

Welcome to

*DS3010:*  
*DS-III: Computational Data Intelligence*  
***Reinforcement Learning***

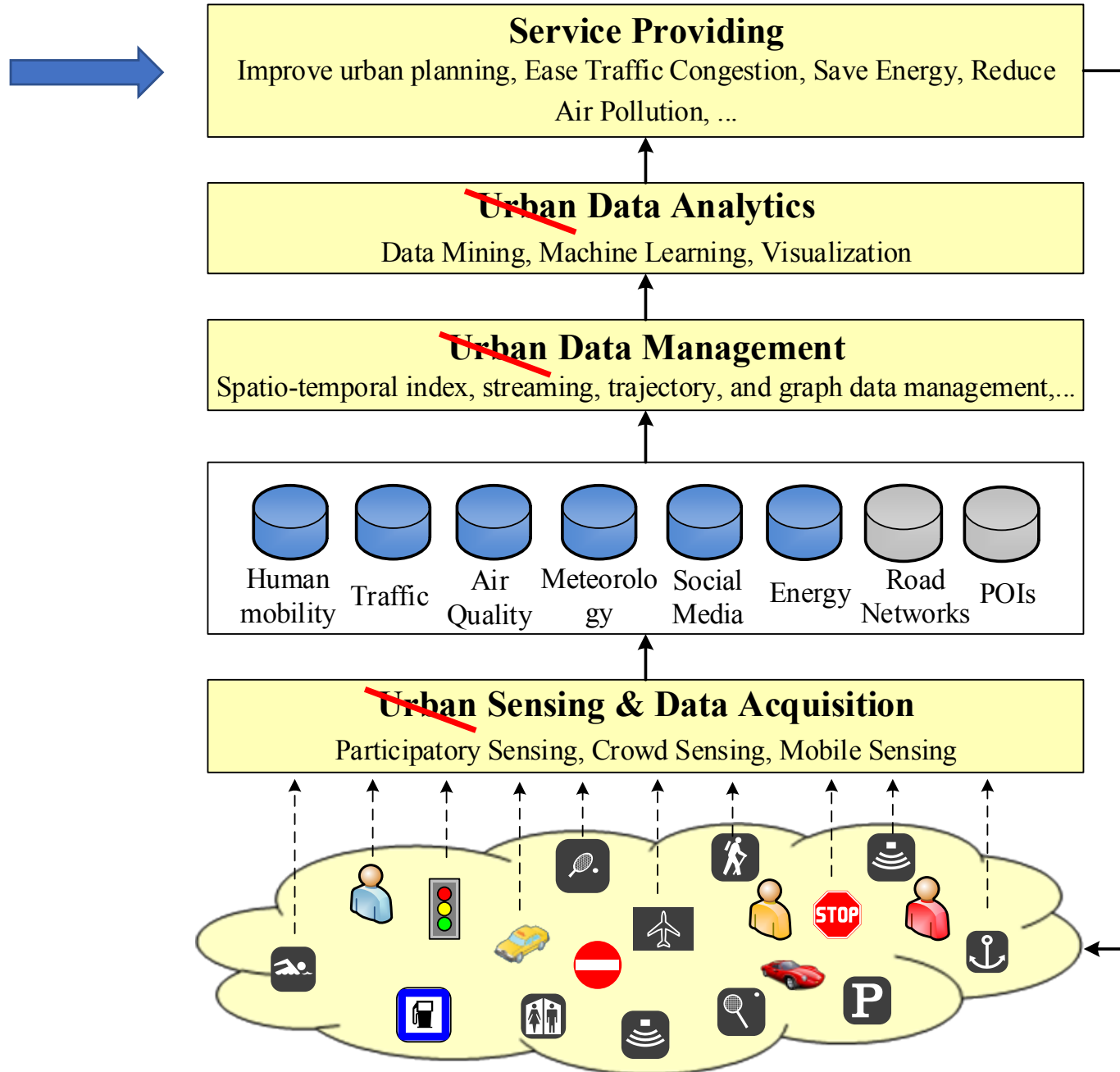
Prof. Yanhua Li

Time: 11:00am – 12:50pm M & R

Location: HL 114

D-term 2022

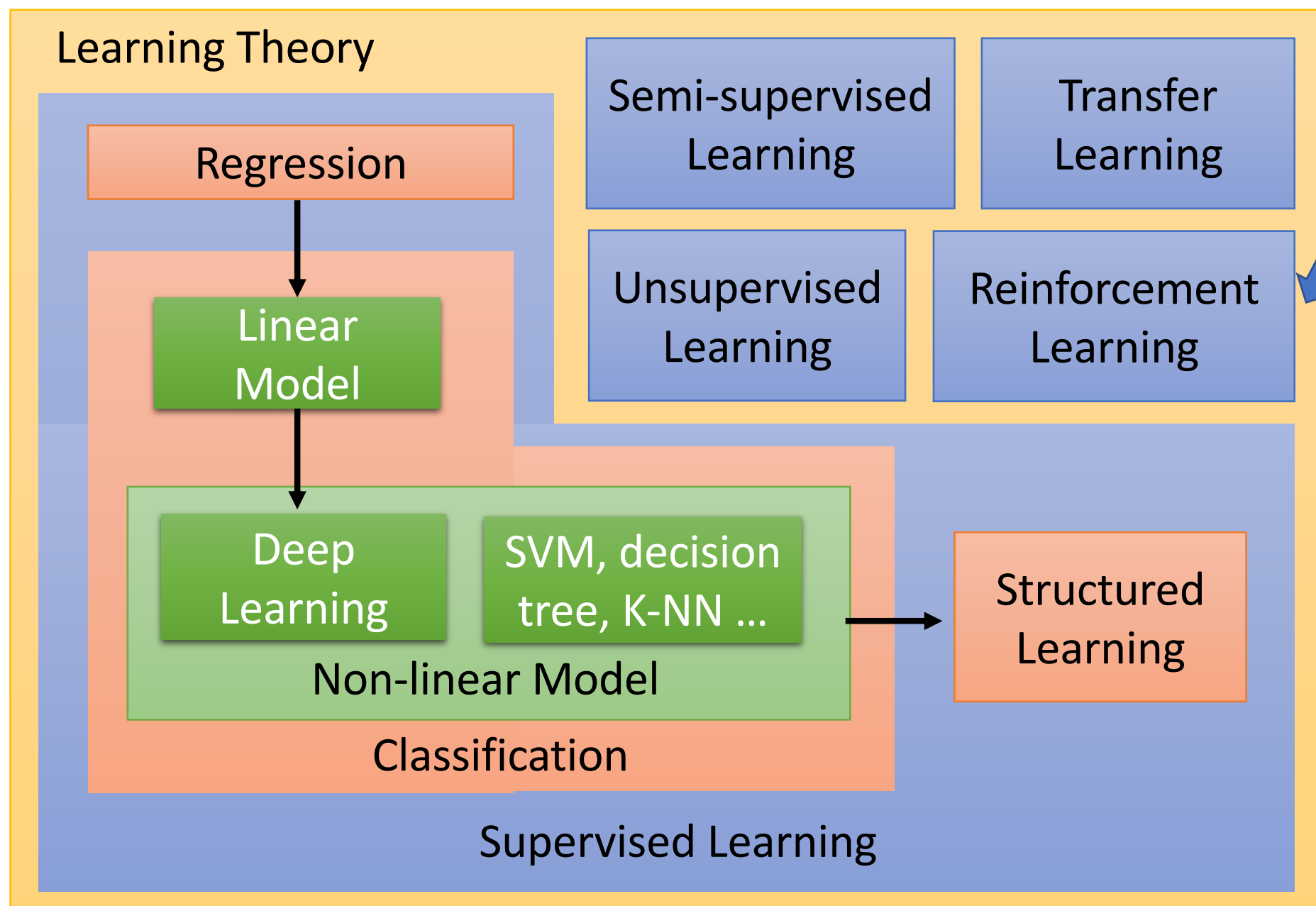
# Data pipeline



**Urban Computing: concepts, methodologies, and applications.**  
Zheng, Y., et al. *ACM transactions on Intelligent Systems and Technology*.

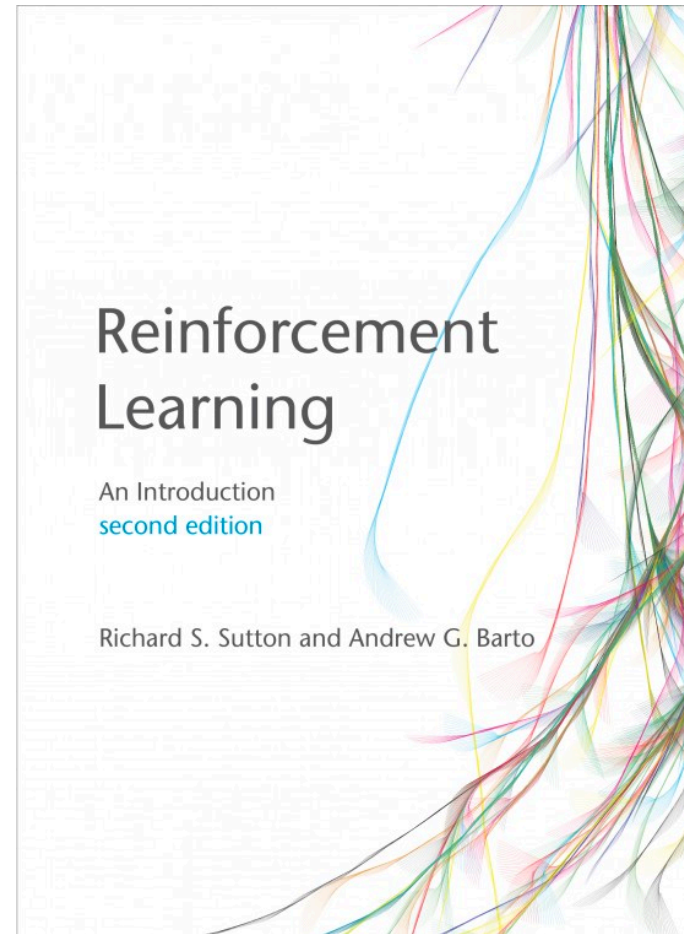
# Learning Map

■ scenario ■ task ■ method



# *References*

Reinforcement  
Learning



# Brief Introduction of Reinforcement Learning

# Deep Reinforcement Learning



David Silver



Deep Reinforcement Learning:  $AI = RL + DL$

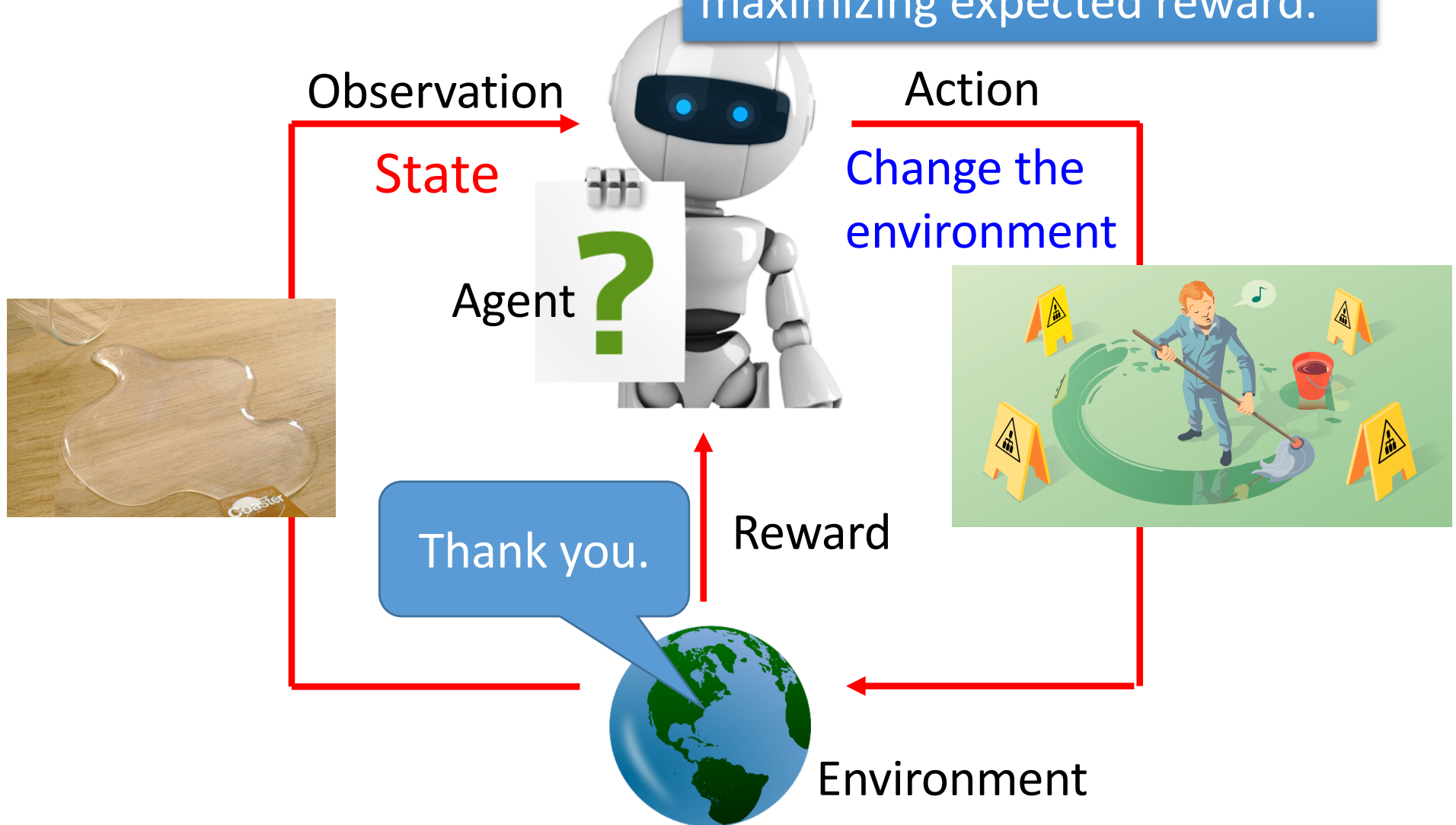
# Scenario of Reinforcement Learning





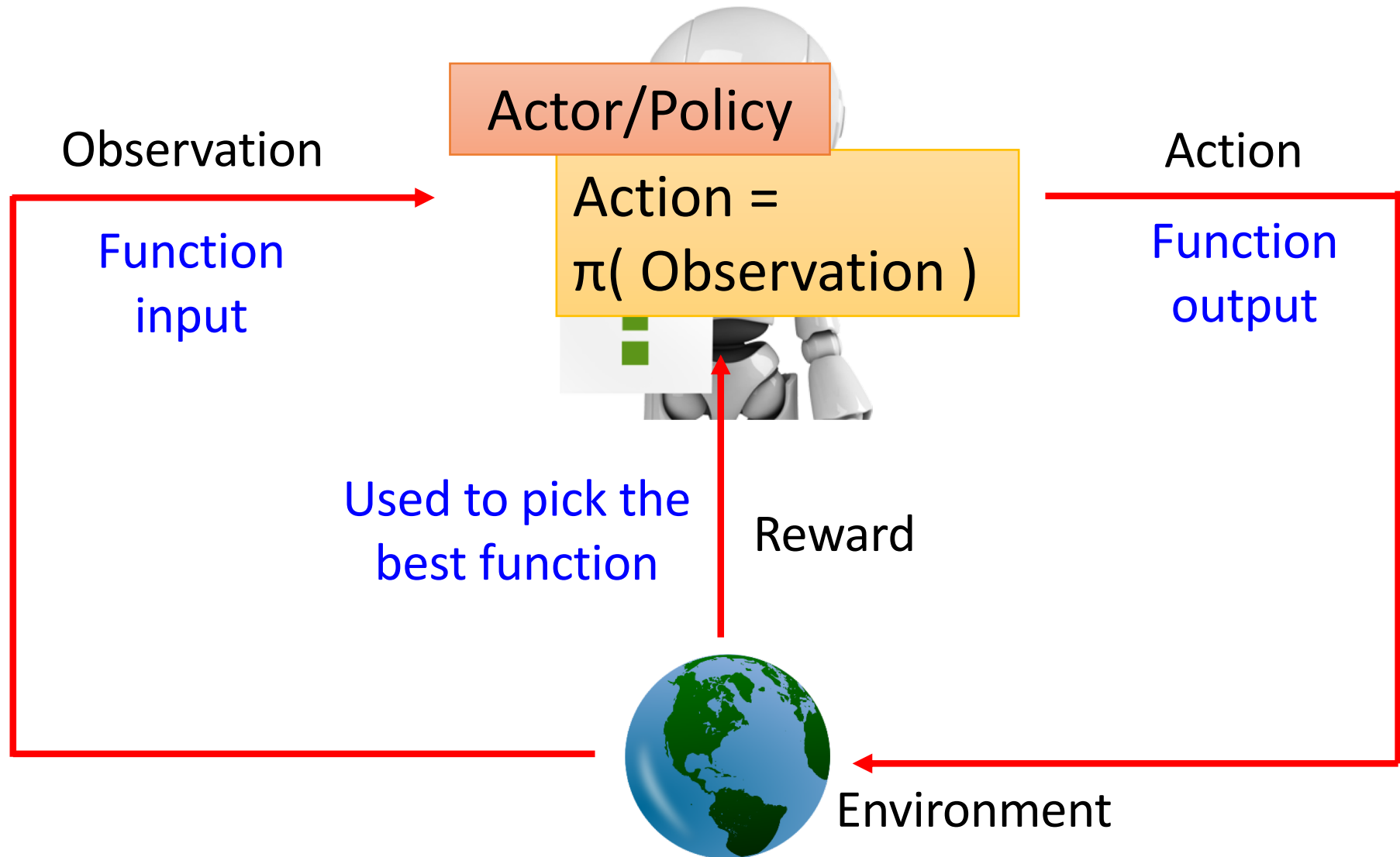
# Scenario of Reinforcement Learning

Agent learns to take actions maximizing expected reward.

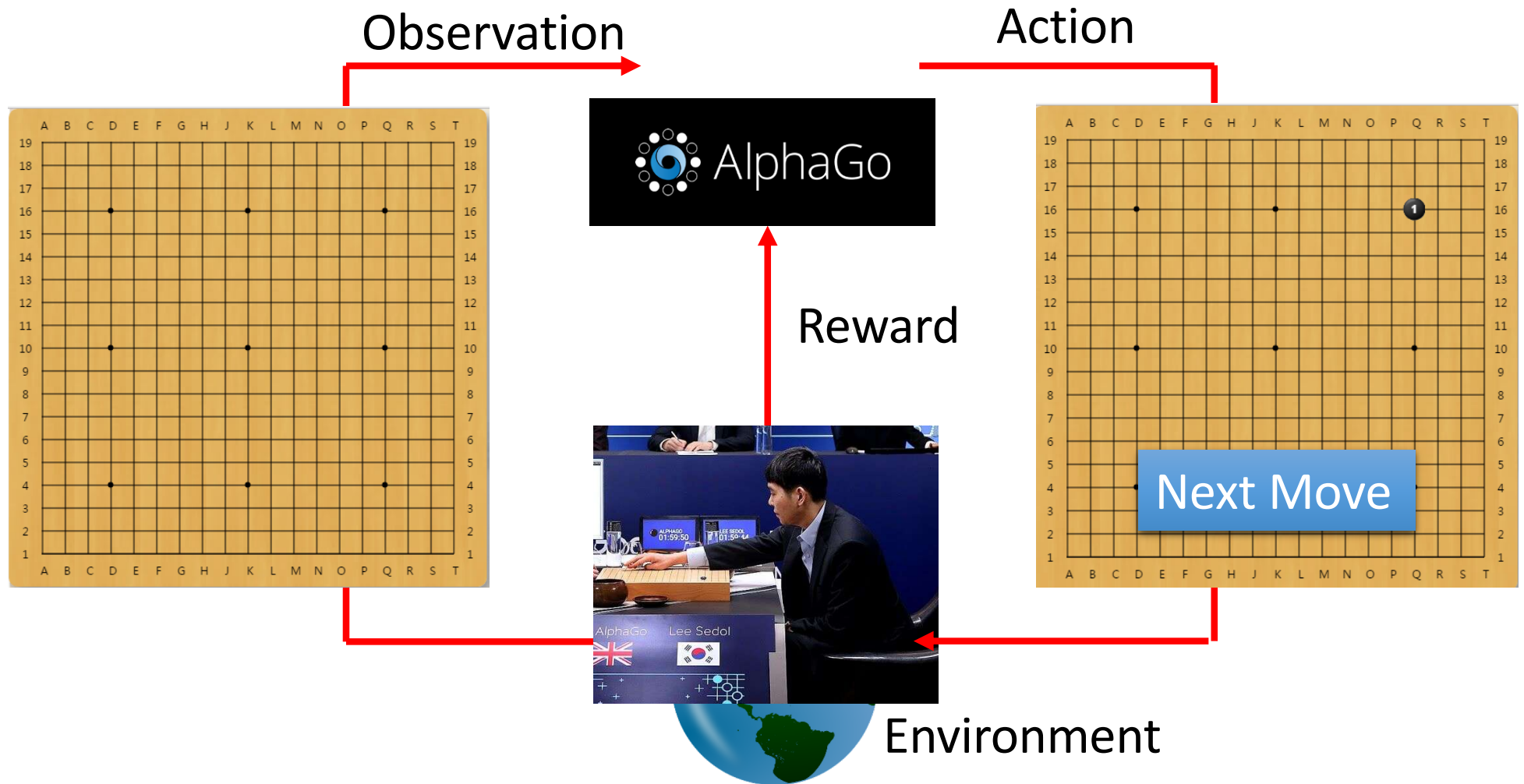




# Machine Learning ≈ Looking for a Function

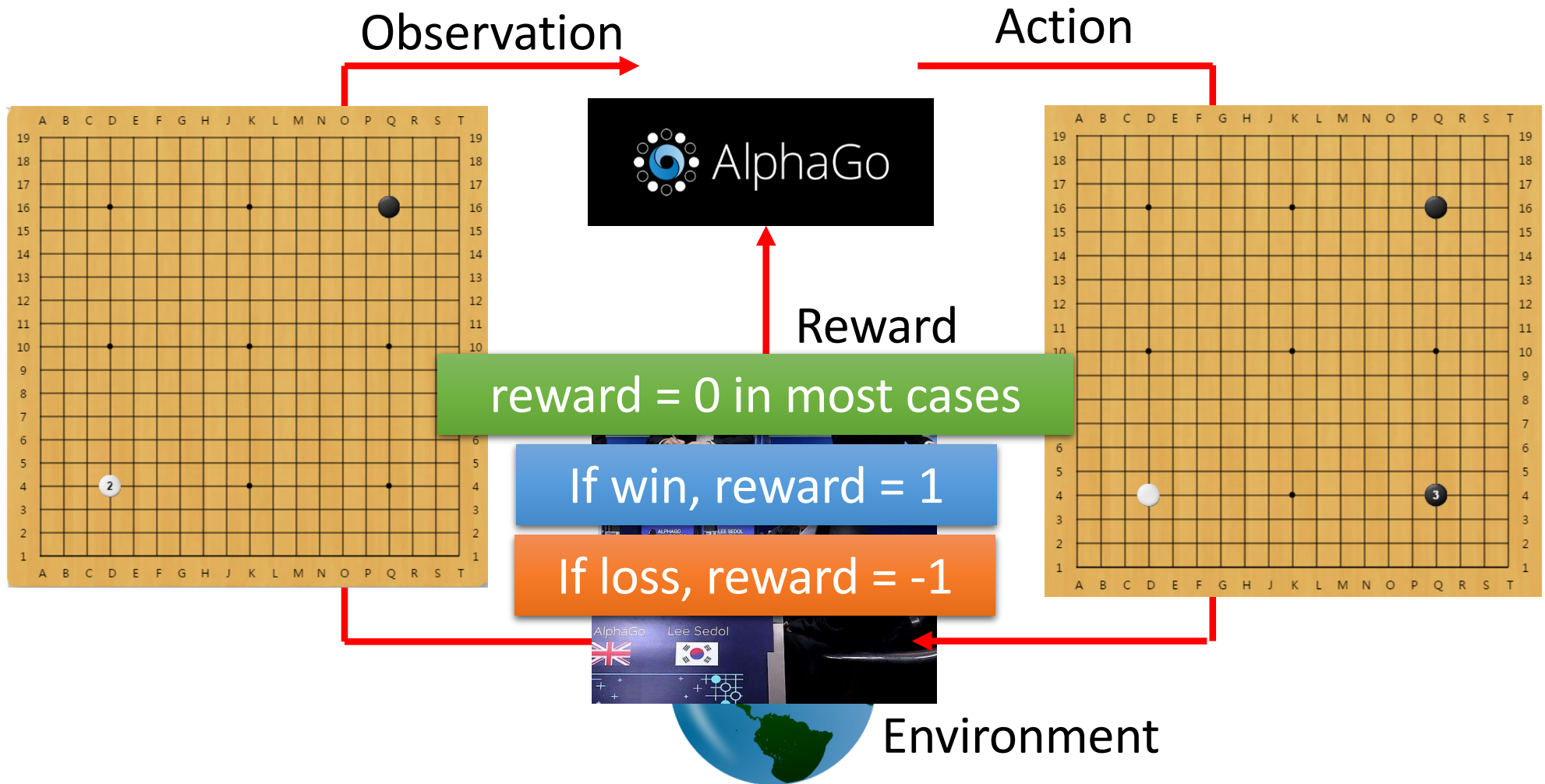


# Learning to play Go



# Learning to play Go

Agent learns to take actions maximizing expected reward.



# Learning to play Go

- Supervised: Learning from teacher



Next move:  
"5-5"



Next move:  
"3-3"

- Reinforcement Learning Learning from experience

First move → ..... many moves ..... → Win!  
(Two agents play with each other.)

Alpha Go is supervised learning + reinforcement learning.

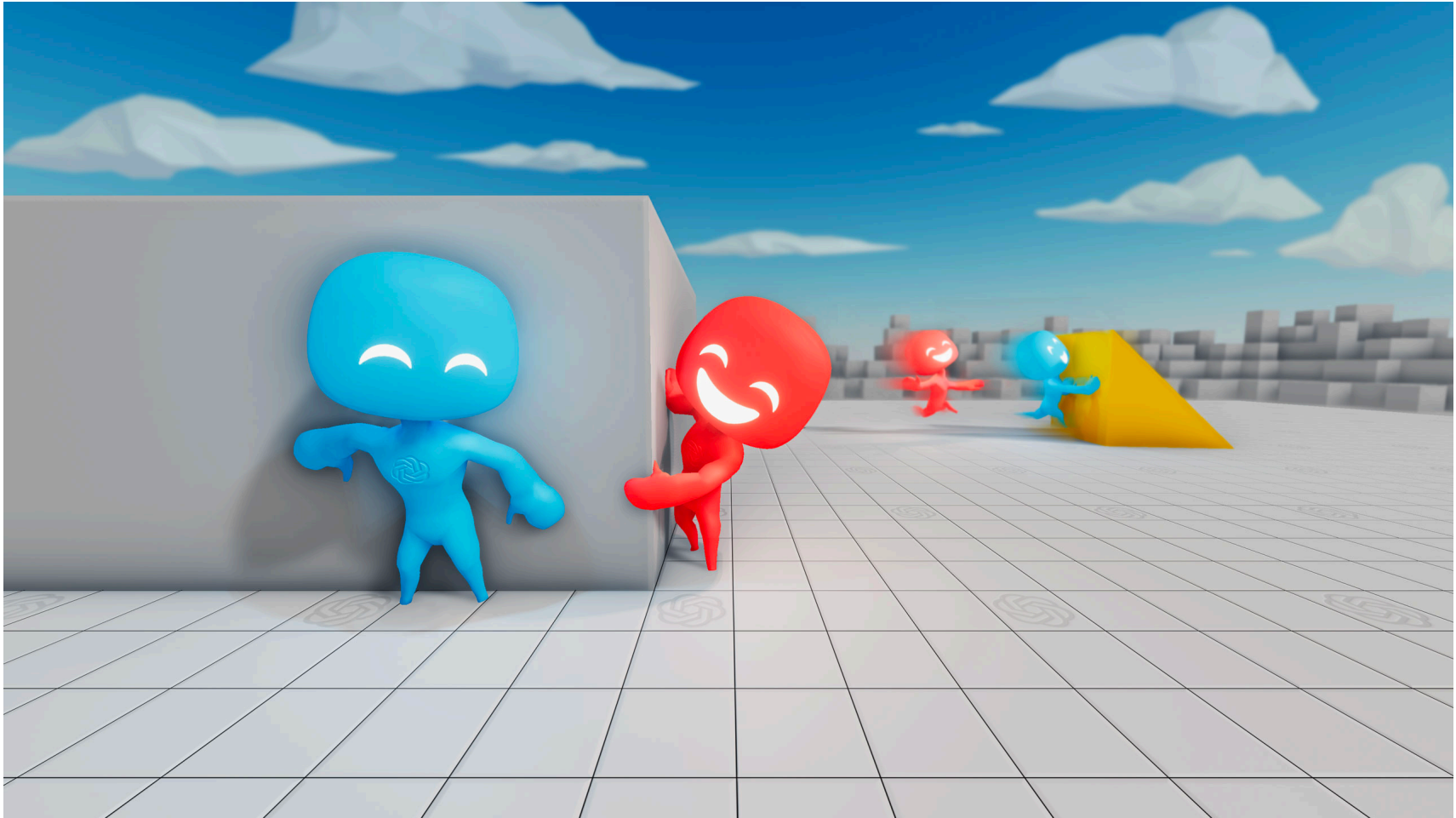
# Examples: OpenAI Five



<https://openai.com/blog/openai-five/>  
[https://www.youtube.com/watch?v=eHipy\\_j29Xw](https://www.youtube.com/watch?v=eHipy_j29Xw)



# Examples



<https://openai.com/blog/emergent-tool-use/>

<https://www.youtube.com/watch?v=kopoLzvh5jY&t=21s>

# More RL materials

- Textbook: Reinforcement Learning: An Introduction
  - <http://incompleteideas.net/book/the-book-2nd.html>
- Lectures of David Silver
  - <http://www0.cs.ucl.ac.uk/staff/D.Silver/web/Teaching.html> (10 lectures)
  - [http://videolectures.net/rldm2015\\_silver\\_reinforcement\\_learning/](http://videolectures.net/rldm2015_silver_reinforcement_learning/) (Deep Reinforcement Learning )
- Lecture of Emma Brunskill, Stanford University, 2019
  - <https://www.youtube.com/watch?v=FgzM3zpZ55o&list=PLoROMvodv4rOSOPzutgyCTapiGLY2Nd8u>
- Lectures of John Schulman
  - [https://youtu.be/aUrX-rP\\_ss4](https://youtu.be/aUrX-rP_ss4)



# Questions