



Artificial Intelligence

– Sheet 4: Learning –

Date: 15. May 2012

Exercise 1 (8 Points, Version-space-learning)

Apply *version-space-learning* to the following examples where it is only allowed to use **conjunctions of attributes** (i.e. no disjunctions, no negations) as hypotheses:

Number	Director	Genre	Language	Duration	Reaction
1	Woody Allen	Comedy	English	Short	yes
2	J. Cameron	Action	German	Long	no
3	S. Spielberg	Comedy	English	Long	no
4	Woody Allen	Drama	English	Long	yes
5	Woody Allen	Drama	German	Short	no

Points:

_____ of 22

Group / Tutor:

Proceed as follows:

1. Choose the examples in the same order as given in the table.
2. *Each* time an example is added state the **G-set** and the **S-set**.
3. In *each* cycle of the algorithm explain what happened and why.
4. As hypotheses we do only allow conjunctions (no disjunctions!) of attributes.

Name(s) & Matr. no.:

Exercise 2 (3 Points)

We never test the same attribute twice along one path in a decision tree. Why not?

Exercise 3 (3 Points)

Suppose we generate a training set from a decision tree and then apply decision-tree learning to that training set. Is it the case that the learning algorithm will eventually return the correct tree **as the training set size goes infinity**? Why or why not?

Exercise 4 (4 Points)

In the recursive construction of decision trees, it sometimes happens that a mixed set of positive and negative examples remain at a leaf node, even after all attributes have been used. Suppose that we have p positive examples and n negative examples.

- (a) Show that the solution used by Decision-Tree-Learning, which picks the majority classification, **minimizes the absolute error** over the set of examples at the leaf.
- (b) Show that the class probability $\frac{p}{p+n}$ **minimizes the sum of squared errors**. (The sum of squared errors is given by $E(x) = p(1 - x)^2 + nx^2$).

To be submitted:

05. June 2012
before class



Exercise 5 (4 Points)

This exercise concerns the expressiveness of decision lists.

- (a) Show that decision lists can represent any Boolean function, if the size of the tests is not limited.
- (b) Show that if the tests can obtain at most k literals each, then decision lists can represent any function that can be presented by a decision tree of depth k .