Title: Challenges and Opportunities in Deep Reinforcement Learning With Graph Neural Networks: A Comprehensive Review of Algorithms and Applications

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Problem and motivation

The paper discussed Deep Reinforcement Learning (DRL) and Graph Neural Networks (GNNs) which individually have shown success in complex environments. However, they can be more useful when combined, but there hasn't been much research on that. With the focus being on making efficient decision-making in uncertain environments, the lack of a unified framework prevents agents from making decisions based on complex graph-structured data like sensor networks.

Methods and results

The paper categorizes DRL and GNN frameworks. In the symbiotic architecture, DRL helps GNN search for optimal structures while GNN helps DRL understand state relationships. This includes neural architecture search and adversarial training by adding fake nodes using Q-learning. It also uses a real-world example like COVID-19 for contact tracing with evolving graphs to explain combinatorial optimization and dynamic node intervention.

Relevance to your own research

The paper focuses on using adaptive learning and GNNs to detect navigation faults or adversarial attacks in robotic environments. It especially discusses adversarial graph attacks like injecting fake nodes, which applies to spoofing and sensor tampering. It highlights the importance of dynamic heterogeneous graphs and transferability under uncertainty, which align with digital twin modeling.