Final Exam

120 minutes, open book. For each question, explain your answer clearly and concisely.

Question 1 (18 points): Decision Tree and Perceptrons:

As an alternative to decision trees for classification, an approach called perceptron trees was developed. It combined together features of a decision tree with a perceptron.

The perceptron tree was similar to a decision tree except that the leaf nodes were perceptrons. It worked liked a decision tree where the splitting on an attribute occurred unit a perceptron was reached. The rest of the attributed that were not used in the higher-level decision nodes were used as an input to the perceptron. An example decision tree and the corresponding perceptron are shown below:





In the diagram above, A and B are decision nodes. The leaf nodes are perceptrons. The learned weights are shown in the boxes. So, the weight for attribute C being F is 1 when A is F and B is T.

1a (12 points) Explain why the perceptron tree is better for classification than either a decision tree or a perceptron by itself.

1b (6 points) In building the perceptron tree, the decision about whether to make a node a perceptron node or a decision node was based on whether the set of attributes (and the corresponding training instances) associated with this decision could be linearly separated. If they could not, then a decision node was used based on a specific attribute from the set, and the tree was further expanded. Explain why this is a reasonable strategy.

Question 2 (18 points) Decision Networks:

The following is a modification of one of the examples presented in class and in Homework 4a.

Suppose an oil company is hoping to buy one of 10 blocks of ocean drilling rights.

- \Rightarrow Exactly one block contains oil worth 1000 dollars.
- \Rightarrow The price of each block is 100 dollars.
- \Rightarrow TWO seismologists offer the company a survey.
- ⇒ Seismologist A can indicate whether block #3 contains oil. However A is only 70% accurate for the case there is oil and the case there is no oil.
- ⇒ Seismologist B can ALSO indicate whether block #3 contains oil. However B is only 85% accurate for the case there is oil and the case there is no oil.

2a (12 points): What is the value of information for combining the response from both Seismologists?

2b (6 points): Draw a decision network diagram for this scenario.

Question 3 (10 points): Bayesian Inference

An admissions committee for a college is trying to determine the probability that an admitted candidate is really qualified; the relevant probabilities are given in the Bayesian Network shown here.



A = Applicant is qualified B = Applicant has a high grade point average C = Applicant has excellent recommendations D = Applicant has a parent who is an alumni of the college E = Applicant is admitted.

Represent p(A|D,E) in-terms of the conditional probabilities given in the Bayesian Network above. Make sure even the "constant" can be represented using the Bayesian Network.

Question 4 (18 points) Reinforcement Learning

Consider the deterministic world below. Arrows show allowable moves. There is a reward of 12 units for entering the top-right most state. There is no reward for being in any other state. Given the Q(s,a) values in the figure below,

4a) (12 points) show the changes in the Q(s,a) estimates for the first two steps in the path shown by the dotted line (the agent starts in the lower left cell) when discount factor = 0.5.

4b) (6 points): Explain why the new Q value computed in the third step is not affected by the new Q value computed in the second step.



Question 5 (36 points) Short Questions:

5a (7 points): In reinforcement learning, there is a learning rate factor that can be between 0 and 1. How would you expect the performance of the learning algorithm to change with different learning rates?

5b (7 points): Given an intuitive answer about why hidden nodes in a neural network increasing the set of functions that can be learned; what is a consequence of introducing a large number of hidden nodes.

5c (7 points): Explain why stochastic simulation is used in computing a query for non-poly tree Bayesian Networks that are large.

5d (7 points): What is the purpose of doing variable elimination in computing a query for a Bayesian Networks?

5f (8 points): What causes over-fitting in a decision classification tree? Does over-fitting increase with number of training examples, explain your answer?