

# Multi-Agent Reinforcement Learning: Asynchronous Communication, Robustness and Privacy

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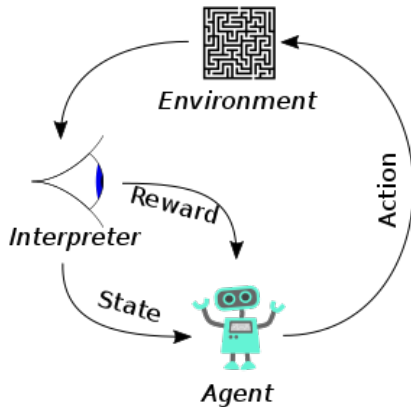
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# Reinforcement Learning

Sequential Decision-Making Problems

- ❖ Interact with environment
- ❖ Sequence of decisions repeatedly
- ❖ Adjust the policy based on the past information

**Goal:** maximize the cumulative reward



# Cooperative Multi-Agent Reinforcement Learning

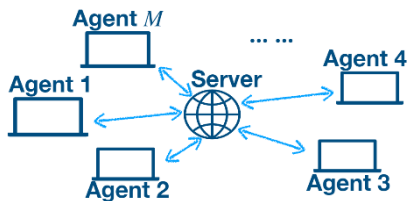
Various of successful applications: game, autonomous driving, dialogue system

Large application scale

- ❖ Enormous number of states in practice ( more than  $10^{100}$ )
- ❖ Massive # of samples (more than  $10^6$ )
- ❖ Single agent: all data in central server

Cooperative Multi-Agent RL (Federated RL)

- ❖ Keep private data decentralized
- ❖ Model learning in agent side
- ❖ Cooperative learning (communication)



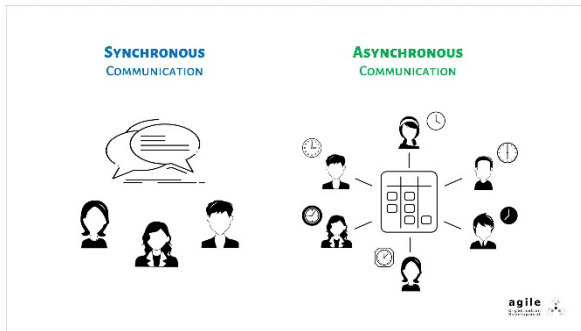
# Topic 1: Asynchronous Communication

## Synchronous Environment

- ❖ Agents: **full** participation
- ❖ Server: **global** synchronization
- ❖ Impractical (offline, unavailable agent)

## My research: Asynchronous Communication Protocol

- ❖ Agent : decide whether or not to participate
- ❖ Communication: independent for different agent
- ❖ Efficiency: communication, performance



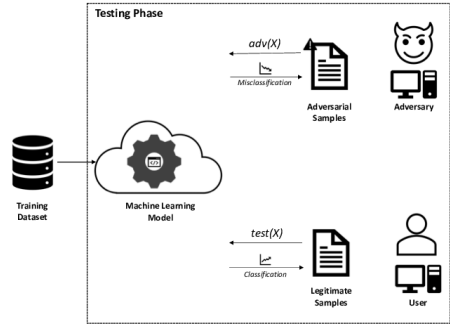
# Topic 2: Robust Reinforcement Learning

## Adversarial attack for Communication

- ❖ Channel: Influenced by adversary
- ❖ Agent: Provided adversarial sample
- ❖ Identify the trustworthiness: expensive, challenging

## My research: Learning the model

- ❖ When the data may **not accurate**
- ❖ Efficiency: performance (low attack level)



# Topic 3: Differentially Private Reinforcement Learning

## Multi-Agent Reinforcement Learning

- ❖ Update the model with personal data
- ❖ Data: **sensitive** personal information
- ❖ Danger: potential **privacy leakage**

My research: safe data sharing and privacy guarantee

- ❖ Differential Privacy Guarantee
- ❖ Efficiency: performance

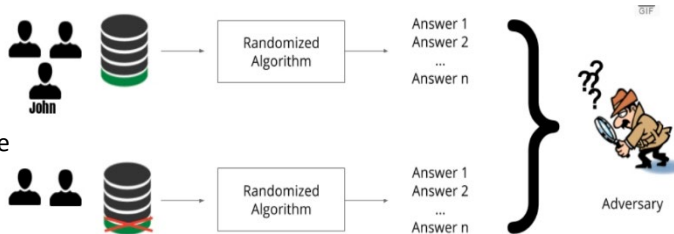


Image Credit: <https://blog.openmined.org/maintaining-privacy-in-medical-data-with-differential-privacy>

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Thanks