DSE 314: Reinforcement Learning

Assignment-1

Question 1: Multi-armed bandit problem

(25 marks)

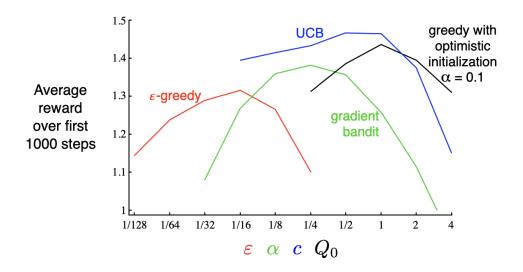
Suppose you have a 5-armed bandit testbed, whose true action values are fixed (stationary distributions). The true reward values of the bandits are $q^*(a) = [2.5, -3.5, 1.0, 5.0, -2.5]$; and the deviation around the mean is given by $\sigma[q^*(a)] = [0.33, 1.0, 0.66, 1.98, 1.65]$. We are assuming the reward to follow a Gaussian distribution characterized by their given mean and standard deviation.

The (general) multi-armed bandit environment can be found at: https://github.com/manavmishra96/reinforcement-learning

Implement the following methods in the 5-arm bandit setting:

- 1. ε-greedy algorithm
- 2. UCB algorithm
- 3. Greedy with the optimistic initial value method
- 4. Gradient bandit algorithm

and plot their respective average reward time evolution graphs (Avg reward vs timestep). Finally, recreate the given plot by changing the respective algorithm parameters:



Question 2: (30 marks)

An undergraduate (not-so-ideal) student at IISER Bhopal has the task of attending classes and eating food during his tenure in college. The student has access to three locations on the campus: hostel (reward: -1), academic building (reward: +3), and canteen (reward: +1), and can either eat food or attend class at a given time.

When the student is at the hostel, (s)he attends classes either by going to the academic building with 50% probability or stays in the hostel with the 50% probability. When hungry, he/she goes to the canteen (from the hostel) with 100% probability. From the academic building, the student attends class where he stays in the academic building with 70% probability or goes to the canteen with 30% probability. When hungry at the academic building, he/she goes to the canteen with 80% probability or stays at the same place with 20% probability. At the canteen, the student has a 60% chance of attending classes by going to the academic building, a 30% chance of attending class by going to the hostel, and a 10% chance of attending from the canteen itself. If hungry, the student stays at the canteen with 100% probability.

Using this information, design a finite MDP by writing down the possible combinations of states, actions, transition probability from one state to another for a given action, and rewards in a tabular form. Also, draw a diagram of the MDP from the information mentioning the probability and rewards.

(Refer to example 3.3 of Chapter 3 in Sutton and Barto: Reinforcement Learning) (5 marks)

- Based on the designed MDP perform value iteration and show the optimal value for each state and the policy obtained. (10 marks)
- Based on the designed MDP perform policy iteration and show the optimal policy. (10 marks)
- Discuss the results obtained from policy iteration and value iteration (5 marks)