

Project Proposal: “*Could multi-agent environments foster the emergence of empathy-like behaviors if agents are trained to care about each other’s rewards?*”

## Context Overview

In multi-agent settings, artificial systems begin to mirror aspects of human interaction.

This project explores whether introducing empathy-like objectives can promote cooperation and higher collective welfare among learning agents.

## Research Focus (Problem to be Addressed)

In multi-agent reinforcement learning, agents are typically designed to maximize only their own rewards.

This raises the question: can introducing empathy-like reward sharing encourage cooperative behaviors and improve overall system welfare?

## Proposed Solution

Develop a multi-agent reinforcement learning simulation where agents are trained under two regimes:

1. Selfish agents: optimize only personal rewards.
2. Empathic agents: partially value others’ rewards.
  - Compare agents’ performance and aggregate welfare outcomes in cooperative board-game-like settings (e.g. prisoner’s dilemma, stag hunt, resource sharing).

## Math / ML Topics Involved

- Reinforcement Learning: define reward functions and then apply Q-learning (a reinforcement learning algorithm which means it teaches an agent how to act in an environment by trial and error, aiming to maximize long-term rewards). + policy gradient (optional ~ more advanced)
- Game Theory Strategy:
  - Start with payoff matrices → build environment
  - Continue with Nash equilibrium → explain how standard self-interest leads to a stable but inefficient outcome
  - Discussion on social welfare → show that empathy increases overall outcomes beyond the Nash prediction
- Simulation: Multi-agent training dynamics & exploration vs exploitation.
  - Multi-agent training dynamics: studying how multiple agents learn and adapt simultaneously.
    - Simulate multiple agents (say, two to four).
    - Observe how their strategies evolve during training:
      - Do they converge to cooperation or competition?
      - How does empathy (reward-sharing) change convergence speed or stability?
    - Visualize this with plots
  - Exploration vs exploitation

- Possibly  $\epsilon$ -greedy policy
  - Each agent would use an  $\epsilon$ -greedy policy to choose moves.
  - Early on → high  $\epsilon$  (agents try random cooperative/competitive actions).
  - Later → lower  $\epsilon$  (agents stick to what yields higher combined welfare).

### **Concrete Output**

Report for publication accompanied by a GitHub repository