

CS 480 Fall 2022 Written Assignment #04

Due: **Wednesday, November 30, 11:00 PM CST**

Points: **45**

Instructions:

1. Use this document template to report your answers. Name the complete document as follows:

LastName_FirstName_CS480_Written04.doc

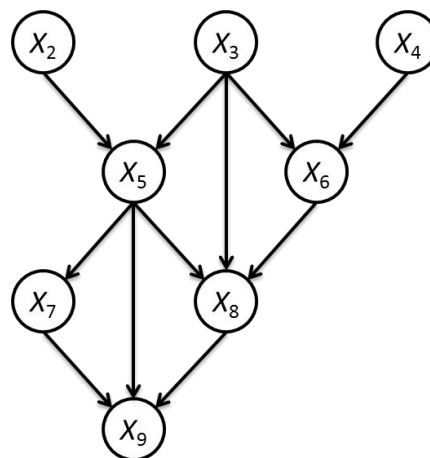
2. Submit the final document to Blackboard Assignments section before the due date. No late submissions will be accepted.

Objectives:

1. (10 points) Demonstrate your understanding of Bayes Networks.
2. (35 points) Demonstrate your understanding of Decision Networks.

Problem 1 [10 pts]:

We are given the following Bayesian network over X_2, X_3, \dots, X_9 . Note that there is no X_1 .



What is the Bayesian network factorization of the joint probability $\mathbf{P}(X_2, X_3, \dots, X_9)$?

Your solution:

The prior probability is for X_2, X_3, X_4

For X_2 , the prior probability is $P(X_2)$

For X_3 , the prior probability is $P(X_3)$

For X_4 , the prior probability is $P(X_4)$

The posterior probability is for X_5, X_6, X_7, X_8, X_9

For X_5 , the posterior probability is $P(X_5|X_2, X_3)$, X_5 is posterior probability and it depends on X_3 and X_2 .

For X_6 , the posterior probability is $P(X_6|X_3, X_4)$, X_6 is posterior probability and it depends on X_3 and X_4 .

For X_7 , the posterior probability is $P(X_7|X_5)$, X_7 is posterior probability and it depends on X_5 .

For X_8 , the posterior probability is $P(X_8|X_5, X_6, X_3)$, X_8 is posterior probability and it depends on X_5, X_6 and X_3 .

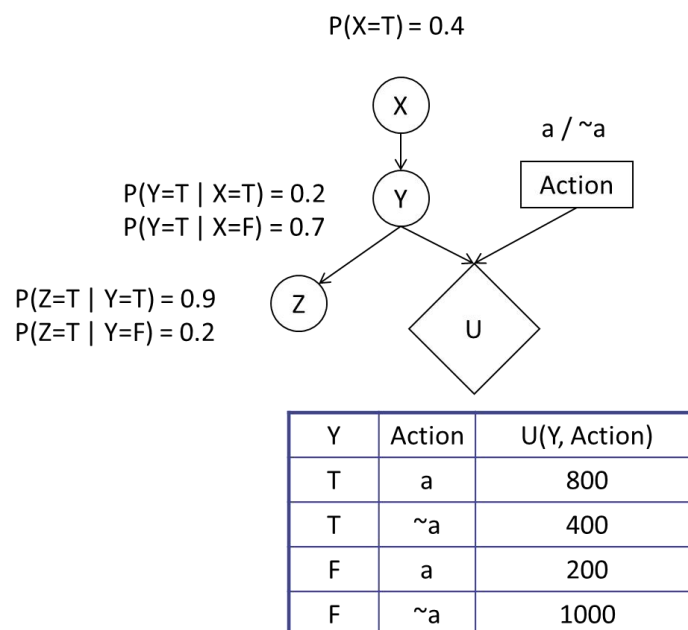
For X_9 , the posterior probability is $P(X_9|X_7, X_5, X_8)$, X_9 is posterior probability and it depends on X_7, X_5 and X_8 .

By chain rule,

$$P(X_2) * P(X_3) * P(X_4) * P(X_5|X_2, X_3) * P(X_6|X_3, X_4) * P(X_7|X_5) * P(X_8|X_5, X_6, X_3) * P(X_9|X_7, X_5, X_8)$$

Problem 2 [35 pts]:

We are given the following decision network:



a) Which action should be taken? Justify your decision. [7 pts]

Your solution:

To find the probability value of $P(Y = T)$

$$P(Y = T) = [P(Y = T | X = F) * P(X = F)] + [P(Y = T | X = T) * P(X = T)]$$

$$= 0.7 * 0.6 + 0.2 * 0.4$$

$$= 0.50$$

To find the probability value of $P(Y = F)$

$$\begin{aligned} P(Y = F) &= 1 - P(Y=T) \\ &= 1 - 0.50 \\ &= 0.50 \end{aligned}$$

To find the utility value - $EU(A)$

$$\begin{aligned} EU(A) &= P(Y=T) * U(Y=T, A=T) + P(Y=F) * U(Y=F, A=T) \\ &= 0.50 * 800 + 0.50 * 200 \\ &= 500 \end{aligned}$$

To find the utility value - $EU(\neg A)$

$$\begin{aligned} EU(\neg A) &= P(Y=T) * U(Y=T, \neg A=F) + P(Y=F) * U(Y=F, \neg A=F) \\ &= 0.50 * 400 + 0.50 * 1000 \\ &= 700 \end{aligned}$$

Choosing the maximum utility value = $\text{Max}(500, 700) = 700$

So the max value is 700 we have to take $EU(\neg A)$

To find the $EU(A|Z)$

$$EU(A|Z) = P(Y|Z) * U(Y, A)$$

To find the $EU(\neg A|\neg Z)$

$$EU(\neg A|\neg Z) = P(Y|\neg Z) * U(Y, \neg A)$$

To find the $EU(A|\neg Z)$

$$EU(A|\neg Z) = P(Y|\neg Z) * U(Y, A)$$

To find the $EU(\neg A|Z)$

$$EU(\neg A|Z) = P(Y|Z) * U(Y, \neg A)$$

To find the value for $P(Y|Z)$

Find the value for $P(Z = T)$

$$\begin{aligned} P(Z = T) &= P(Z=T | Y = T) * P(Y = T) + P(Z = T | \neg Y = F) * P(Y = F) \\ &= 0.9 * 0.50 + 0.2 * 0.50 \\ &= 0.55 \end{aligned}$$

Find the value for $P(Z = F)$

$$\begin{aligned} P(Z = F) &= 1 - P(Z=T) = 1 - 0.55 \\ &= 0.45 \end{aligned}$$

To find the value for $P(Y|Z)$

$$P(Y, Z) = P(Y|Z)P(Z)$$

$$P(Y|Z) = P(Y, Z) / P(Z)$$

$$\begin{aligned} P(Y=T|Z=T) &= (P(Z = T | Y = T) * P(Y = T)) / P(Z = T) \\ &= 0.9 * 0.50 / 0.55 \\ &= 0.8181 \end{aligned}$$

$$\begin{aligned}
 P(Y = T|Z = F) &= (P(\neg Z = F|Y = T) * P(Y=T)) / P(\neg Z = F) \\
 &= 0.1 * 0.50 / 0.45 \\
 &= 0.1111111
 \end{aligned}$$

$$\begin{aligned}
 P(Y=F|Z=T) &= P(Z=T|\neg Y=F) * P(Y =F) / P(Z=T) \\
 &= 0.2 * 0.5 / 0.55 \\
 &= 0.1818
 \end{aligned}$$

$$P(Y =F|Z=F) = 1 - 0.11111 = 0.8889$$

To find the expected utility EU(A|Z)

To find the value for EU (A=T|Z = T)

$$\begin{aligned}
 EU (A=T|Z = T) &= P(Y=T|Z=T) * U(Y=T, A=T) \\
 &= P(Y=T|Z=T)*U(A=T,Y=T) + P(Y=F|Z=T)*U(A=T,Y=F) \\
 &= 0.8181 * 800 + 0.1818 * 200 \\
 &= 690.84
 \end{aligned}$$

To Find the value for EU (A = F|Z = T)

$$\begin{aligned}
 EU (A = F|Z = T) &= P(Y=T|Z=T) * U(Y=T, \neg A=F) \\
 &= P(Y=T|Z=T)*U(\neg A=F,Y=T) + P(\neg Y=F|Z=T)*U(\neg A=F, \neg Y=F) \\
 &= 0.8181 * 400 + 0.1818 * 1000 \\
 &= 509.04
 \end{aligned}$$

To Find the value for EU(A =T|Z = F)

$$\begin{aligned}
 EU(A =T|Z = F) &= P(Y=T|\neg Z=F) * U(Y=T, A=T) \\
 &= P(Y=T|\neg Z=F)*U(A=T,Y=T) + P(Y=F|\neg Z=F)*U(A=T, Y=F) \\
 &= 0.1111 * 800 + 0.8889 * 200 \\
 &= 266.66
 \end{aligned}$$

To find the value for EU(A= F| Z = F)

$$\begin{aligned}
 EU(A= F| Z = F) &= P(Y=T|\neg Z=F) * U(Y=T, \neg A=F) \\
 &= P(Y=T|\neg Z=F)*U(\neg A=F,Y=T) + P(Y=F|\neg Z=F)*U(\neg A=F, Y=F) \\
 &= 0.1111 * 400 + 0.8889 * 1000 \\
 &= 933.34
 \end{aligned}$$

$$MEU (A=T|Z = T) = 690.84$$

$$MEU(A = F| Z = F) = 933.34$$

b) What is the value of information of Z? Justify your decision. [8 pts]

Your solution:

$$MEU(A) = 700$$

Use the value from the previous subdivision

$$MEU(a1|e1) = MEU(A=T|Z=T) = 690.84$$

$$MEU(a2|e2) = MEU(\neg A=F|\neg Z=F) = 933.34$$

$$VPI(Z=T) = (P(Z=T) * MEU(A=T|Z=T) + P(\neg Z=F) * MEU(\neg A=F|\neg Z=F)) - MEU(A=T)$$

$$= (0.55 * 690.84 + 0.45 * 933.34) - 700$$

$$= 800 - 700$$

$$= 100$$

c) What is the value of information of X? Justify your decision. [10 pts]

Your solution:

To find $P(Y,X)$

$$P(Y,X) = P(Y|X)P(X)$$

$$P(Y|X) = P(Y,X) / P(X)$$

$$P(Y=T|X=T) = 0.2$$

$$P(Y=F|X=T) = 1 - 0.2 = 0.8$$

$$P(Y=T|X=F) = 0.7$$

$$P(Y=F|X=F) = 1 - 0.7 = 0.3$$

$$\begin{aligned} EU(A=T|X=T) &= P(Y=T|X=T) * U(Y=T, A=T) \\ &= P(Y=T|X=T) * U(A=T, Y=T) + P(\neg Y=F|X=T) * U(A=T, \neg Y=F) \\ &= 0.2 * 800 + 0.8 * 200 \\ &= 320 \end{aligned}$$

$$\begin{aligned} EU(\neg A=F|X=T) &= P(Y=T|X=T) * U(Y=T, \neg A=F) \\ &= P(Y=T|X=T) * U(Y=T, \neg A=F) + P(\neg Y=F|X=T) * U(\neg Y=F, \neg A=F) \\ &= 0.2 * 400 + 0.8 * 1000 \\ &= 880 \end{aligned}$$

$$\begin{aligned} EU(A=T|\neg X=F) &= P(Y=T|\neg X=F) * U(Y=T, A=T) \\ &= P(Y=T|\neg X=F) * U(Y=T, A=T) + P(\neg Y=F|\neg X=F) * U(\neg Y=F, A=T) \\ &= 0.7 * 800 + 0.3 * 200 \\ &= 620 \end{aligned}$$

$$\begin{aligned} EU(\neg A=F|\neg X=F) &= P(Y=T|\neg X=F) * U(Y=T, \neg A=F) \\ &= P(Y=T|\neg X=F) * U(Y=T, \neg A=F) + P(\neg Y=F|\neg X=F) * U(\neg Y=F, \neg A=F) \\ &= 0.7 * 400 + 0.3 * 1000 \\ &= 580 \end{aligned}$$

To Find MEU value

$$\text{MEU}(A = F|X = T) = 880$$

$$\text{MEU}(A = T|X = F) = 620$$

Finding the VPI for X

$$\begin{aligned}\text{VPI}(X) &= (P(X) * \text{MEU}(\sim A|X) + P(\sim X) * \text{MEU}(A|\sim X)) - \text{MEU}(A) \\ &= (0.4 * 880 + 0.6 * 620) - 700 \\ &= 24\end{aligned}$$

d) Given $Z = T$, what is the value of information of X? Justify your decision. [10 pts]

Your solution:

Find the $P(Y|X,Z)$

$$P(Y|X,Z) = P(X,Y,Z) / P(X,Z)$$

$$P(X,Z) = P(Z|X)P(X)$$

To Find the $P(Z|X)$

$$\begin{aligned}P(Z|X) &= P(X,Z)/P(X) \\ &= (P(X,Y,Z) + P(X,\sim Y,Z)) / P(X) \\ &= (P(Z|X,Y)P(X,Y) + P(Z|X,\sim Y)P(X,\sim Y)) / P(X) \\ &= (P(Z|Y)P(Y|X)P(X) + P(Z|\sim Y)P(\sim Y|X)P(X)) / P(X)\end{aligned}$$

$$P(Z|X) = P(Z|Y)P(Y|X) + P(Z|\sim Y)P(\sim Y|X)$$

$$\begin{aligned}P(X,Z) &= P(Z|X)P(X) \\ &= (P(Z|Y)P(Y|X) + P(Z|\sim Y)P(\sim Y|X)) * P(X)\end{aligned}$$

$$\begin{aligned}P(Y|X,Z) &= P(Z|Y)P(Y|X)P(X) / (P(Z|Y)P(Y|X) + P(Z|\sim Y)P(\sim Y|X)) * P(X) \\ &= P(Z|Y)P(Y|X) / (P(Z|Y)P(Y|X) + P(Z|\sim Y)P(\sim Y|X)) \\ &= (0.9 * 0.2) / ((0.9 * 0.2) + (0.2 * 0.8)) \\ &= 0.5294\end{aligned}$$

$$\begin{aligned}P(Y|\sim X,Z) &= P(Z|Y)P(Y|\sim X) / (P(Z|Y)P(Y|\sim X) + P(Z|\sim Y)P(\sim Y|\sim X)) \\ &= (0.9 * 0.7) / ((0.9 * 0.7) + (0.2 * 0.3)) \\ &= 0.9130\end{aligned}$$

$$\begin{aligned}P(\sim Y|X,Z) &= P(Z|\sim Y)P(\sim Y|X) / (P(Z|Y)P(Y|X) + P(Z|\sim Y)P(\sim Y|X)) \\ &= (0.2 * 0.8) / ((0.9 * 0.2) + (0.2 * 0.8)) \\ &= 0.4706\end{aligned}$$

$$\begin{aligned}P(\sim Y|\sim X,Z) &= P(Z|\sim Y)P(\sim Y|\sim X) / (P(Z|Y)P(Y|\sim X) + P(Z|\sim Y)P(\sim Y|\sim X)) \\ &= (0.2 * 0.3) / ((0.9 * 0.7) + (0.2 * 0.3)) \\ &= 0.0869\end{aligned}$$

To find the EU(A|X,Z)

$$\begin{aligned} \text{EU}(A|X,Z) &= P(Y|X,Z) * U(Y, A) \\ &= P(Y|X,Z) * U(Y,A) + P(\sim Y|X,Z) * U(\sim Y,A) \\ &= (0.5294 * 800) + (0.4706 * 200) \\ &= 517.64 \end{aligned}$$

To Find the EU($\sim A|X,Z$)

$$\begin{aligned} \text{EU}(\sim A|X,Z) &= P(Y|X,Z) * U(Y, \sim A) \\ &= P(Y|X,Z) * U(Y,\sim A) + P(\sim Y|X,Z) * U(\sim Y,\sim A) \\ &= (0.5294 * 400) + (0.4706 * 1000) \\ &= 682.36 \end{aligned}$$

To find the EU($\sim A|\sim X,Z$)

$$\begin{aligned} \text{EU}(\sim A|\sim X,Z) &= P(Y|\sim X,Z) * U(Y, \sim A) \\ &= P(Y|\sim X,Z) * U(Y, \sim A) + P(\sim Y|\sim X,Z) * U(\sim Y, \sim A) \\ &= (0.9130 * 400) + (0.0869 * 1000) \\ &= 452.1 \end{aligned}$$

To find the EU(A| $\sim X,Z$)

$$\begin{aligned} \text{EU}(A|\sim X,Z) &= P(Y|\sim X,Z) * U(Y, A) \\ &= P(Y|\sim X,Z) * U(Y, A) + P(\sim Y|\sim X,Z) * U(\sim Y, A) \\ &= (0.9130 * 800) + (0.0869 * 200) \\ &= 747.78 \end{aligned}$$

Find MEU value

$$\text{MEU}(A|\sim X,Z) = 747.78$$

$$\text{MEU}(\sim A|X,Z) = 682.36$$

Find VPI for X

$$\text{VPI}(X) = (P(\sim X) * \text{MEU}(A|\sim X,Z) + P(X) * \text{MEU}(A|X,Z)) - \text{MEU}(A)$$

$$\text{VPI}(X) = (0.6 * 747.78 + 0.4 * 682.36) - 700$$

$$= 721.612 - 700$$

$$= 21.612$$