



Probabilistic Graphical Models

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[Home](#)
[Quizzes](#)
[Theory Problems](#)
[Assignments](#)
[Assignment Questions](#)
[Video Lectures](#)
[Discussion Forums](#)
[Octave Installation](#)
[Lecture Slides](#)
[Course Schedule](#)
[Course Logistics](#)
[Course Information](#)
[Course Staff](#)

Feedback — Structured CPDs + Week 1 Review

You achieved a score of 9.00 out of 9.00

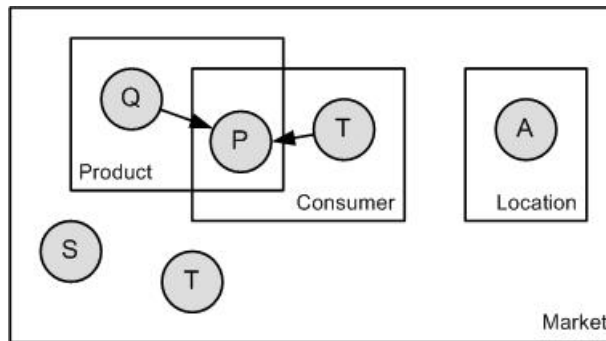
Question 1

I-maps. Suppose $(A \perp B) \in \mathcal{I}(P)$, and G is an I-map of P . Is it necessarily true that $(A \perp B) \in \mathcal{I}(G)$?

Your Answer	Score	Explanation
<input checked="" type="radio"/> No	1.00	Since G is an I-map of P , all independencies in G are also in P . However, this doesn't mean that all independencies in P are also in G . An easy way to remember this is that the complete graph, which has no independencies, is an I-map of all distributions.
Total	1.00	

Question 2

Template Models. Consider the plate model shown below. Assume we are given K Markets, L Products, M Consumers and N Locations. What is the total number of instances of the variable P in a grounded BN?



Your Answer	Score	Explanation
<input checked="" type="radio"/> $K \cdot L \cdot M$	1.00	There will be one grounded instance of P for each combination of Market, Consumer, and Product. There will be $K \cdot L \cdot M$ of these combinations.
Total	1.00	

Question 3

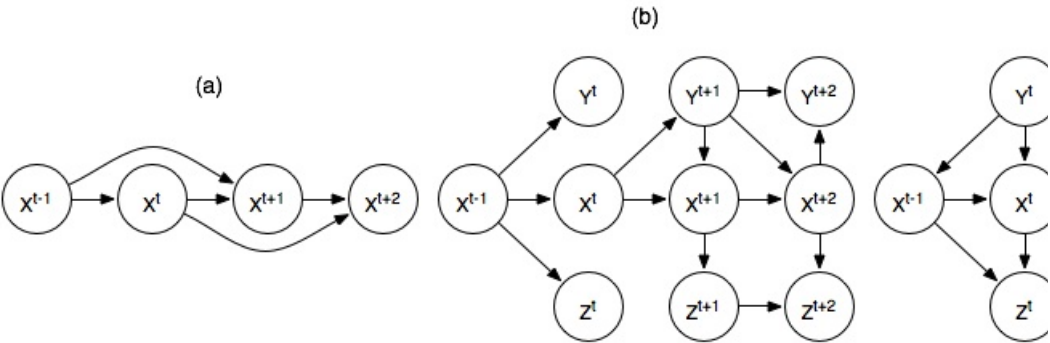
Template Models. Consider the plate model from the previous question. What might P represent?

Your Answer	Score	Explanation
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Whether a specific product PROD was consumed by consumer C in market M	1.00	In the grounded model, there will be an instance of P for each combination of Product and Consumer, and there is a combination like this for each Market. Thus, we are looking at a random variable that will say something about a specific product, market, and consumer combination. The correct answer is the only one that does this.
Total	1.00	

Question 4

Time-Series Graphs. Which of the time-series graphs satisfies the Markov assumption? You may select 1 or more options (or none of them, if you think none apply).

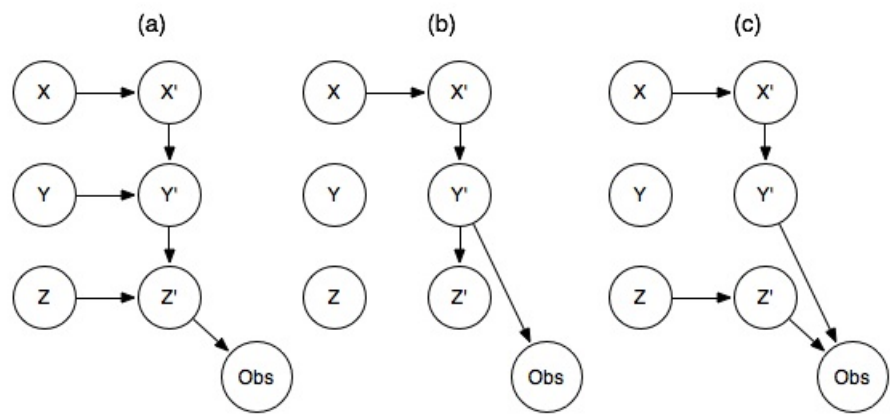


Your Answer	Score	Explanation
<input type="radio"/> (a)	0.33	In (a), this fails because of the direct edges from nodes to nodes that are two time points away.
<input checked="" type="radio"/> (b)	0.33	(b) is a time-series graph in which all variables in each time slice are independent of all variables in time slices at least 2 time slices before, given all variables in the previous time slice ($X^{(t+1)}, Y^{(t+1)}, Z^{(t+1)} \perp X^{(t-1)}, Y^{(t-1)}, Z^{(t-1)} X^{(t)}, Y^{(t)}, Z^{(t)}$).
<input type="radio"/> (c)	0.33	In (c), it fails because of the backwards edges, which cause time-slices to depend on both the previous and the following time-slice.
Total	1.00	

Question 5

***Unrolling DBNs.** Below are 2-TBNs that could be unrolled into DBNs. Consider these unrolled DBNs (note that there are no edges within the first time-point). In which of them will $(X^{(t)} \perp Z^{(t)} | Y^{(t)})$ hold for all t , assuming $Obs^{(t)}$ is observed for all t and $X^{(t)}$ and $Z^{(t)}$ are never observed? You may select 0 or more options (or none of them, if you think none apply).

Hint: Unroll these 2-TBNs into DBNs that are at least 3 time steps long (i.e., involving variables from $t - 1, t, t + 1$).

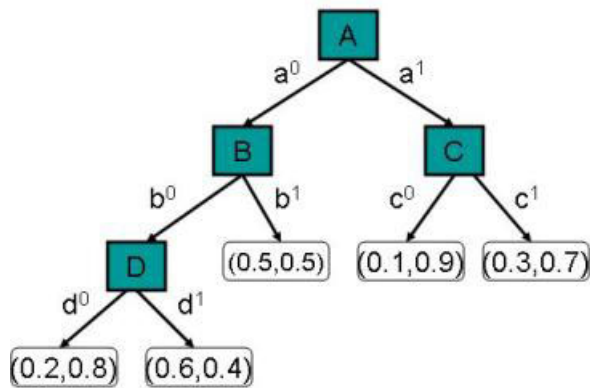


Your Answer	Score	Explanation
<input type="radio"/> (a)	0.33	(a) is incorrect because there is still an active path from $X^{(t)}$ to $Z^{(t)}$ through the previous time step variables ($X^{(t)} \leftarrow X^{(t-1)} \rightarrow Y^{(t-1)} \rightarrow Z^{(t-1)} \rightarrow Z$).
<input checked="" type="radio"/> (b)	0.33	The independence assumption holds in this network because knowing Y blocks what was the only active trail from $X^{(t)}$ to $Z^{(t)}$.
<input type="radio"/> (c)	0.33	(c) is incorrect because of active path $X^{(t)} \rightarrow X^{(t+1)} \rightarrow Y^{(t+1)} \rightarrow \text{Obs}^{(t+1)} \leftarrow Z^{(t+1)} \leftarrow Z^{(t)}$.
Total	1.00	

Question 6

Causal Influence. Consider the CPD below. What is the probability that $E = e_0$ in the following graph given an observation $A = a_1, B = b_0, C = c_0, D = d_1$? Note that, for the pairs of probabilities that make up the leaves, the probability on the left is the probability of e_0 , and the probability on the right

Tree CPD for $P(E \mid A, B, C, D)$



the probability of e_1 .

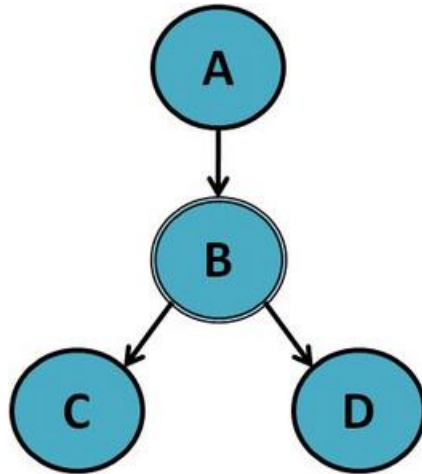
0.1

Your	Score	Explanation
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Answer			
0.1	✓	1.00	This is the probability that is reached when following the tree down the appropriate branches.
Total		1.00	

Question 7

Independencies with Deterministic Functions. In the following Bayesian network, the node B is a deterministic function of its parent A . Which of the following is an independence statement that holds the network? You may select 1 or more options (or none of them, if you think none apply).



Your Answer	Score	Explanation
<input checked="" type="checkbox"/> $(C \perp D \mid A)$	✓ 0.25	Since B is a deterministic function of A , observing A implies that B is also observed, which d-separates C and D . Therefore, $(C \perp D \mid A)$ holds.
<input checked="" type="checkbox"/> $(A \perp D \mid B)$	✓ 0.25	Given B , there is no active trail between A and D therefore, they are conditionally independent.
<input type="checkbox"/> $(B \perp D \mid C)$	✓ 0.25	B is a deterministic function of A , not C , and D is a child of B , so observing C does not make B and D independent.
<input type="checkbox"/> $(A \perp D \mid C)$	✓ 0.25	Since A is an ancestor of both C and D , observing D does not make A and C independent.
Total	1.00	

Question 8

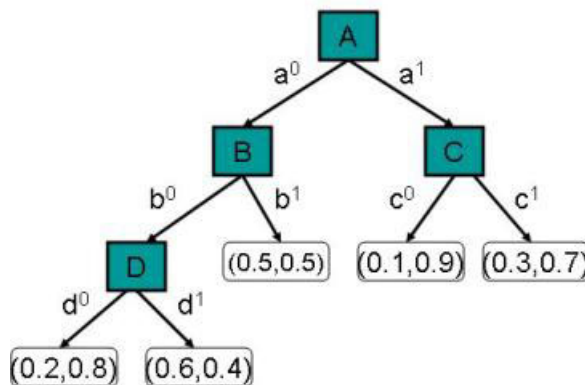
Independencies in Bayesian Networks. For the network in the previous question, let B no longer be a deterministic function of its parent A . Which of the following is an independence statement that holds the modified Bayesian network? You may select 1 or more options (or none of them, if you think none apply).

Feedback			
Your Answer	Score	Explanation	
<input type="radio"/> $(B \perp D \mid A)$	<input checked="" type="checkbox"/> 0.25	Since B is the parent of D , B and D do not become independent when A is observed.	
<input checked="" type="checkbox"/> $(A \perp D \mid B)$	<input checked="" type="checkbox"/> 0.25	The only active trail from A to D passes through B , and there are no V-structures between A and D , so observing B makes A and D independent.	
<input type="radio"/> $(A \perp D \mid C)$	<input checked="" type="checkbox"/> 0.25	Since C is not on the active trail from A to D , observing C does not make A and D independent.	
<input type="radio"/> $(C \perp D \mid A)$	<input checked="" type="checkbox"/> 0.25	Since A is not on the active trail from C to D , observing A does not make C and D independent.	
Total	1.00		

Question 9

Context-Specific Independencies in Bayesian Networks. Which of the following are context-specific independencies that **do** exist in the tree CPD below? (Note: Only consider independencies in this CPD ignoring other possible paths in the network that are not shown here. You may select 1 or more options (or none of them, if you think none apply).)

Tree CPD for $P(E \mid A, B, C, D)$



Your Answer	Score	Explanation	
<input type="radio"/> $(E \perp_c C \mid b^0, d^0)$	<input checked="" type="checkbox"/> 0.25	A variable X is independent of E given conditioning assignment \bar{z} if all paths consistent with \bar{z} traversed in the tree CPD reach a leaf without querying X . This is not true for this option because C is on a separate branch from B and D , and the initial branch is even known since it depends on A .	
<input type="radio"/> $(A \perp_c D \mid B)$	<input checked="" type="checkbox"/> 0.25	This option is wrong because the tree CPD represents $P(E \mid A, B, C, D)$, so it does not give any information about whether A and D are independent.	
<input checked="" type="checkbox"/> $(E \perp_c D \mid b^1)$	<input checked="" type="checkbox"/> 0.25	A variable X is independent of E given conditioning assignment \bar{z} if all paths consistent with \bar{z} traversed in the tree CPD reach a leaf without querying X . This is true for this option.	
<input checked="" type="checkbox"/> $(E \perp_c C \mid a^0, b^0)$	<input checked="" type="checkbox"/> 0.25	A variable X is independent of E given conditioning assignment \bar{z} if all paths consistent with \bar{z} traversed in the tree CPD reach a leaf without querying X . This is true for this option.	

Total	1.00
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