THE UNIVERSITY



OF HONG KONG

Institute of Mathematical Research Department of Mathematics

Numerical Analysis Seminar

Cooperative multi-agent reinforcement learning: a mean-field control perspective

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Abstract

Multi-agent systems are rapidly finding applications in a variety of domains, including robotics, distributed control, telecommunications, and economics. Multi-agent reinforcement learning (MARL) addresses the sequential learning and decision-making problem in a multi-agent system. Despite its popularity and empirical success, MARL suffers from the curse of many agent: the sample complexity scales exponentially with respect to the number of agents, N.

In this talk, we will first introduce a mean-field control (MFC) approach to approximate cooperative MARL, with approximation error $\mathcal{O}(\frac{1}{\sqrt{N}})$. By establishing an appropriate form of the dynamic programming principle for both the value function and the Q function, we further propose a model-free kernel-based Q-learning algorithm to solve the MFC problem. The convergence rate and the sample complexity of the proposed algorithm are independent of the number of agents N, which resolves the curse of many agent. Empirical studies on a network traffic congestion problem demonstrate that the proposed algorithm outperforms other existing MARL algorithms when N is large.

Date: April 27, 2022 (Wednesday) Time: 2:00 – 3:00pm (Hong Kong Time) Venue: ZOOM: <u>https://hku.zoom.us/j/</u> Meeting ID: 913 6532 3891 Password: 310656

All are welcome