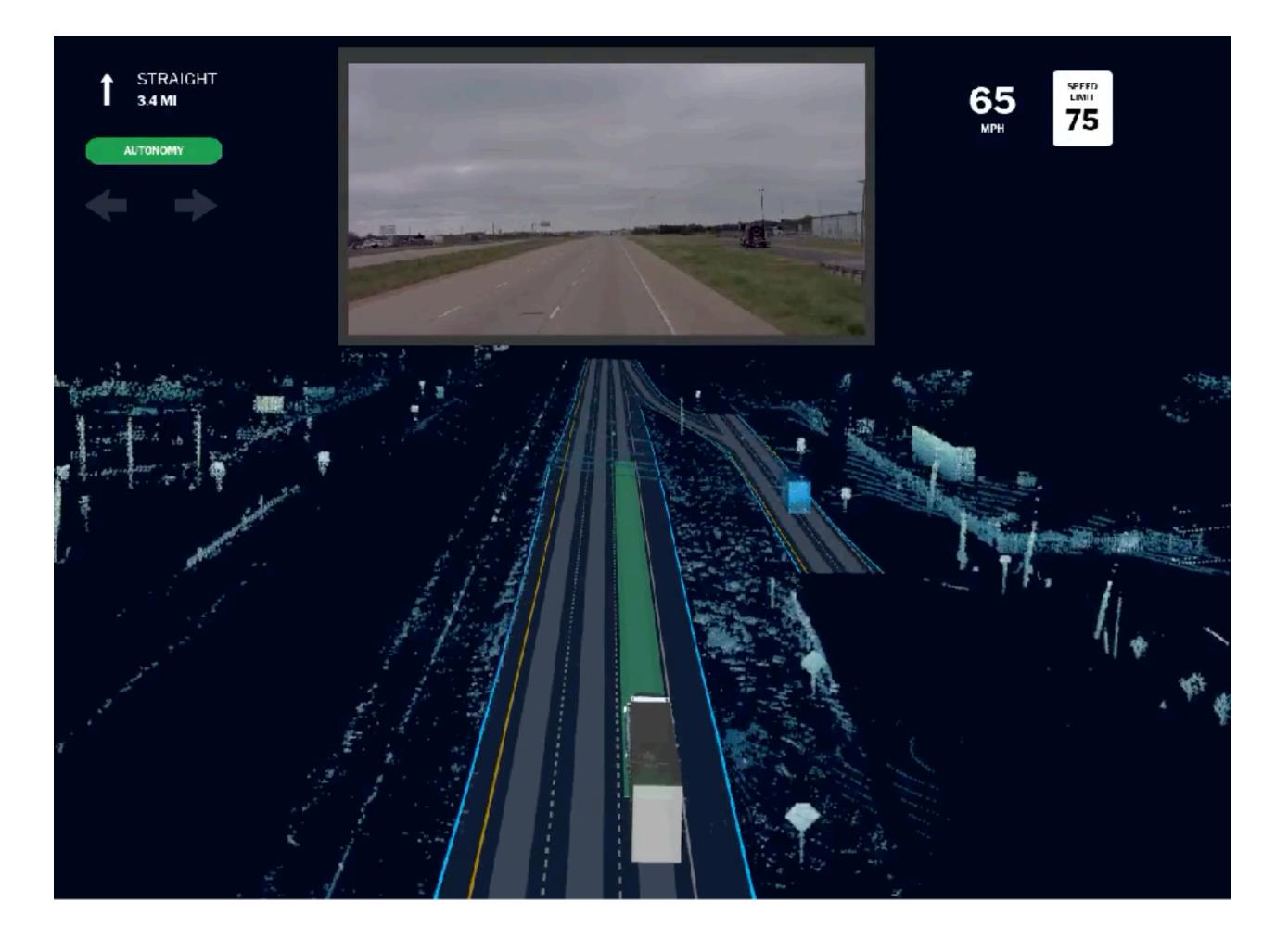












#### Research Engineer: Self-driving

#### Drive alongside humans?



## PoRTaL: People and Robots, Teaching and Learning







# Belonging



## How should robots learn from interactions?

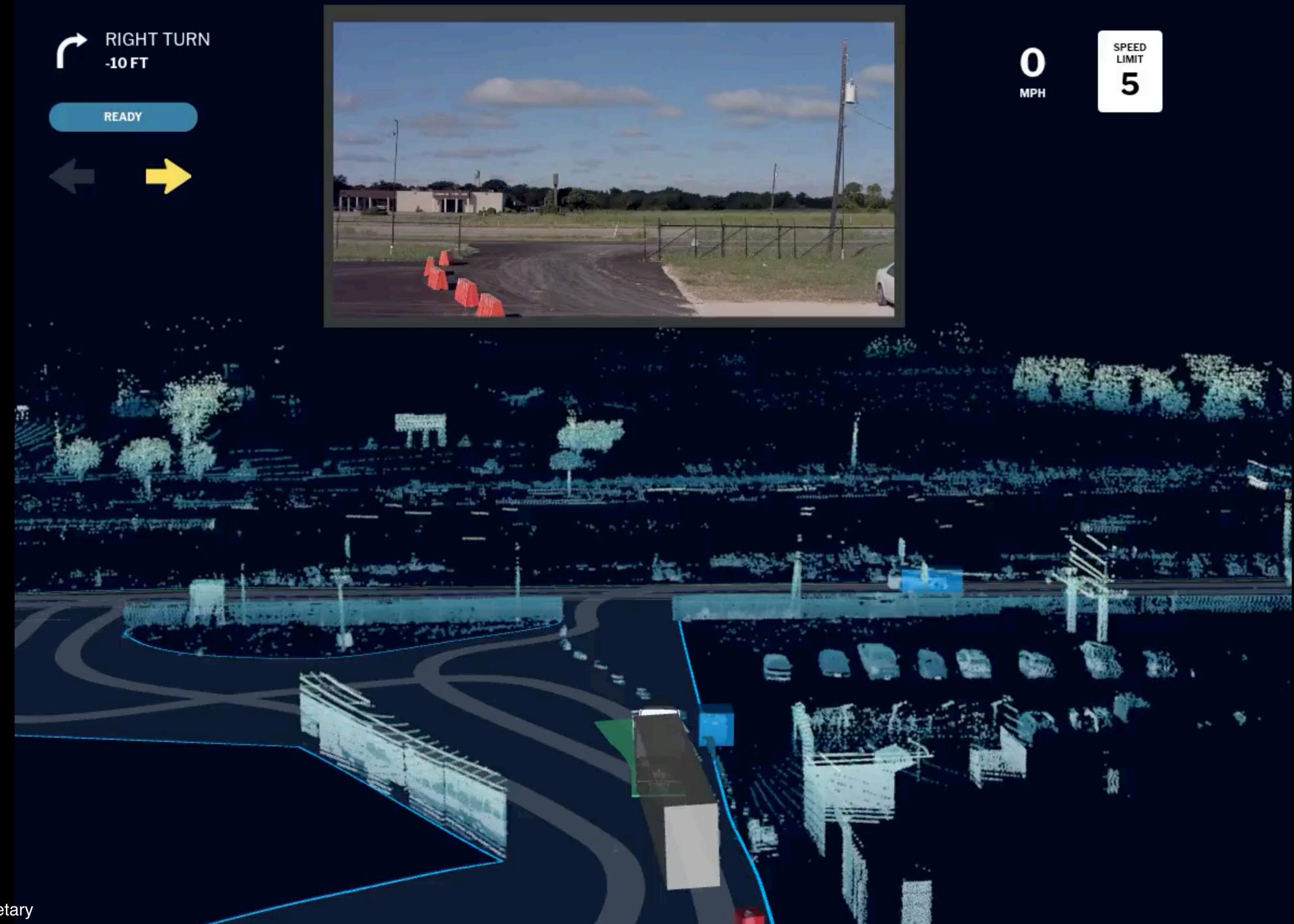






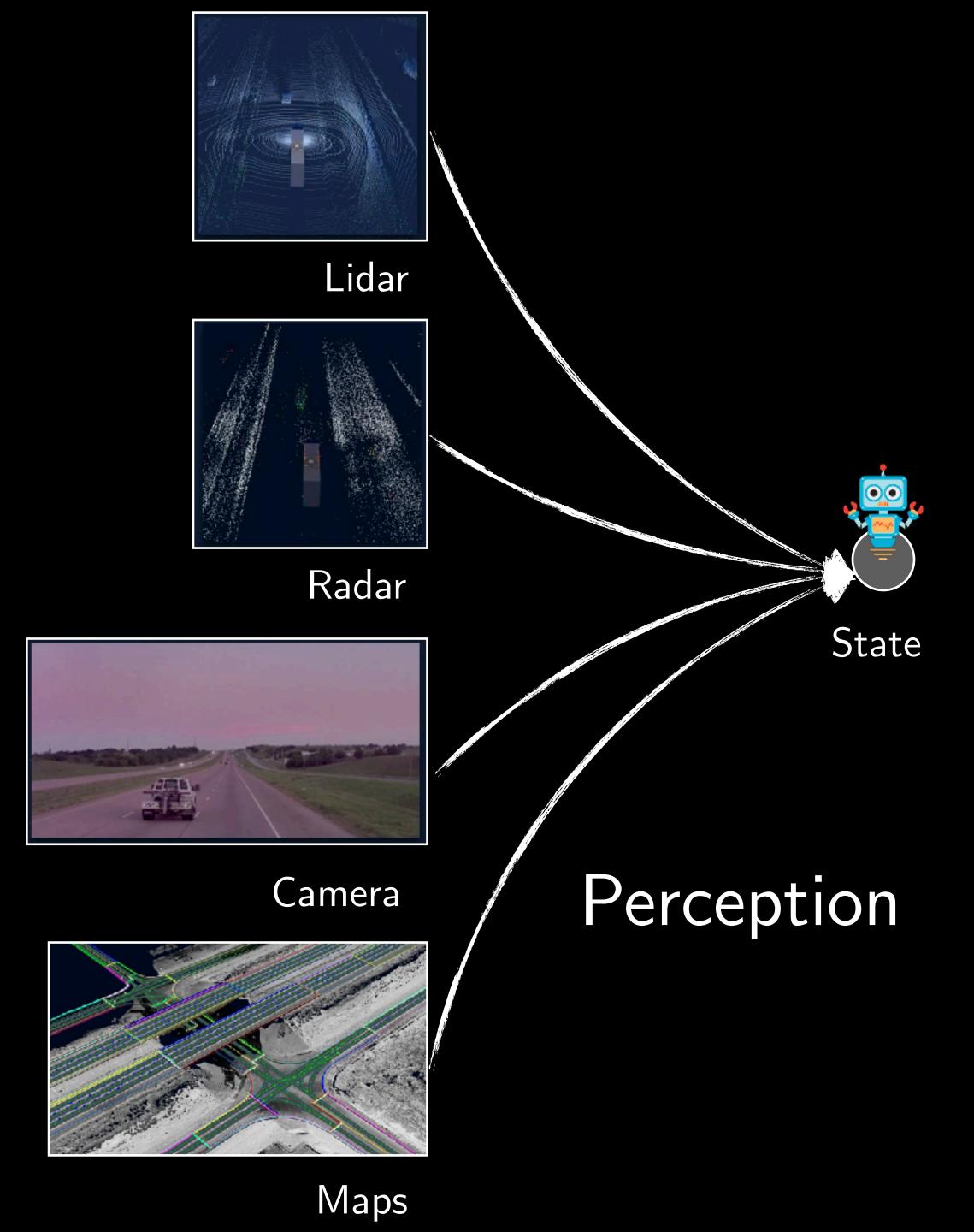
Self-driving

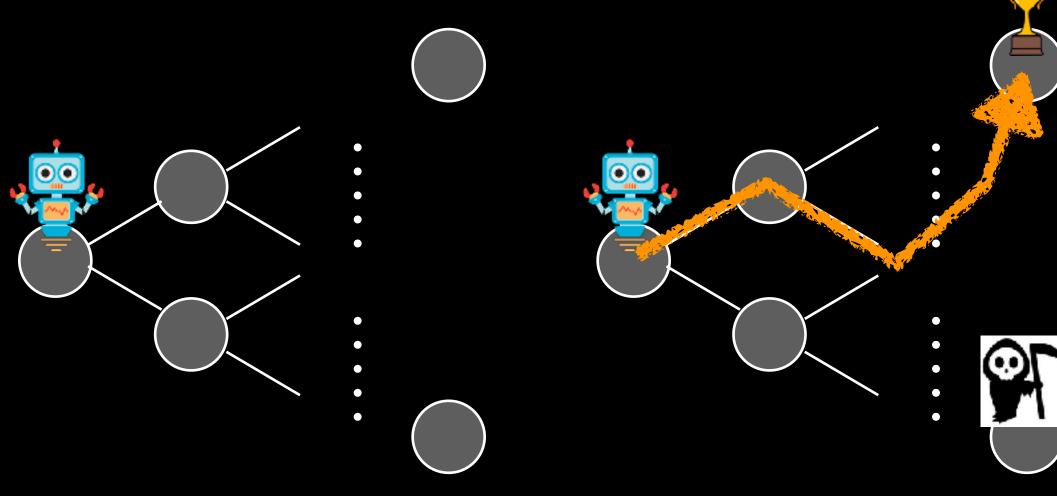




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#### Prediction

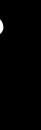
Decision Making



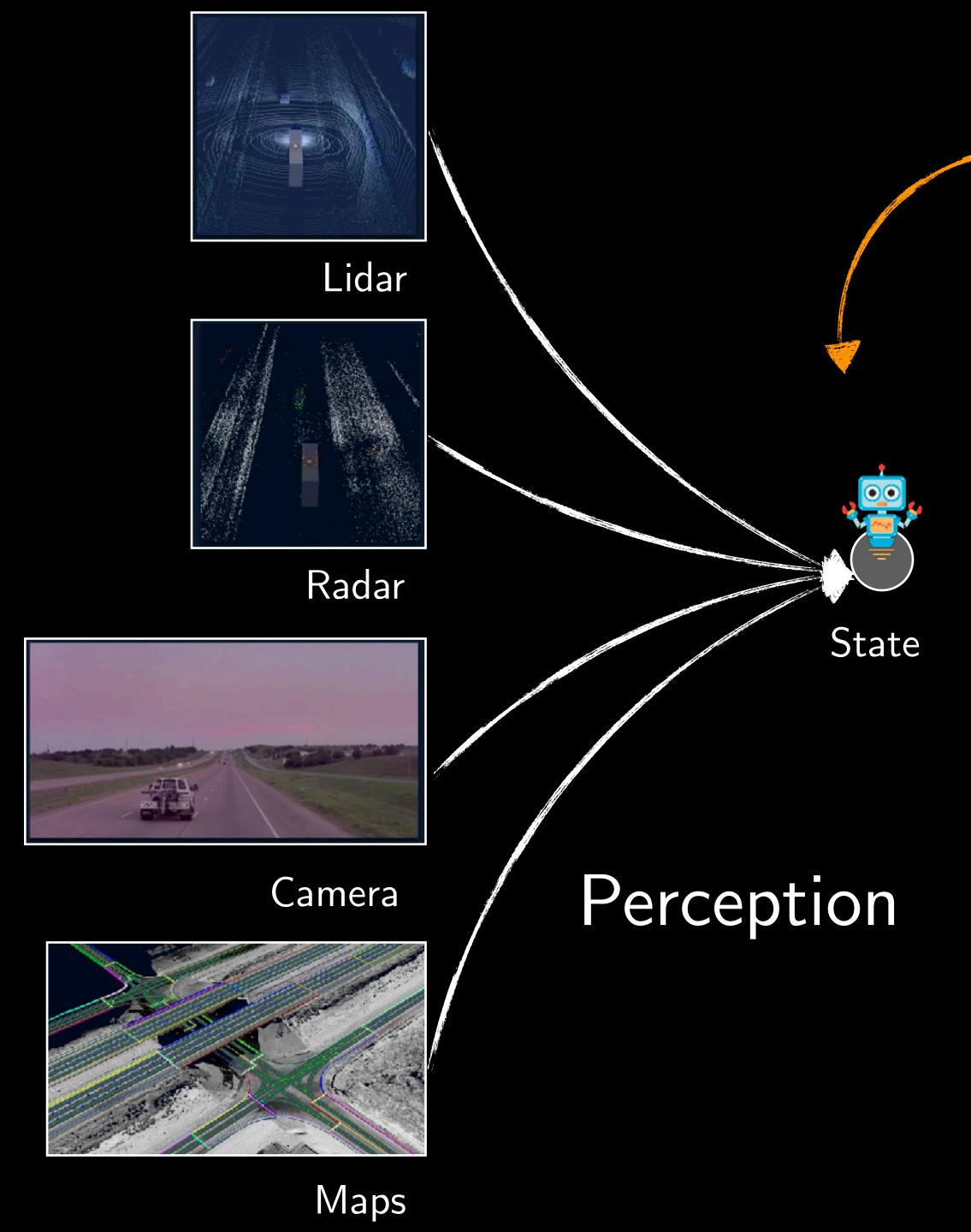


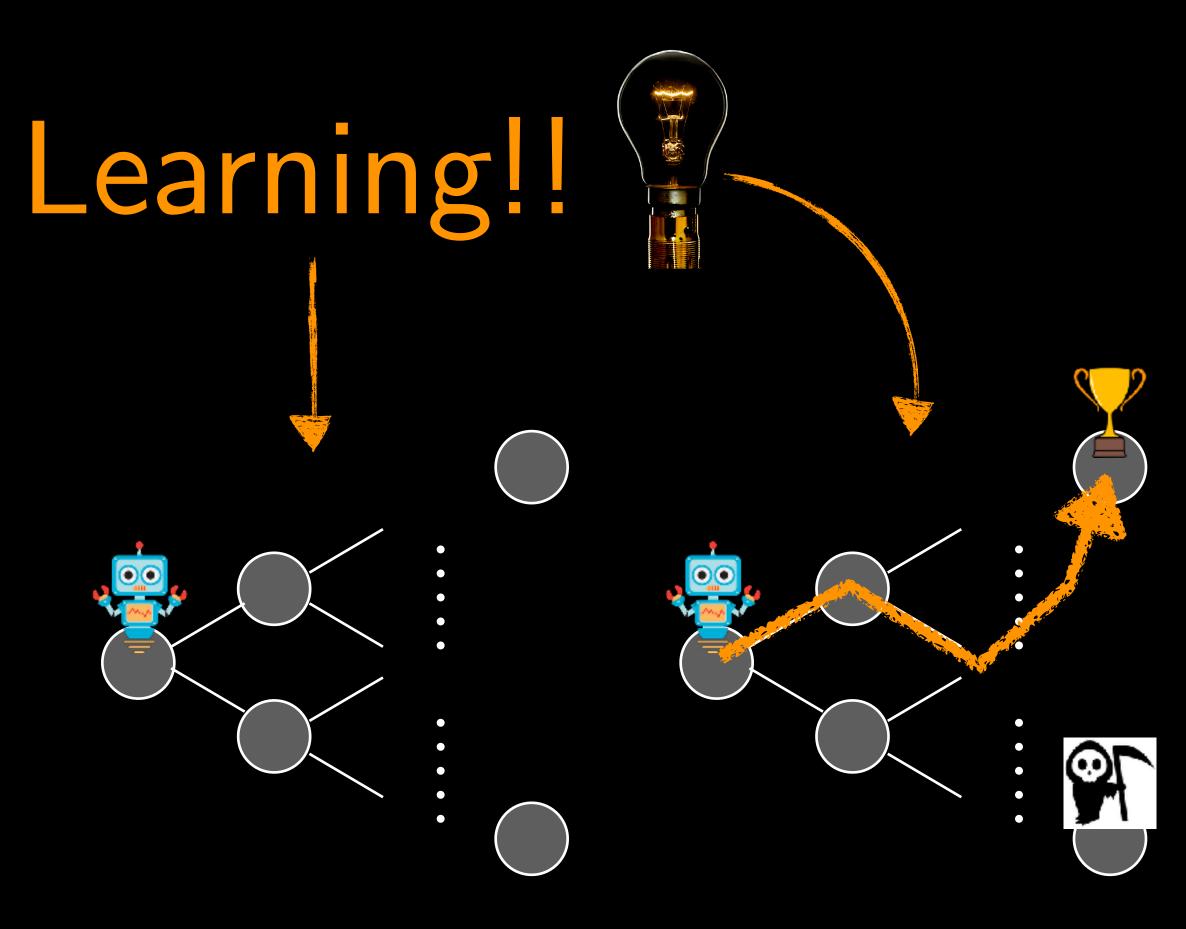










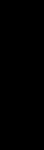


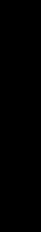
#### Prediction

Decision Making

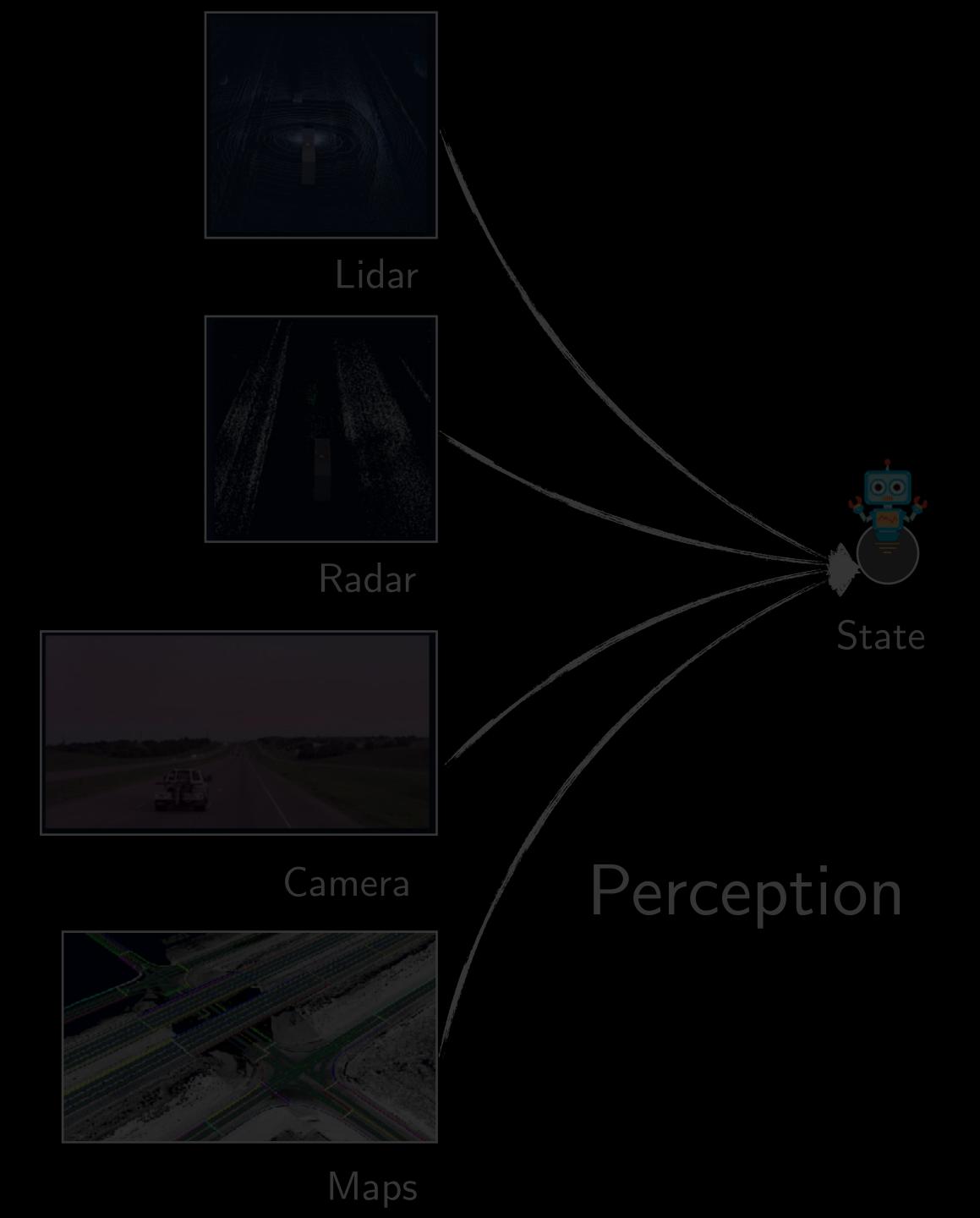


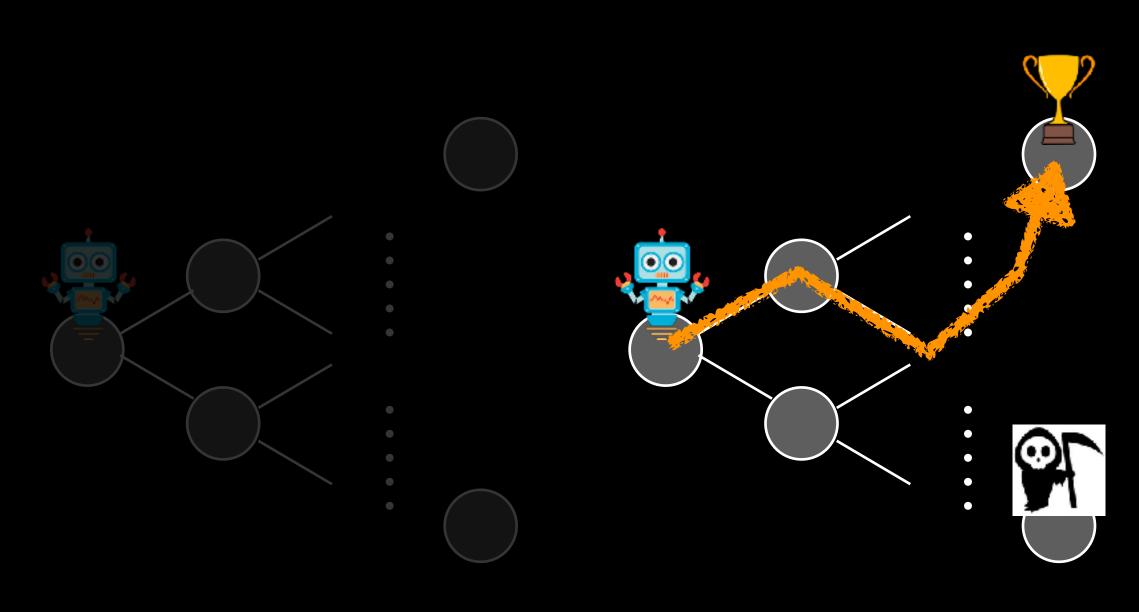












#### Prediction

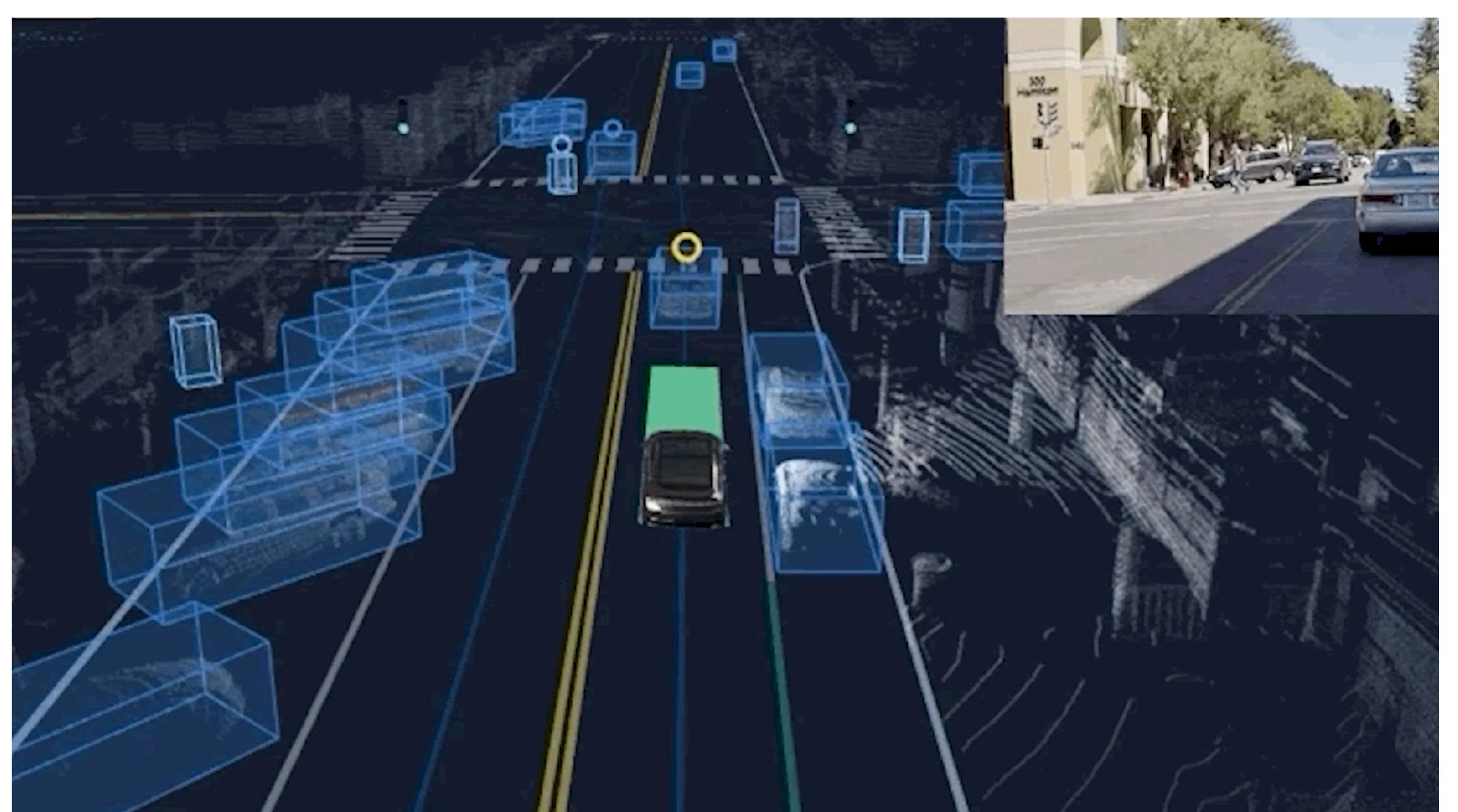
Decision Making







## Activity: What is "good" behavior in a left turn?



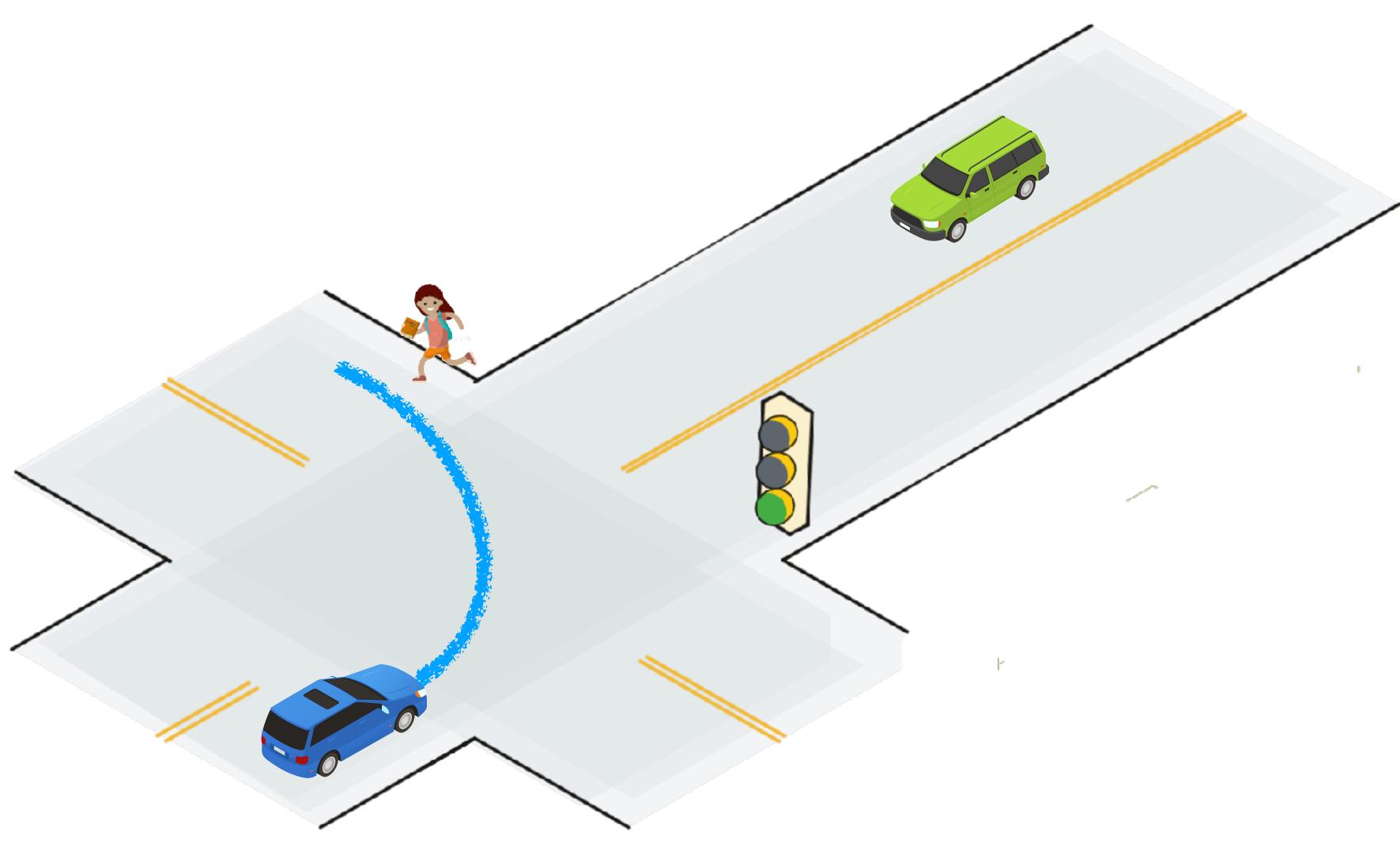








### Activity: What is "good" behavior in a left turn?

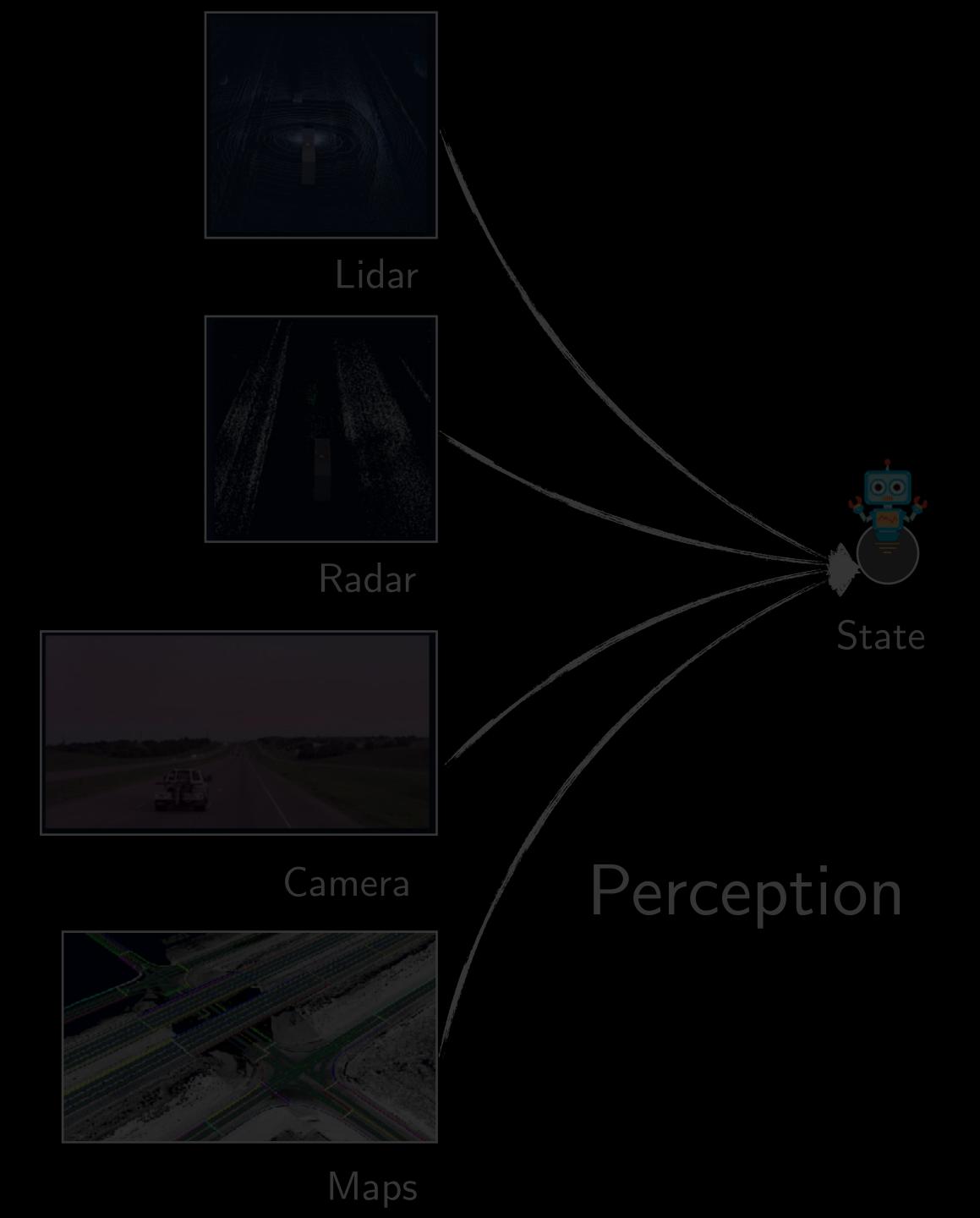


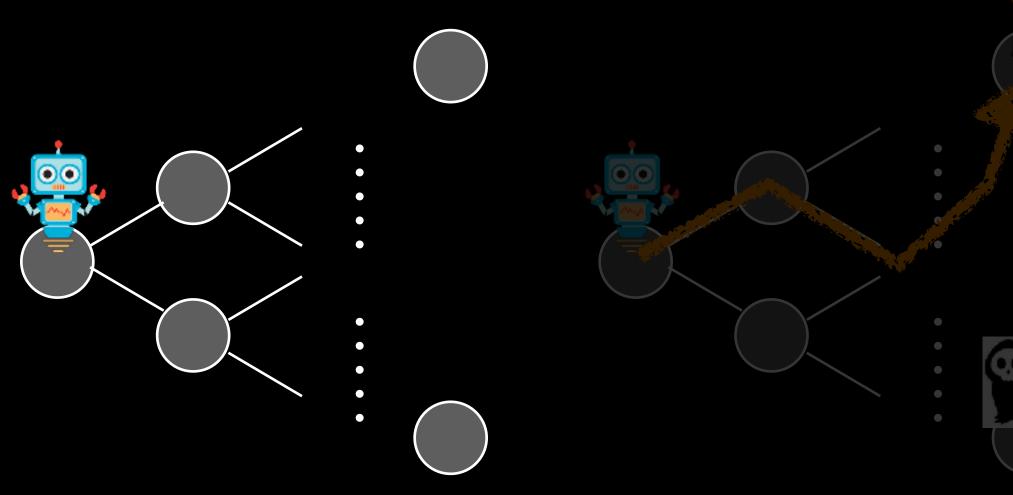




# Lesson #1 Values are implicit in human driving!





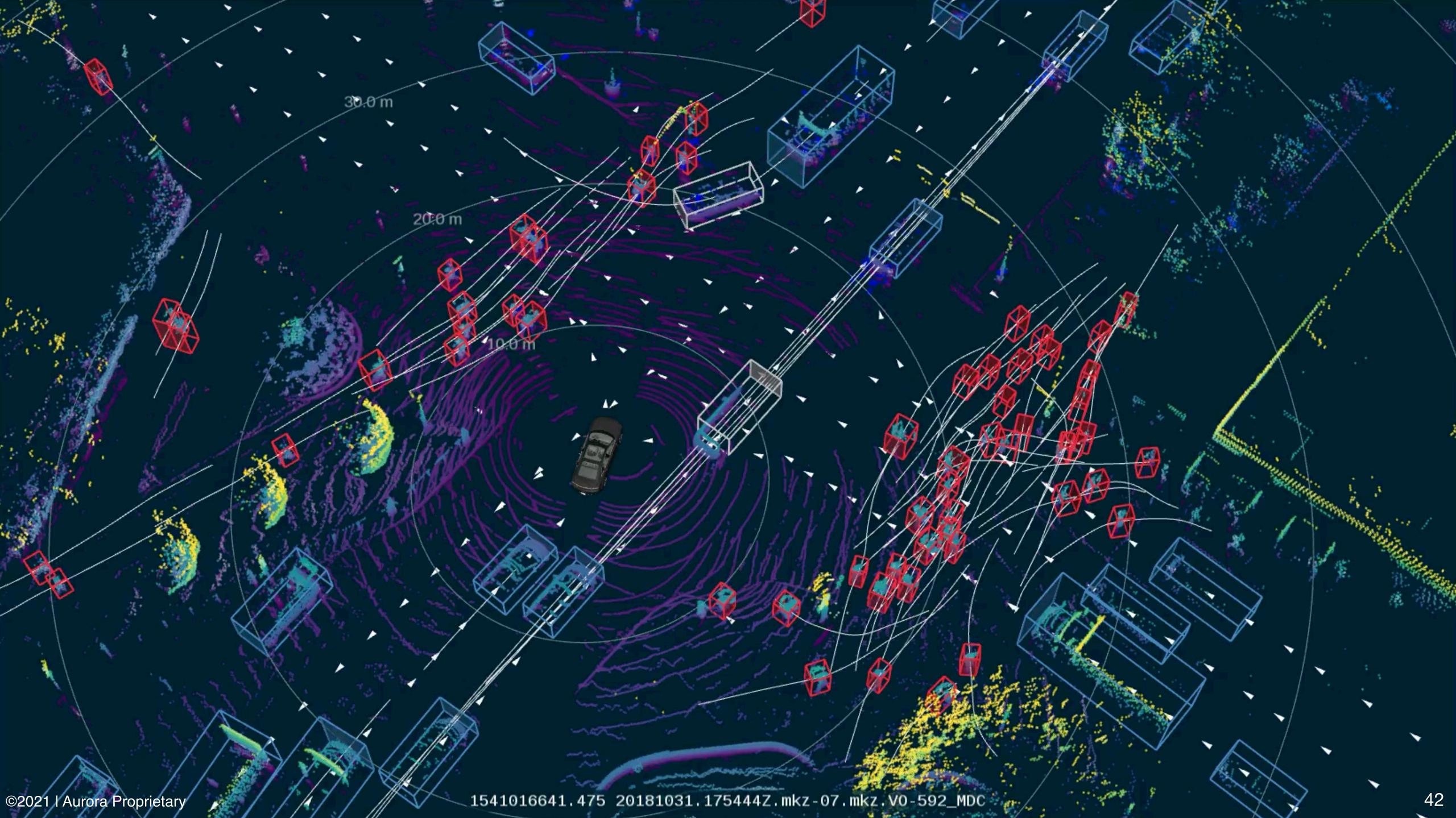


### Prediction

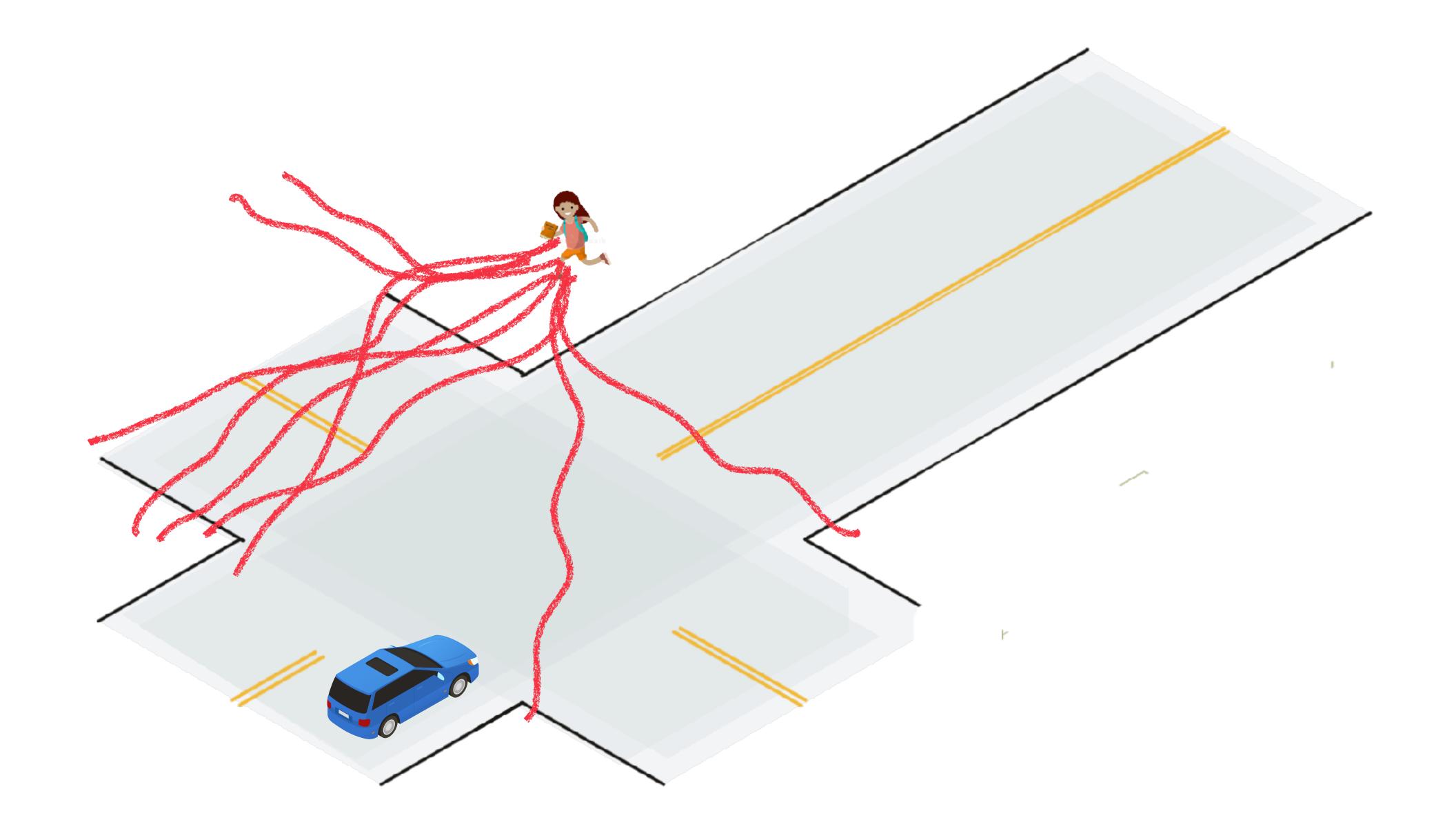
Decision Making







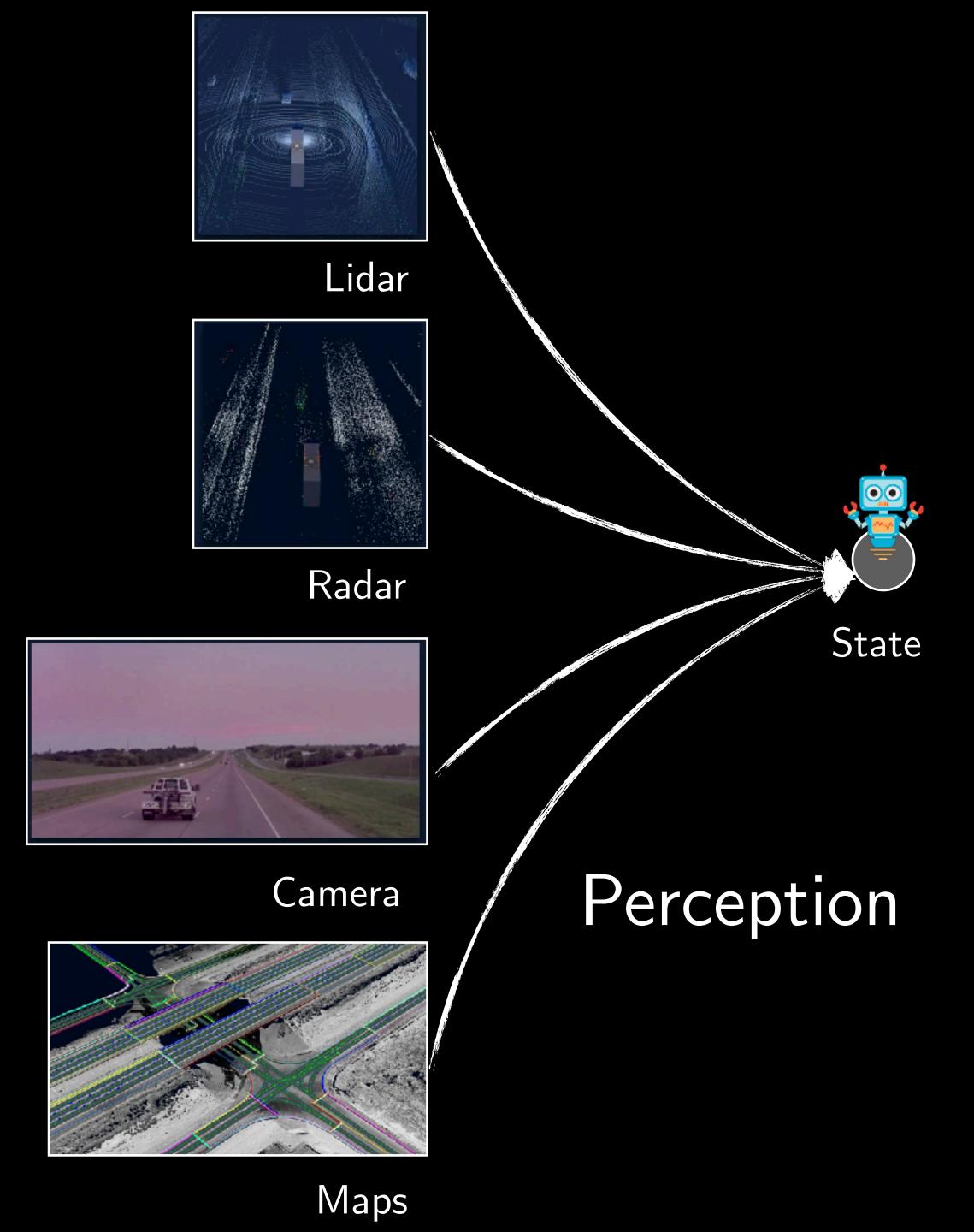
### Brainstorm: How can we predict the pedestrian motion?

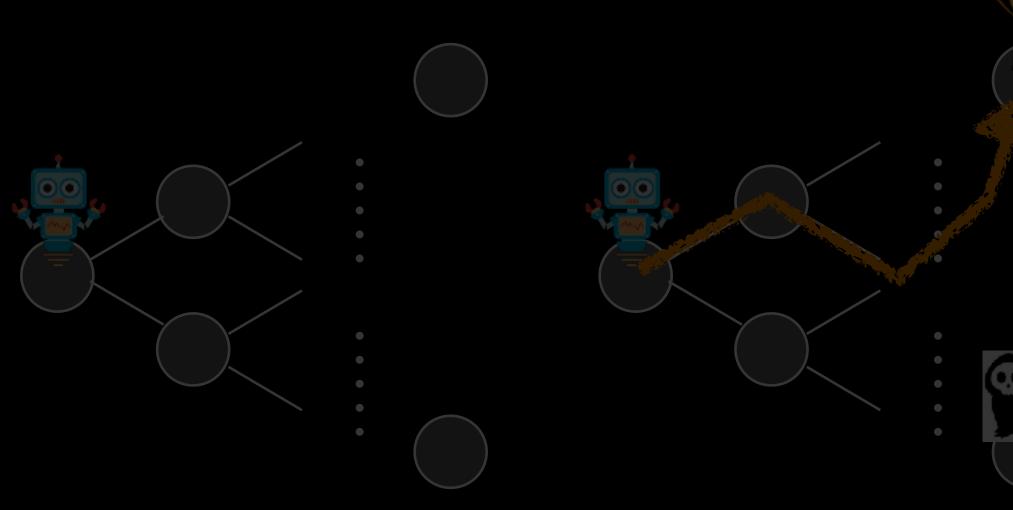






# Lesson #2 Models are useful fictions





### Prediction

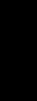
Decision Making





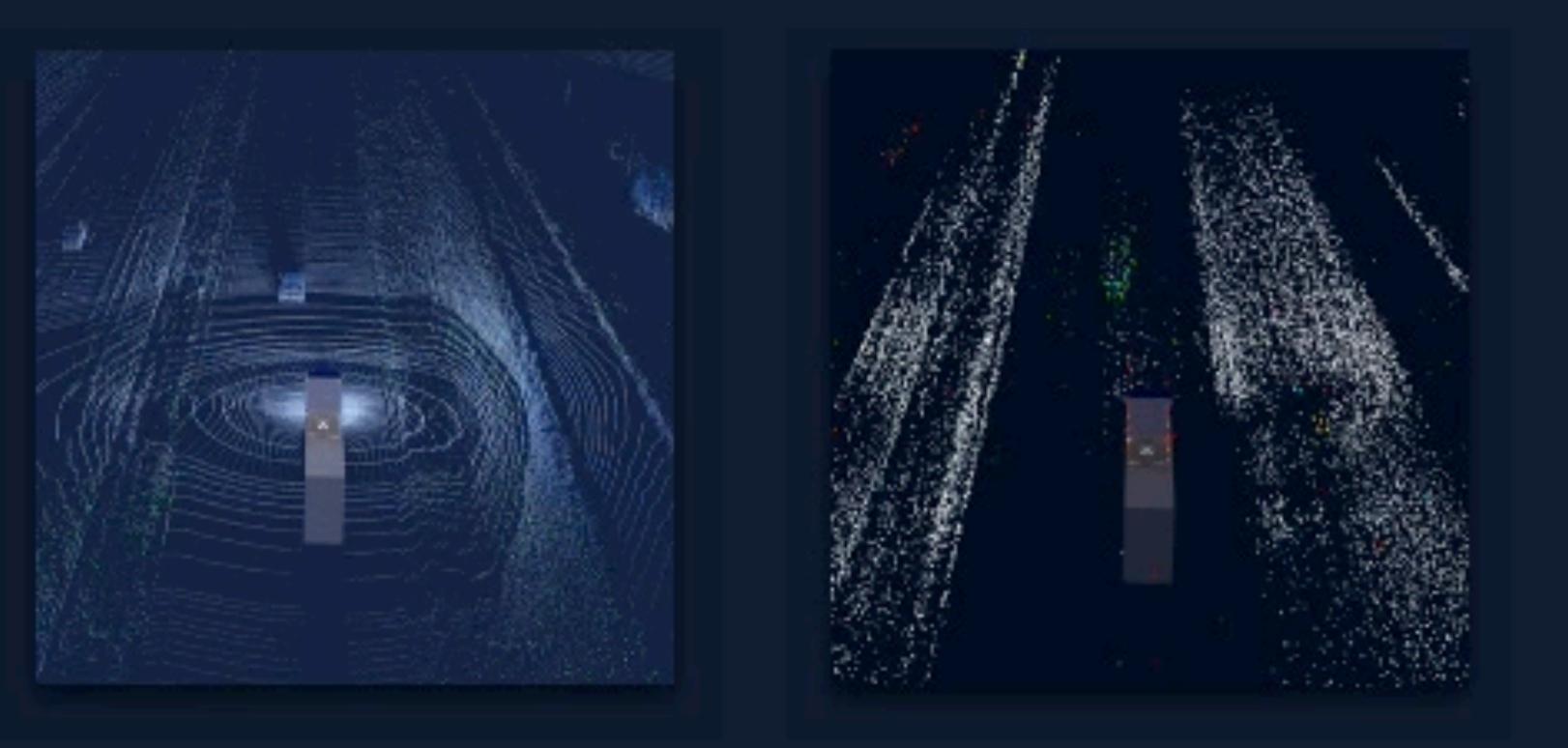








## Fuse complementary sensors





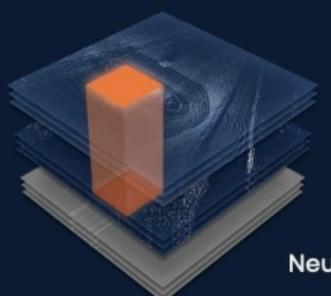
Radar



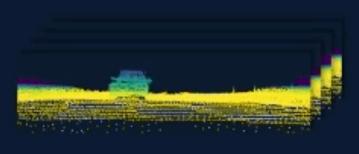








### Neural Convolution Engine



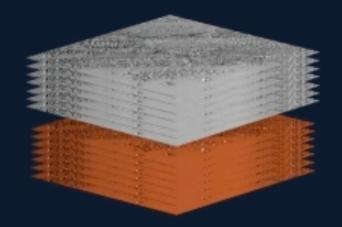
Range Conv. Engine





Image Fusion Engine

Euclidian Ray Scatter Engine







# Solve for the state that explains all observations



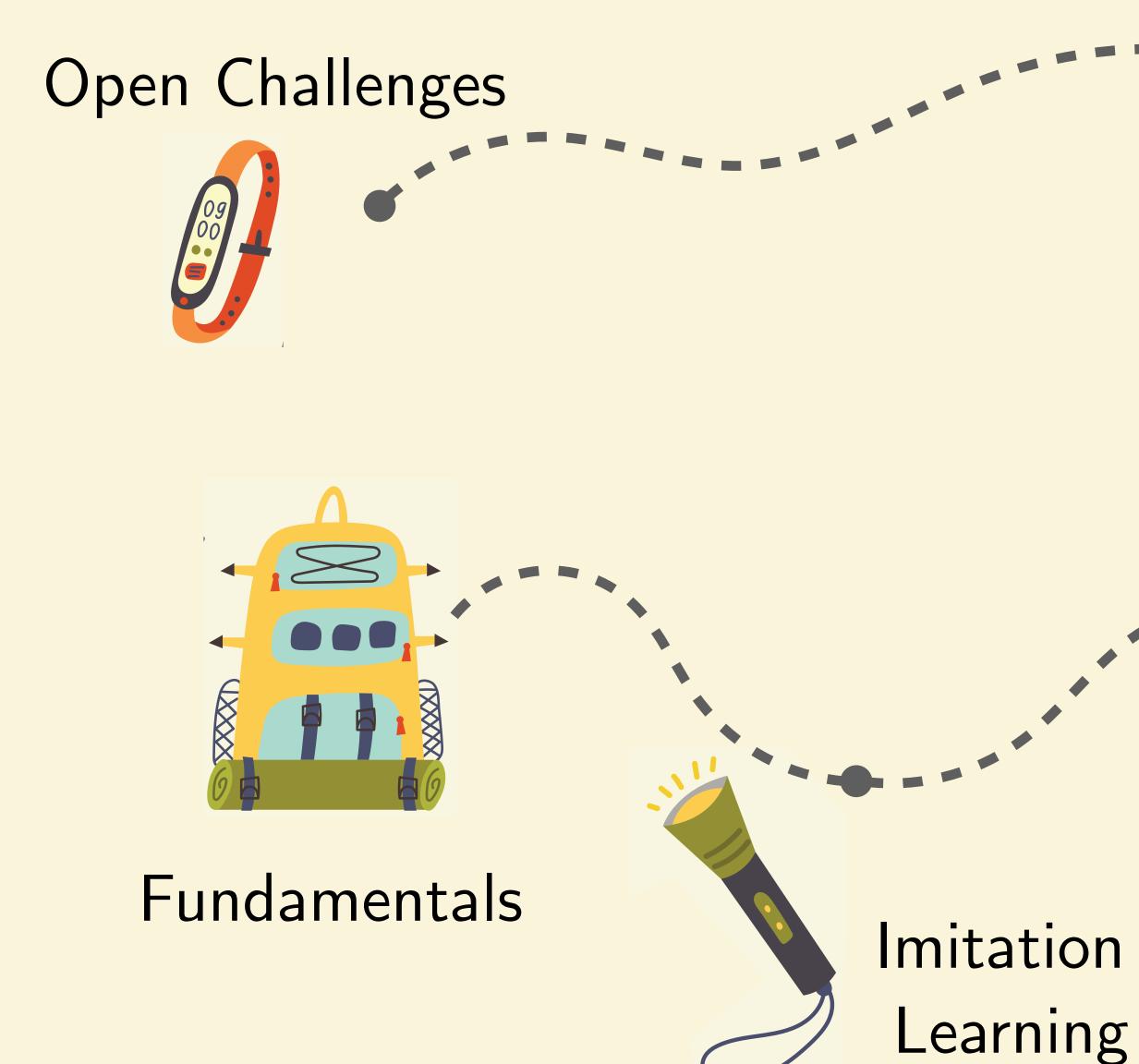




# The journey ahead!



Localization & Mapping



World Models & Forecasting

### Robot Perception



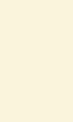
Reinforcement Learning

Planning & Control





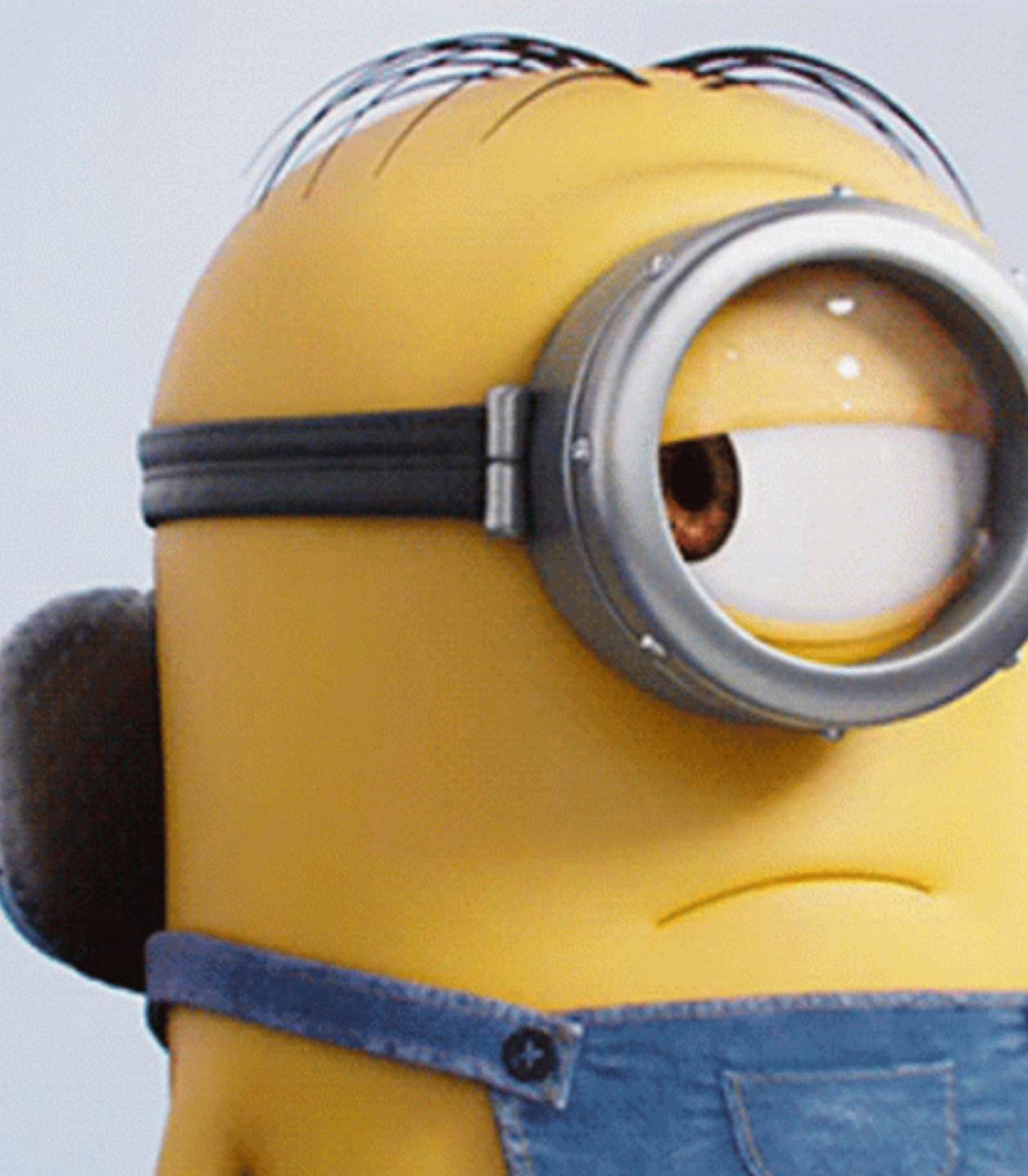












# Logistics





# Website is the ONE true hub

https://www.cs.cornell.edu/courses/cs4756/2023sp/







## 5 Assignments [65%]

## Final Project [30%]

## Participation [5%]

https://www.cs.cornell.edu/courses/cs4756/2023sp/









# Announcement!







# https://github.com/portal-cornell/

Link in website!

Checks familiarity with PyTorch!

Checks probability fundamentals!

Due Tuesday 1/31!

### Assignment 0

<u>cs4756</u> robot learning/tree/main/assignments/HW0



# Graduate Version (CS5756)

If you are enrolled in CS 5756, every assignment has an extra question that you must solve.

there is extra credit if you do!

### This can be either an extra experiment or extra theory question.

### Undergraduates (CS 4756) do not have to solve this question. But



## Books and other resources

### Work-in-progress book

(Please feel free to send me feedback)

For other resources, keep checking website

- <u>Modern Adaptive Control and Reinforcement Learning,</u> James A. Bagnell, Byron Boots, and Sanjiban Choudhury



## Course Policies

All policies are posted on the Website!

late will incur a reduction in score by 33% for each late day

violates academic integrity.

- Course Website: 3 TOTAL late days. Any assignment turned in
- <u>Academic Integrity:</u> Any work presented as your own must be your own, with no exceptions tolerated. Submitting work created by ChatGPT, or copied from a bot or a website, as your own work





## ChatGPT!

Use of text generation/editing systems such as ChatGPT: For each component of the workload, the vast majority of the intellectual work must be originated by you, not by text generation systems. It is OK to use aids for writing fluency --- but note that writing fluency is not part of the assessment rubrics below anyway.

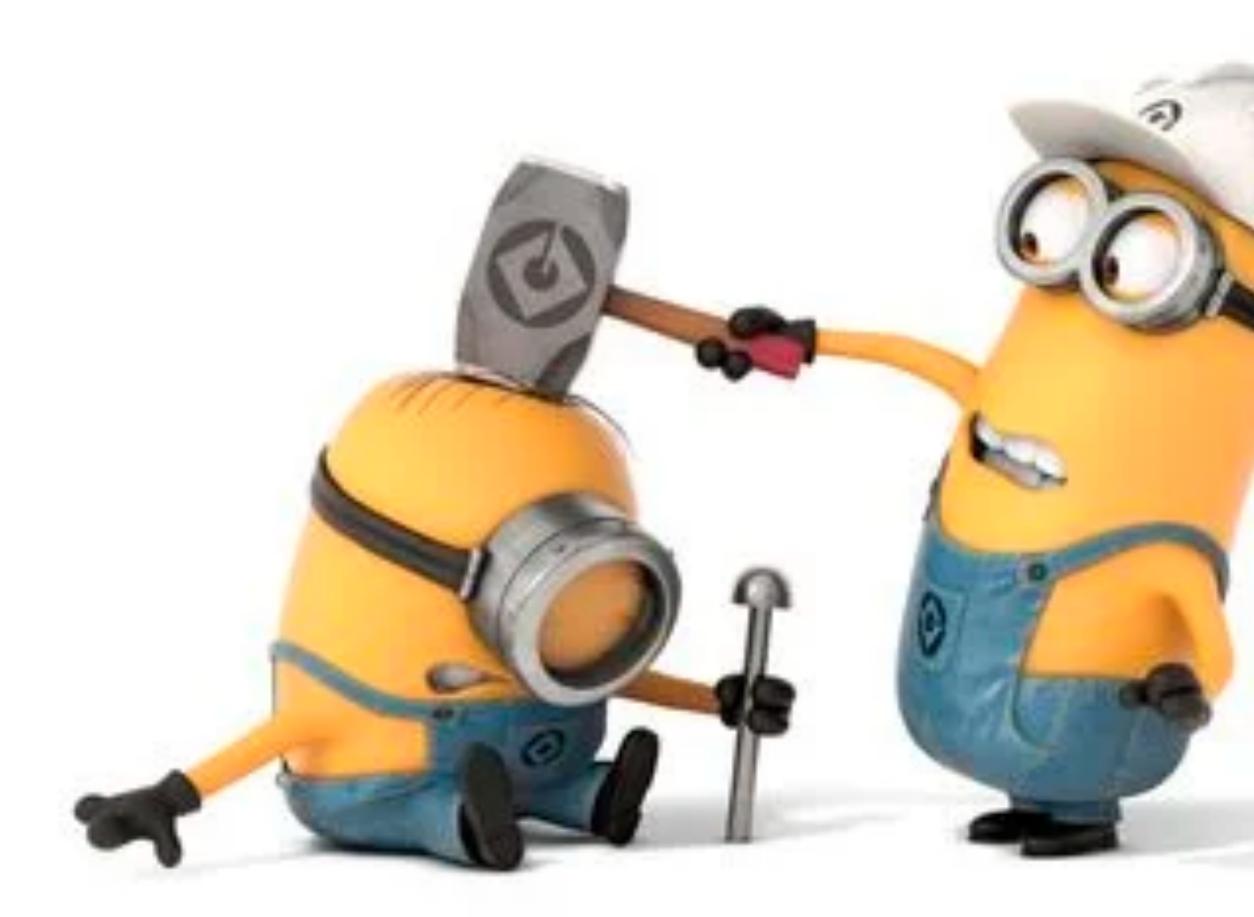
i). Example of something that is allowed: You write the initial draft(s), review its contents. You then use some form of text generation system to proofread and improve the flow. You do not use the system's output to add extra content.

ii). Example of something that is definitely not allowed: You essentially use a text generation system to generate an early draft, even if you later post-edit and correct the output.

iii). Example of something that is OK but requires special treatment. You start with the procedure in i). But, the system output includes good points that you hadn't thought of before, or makes you realize that a point you had made isn't quite right. You may include the new material and/or make appropriate edits, but you should mention what specific system(s) you used and what changes you made based on it.







# The Crew





# Yuki Wang

- 1st Year PhD Student in CS
- A member of the PoRTaL lab
- Interested in high level task-planning for robots
- Fun fact: Because I learned Japanese in college, I invented a new language "JanKoreanglish", which mixes Japanese, Korean, and English in one sentence to annoy my friends.





### Juntao Ren

Interested in using IL/RL to efficiently teach robots how to make safe and optimal decisions in assisting humans.

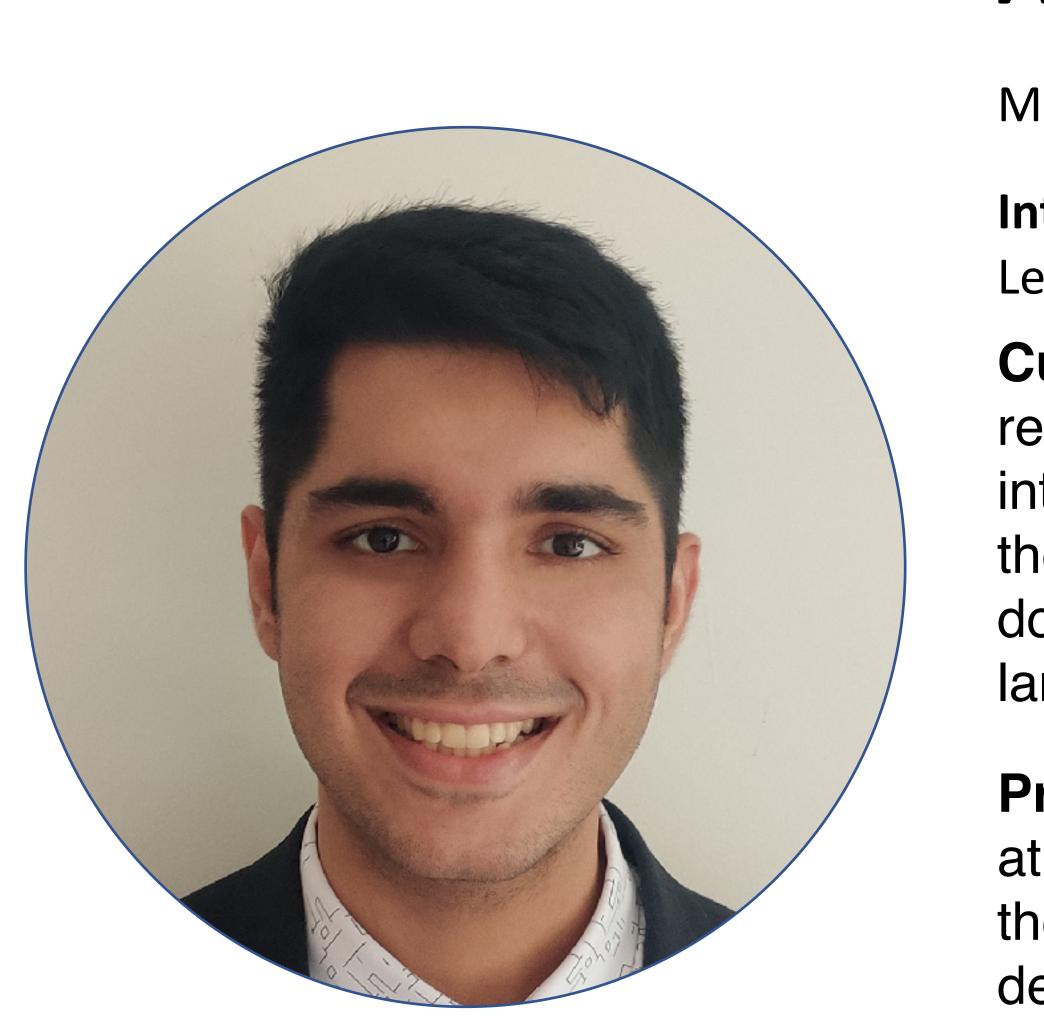
Currently working on building a library of low-level skills for our robot Hal at PoRTaL :).

Fun fact: I used to play water polo in high school.



- Kushal Kedia, PhD Student
- Research Interests: Motion Planning, Human-Robot Interaction
- Fun Fact about me: I love collecting merchandise for my favourite sports team, Chelsea! Let's chat about soccer :)





**Fun Fact:** I started out as a consultant and over time became a researcher

### Abhishek Masand

MEng Computer Science'23

**Interests:** Large Language Models, Reinforcement Learning, Representation Learning, NLP

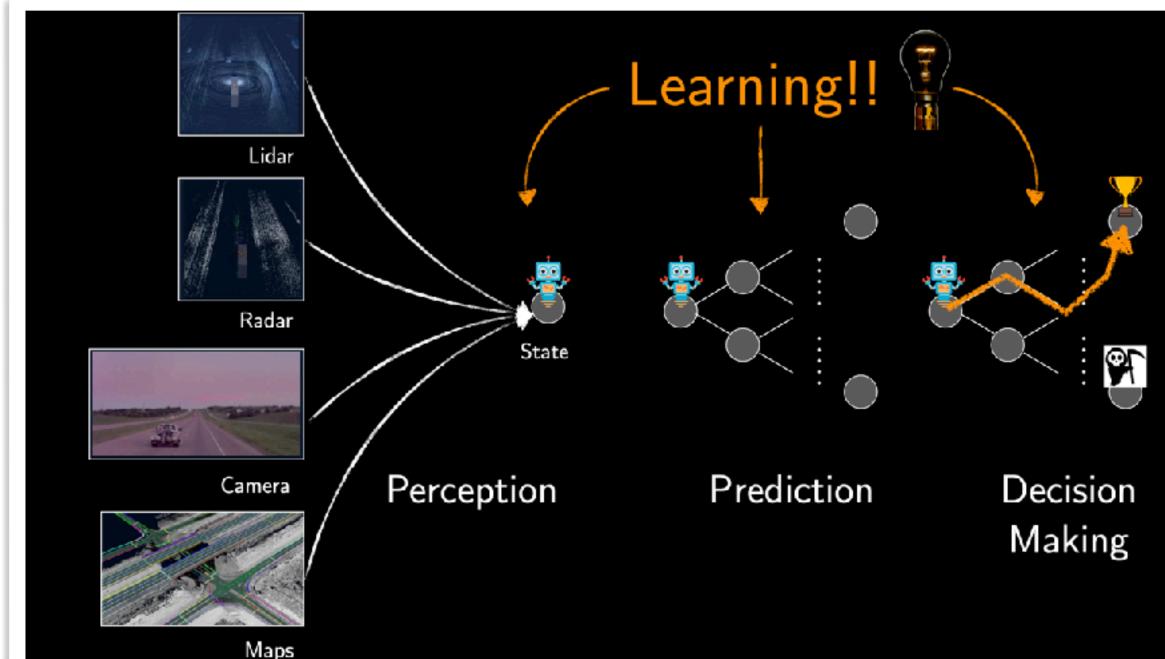
**Current Research**: Goal directed influence and reasoning for large language models. Also interested in exploring various strategies to control the influence of large language models on downstream tasks, and improving unsupervised language quantification reward functions.

**Previous Work:** Recently worked as an AI Engineer at Microsoft, where he collaborated with the Office of the CTO and Microsoft Research NLP group to develop libraries to facilitate the use of LLMs and applications demonstrating OpenAI models.

# tl;dr

### How should robots learn from interactions?







Formulate as a Markov Decision Problem (MDP)

