



Semester 1 2017

Artificial Intelligence, Assignment 2 COMPSCI 3007, 7059

Instructions and submission guidelines:

- Answer all questions in a report.
- Make sure that your writing is legible and clear, and the mathematical symbols are consistent.
- You must sign an assessment declaration coversheet to submit with your assignment. The assessment declaration coversheet is included in the zip file.
- Submit via myuni.

Questions	Due day	Marks
Answer all 2 questions	See myuni	100 marks
		100 Total

Probabilities

Question 1

- (a) John enjoys a repeated random game of taking a ball from one of three containers. He always randomly picks a container (uniformly) first. Then he randomly picks a ball from that container. Assuming the first draw has 1 blue ball and 1 red ball, the second drawer has 1 blue ball and 2 red balls, and the third drawer has 2 red balls. Let $D \in \{1, 2, 3\}$ be the random variable that represents which container that John would pick, and let $C \in \{b, r\}$ (b for blue, r for red) be the random variable representing the colour of the ball that John would pick.

Table 1: $P(D)$ (Left) and $P(C|D)$ (Right) tables

1	2	3		b	r
			$D = 1$		
			$D = 2$		
			$D = 3$		

- i. Please write down $P(D)$ in the same table format in Table 1. [3 marks]
 - ii. Please write down $P(C|D)$ in the same table format in Table 1. [6 marks]
 - iii. What is $P(C = r, D = 2)$? [2 marks]
- (b) Independence $X \perp\!\!\!\perp Y$ means $P(X, Y) = P(X)P(Y)$, and Conditional Independence $X \perp\!\!\!\perp Y|Z$ means $P(X, Y|Z) = P(X|Z)P(Y|Z)$. Prove the following properties of independence:
- i. Symmetry: $X \perp\!\!\!\perp Y|Z \Rightarrow Y \perp\!\!\!\perp X|Z$, [10 marks]
 - ii. Decomposition: $X \perp\!\!\!\perp Y, W|Z \Rightarrow X \perp\!\!\!\perp Y|Z$ and $X \perp\!\!\!\perp W|Z$. [10 marks]
 - iii. Weak union: $X \perp\!\!\!\perp Y, W|Z \Rightarrow X \perp\!\!\!\perp Y|Z, W$. [10 marks]
- [Total for Question 1: 41 marks]**

Inference

Question 2

- (a) A Bayesian network with 3 boolean variables A, B, C has a graph in Figure 1 with the local (conditional) distributions provided in the Table 2.

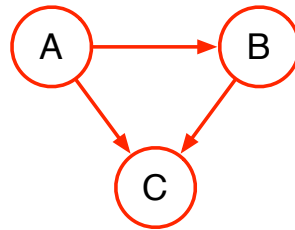


Figure 1: Bayesian Network

Table 2: Local (conditional) distributions $P(A), P(B|A), P(C|A, B)$

a	$\neg a$
0.4	0.6

	b	$\neg b$
a	0.6	0.4
$\neg a$	0.3	0.7

	c	$\neg c$
a, b	0.8	0.2
$a, \neg b$	0.4	0.6
$\neg a, b$	0.3	0.7
$\neg a, \neg b$	0.1	0.9

- What is $P(A = a, B = b, C = \neg c)$? Please write down the derivation and intermediate result instead of the final number. [6 marks]
- What is $P(B = b, C = \neg c)$? Please write down the derivation and intermediate result instead of the final number. [6 marks]
- What is $P(A = a|B = b, C = \neg c)$? Please write down the derivation and intermediate result instead of the final number. [6 marks]
- If the edge from A to B is deleted, will the local distribution tables be changed? If not, why? If yes, which one will be changed and becomes what? [6 marks]
- If the edge from A to B is deleted, is A independent to B ? Prove it. [6 marks]
- Which one of the following two inference methods can also be used to compute $P(C)$: max-product or sum-product? [2 marks]

Please go on to the next page...

- (b) Given a Bayesian Network in Figure 2, please answer the following questions.

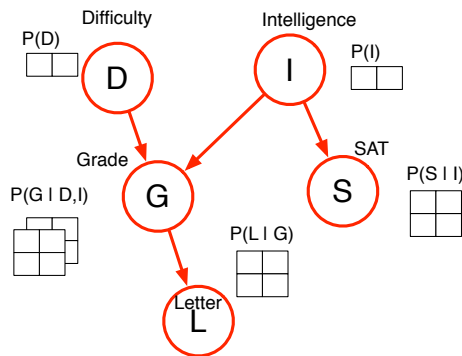


Figure 2: a Bayesian Network modelling student performance

- i. Write down the factorisation of the joint distribution. [3 marks]
 - ii. Write down variable elimination for marginal inference to compute $P(G)$. [6 marks]
 - iii. Write down variable elimination for MAP inference. [6 marks]
- (c) You are given a Markov Random Field represented by Figure 3. Please answer the following questions.

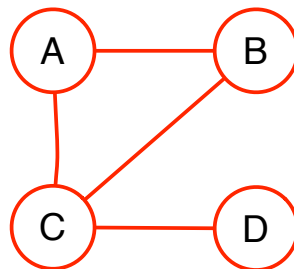


Figure 3: Markov Random Field

- i. Is B independent to D ? [3 marks]
- ii. Is B independent to D conditioned on C ? [3 marks]
- iii. What messages are needed to compute message $m_{C \rightarrow B}(B)$ (i.e. the message from C to B)? [3 marks]
- iv. What messages are needed to compute message $m_{C \rightarrow D}(D)$ (i.e. the message from C to D)? [3 marks]

[Total for Question 2: 59 marks]

End of Assignment