CPS 170: Introduction to AI Instructor: Ron Parr

Homework 5 Due: Thursday April 15, 2010

## 1 Decision theory (10 points)

Do problem 16.17 (16.11 in the second edition). You may skip part (a).

## 2 Decision theory (10 points)

Recall the definition of value of information.

- (a) Prove that the value of information is nonnegative and order independent.
- (b) Explain why it is that some people would prefer not to get some information for example, not wanting to know the sex of their baby when an ultrasound is done.
- (c) A function f on sets is *submodular* if, for any element x and any sets A and B such that  $A \subseteq B$ , adding x to A gives a greater increase in f than adding x to B:

$$A \subseteq B \Rightarrow (f(A \cup \{x\}) - f(A)) \ge (f(B \cup \{x\}) - f(B)).$$

Submodularity captures the intuitive notion of diminishing returns. Is the value of information, viewed as a function f on sets of possible observations, submodular? Prove this or find a counterexample.

# 3 MDPs (10 points)

Suppose there are two coins. Coin A has probability 0.25 of heads and coin B has probability 0.1 of heads. You are given a chance to play a game with the following rules: At the start of the game, you pick a coin. The selected coin is then flipped until it yields heads. The game then stops. When coin A comes up heads, you get a payoff of 100. When coin B comes up heads you get a payoff of 500. There can be a significant delay between flips, so we'll assume that there is a discount factor of  $\gamma$  applied per time step to future payoffs.

- (a) Formulate this problem as an MDP. Indicate the states, actions, and rewards for this MDP. Hints: In some states for your MDP there will be no action choices. You can also view the end of the game as a state with 0 reward and a deterministic transition to itself, i.e., a state which must have value 0.
- (b) State the optimal policy for this MDP and justify your answer mathematically. Note that the policy may depend upon the value of  $\gamma$ .

## 4 MDPs (10 points)

Do problem 17.10 (17.4 in the second edition).

# 5 Game theory (10 points)

Do problem 17.17 (17.10 in the second edition).

## 6 Game theory (10 points)

Teams in the National Hockey League historically received 2 points for winning a game and 0 for losing. If the game is tied, an overtime period is played; if nobody wins in overtime, the game is a tie and each team gets 1 point. But league officials felt that teams were playing too conservatively in overtime (to avoid a loss), and it would be more exciting if overtime produced a winner. So in 1999 the officials experimented in mechanism design: the rules were changed, giving a team that loses in overtime 1 point, not 0. It is still 2 points for a win and 1 for a tie.

- (a) Was hockey a zero-sum game before the rule change? After?
- (b) Suppose that at a certain time t in a game, the home team has probability p of winning in regulation time, probability 0.78 p of losing, and probability 0.22 of going into overtime, where they have probability q of winning, .9 q of losing, and .1 of tying. Give equations for the expected value for the home and visiting teams.
- (c) Imagine that it were legal and ethical for the two teams to enter into a pact where they agree that they will skate to a tie in regulation time, and then both try in earnest to win in overtime. Under what conditions, in terms of p and q, would it be rational for both teams to agree to this pact?
- (d) Longley and Sankaran (2005) report that since the rules change, the percentage of games with a winner in overtime went up 18.2%, as desired, but the percentage of overtime games also went up 3.6%. What does that suggest about possible collusion or conservative play after the rule change?