Sample RL Project Proposal

Dimitris Diochnos Anna Partner

[This proposal is very detailed and ambitious and is for a group of two people working together. Clearly, if you are working alone your goals will be half as much.]

[First I tell the reader what the heart of my project will be. More detail is given in later paragraphs.] For our ML semester project component focusing on RL, we propose to create a highly competitive machine learning agent that plays the game of hearts. As expert hearts players, we hypothesize that we can create a player that is competitive with us.

[Talk about the problem domain in more detail.] Hearts is a multi-player card game where the object of the game is to win as few points as possible. As with bridge, hearts is a trick-based game where the highest card in each trick takes the trick. The winner of the trick gets all of the cards played in that round and any points played are assigned to that player. Hearts are worth one point each and the queen of spades is worth 13 points. The jack of diamonds is optionally worth -10 points. Hearts has a special rule where a player can take all 26 points in one game. This is called "shooting the moon" and it penalizes the other players instead of the player who took all the points. In this case, the player who took all 26 points gets 0 points and the other players all get 26 points. I will first experiment with a player without the jack of diamonds rule and perhaps add the jack of diamonds rule as my player improves.

[After discussing the project domain, you should discuss your intended reinforcement learning approach. Give as much detail as you know (I realize you are still learning RL).] Amy will train her hearts player using TD learning. Anna will also use RL but she intends to use Q-learning. Both of us plan to explore rollouts as a method to improve player performance. We will reward our players by giving them the negative number of points won in each hand. Thus, each point taken is a punishment and the player should seek to minimize punishment. This will be tricky because shooting the moon should not be viewed as a punishment. To solve this, we will not train until the end of the game but will instead save the entire game in memory. Once the final point distribution is known, we will train using that game.

Since we will have two players, we intend to train them against each other at first. We will also experiment against

heuristic players available in the simulator. As each player improves, we will enter them in the online competition and will save the training experience from those games. In addition, we will play games against the player ourselves and save that experience. Once the two players are working well together, we will focus on the combined player and expect that will be the best overall player.

Because hearts is a partially observable domain, the state representation will be tricky. We both propose to create feature vectors that summarize the cards in the player's hand as well as the important information about the past history (critical cards being played, such as the queen of spades, whether points have spread among the players yet, etc).

[Next discuss how you will evaluate your project, how you will know it is working well (or poorly), and how you will stop training.] We will evaluate our players in several ways. First, we will examine the number of matches won over time, as the player trains. A match generally goes to 250 or 500 points. Second, we will examine the average reward that the player is receiving as it trains. Because our players will be stochastic, we will measure the average reward over time. However, it is too computationally intensive to enter multiple agents in the online competition. We will wait to enter the agents into the online competition until we feel that they are competitive. Once an agent has entered, we will measure its progress by the nightly ladder performance. This progress will not be averaged. We hope that our player will move to the top 10% of all players and we will try to enter it into the competition by November so that it has time to move to the top of the ladder.

[Other details such as intended use of shared code, etc.] In order to compete in the online competition, we will make use of the generic java hearts player code available at *URL*. We will place all of our code in separate files (except the call to the original code) and note any changes that we make to the downloaded code.

[Your written proposal must be no longer than one and a half column if you use the style that we have for typesetting. If you use a single-column style for the writeup, then the proposal must be no longer than one and a half page.]