University of Camerino

School of Science and Technology

Master Degree in Computer Science

Clustered Federated Deep Reinforcement Learning with Selective Aggregation

A Framework for Chess Playstyle Preservation

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Abstract

This thesis explores the application of federated learning to reinforcement learning in the domain of chess. We investigate how multiple distributed agents can collaboratively learn chess strategies while maintaining data privacy and reducing centralized computational requirements.

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Additional Material