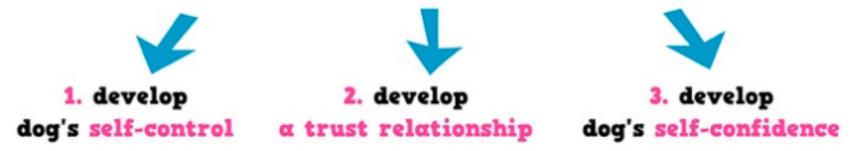


Lecture I: Introduction

Reinforcement Learning with TensorFlow&OpenAl Gym Sung Kim <hunkim+ml@gmail.com>

What is **Positive Reinforcement** Dog Training?

- Teaching dogs desirable behaviors using SCIENCE-based & REWARD-based methods.
- Helping dogs learn and succeed step by step.
- Motivating dogs with fun exercises and games. No force! No pain!
- Encouraging dogs to think more for themselves.
- Valuing dogs' voluntary behaviors.
- Understanding dogs' feelings from their body language.
- Understanding how dogs learn, their needs and wants.
- Using methods that work humanely with ANY dog. Big dogs, small dogs, W2-UU puppies, senior dogs, disabled dogs, fearful dogs, reactive dogs... can all learn and have fun!



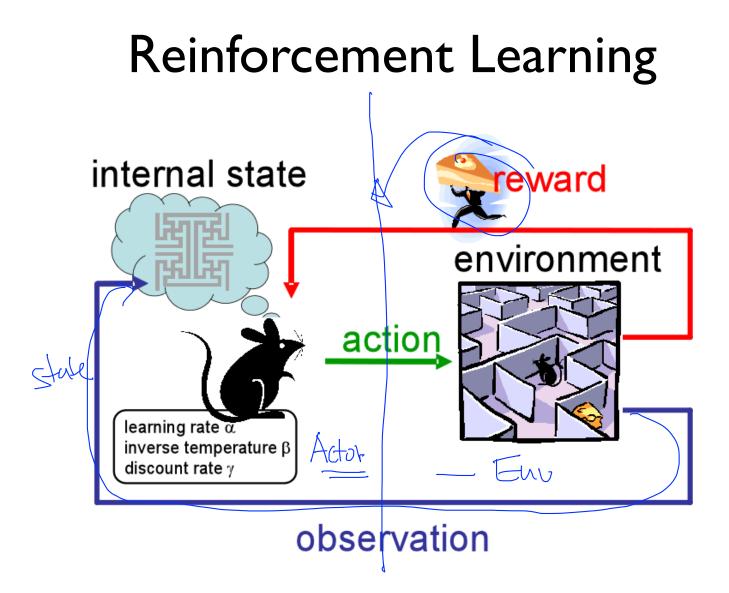
http://angelpawstherapy.org/positive-reinforcement-dog-training.html

Nature of Learning

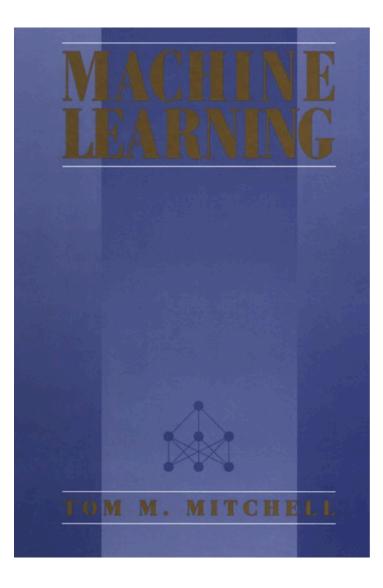
- We learn from past experiences.
 - When an infant plays, waves its arms, or looks about, it has no explicit teacher
 - But it does have direct interaction to its environment.
- Years of positive compliments as well as negative criticism have all helped shape who we are today.

Reinforcement learning: computational approach to learning from interaction.

Richard Sutton and Andrew Barto, Reinforcement Learning: An Introduction Nishant Shukla, Machine Learning with TensorFlow



https://www.cs.utexas.edu/~eladlieb/RLRG.html



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Machine Learning, Tom Mitchell, 1997

Atari Breakout Game (2013, 2015)

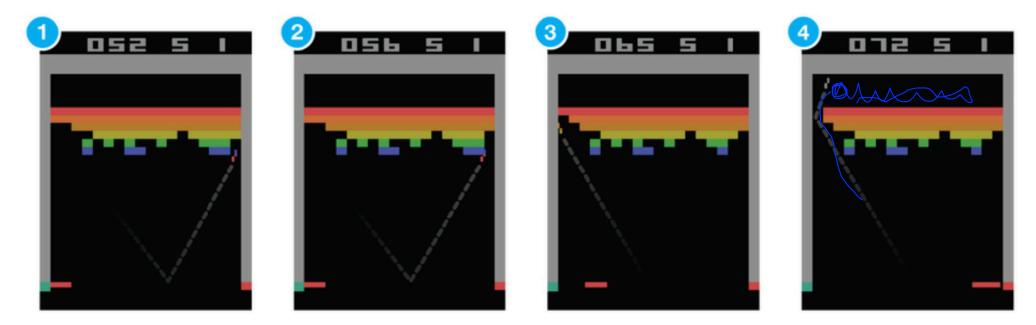


Figure 1: Atari Breakout game. Image credit: DeepMind.

Atari Games

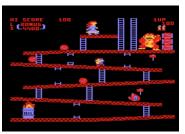


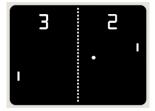








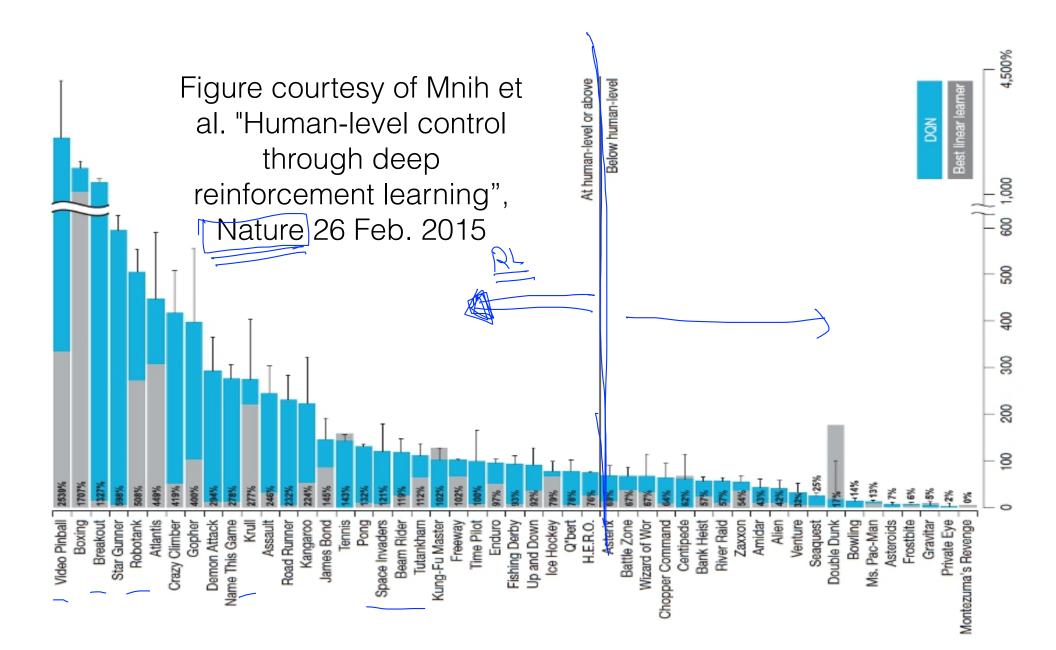




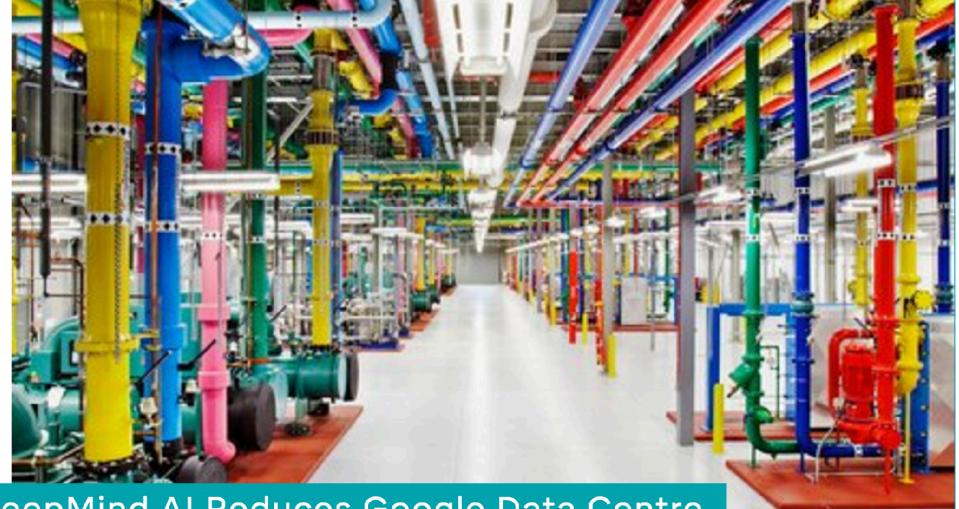
Nature : Human-level control through deep reinforcement learning



Human-level control through deep reinforcement learning, Nature <u>http://www.nature.com/nature/journal/v518/n7540/full/nature14236.html</u>







DeepMind Al Reduces Google Data Centre Cooling Bill by 40%

https://deepmind.com/applied/deepmind-for-google/

Reinforcement Learning Applications

- Robotics: torque at joints
- Business operations
 - Inventory management: how much to purchase of inventory, spare parts
 - Resource allocation: e.g. in call center, who to service first
- Finance: Investment decisions, portfolio design
- E-commerce/media
 - What content to present to users (using click-through / visit time as reward)
 - What ads to present to users (avoiding ad fatigue)

Audience

- Want to understand basic reinforcement learning (RL)
- Nø/weak math/computer science background
 - $-\mathbf{Q} = \mathbf{r} + \mathbf{Q} \qquad \qquad \bigcirc \leftarrow \mathbf{r} + \bigotimes$
- Want to use RL as black-box with basic understanding
- Want to use TensorFlow and Python (optional labs)

Schedule

I. Introduction √

- 2. Playing Games, OpenAl Gym Introduction & Lab
- 3. Q-learning with Tables & Lab
- 4. Q learning on nondeterministic Rewards and Actions & Lab
- 5. Q-learning with Networks (DQN) & Lab
- 6. Policy Gradients & Lab
- 7. Further Topics \bigvee

References

- Awesome Reinforcement Learning <u>http://aikorea.org/awesome-rl/</u>
- Simple Reinforcement Learning with TensorFlow, <u>https://medium.com/</u> <u>emergent-future/</u>
- <u>http://kvfrans.com/simple-algoritms-for-solving-cartpole/</u> (written by a high school student)
- Deep Reinforcement Learning: Pong from Pixels Andrej Karpathy blog <u>http://karpathy.github.io/2016/05/31/rl/</u>
- Machine Learning, Tom Mitchell, 1997
- CS 294: Deep Reinforcement Learning, Spring 2017, <u>http://rll.berkeley.edu/</u>
- Fundamental of Reinforcement Learning, <u>https://www.gitbook.com/book/</u> <u>dnddnjs/rl/details</u> (Korean Book)

Online video lectures

- A Tutorial on Reinforcement Learning, <u>https://simons.berkeley.edu/talks/tutorial-reinforcement-learning</u> 2017
- Berkeley CS 294: Deep Reinforcement Learning, Spring 2017 <u>http://rll.berkeley.edu/</u> <u>deeprlcourse/</u>, 2017
- MIT 6.S094: Deep Learning for Self-Driving Cars (Lecture 2) <u>http://</u> selfdrivingcars.mit.edu/, 2017
- Deep Reinforcement Learning (John Schulman, OpenAI) <u>https://www.youtube.com/watch?v=PtAIh9KSnjo&t=2457s</u> (summary) and <u>https://www.youtube.com/watch?v=aUrX-rP_ss4&list=PLjKEIQIKCTZYN3CYBlj8r58SbNorobqcp</u> (4 lectures)
- UCL, David Silver, Reinforcement Learning <u>http://www0.cs.ucl.ac.uk/staff/d.silver/</u> web/Teaching.html, 2015
- Stanford Andrew Ng CS229 Lecture 16 <u>https://www.youtube.com/watch?</u> <u>v=RtxI449ZjSc</u>, 2008

Prerequisite: <u>http://hunkim.github.io/ml/</u> or <u>https://www.inflearn.com/course/기본적인-머신러닝-딥러닝-강좌/</u>

Net Thereace 2015, D. Actioned 2015, D. Actio	Add videos
1 Lec 00 - Machine/Deep learning 수업의 개요와 일정 by Sung Kim	10:05
: 2 ML lec 01 - 기본적인 Machine Learnnig의 용어와 개념 설명 by Sung Kim	More - X
3 ML lab 01 - TensorFlow의 설치및 기본적인 operations by Sung Kim	10:48
4 ML lec 02 - Linear Regression의 Hypothesis 와 cost 설명 by Sung Kim	13:30
5 ML lab 02 - Tensorflow로 간단한 linear regression을 구현 by Sung Kim	10:00
6 ML lec 03 - Linear Regression의 cost 최소화 알고리즘의 원리 설명	16:12

Next Playing OpenAl Gym games

