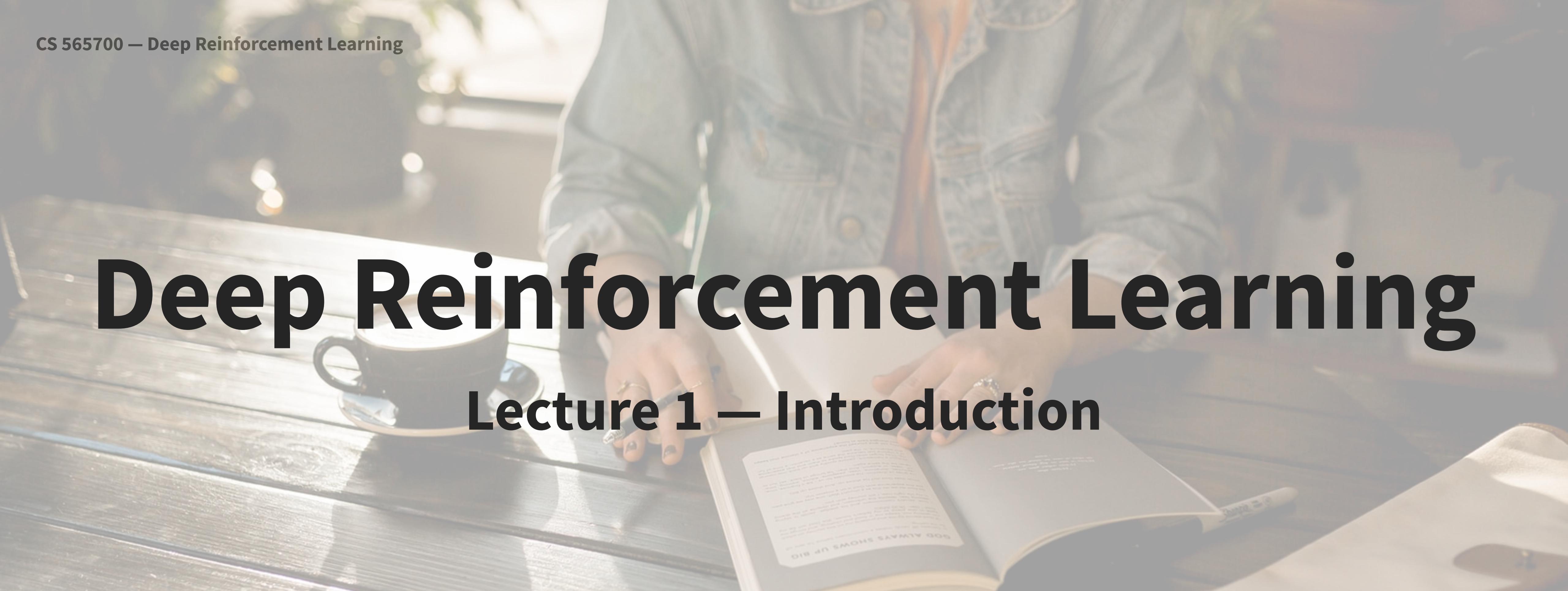


# Deep Reinforcement Learning

## Lecture 1 – Introduction



國立清華大學  
NATIONAL TSING HUA UNIVERSITY



National Tsing Hua University  
Department of Computer Science

Prof. Chun-Yi Lee

# Outline

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- Class information
- What is artificial intelligence (AI)
- What is reinforcement learning
- What reinforcement learning can do
- What we can learn from the Course

# Class Information

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- **Lecture Hours :** 9:00-12:00 (Every Tuesdays)
- **Location:** Delta 104
- **Course TA's :** 孫偉芳, 林士軒, 陳皓威, 江柏翰, 楊炫恭
- **Course Web. :** NTHU iLMS
- **Reference Material :**
  - Reinforcement Learning : An Introduction (2018) (By R. S. Sutton and A. G. Barto),
  - Websites :
    - David Silver ([Link](#))
    - Sergey Levine ([Link](#))
- **Requirements :**
  - Fundamental backgrounds in machine learning (ML) and deep learning (DL)
  - Fundamental backgrounds in Python programming
  - Proficiency in Tensorflow/Pytorch/other DL frameworks
  - Your own computer equipped with NVIDIA GPUs

# Class Information

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- **Grading Policy**
  - Assignments (70%)
    - Everyone has to submit his/her own homework
  - Final project and presentation (30%)
    - Please form groups of one to two people
- **Submission Policy**
  - You have two days to be used for “late submissions”
  - No copy or cheating, otherwise you will get zero points
- **Exception:** You will get a few bonus points if you satisfies the following conditions
  - You have a full paper on DRL accepted by ICML, CVPR, ICCV/ECCV, or IROS
  - You have a very cool full paper submitted to NeurIPS 2021 together with us!

# Final Project Specification

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- **Scope**
  - Any topics related to DRL. The topic should not be any existing work
  - DRL has to be the primary focus of your project, not CV, NLP, or other subjects
- **Breakdown**
  - Final project proposal (5%) due on 5/18/2021, 23:59 PM
  - Report written in NeurIPS template (50%) due on 6/15/2021, 23:59 PM
  - 10 minutes presentation (30%) 6/15 in class
  - Review comments for at most 5 other teams (15%) due on 6/22/2021, 23:59 PM
- **Submission format:**
  - The final report has to be submitted in NeurIPS 2021 template, in English
  - 4~8 pages, using LaTeX (LaTeX source files should be submitted)
  - Clearly specify your motivation, novelty, and main contributions
  - The source codes. The results should be reproducible
    - Following this: <https://github.com/paperswithcode/releasing-research-code>

# Your Instructor

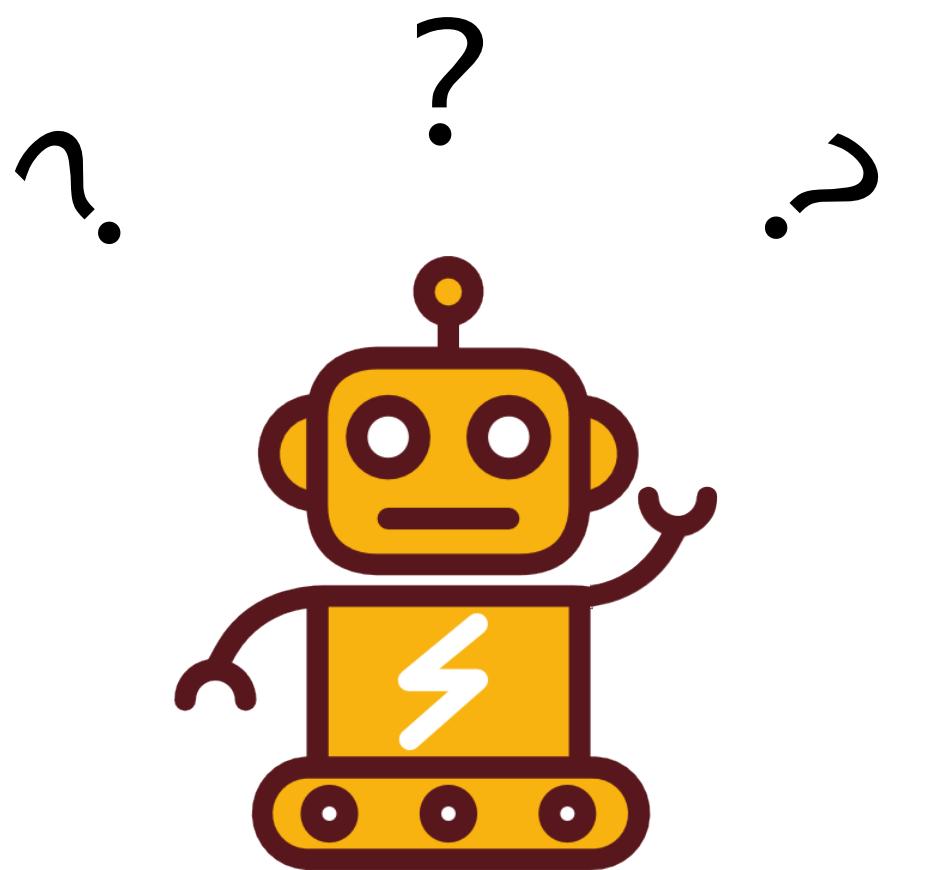
- Prof. Chun-Yi Lee (李濬屹)
- [cylee@cs.nthu.edu.tw](mailto:cylee@cs.nthu.edu.tw)
- Office: Delta Building R606
- Office Hours :
  - Appointments by email



 **NVIDIA**  
 **ORACLE**  
 **cadence**<sup>®</sup>



# What is artificial intelligence (AI)?

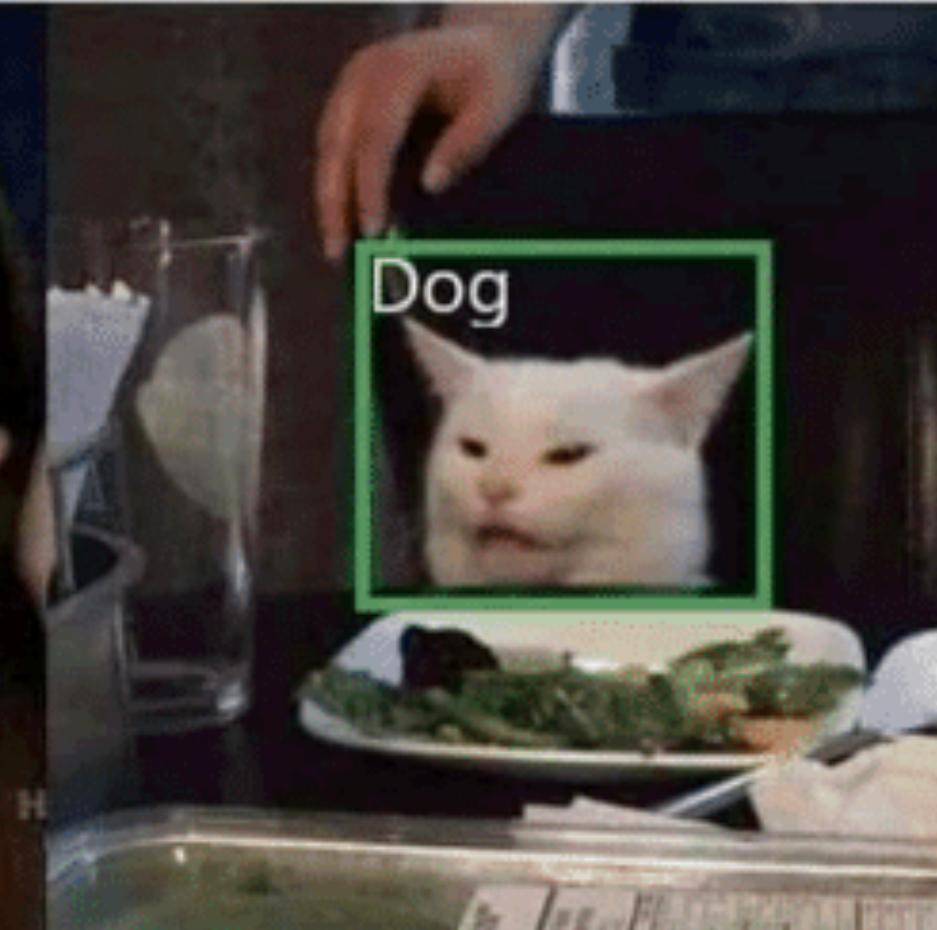


# What is Artificial Intelligence

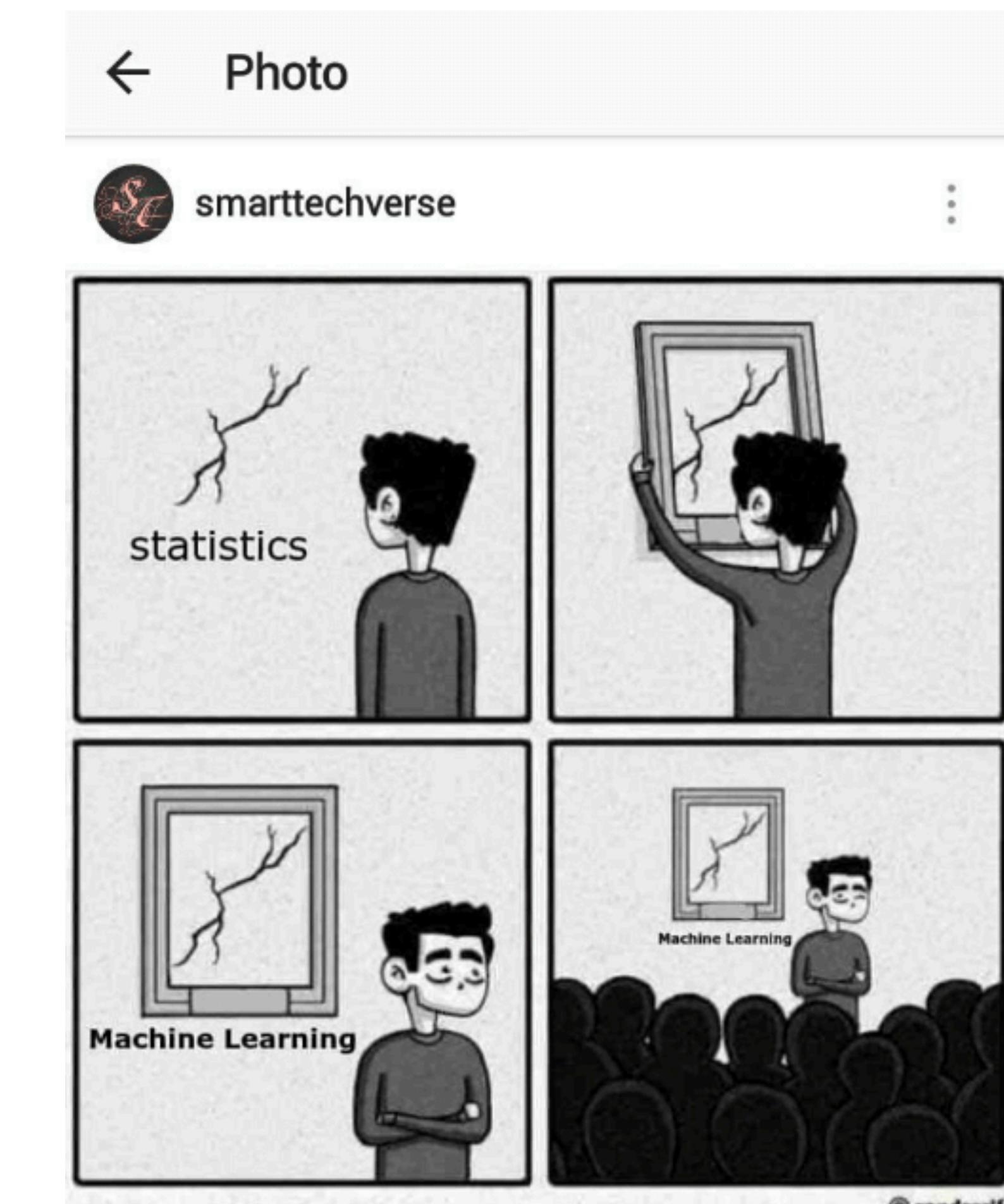
People with no idea  
about AI, telling me my  
AI will destroy the world



Me wondering why my  
neural network is  
classifying a cat as a dog..



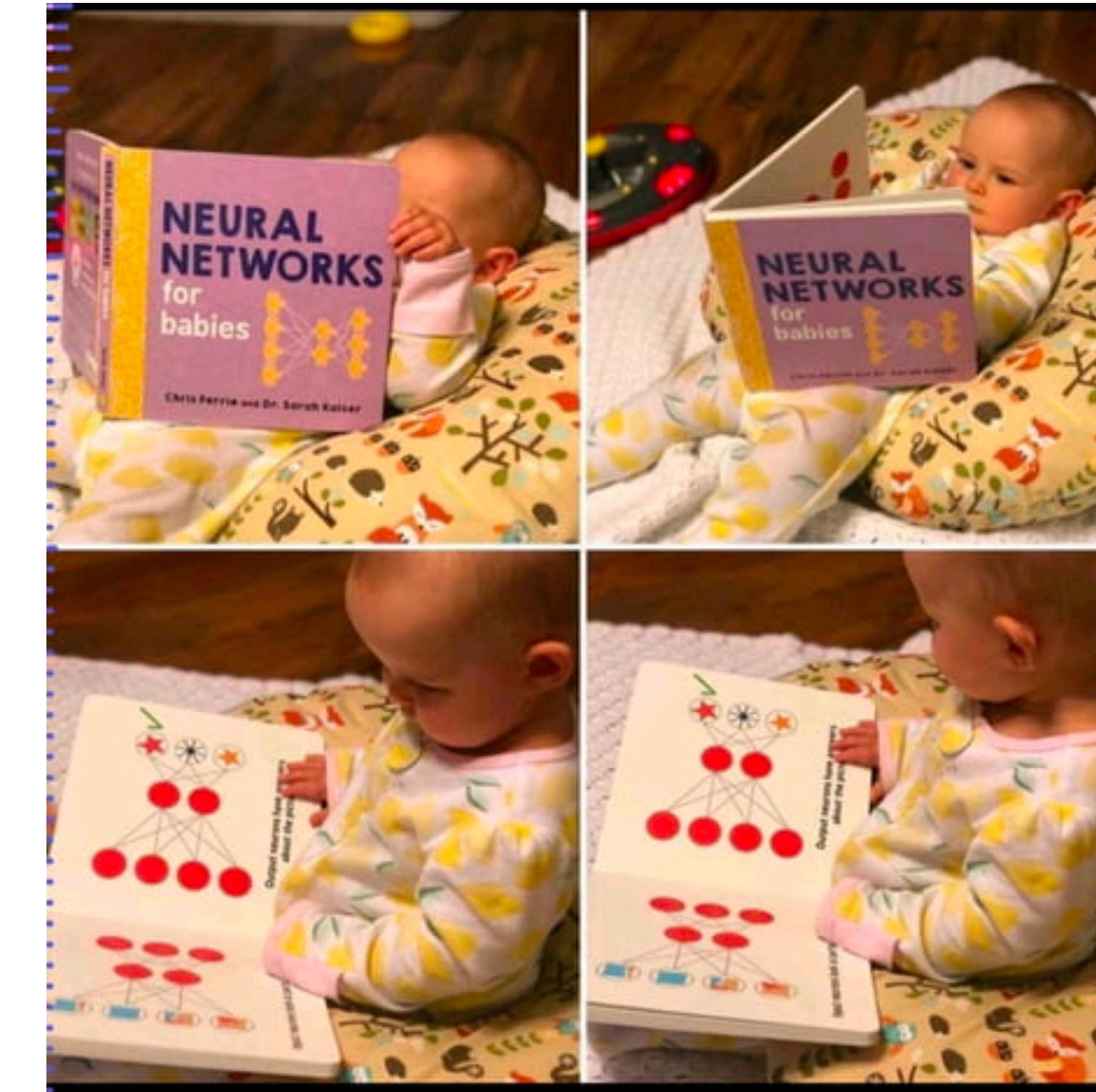
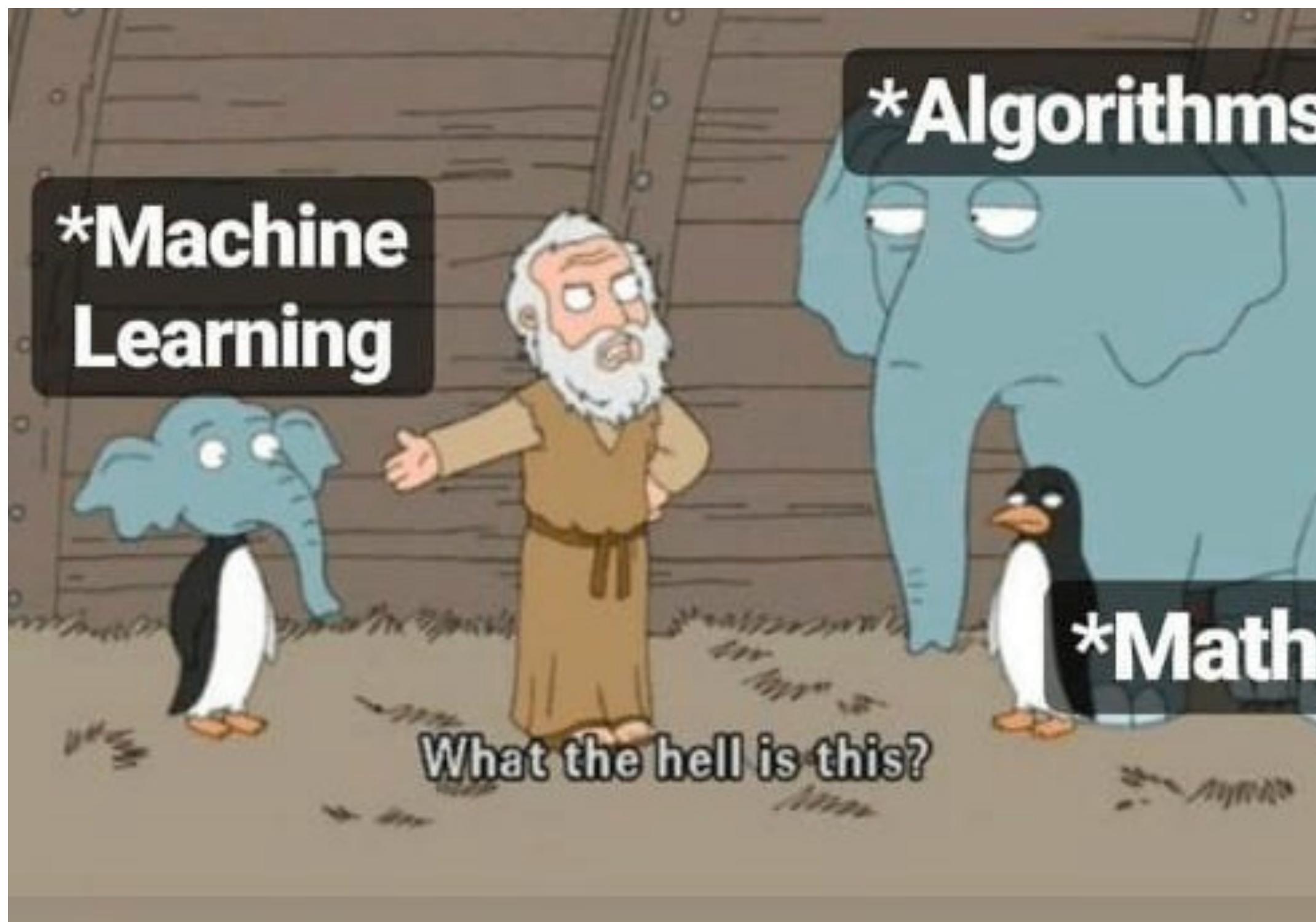
Me wondering why my AI is  
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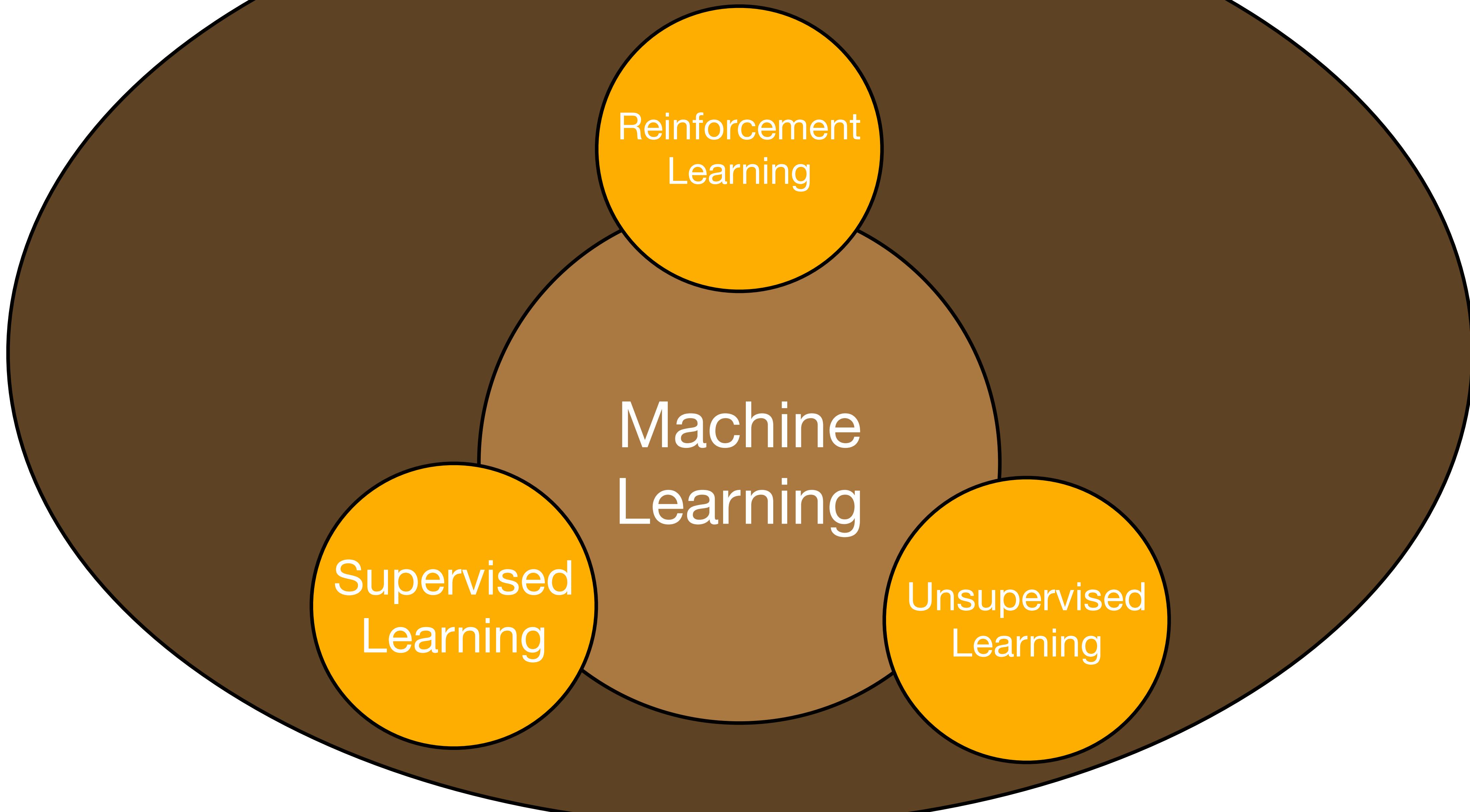
Machine Learning?

# What is Artificial Intelligence

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# Artificial Intelligence



# Artificial Intelligence

Using labeled training data to train a model to predict outputs

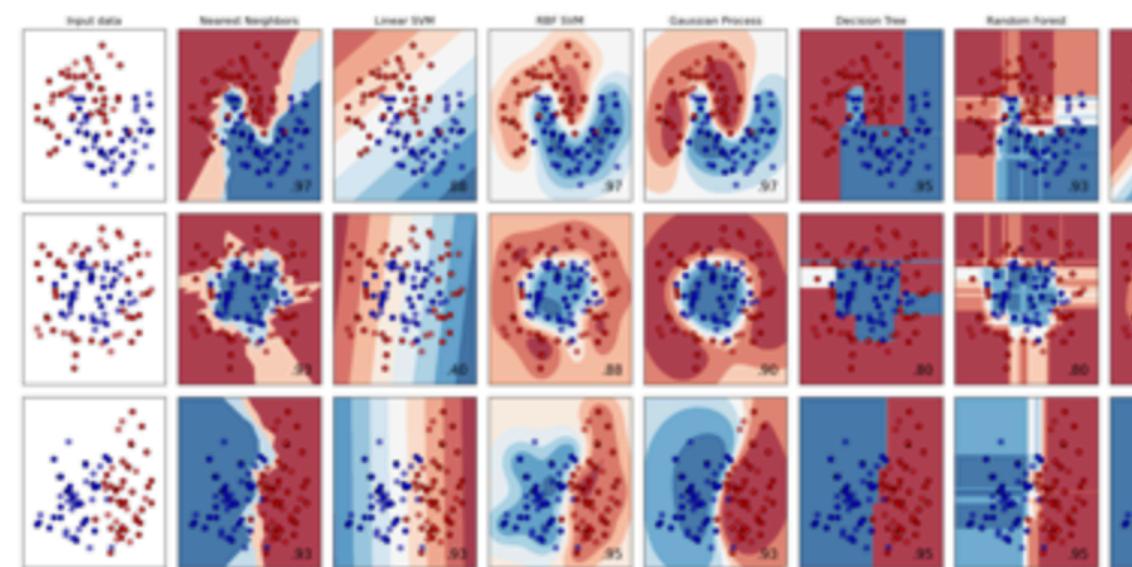
Machine Learning

Supervised Learning

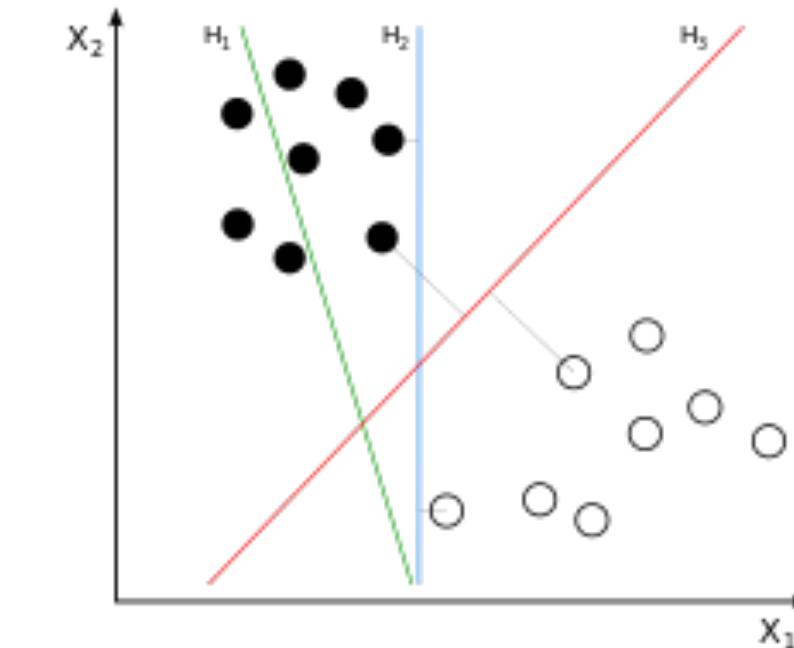
Unsupervised Learning

Reinforcement Learning

# Using labeled training data to train a model to predict outputs



## Supervised Learning

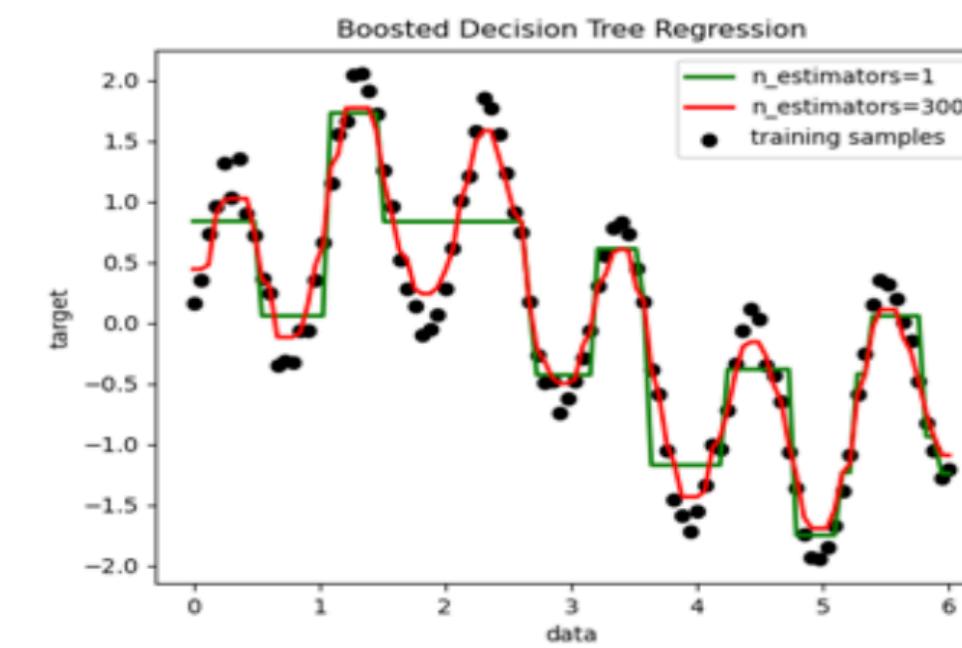


### Classification

### SVM

### Regression

### Decision Tree



# Artificial Intelligence

Reinforcement  
Learning

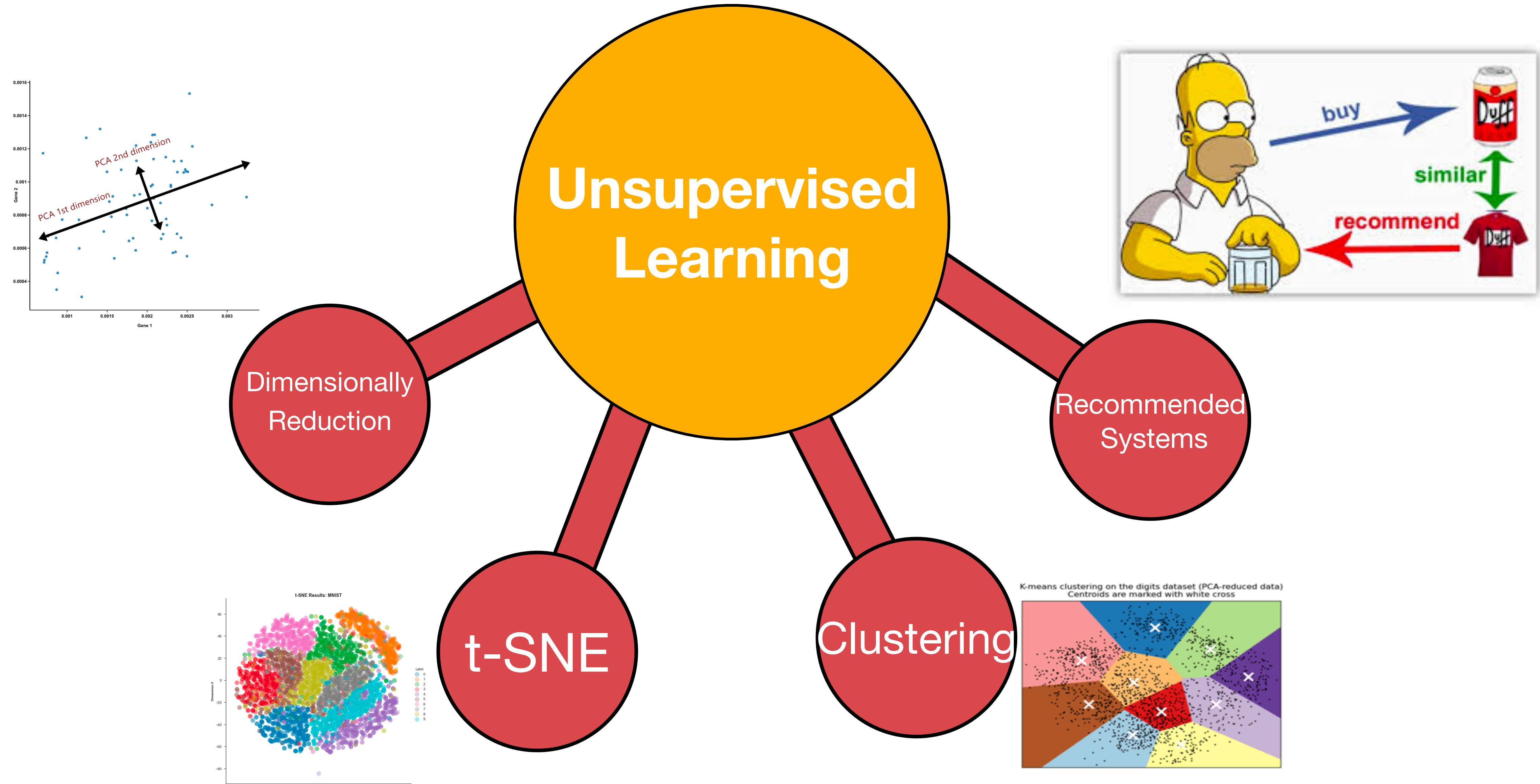
Machine  
Learning

Supervised  
Learning

Unsupervised  
Learning

Using **non-labeled**  
training data to train  
a model to predict  
outputs

# Using non-labeled training data to train a model to predict outputs



# Artificial Intelligence

Reinforcement  
Learning

Learning from the  
signal provided from  
an environment

Machine  
Learning

Supervised  
Learning

Unsupervised  
Learning

# Learning from the signal provided from an environment



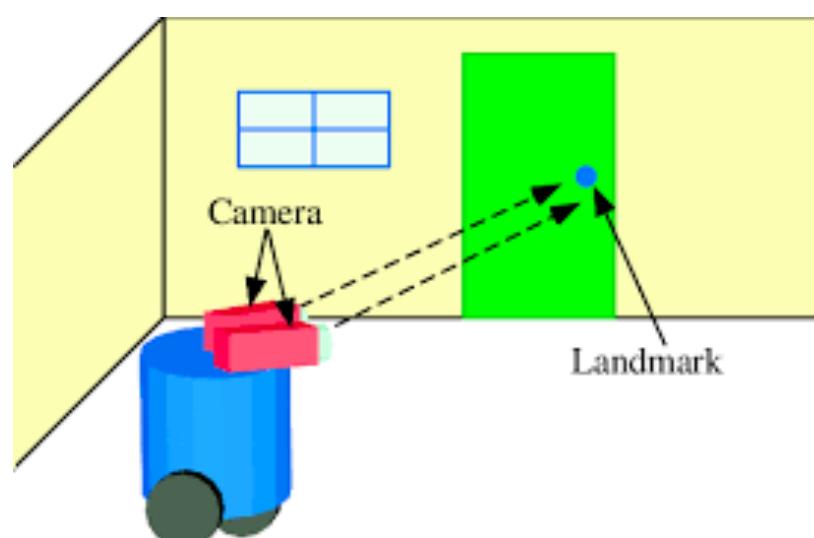
## Reinforcement Learning

Sequential Decision

Self-driving Car

Robot Navigation

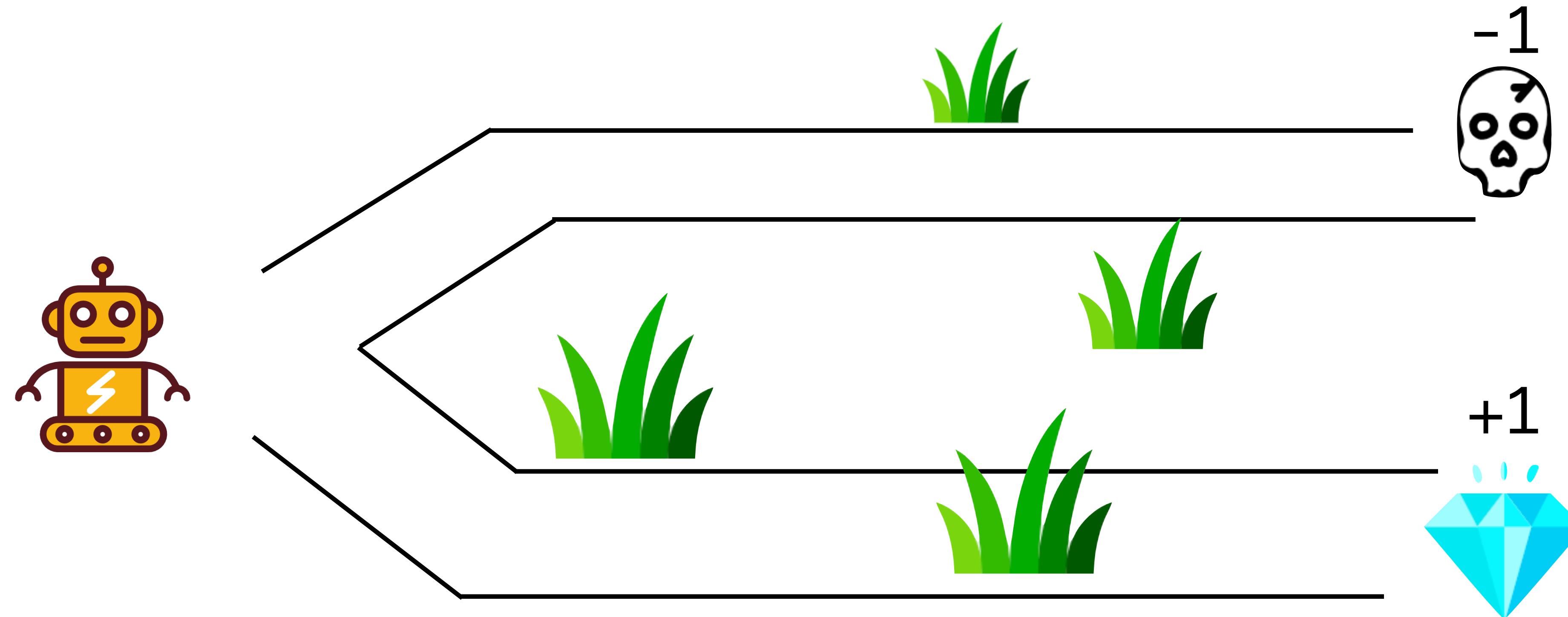
Game Playing



# What is Reinforcement Learning

## Example

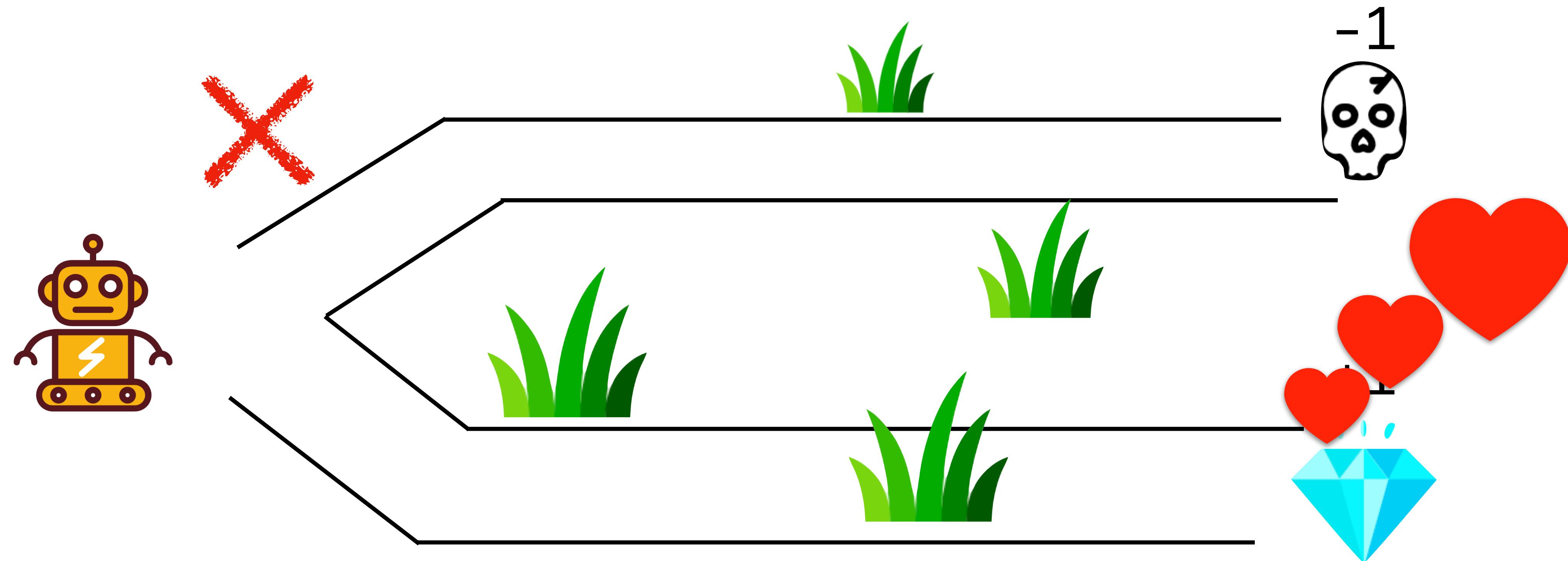
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# What is Reinforcement Learning

## Example

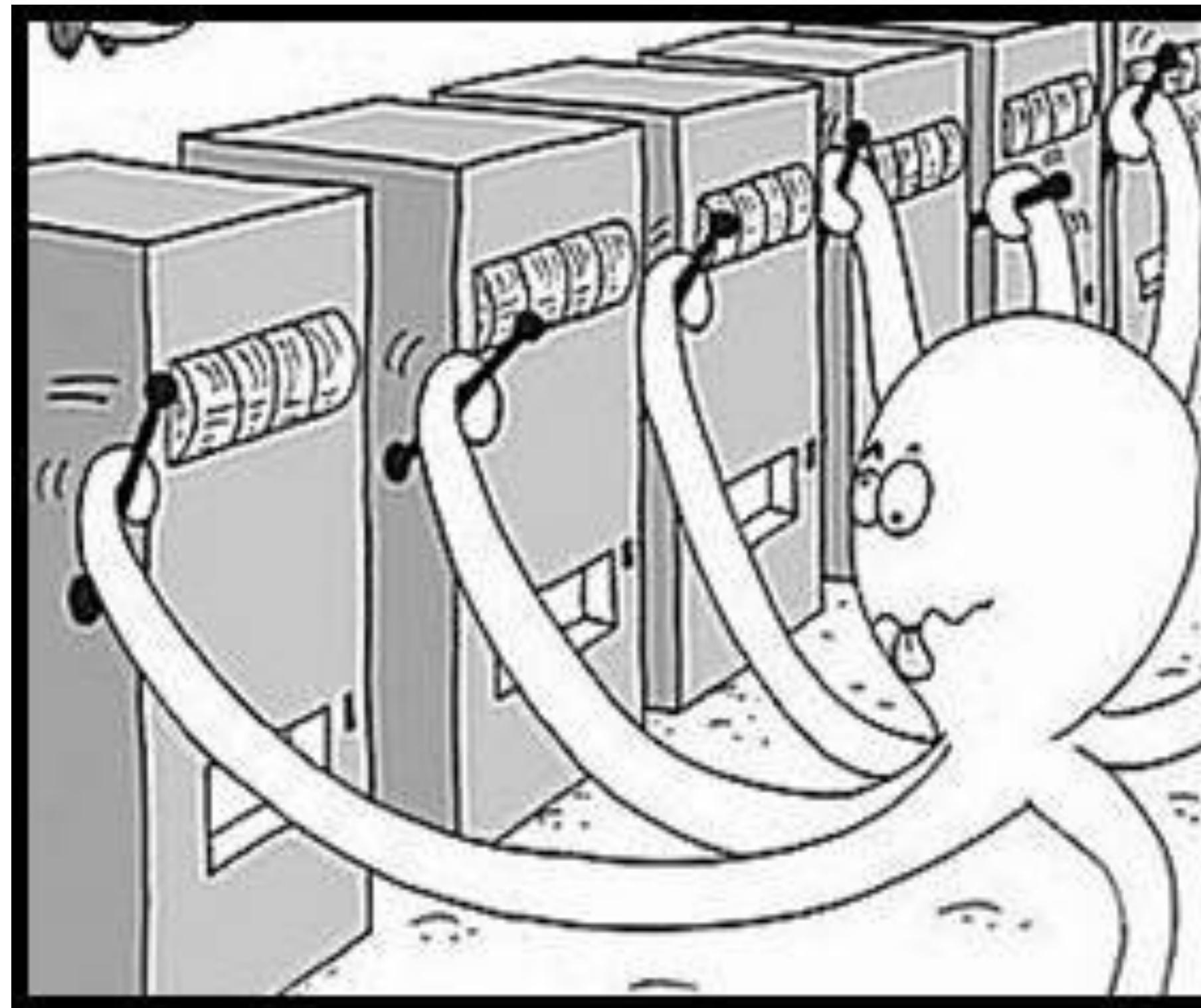
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# Multi-Armed Bandit

## Example

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- N Different Machines
- Different machines have different winning probabilities
- Find the best Machine by **Trial-and-Error**
- **Exploration / Exploitation**

# What RL Differs from the Other Subjects

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- Only **reward signals** are available
- Feedback is delayed
- Data collected by the agents themselves (most cases)
- Data samples are **non-i.i.d (independent and identically distributed)**

# What Reinforcement Learning Can Do

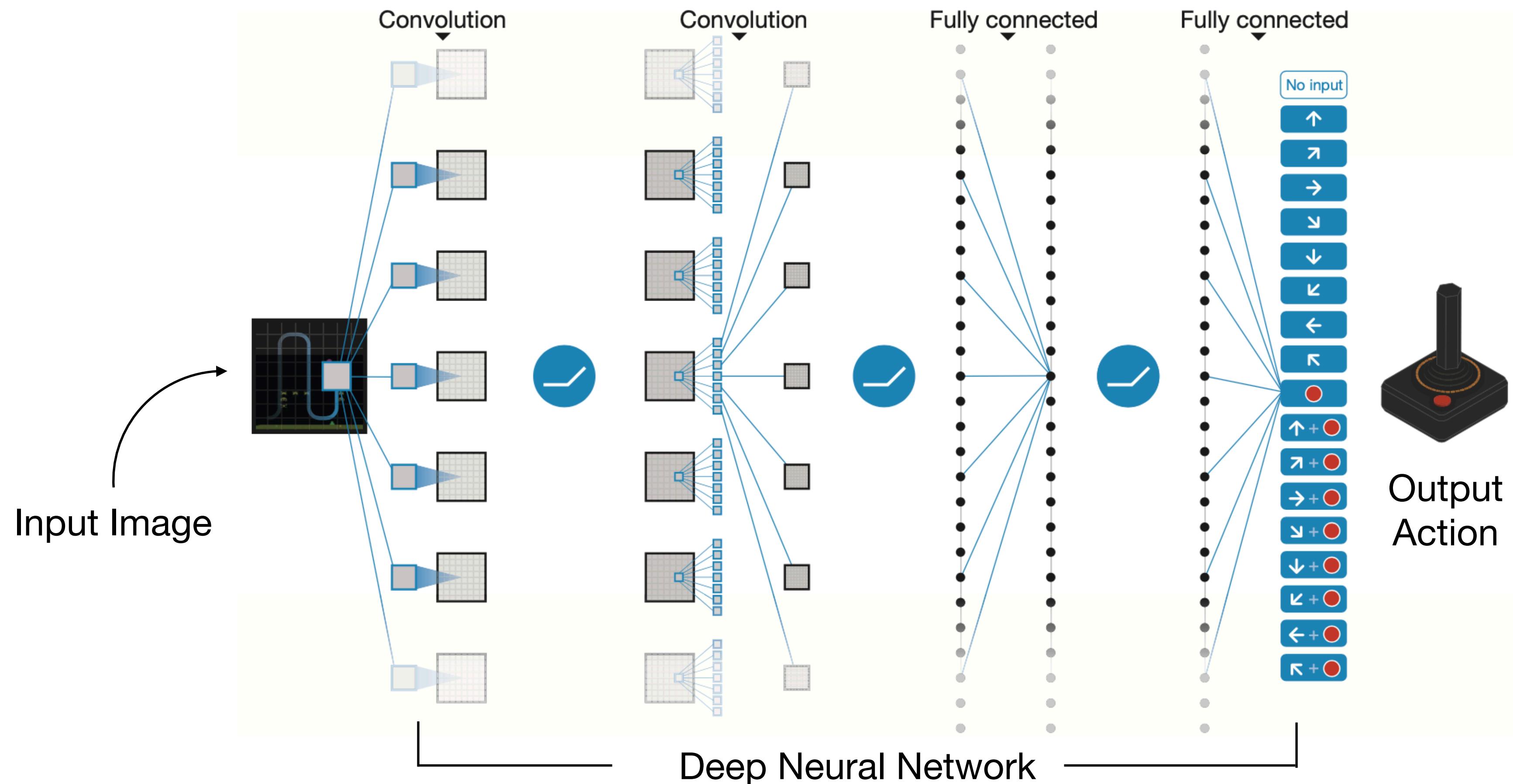
DRL example

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- Playing Atari Games
- Hide and Seek
- Alpha Star / Alpha Go
- Rubik's Cube
- Robotic Arm

# Playing Atari Game

## Deep Q-learning



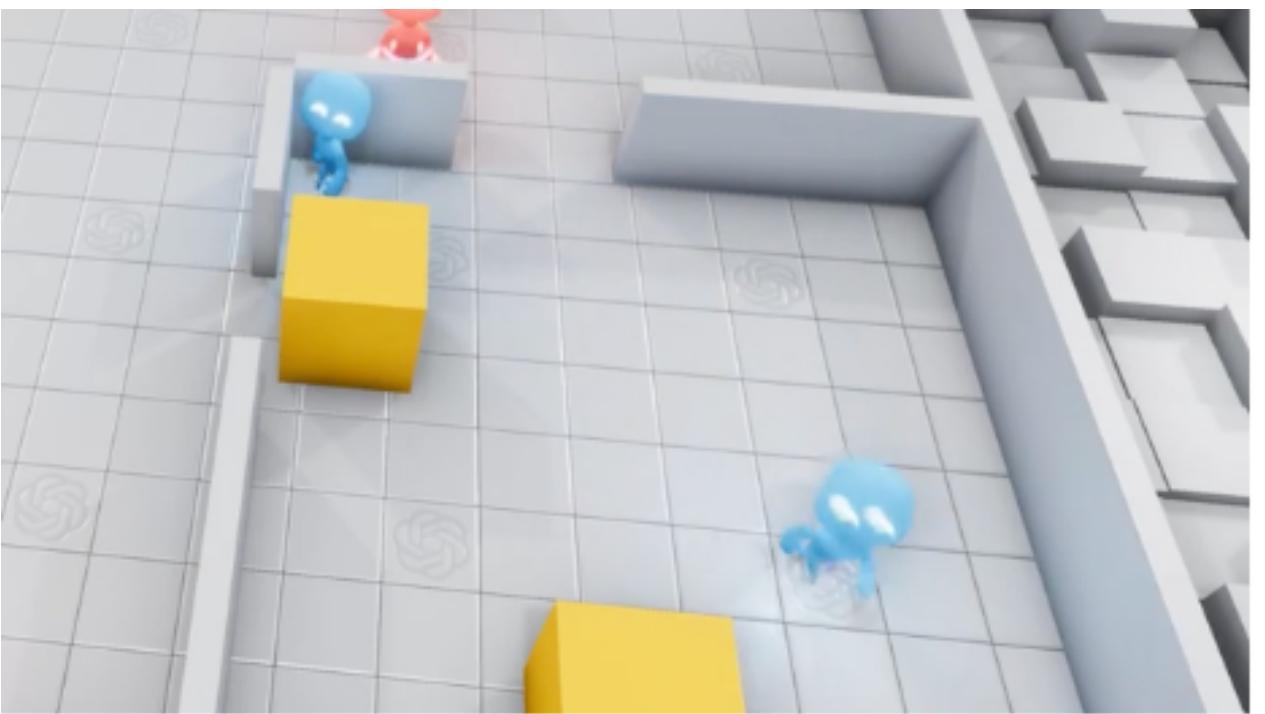
# Hide and Seek

Multi-Agent task

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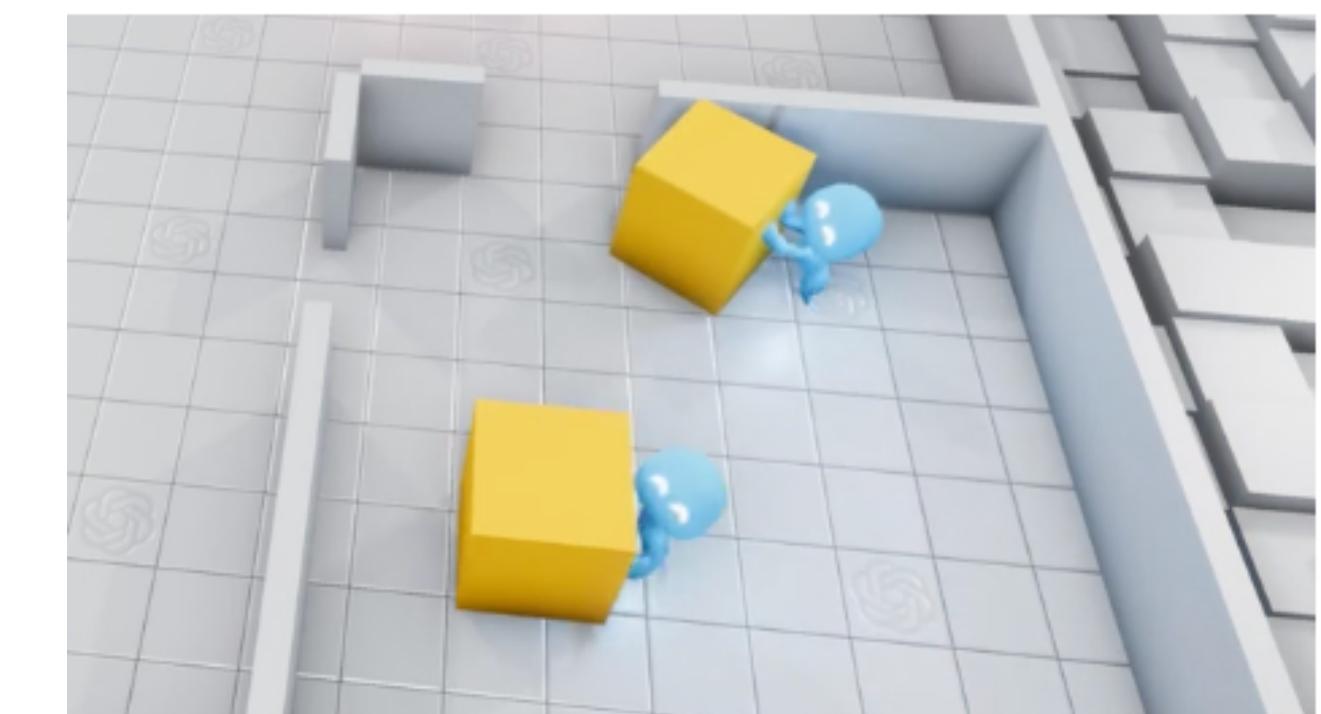
Move



Search



Grab



# AlphaGo

Beat Human Expert of GO

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# AlphaStar

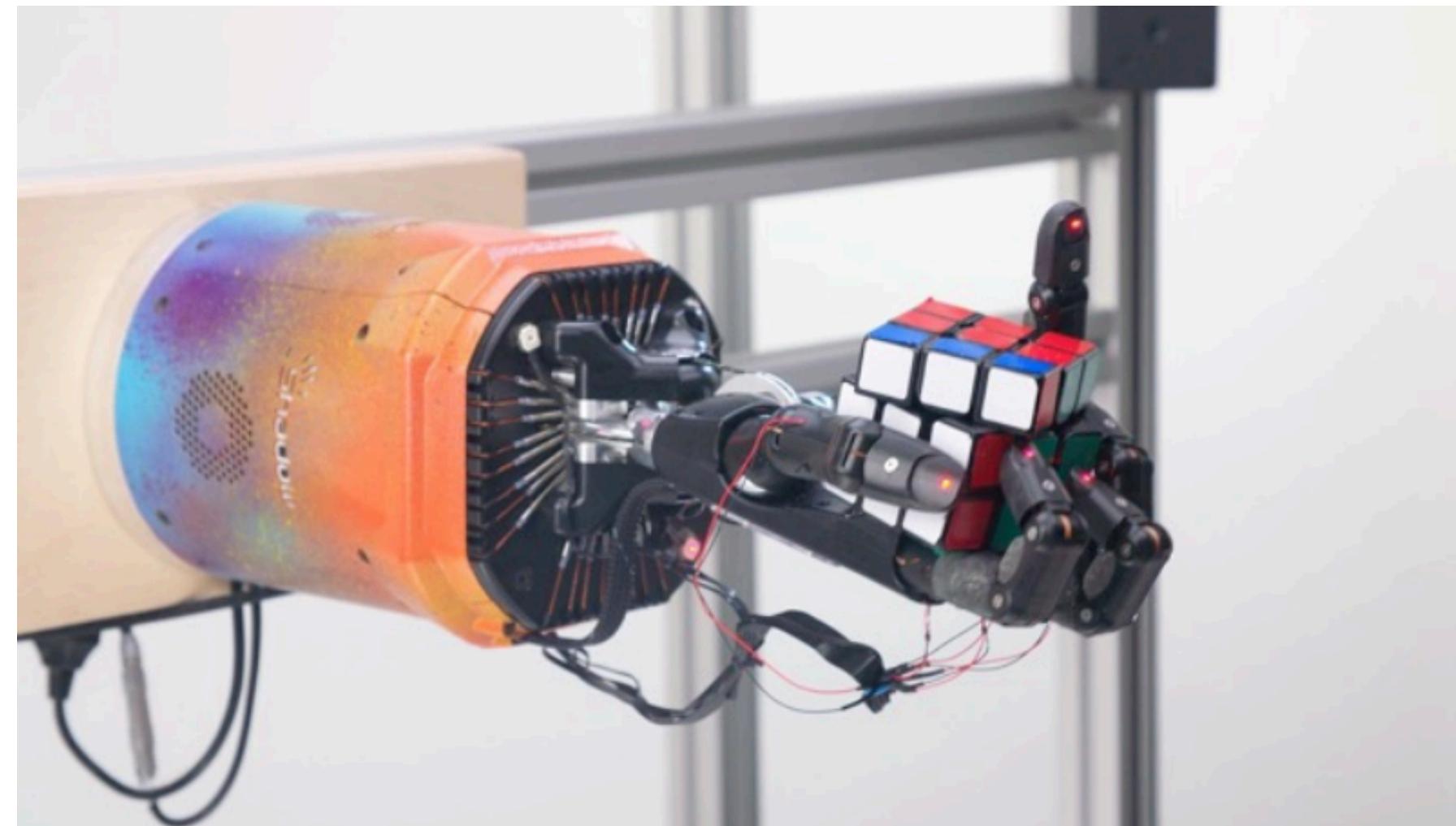
DOTA game

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# Rubik's Cube

## Robotic Arm and Hand



### Train in Simulation

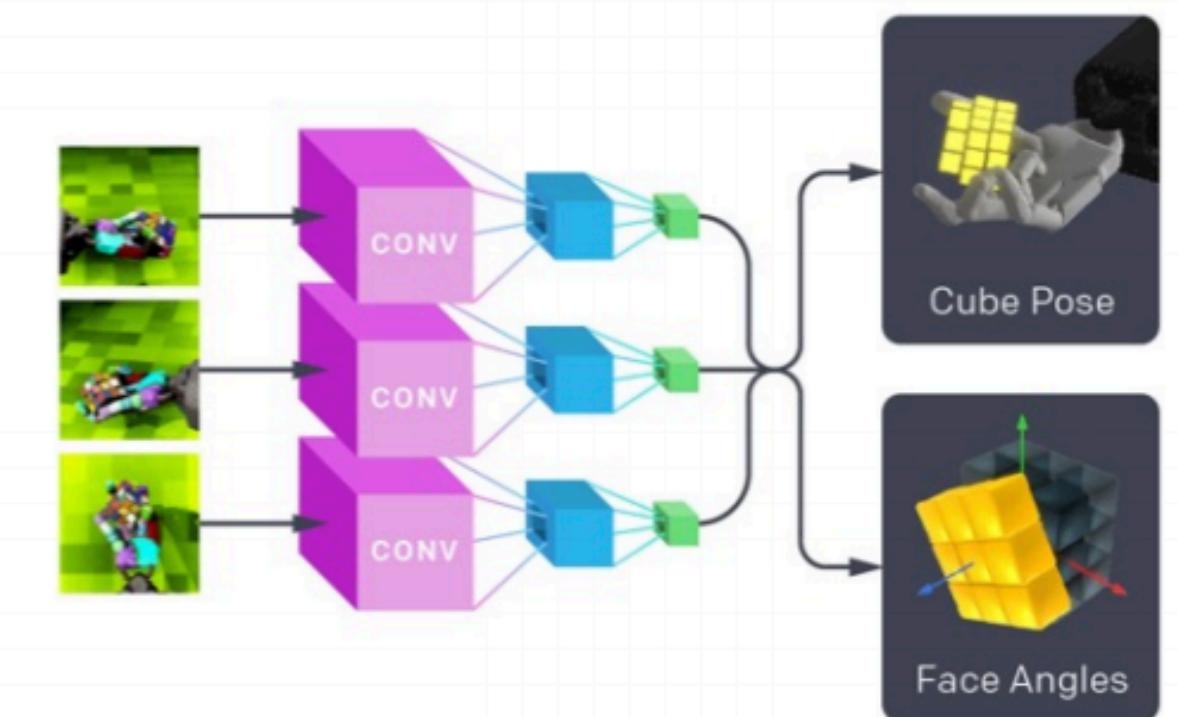
**A** We use Automatic Domain Randomization (ADR) to collect simulated training data on an ever-growing distribution of randomized environments.



**B** We train a control policy using reinforcement learning. It chooses the next action based on fingertip positions and the cube state.



**C** We train a convolutional neural network to predict the cube state given three simulated camera images.



# Robotic Arm

## Arm Grasp and Push



monocular RGB camera

7 DoF robotic manipulator

2-finger gripper

object bin

# What Can We Learn from this Course

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- Introduction to deep reinforcement learning
- Markov decision process
- Value function approximation / policy gradients
- Deep Q-learning
- Continuous action space learning
- Inverse reinforcement learning
- Reinforcement learning techniques and applications

