

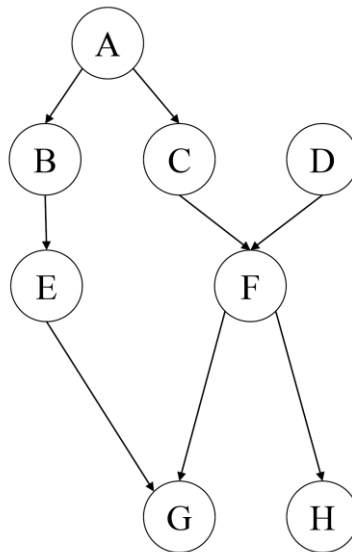
## CS331: Introduction to Artificial Intelligence

### Written Assignment #4

Date handed out: May 17, 2021  
Date due: May 24, 2021 at 10am  
Total: 25 points

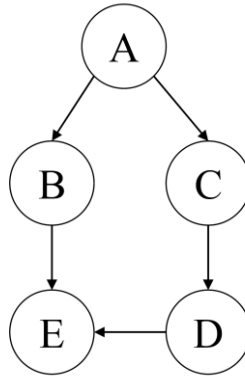
**The written portion of this assignment is to be done individually.** Please hand in pdf on Canvas.

1. Consider the Bayesian network below. Answer false or true for the following questions on d-separation. Show the blocked paths for partial credit.



- a)  $I(A, H \mid \{\})$  [2 points]
- b)  $I(B, F \mid A)$  [2 points]
- c)  $I(B, D \mid \{F, G\})$  [2 points]
- d)  $I(A, D \mid \{\})$  [2 points]
- e)  $I(A, D \mid \{B, H\})$  [2 points]

2. Calculate the following probabilities using the Bayesian network below. The CPTs for each node are shown below the network. You may need to use the various probability formulas such as marginalization, the chain rule, conditional independence, Bayes rule, etc.



Conditional probability tables are given below:

| A     | P(A) |
|-------|------|
| true  | 0.4  |
| false | 0.6  |

| A     | B     | P(B A) |
|-------|-------|--------|
| true  | true  | 0.9    |
| true  | false | 0.1    |
| false | true  | 0.25   |
| false | false | 0.75   |

| C     | D     | P(D C) |
|-------|-------|--------|
| true  | true  | 0.75   |
| true  | false | 0.25   |
| false | true  | 0.9    |
| false | false | 0.1    |

| B     | D     | E     | P(E B,D) |
|-------|-------|-------|----------|
| true  | true  | true  | 0.1      |
| true  | true  | false | 0.9      |
| true  | false | true  | 0.2      |
| true  | false | false | 0.8      |
| false | true  | true  | 0.3      |
| false | true  | false | 0.7      |
| false | false | true  | 0.4      |
| false | false | false | 0.6      |

| A     | C     | P(C A) |
|-------|-------|--------|
| true  | true  | 0.25   |
| true  | false | 0.75   |
| false | true  | 0.8    |
| false | false | 0.2    |

- P( A=true, B=false, C=true, D=false, E=true) [5 points]
- P( B=false, C=true) [5 points]
- P( A=true | B=false, C=true ) [5 points]

1. (a) A C F H      Unblocked

A B E G F H      blocked by G      (case 3)  
G is not in evidence set

∴ No

(b) B E G F      blocked by A      (case 1)

B A C F      blocked by G      (case 3)  
G is not in evidence set

∴ Yes

(c) B A C F D      Unblocked

B E G F D      blocked by F      (case 2)

∴ No

(d) A C F D      blocked by F (F not in evidence set) (case 3)

A B E G F D      blocked by G (G not in evidence set) (case 3)

∴ Yes.

(e) A C F D      Unblocked

A B E G F D      blocked by G (G not in evidence set)  
(case 3)

∴ No.

$$2. (a) P(A=T, B=F, C=T, D=F, E=T)$$

$$= P(A) P(B|A) P(C|A) P(D|C) P(E|B, D)$$

$$= 0.4 \times 0.1 \times 0.25 \times 0.25 \times 0.4$$

$$= \boxed{0.001}$$

$$(b) P(B=F, C=T)$$

$$= \sum_a \sum_d \sum_e P(A=a, B=F, C=T, D=d, E=e)$$

$$= \sum_a \sum_d \sum_e P(A=a) P(B=F|A=a) P(C=T|A=a) P(D=d|C=T) P(E=e|B=F, D=d)$$

$$= \sum_a \left[ P(A=a) P(B=F|A=a) P(C=T|A=a) \sum_d \left[ P(D=d|C=T) \sum_e \left[ P(E=e|B=F, D=d) \right] \right] \right]$$

$$= \sum_a \left[ P(A=a) P(B=F|A=a) P(C=T|A=a) \right] \underbrace{\sum_d \sum_e \left[ P(D=d|C=T) P(E=e|B=F, D=d) \right]}_1$$

$$= (0.4 \times 0.1 \times 0.25) + (0.6 \times 0.75 \times 0.8)$$

$$= 0.01 + 0.36 = \boxed{0.37}$$

$$(c) P(A=\bar{1} | B=F, C=\bar{1})$$

$$= \frac{P(A=\bar{1}, B=F, C=\bar{1})}{P(B=F, C=\bar{1})}$$

$$= \frac{\sum_a \sum_e P(A=\bar{1}, B=F, C=\bar{1}, D=d, E=e)}{\sum_a \sum_a \sum_e P(A=a, B=F, C=\bar{1}, D=d, E=e)}$$

$$\sum_a \sum_e P(A=\bar{1}) P(B=F|A=\bar{1}) P(C=\bar{1}|A=\bar{1}) P(D=d|C=\bar{1}) P(E=e|B=F, D=d)$$

$$= \frac{\sum_a \sum_a \sum_e P(A=a) P(B=F|A=a) P(C=\bar{1}|A=a) P(D=d|C=\bar{1}) P(E=e|B=F, D=d)}{P(A=\bar{1}) P(B=F|A=\bar{1}) P(C=\bar{1}|A=\bar{1}) \sum_a [P(D=d|C=\bar{1}) \sum_e [P(E=e|B=F, D=d)]]}$$

$$= \frac{P(A=\bar{1}) P(B=F|A=\bar{1}) P(C=\bar{1}|A=\bar{1}) \sum_a [P(D=d|C=\bar{1}) \sum_e [P(E=e|B=F, D=d)]]}{\sum_a [P(A=a) P(B=F|A=a) P(C=\bar{1}|A=a) \sum_a [P(D=d|C=\bar{1}) \sum_e [P(E=e|B=F, D=d)]]]}$$

$$= \frac{P(A=\bar{1}) P(B=F|A=\bar{1}) P(C=\bar{1}|A=\bar{1})}{0.037} \leftarrow (\text{this is from Part b})$$

$$= \frac{0.4 \times 0.1 \times 0.25 = 0.01}{0.037} = 0.27027 \dots$$