

## 星际争霸与人工智能

阿里巴巴认知计算实验室龙海涛





## Challenge Problems for Artificial Intelligence

Imperfect Information Huge State and Action Space

Adversarial Real-time Strategy

Long-Term Planning

Temporal and
Spatial Reasoning

Multiagent Cooperation



## StarCraft AI Research and Competitions

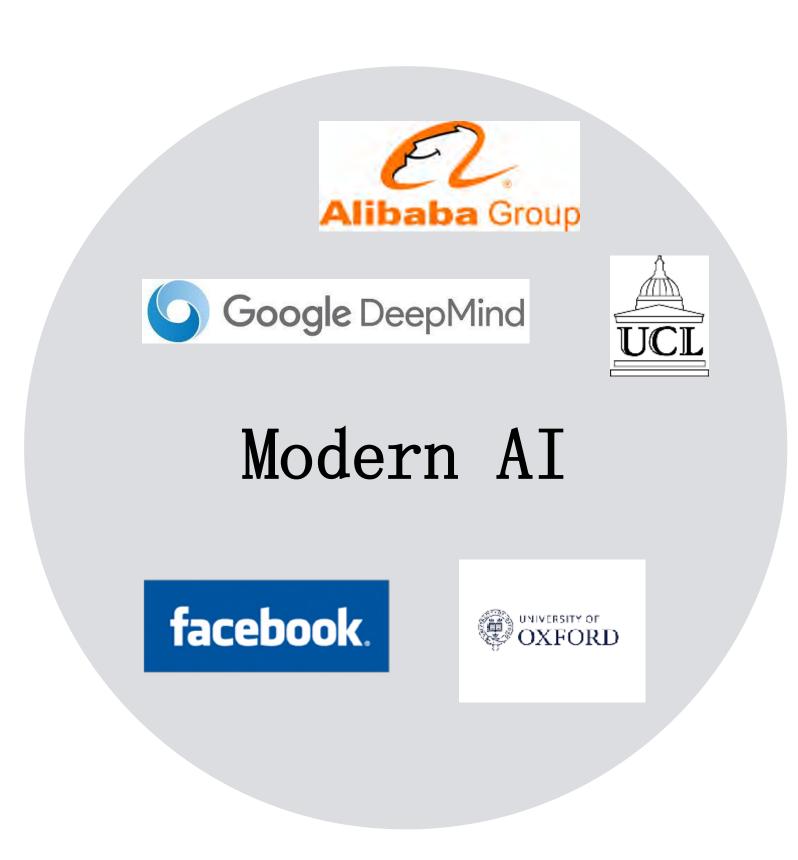
AIIDE

IEEE CIG

SSCAIT

Classic AI



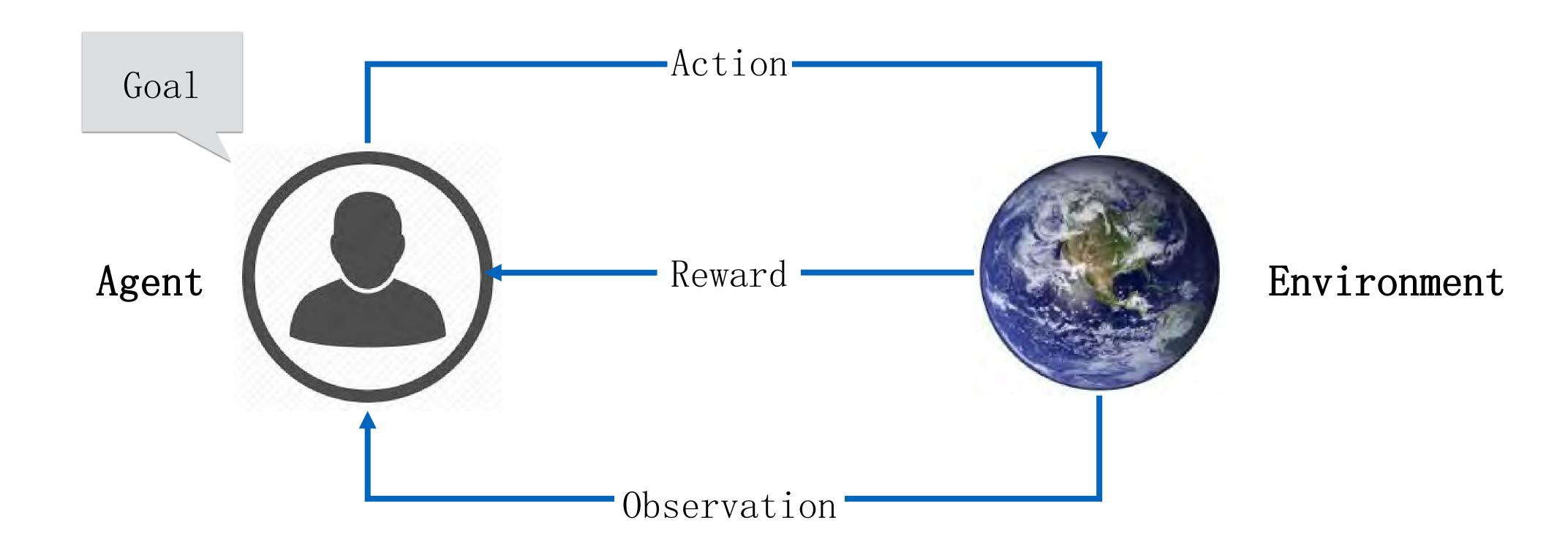


 $2010^{\sim}$ Now

2016 Now

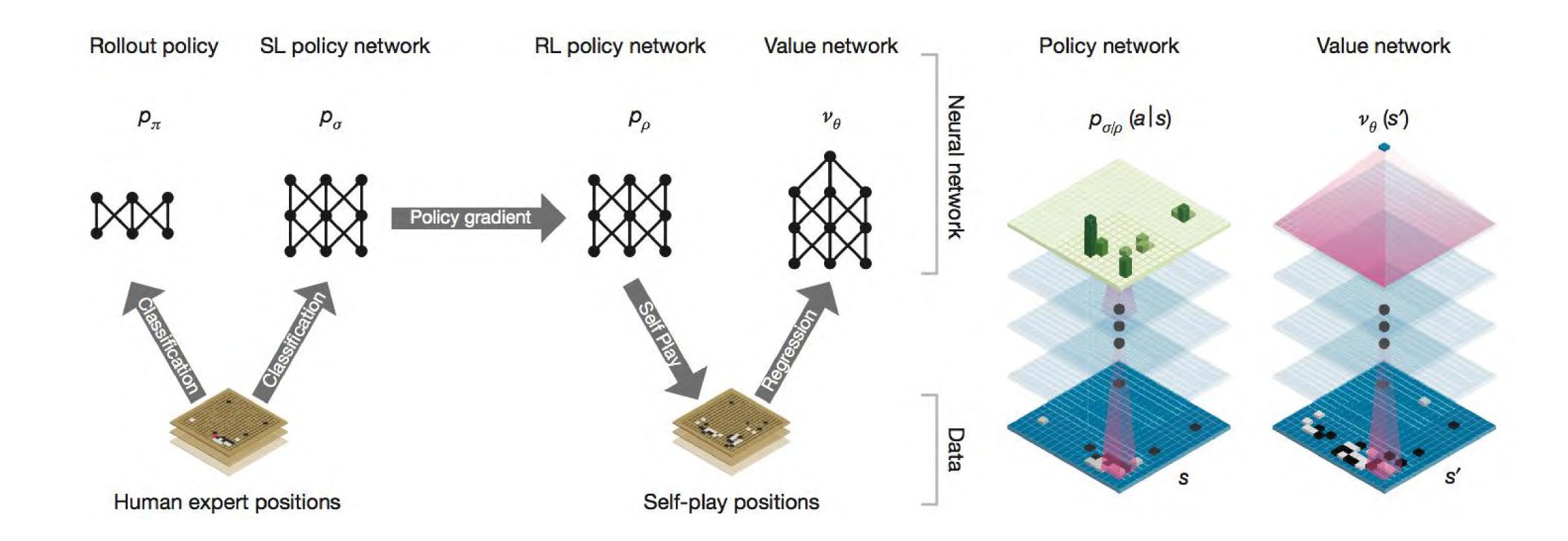


## Reinforcement Learning





## Deep Reinforcement Learning





#### What is next?

- All above are single AI agent
- But, true human intelligence embraces social and collective wisdom
- How large-scale multiple AI agents could learn human-level collaborations (or competitions) from their experiences?







## Cooperative Hunting











## Artificial Collective Intelligence









# Multiagent Bidirectionally-Coordinated Nets for Learning to Play StarCraft Combat Games

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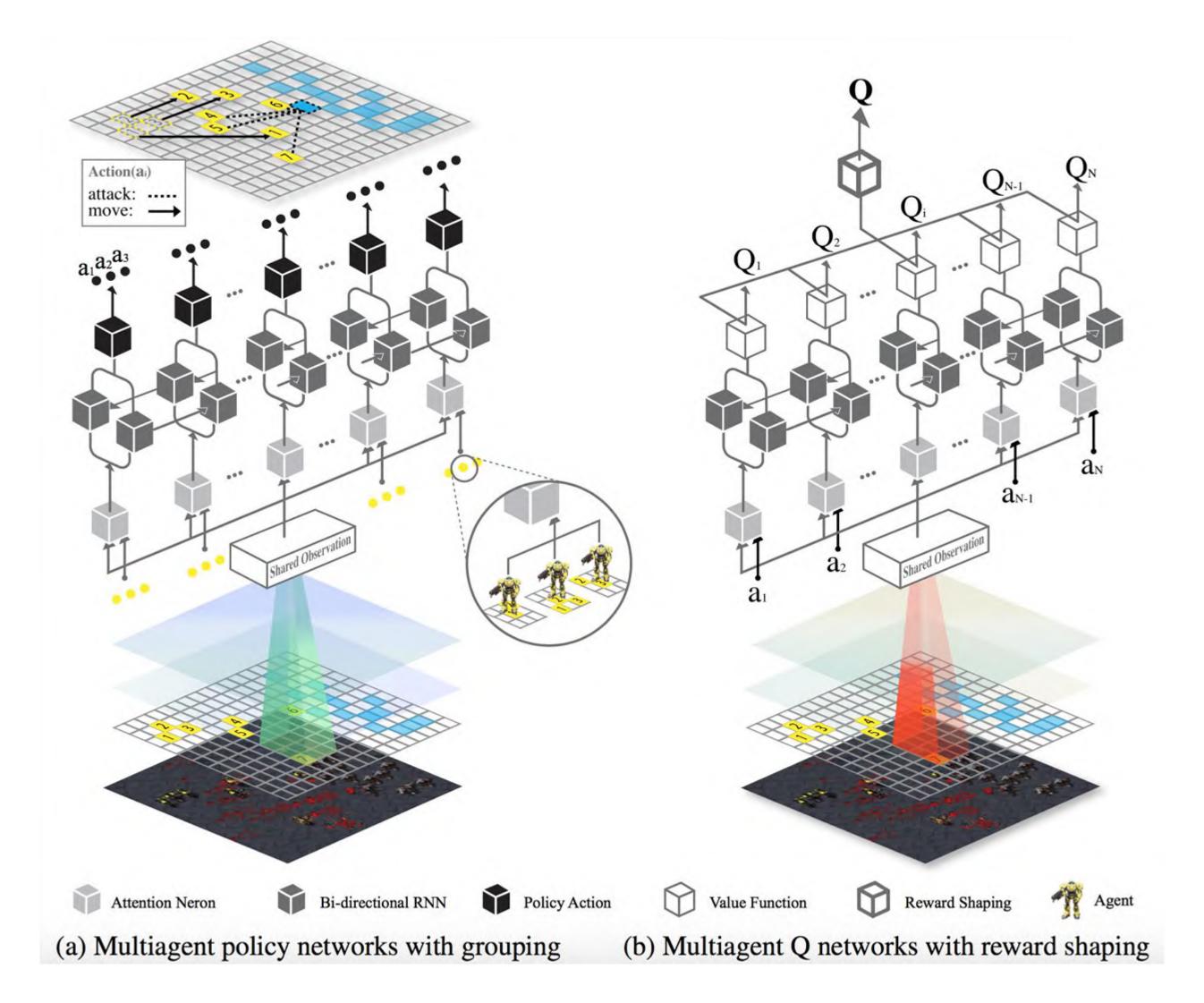
<sup>†</sup>Alibaba Group, <sup>‡</sup>University College London

#### **Abstract**

Real-world artificial intelligence (AI) applications often require multiple agents to work in a collaborative effort. Efficient learning for intra-agent communication and coordination is an indispensable step towards general AI. In this paper, we take StarCraft combat game as the test scenario, where the task is to coordinate multiple agents as a team to defeat their enemies. To maintain a scalable yet effective

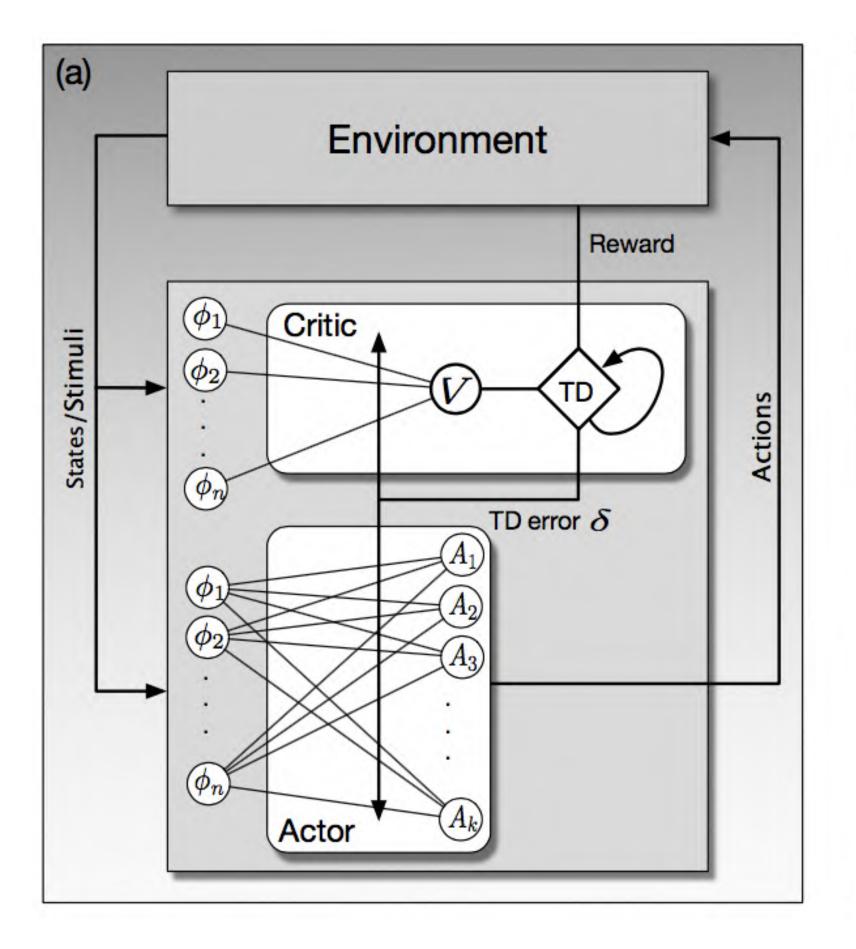


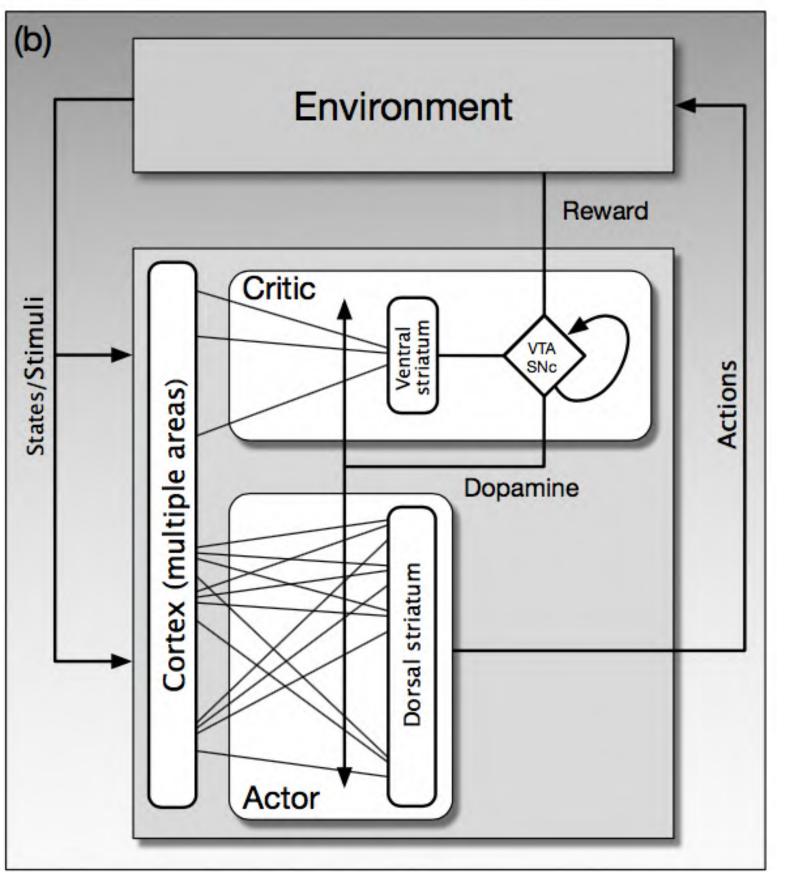
## Multiagent Bidirectionally-Coordinated Net (BiCNet)





## Neuroscience Hypothesis

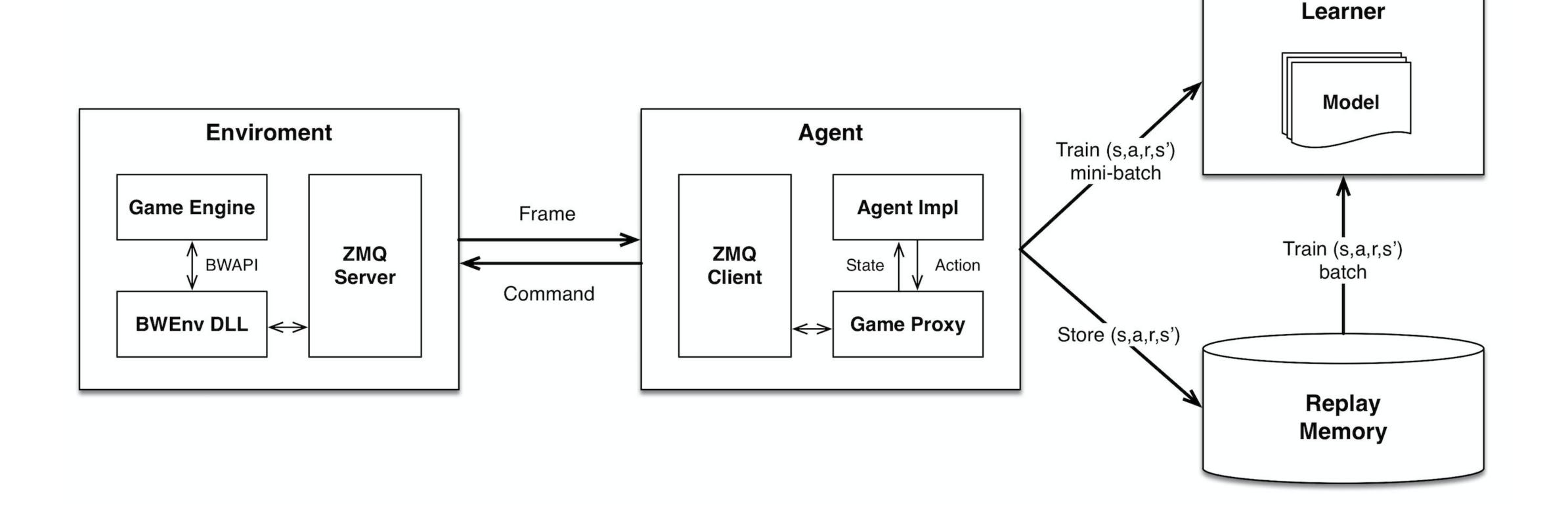




Source: Reinforcement Learning - An Introduction



#### Architecture Overview



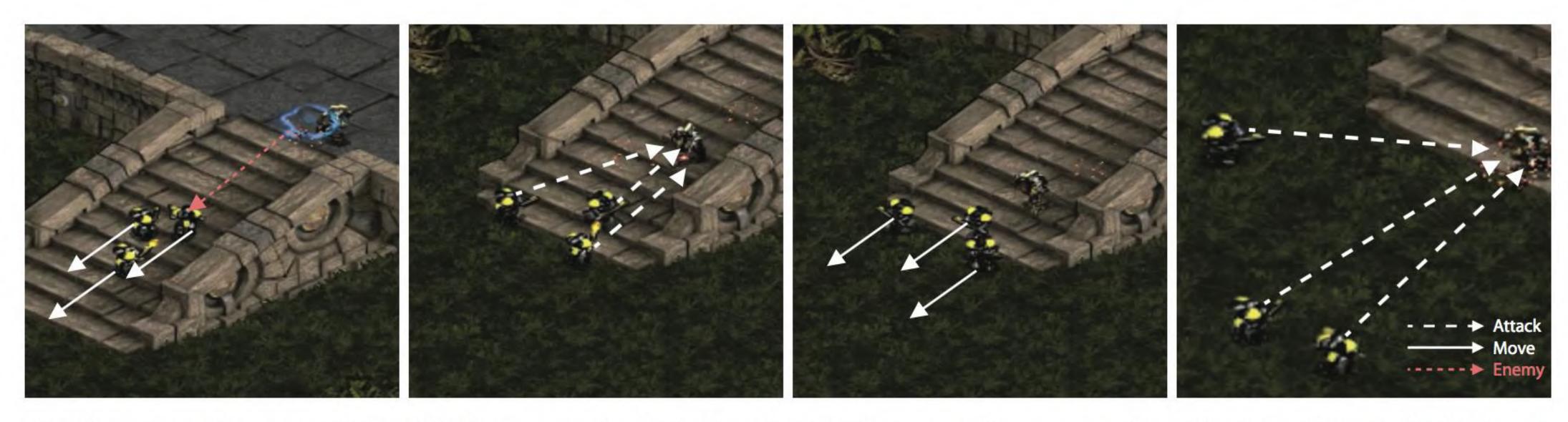


#### Coordinated Moves without Collision





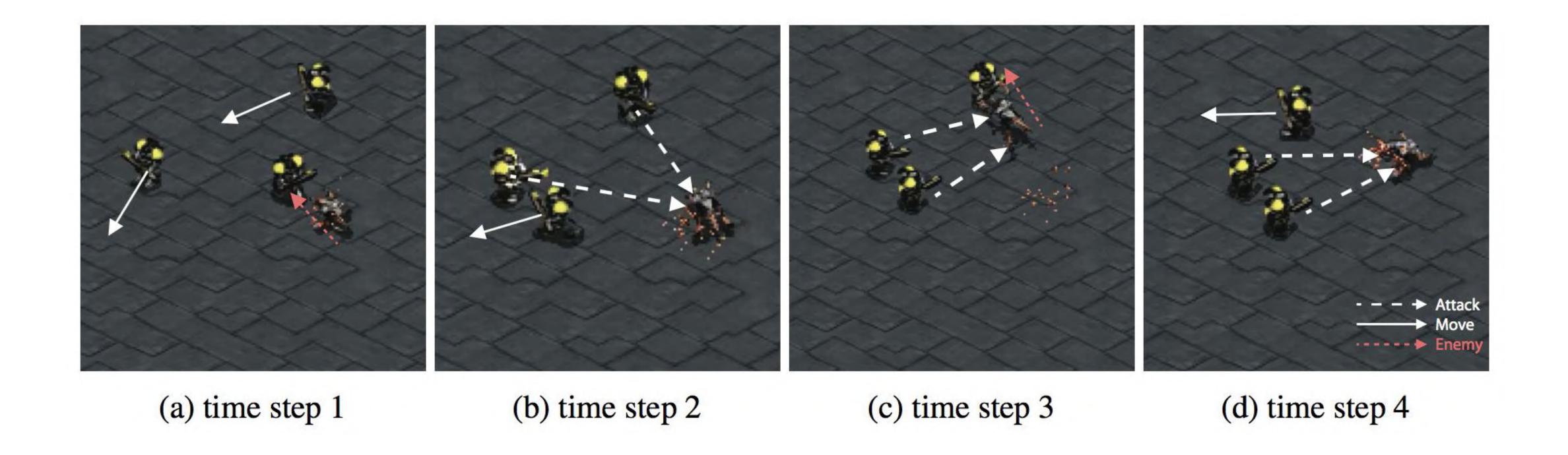
#### Hit and Run Tactics



(a) time step 1: run when (b) time step 2: fight back (c) time step 3: run again (d) time step 4: fight back attacked when safe

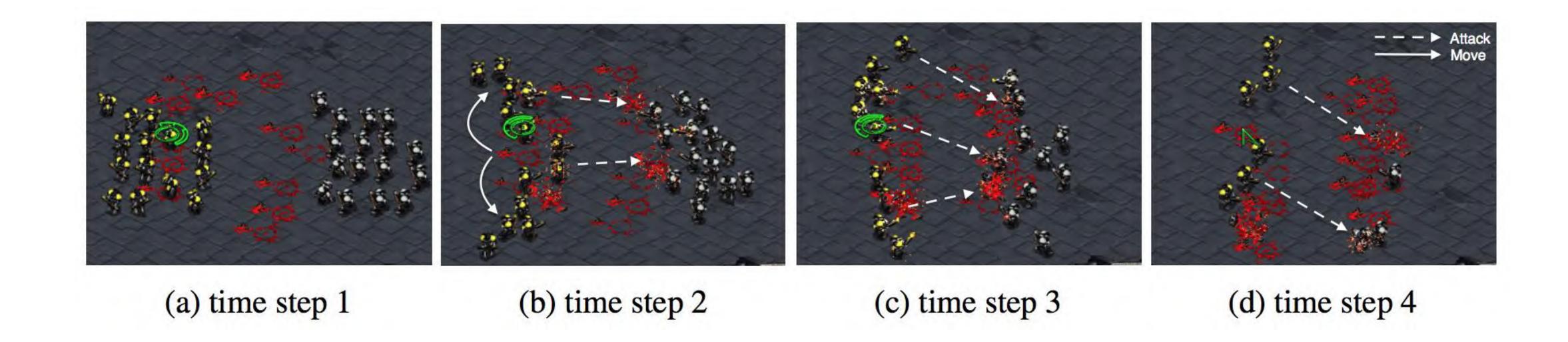


### Coordinated Cover Attack



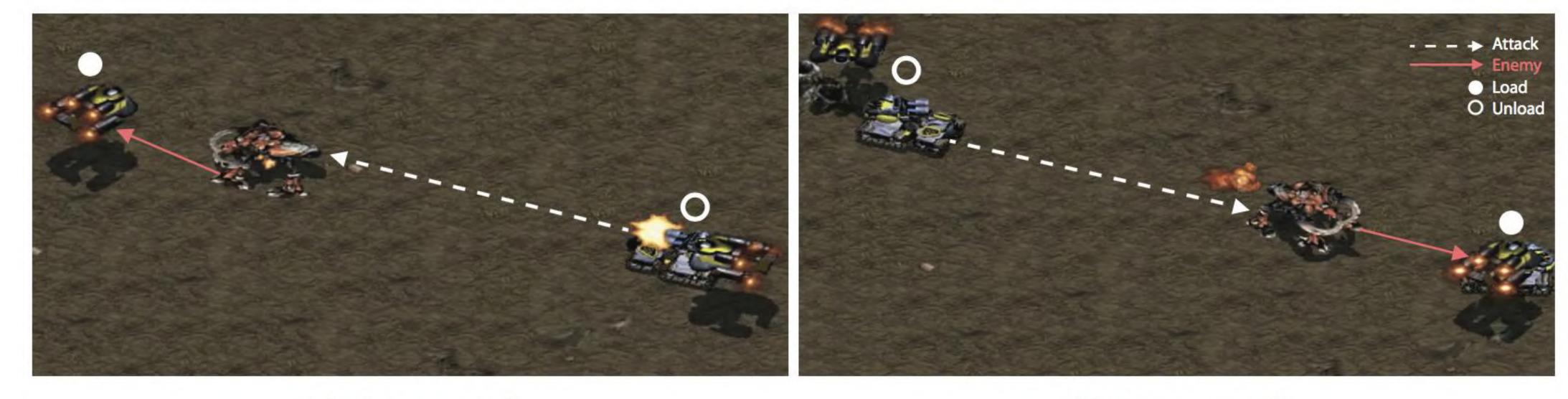


### Focus Fire without Overkill





## Coordinated Heterogonous Agents



(a) time step 1

(b) time step 2



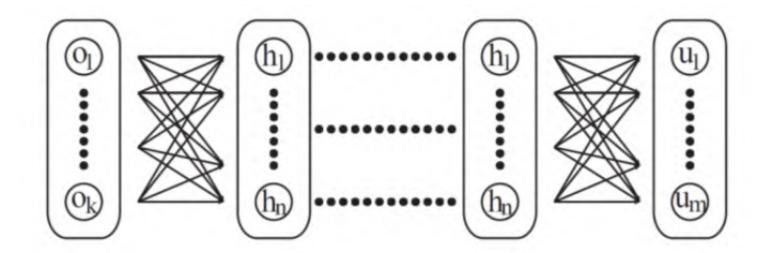


## Hierarchical Reinforcement Learning

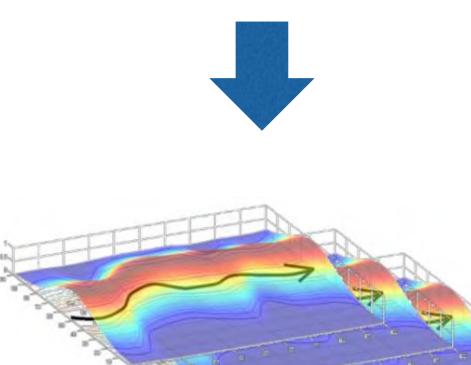




## Imitation Learning



Supervised Learning

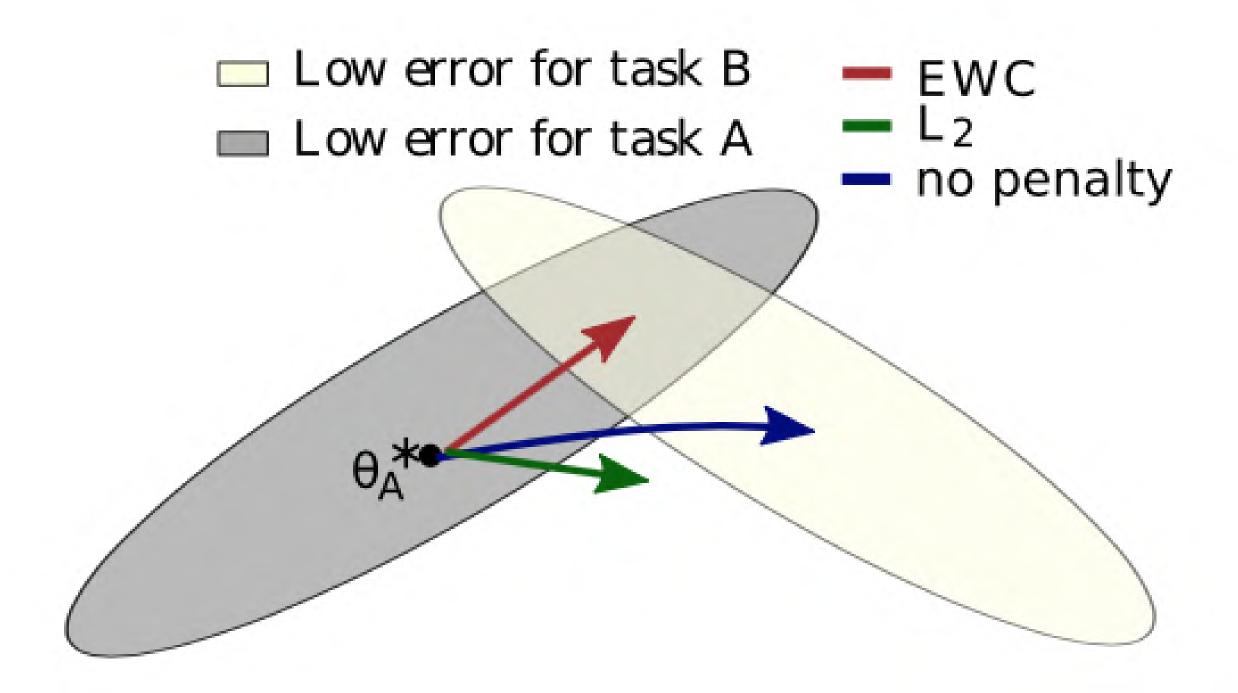


Reinforcement Learning





## Continual Learning

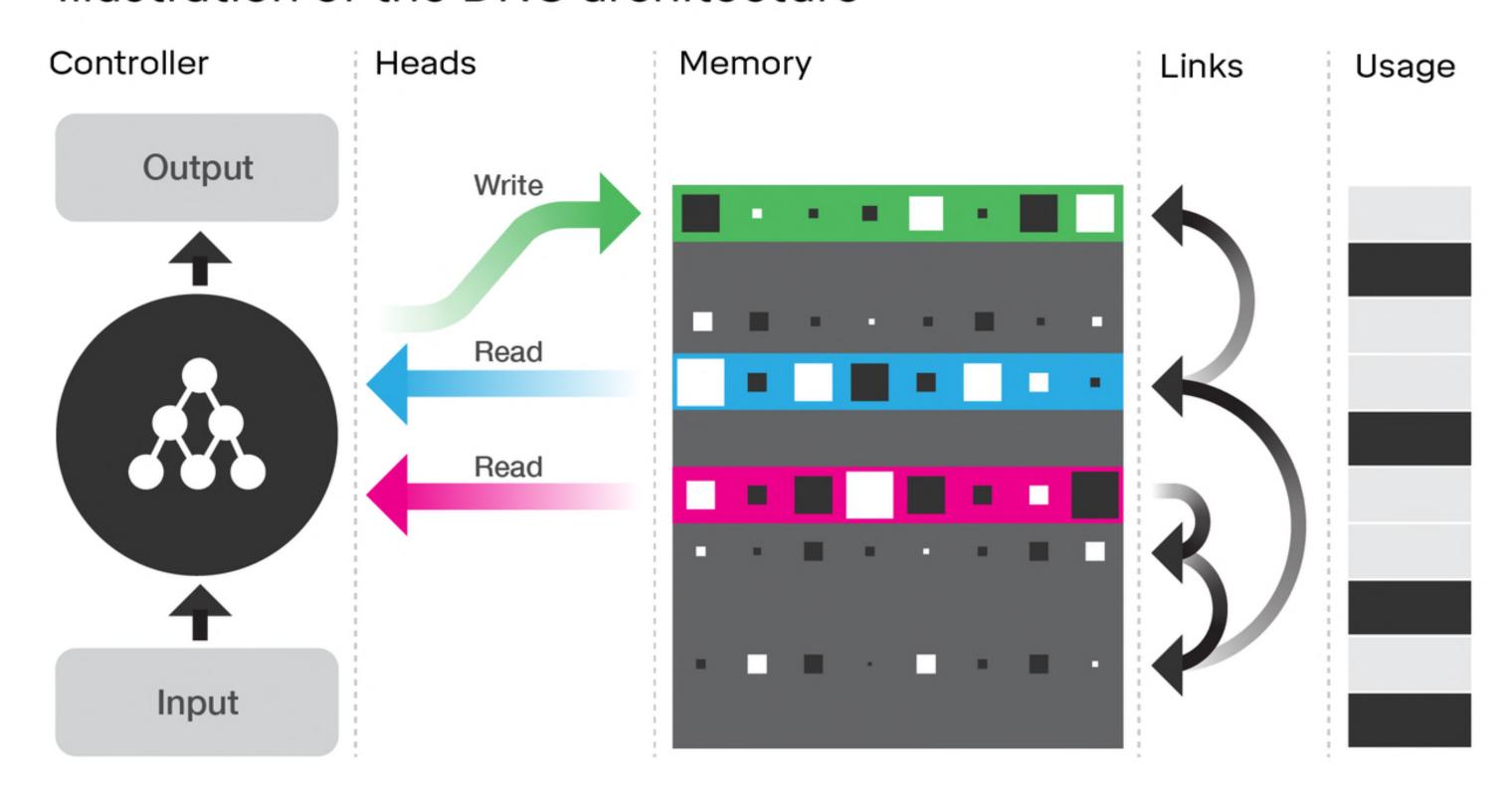


Source: Overcoming catastrophic forgetting in neural networks



## Memory-Augmented Neural Networks

#### Illustration of the DNC architecture



Source: Hybrid computing using a neural network with dynamic external memory





## Work Fun Play Hard