# Norges teknisk-naturvitenskapelige universitet Institutt for datateknikk og informasjonsvitenskap

Examination in TDT4171 Artificial Intelligence Methods

Date May 29th

Antall timer 4
Antall studiepoeng 7,5
Antall sider: 3
Tillatte hjelpemidler D

Sensurdato June 19th

All 5 questions, including sub-questions, shall be answered. Each question is weighted as shown.

Contact during the examination: Assoc. Prof. Helge Langseth, IDI, tlf. (735)96488

## **Question 1** – Bayesian Networks (25%)

- a) Describe the syntax and semantics of a Bayesian Network.
- b) Model the following problem using a Bayesian network (only the *structure* is required, the quantitative part should not be given). The model should be as simple and easy to understand as possible:

There is a higher fraction of tuberculosis patients among those who have recently visited Asia than there is amongst those who have not. There is a larger fraction of bronchitis among smokers than there is among non-smokers. Both bronchitis as well as tuberculosis can lead to being short-winded (problems breathing). Both tuberculosis and lung cancer can be detected from X-ray scanning, but bronchitis cannot. The X-ray cannot be used to distinguish between lung cancer and tuberculosis. There is a higher fraction of lung cancer patients among smokers than among non-smokers.

- c) A medical doctor gets your Bayesian network (including a quantitative part) and uses it on a patient who is short-winded and has just visited Asia. The medic wants to use the Bayesian network for decision support. To what extent can the model help the decision-making?
- d) Would you say that a Bayesian network is a *natural* modeling tool for this problem? What are the characteristics of a problem domain where Bayesian networks can be used successfully? Can you give examples of situations where Bayesian networks are *not* suitable?

## **Question 2** – Instance-based and Case-based reasoning (15%)

- a) What are the characteristics of Instance-based learning, as opposed to other types of machine learning methods?
- b) How are problems solved in a *k*-nearest-neighbor method?
- c) Describe the four main steps in the CBR-cycle. Explain briefly what happens in each step.

#### **Question 3** - Neural Networks (25%)

- a) Research on Artificial Neural Networks is partly motivated by knowledge about how the brain works. Explain this relation.
- b) Gradient descent is a powerful, general-purpose algorithm, which amongst other things can be used for learning the weights  $\mathbf{w}$  of a neural network. Give a reason why it is useful to update the weight  $w_i$  by using the formula  $w_i \leftarrow w_i \eta \cdot \frac{\partial E(\vec{w})}{\partial w_i}$ , where  $\eta$  is a positive constant. Explain the symbols in the formula.
- c) What are the strengths and weaknesses of Gradient Descent?
- d) Create a multilayer artificial neural network, and find weights to ensure that the network represents the function  $\mathbf{x_1}$  XOR  $\mathbf{x_2}$ , where  $x_1$  and  $x_2$  are binary inputs; that is, the output is true if exactly one of  $x_1$  or  $x_2$  is true, and false otherwise. You should make the network as simple as possible (i.e., containing as few nodes as possible).

Can the function  $x_1$  XOR  $x_2$  be represented exactly by a perceptron (a neural network *without* a hidden layer)? Explain your answer.

Hint: In question (d) you can let the transfer function g() in the nodes be the step-function.

## **Question 4** – **Probabilistic models over time (20%)**

- a) Explain the *Markov Assumption* using your own words. Give an example where the Markov assumption is reasonable, and one where it is not.
- b) What is *filtering* and *smoothing*? Explain the difference between the two. (You may want to use a graph to explain, formulas are not required here.)
- c) What are *Kalman Filters*? What assumptions are underlying a Kalman Filter model?

## **Question 5** – Mixed questions (15%)

- a) What is the *Strong AI hypothesis*? What is *The Chinese Room*, and how is The Chinese Room used to argue against the Strong AI hypothesis?
- b) What are *unigram*, *bigram* and *trigram* models for strings of words? Many probabilistic language-processing systems use *bigram* models (and not unigram or trigram). Give at least one argument for bigram models over unigram models and at least one argument for bigram models over trigram models.
- c) What is the *maximum expected utility principle*, and why is this principle important when creating rational agents?