Seasons of Code 2025: RL in Self-Driving Cars Assignment - 1

Objective

This assignment evaluates your understanding of fundamental reinforcement learning algorithms. You will implement classic tabular methods and modern actor-critic algorithms from scratch, apply them to OpenAI Gym environments, and analyze their behavior through reward plots and rollout videos.

Environments

- FrozenLake-v1 (deterministic) for tabular methods (discrete state/action space).
- Pendulum-v1 for continuous control algorithms (PPO, DDPG, SAC).

Tasks

Task 1. Theory: Write a short explanation of the mathematical foundations of all 5 algorithms:

- Q-Learning
- Monte Carlo Control
- PPO (Proximal Policy Optimization)
- DDPG (Deep Deterministic Policy Gradient)
- SAC (Soft Actor Critic)

Task 2. FrozenLake-v1:

- Implement **Tabular Q-learning** with epsilon-greedy exploration.
- Implement Monte Carlo Control (First-Visit).

Task 3. Pendulum-v1:

- Choose any 2 out of 3 from the following:
 - (a) Implement PPO from scratch.
 - (b) Implement DDPG from scratch.
 - (c) Implement SAC from scratch.
- Task 4. Log and plot the total reward per episode for all implementations.
- Task 5. Record and save a video of each trained agent performing in its environment.

Requirements

Install the following Python packages:

pip install gym matplotlib numpy imageio

Submission

Submit a ZIP folder named ${\tt Name_RollNo.zip}$ containing the following:

- A PDF generated from your **Word or L^AT_EX document** for **Task 1** (Mathematical explanations of all algorithms).
- Python scripts for all implemented algorithms:
 - $q_{-}learning.py$
 - monte_carlo.py
 - ppo.py, ddpg.py, or sac.py (any two)
- All reward **plots**
- $\bullet \ \ {\rm All \ rollout \ videos}$