



# Probabilistic Graphical Models

Daphne Koller, Kevin Murphy  
Winter 2011-2012

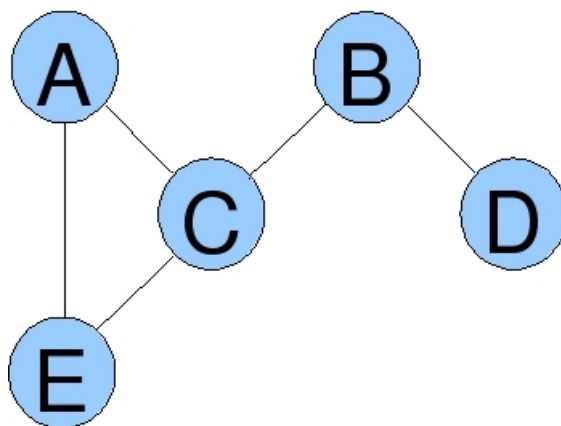
[Home](#)
[Quizzes](#)
[Theory Problems](#)
[Assignments](#)
[Assignment Questions](#)
[Video Lectures](#)
[Discussion Forums](#)
[Octave Installation](#)
[Lecture Slides](#)
[Course Schedule](#)
[Course Logistics](#)
[Course Information](#)
[Course Staff](#)

## Feedback — Markov Network Fundamentals

You achieved a score of 7.00 out of 7.00

### Question 1

**Independence in Markov Networks.** Consider this graphical model from week 1's quizzes. This time the edges are undirected (see modified graph below). Which pairs of variables are independent in network? You may select 1 or more options (or none of them, if you think none apply).



Your Answer	Score	Explanation
<input type="radio"/> A, B	✓ 0.33	There is a path from A to B that goes through C.
<input type="radio"/> C, D	✓ 0.33	There is a path connecting C and D that goes through B.
<input type="radio"/> D, E	✓ 0.33	There a path connecting D and E that goes through B and C.
Total	1.00	

There is a path from every node to every other node, so none of the nodes are independent.

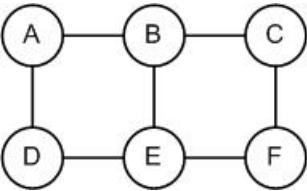
### Question 2

**Factor Scope.** Let  $\phi(c, e)$  be a factor in a graphical model, where  $c$  is a value of  $C$  and  $e$  is a value of  $E$ . What is the scope of  $\phi$ ?

Your Answer	Score	Explanation
<input checked="" type="radio"/> {C, E}	✓ 1.00	
Total	1.00	

Question 3

**Factorization.** Which of the following sets of factors could factorize over the undirected graph below. You may select 1 or more options (or none of them, if you think none apply).



Your Answer	Score	Explanation
<input type="radio"/> $\phi(A, B, D), \phi(C, E, F)$	<input checked="" type="checkbox"/> 0.25	The scope of each factor in the set must be a clique in the graph, so factors like $\phi(A, B, D)$ can be involved in a factorization of this graph.
<input type="radio"/> $\phi(A, B), \phi(C, D), \phi(E, F)$	<input checked="" type="checkbox"/> 0.25	The scope of each factor in the set must be a clique in the graph, which is not the case here.
<input type="radio"/> $\phi(A, B, C, D), \phi(C, D, E, F)$	<input checked="" type="checkbox"/> 0.25	The scope of each factor in the set must be a clique in the graph, so factors like $\phi(A, B, C, D)$ can't be involved in a factorization over this graph.
<input type="radio"/> $\phi(A, B, C), \phi(A, B), \phi(C, D, E), \phi(E, F), \phi(F)$	<input checked="" type="checkbox"/> 0.25	The scope of each factor in the set must be a clique in the graph, which is not the case here.
Total	1.00	

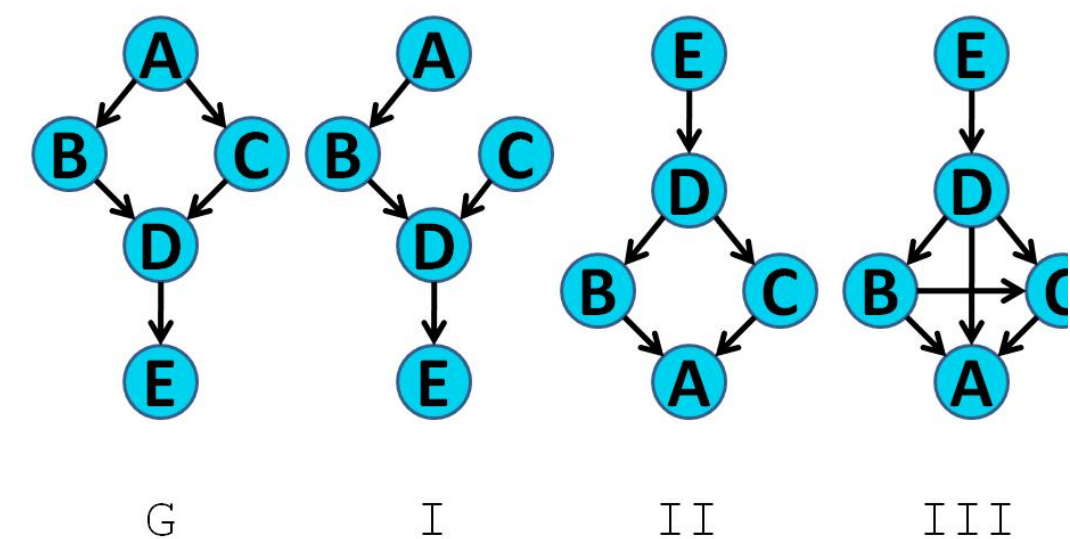
Question 4

**Factors in Markov Network.** Let  $\pi_1[A, B]$ ,  $\pi_2[B, C]$ , and  $\pi_3[A, C]$  be all of the factors in a particular undirected graphical model. Then what is  $\sum_{A,B,C} \pi_1[A, B] \times \pi_2[B, C] \times \pi_3[A, C]$ ? More than one answer could be correct.

Your Answer	Score	Explanation
<input checked="" type="checkbox"/> Always equal to the partition function, $Z$	<input checked="" type="checkbox"/> 0.17	This is the formula for $Z$ , the partition function.
<input type="radio"/> Always equal to 1	<input checked="" type="checkbox"/> 0.17	There is no restriction that this sum over possible factor products be 1 (it is not normalized).
<input checked="" type="checkbox"/> Always greater than or equal to 0	<input checked="" type="checkbox"/> 0.17	The factors can be any positive function.
<input type="radio"/> Always less than or equal to 1	<input checked="" type="checkbox"/> 0.17	There is no restriction that the factors be less than one (it is not normalized).
<input checked="" type="checkbox"/> Always greater than or equal to	<input checked="" type="checkbox"/> 0.17	This is the sum over the factor products for

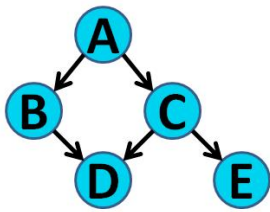
Feedback		
$\pi_1[a, b] \times \pi_2[b, c] \times \pi_3[a, c]$ , where $a$ is a value of $A$ , $b$ is a value of $B$ , and $c$ is a value of $C$		all possible values of the variables in the factors, so it is greater than or equal to the factor product for only one combination of values.
<div><div>●</div> Always less than or equal to <math>\pi_1[a, b] \times \pi_2[b, c] \times \pi_3[a, c]</math>, where <math>a</math> is a value of <math>A</math>, <math>b</math> is a value of <math>B</math>, and <math>c</math> is a value of <math>C</math>.</div>	<div><div>✓</div>0.17</div>	This is the sum over the factor products for all possible values of the variables in the factors, so it is at least the factor product for only one combination of values.
Total	1.00	

**Question 5**  
**I-Maps.** Graph  $G$  is a perfect I-map for distribution  $P$ , i.e.  $\mathcal{I}(G) = \mathcal{I}(P)$ . Which of the other graphs is a perfect I-map for  $P$ ?

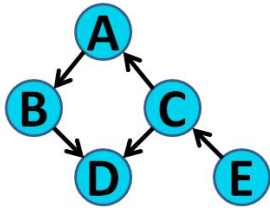


Your Answer	Score	Explanation
<div><div>●</div> None of the above</div>	<div><div>✓</div>1.00</div>	I isn't because it has the extra independence $(A \perp C)$ . II has the extra independence relation $(B \perp C \mid D)$ (among others). III has no extra independencies but does not preserve an independence relationship in $G$ .
Total	1.00	

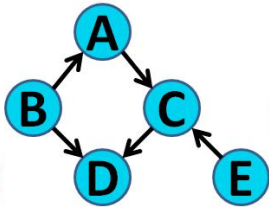
**Question 6**  
**I-Equivalence.** In the figure below, graph  $G$  is I-equivalent to which other graph(s)?



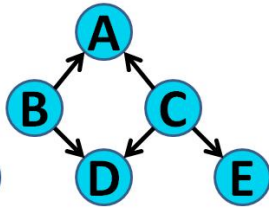
G



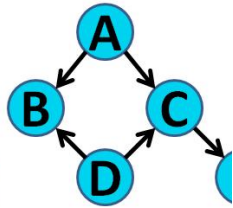
I




II



III




IV

Your Answer	Score	Explanation
<input checked="" type="radio"/> I	 1.00	II, III, and IV all have extra independencies.
Total	1.00	

Question 7

**\*I-Equivalence.** Let  $T$  be any directed tree (not a polytree) over  $n$  nodes, where  $n \geq 1$ . A directed tree is a traditional tree, where each node has at most one parent and there is only one root, i.e., all but one node has exactly one parent. (In a polytree, nodes may have multiple parents.) How many networks (including itself) are I-equivalent to  $T$ ?

Your Answer	Score	Explanation
<input checked="" type="radio"/> $n$	 1.00	The only graphs that are I-equivalent to $T$ are directed trees with the same edges and no V-structures. Thus, making a different node the root would make an I-equivalent tree. Any of the tree nodes can be set as the root.
Total	1.00	