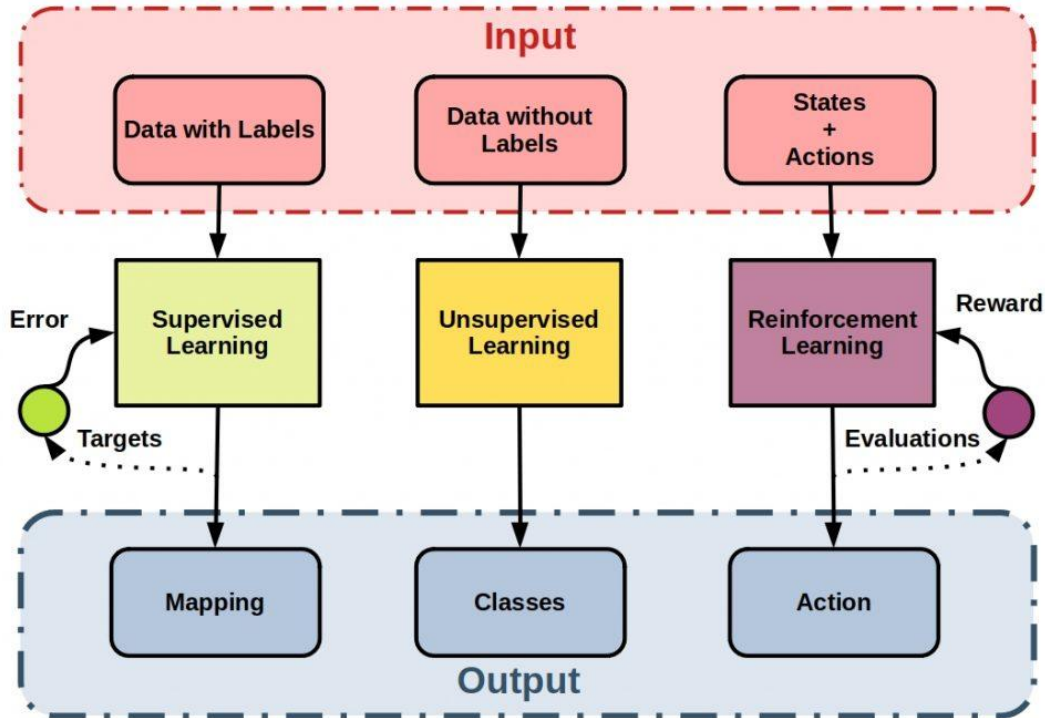


Reinforcement Learning

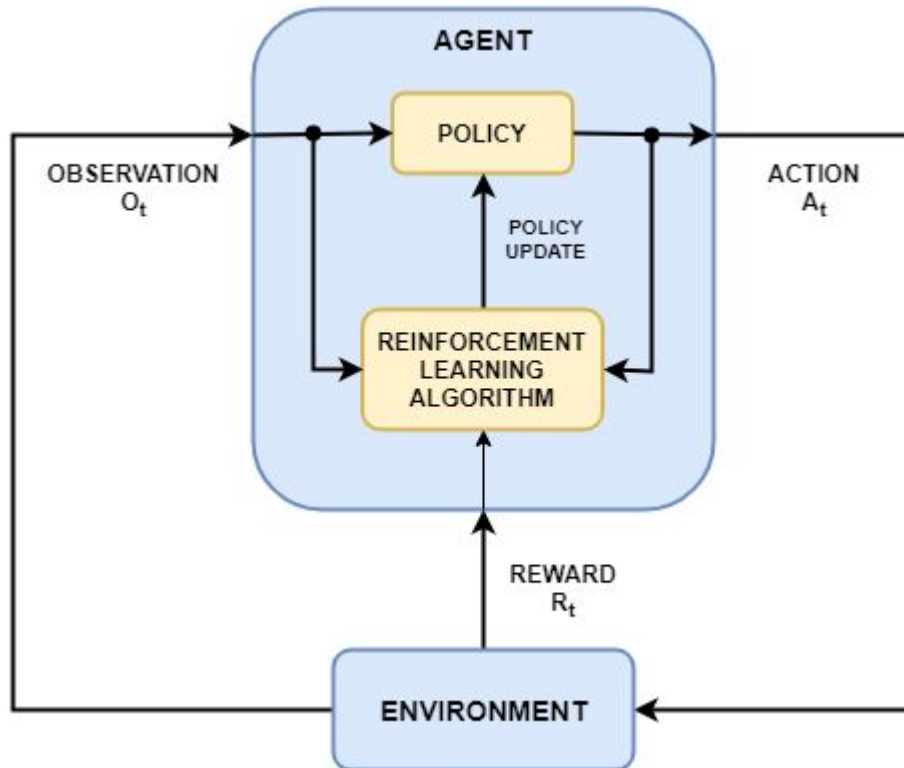
Cihan University – Erbil
Department of Computer Science
Assist. Lect. Soma Solaiman Zadeh

Machine Learning Paradigms



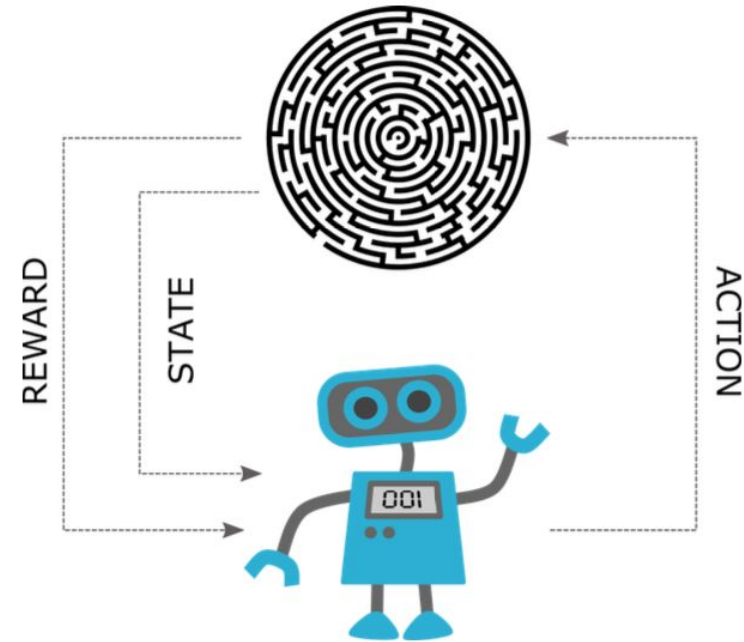
“ In psychology, reinforcement is a term that refers to “anything that increases the likelihood that a response will occur” (*Cherry*)

Elements of Reinforcement Learning



Reinforcement Learning in a Simple Word

Reinforcement Learning is a subfield of machine learning that teaches an agent how to choose an action from its action space, within a particular environment, in order to maximize rewards over time.



Reinforcement Learning Algorithms

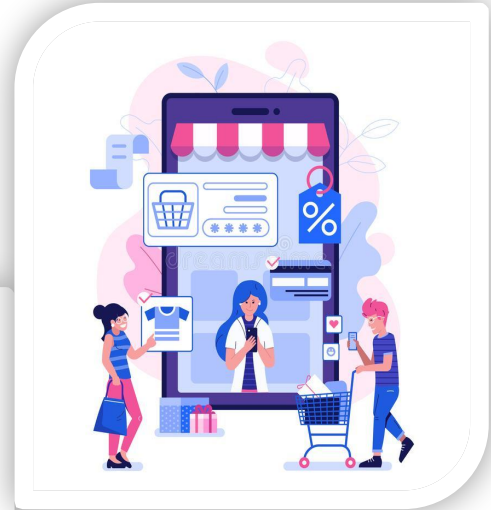
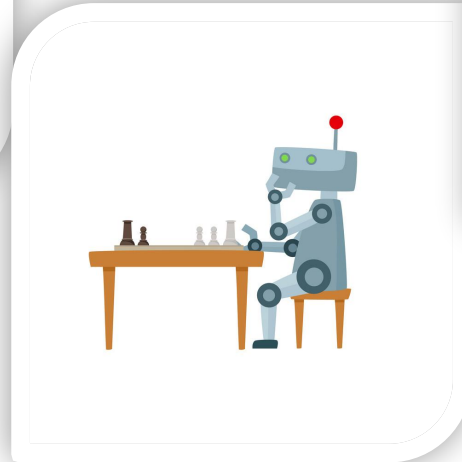
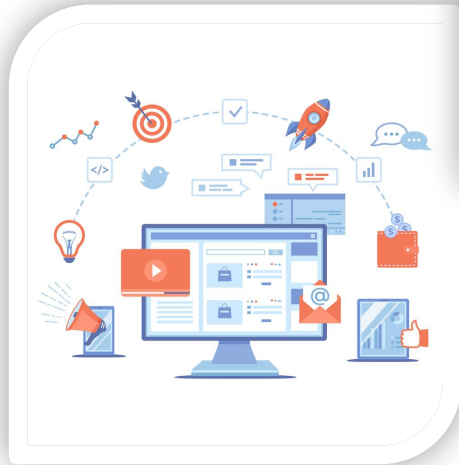


Markov Decision Process (MDP)

Q-Learning

Deep Reinforcement Learning

Reinforcement Learning Applications



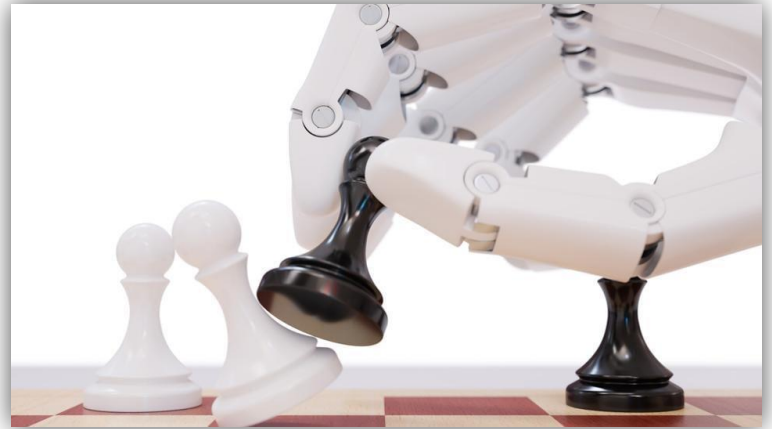
RL in Self-driving Cars

- Speed limits at different streets, drivable zones, avoiding collisions, parking.
- **AWS DeepRacer** is an autonomous racing car that has been designed to test out **RL** in a physical track.



RL in Computer Games

- Games like Atari, Chess, GO and sudoku have become testbeds of testing deep reinforcement learning algorithms.

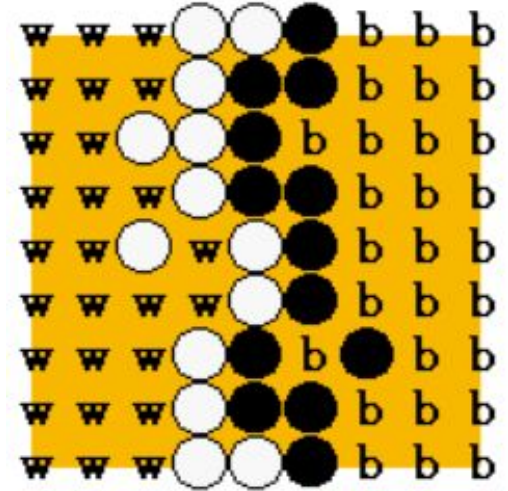
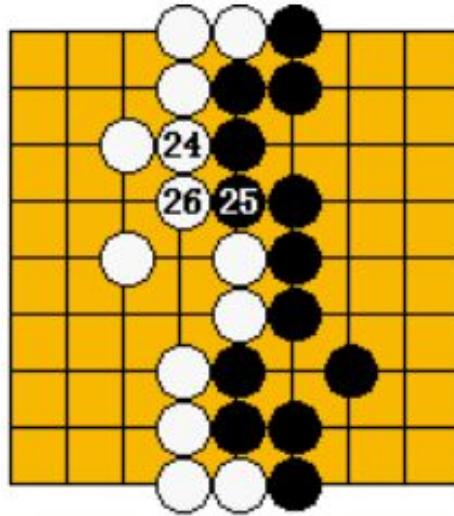
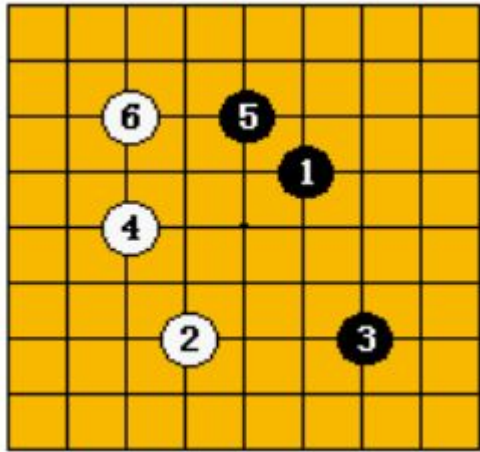


A close-up photograph of a white robotic hand with blue joints, reaching towards a Go board. The board is covered with black and white Go stones. The background is softly blurred. In the top-left corner, there is a blue arrow pointing right. In the bottom-right corner, there is an orange and blue graphic element.

AlphaGo Zero



Ancient Chinese Game of Go



Black □ 28 Points

White □ 27 Points

Winner: **Black**

AlphaGo

- 30 million moves of expert human play
- **Several months** for training

48
TPUs

AlphaGo Zero

- Never saw humans play
- 5 million games of self-play
- **3 days** for training and less computing power

4
TPUs

AlphaGo vs AlphaGo Zero

- **Original AlphaGo** defeated world champion **Lee Sedol** by 18 games to 0.
- **Original AlphaGo** defeated the world's leading Go player **Ke Jie** by 3 games to 0.
- **AlphaGo Zero** defeated the **original AlphaGo** in a 100-game match by 100 to 0.

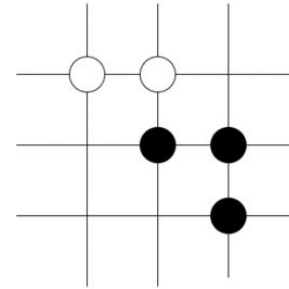
AlphaGo and AlphaGo Zero

- Both original **AlphaGo** and **AlphaGo Zero** use deep reinforcement learning.
- Two basic things the program needs to learn:
 - ▷ **Policy:** the probability of making each of the possible moves in a given position.
 - ▷ **Value:** the probability of winning from any given position.

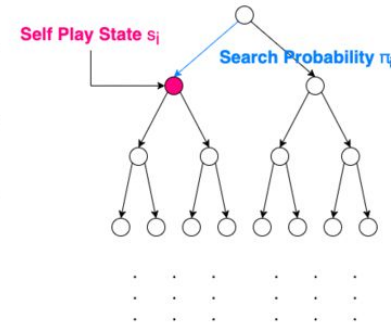
AlphaGo Zero Architecture

- It combines a **neural network** and **Monte Carlo Tree Search** in a policy iteration framework to achieve stable learning.

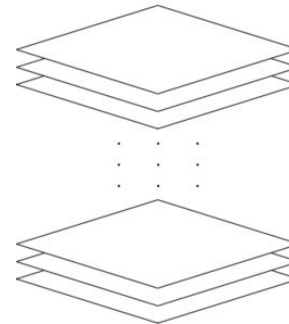
Board State s_i



Monte Carlo Tree α_i



Convolutional Neural Network f_i



Conclusion

- Reinforcement Learning needs large datasets to make better decisions.
- Constant changes in the environment makes decision making difficult.
- Design of the reward and punishment structure of the model is the key for the success.



THANKS!

Any questions?