## CS151 - Written Problem 4 To be done by: Monday, Oct. 4

- 1. Exercise 13.8
- 2. Exercise 13.21

The next two problems are taken from http://www-nlp.stanford.edu/~grenager/cs121//handouts/hw2.pdf

3. In this problem were going to prove the conditional independence properties of the following Bayesian network:



- (a) What are the conditional probability distributions (CPDs) that are represented in this Bayesian network?
- (b) Write down the joint probability distribution over X, Y, and Z as represented by this Bayesian network. This expression should be written in terms of the CPDs you enumerated in a. (plus any unconditional distributions).
- (c) Now write down an expression in terms of these for P(X, Z), the marginal probability of X and Z (hint: sum the variable Y "out" from the joint distribution you wrote above).
- (d) Based on the expression in c., and the definition of independence, are X and Z independent?
- (e) Write down an expression for P(X, Z|Y), again in terms of these simplified probability distributions

- (f) Based on this expression, and the definition of conditional independence, are X and Z conditionally independent given Y?
- 4. In this question we examine the conditional independence assumptions encoded in the Bayesian network graph topology. Consider the following Bayesian network:



- (a) Write down all the independencies not conditioned on other variables that are enforced by this Bayesian network, using the notation  $A \perp B$  to mean that A is independent of B.
- (b) Write down three independencies which do not necessarily hold in this Bayesian network.
- (c) Write down all the conditional independencies that are enforced by this Bayesian network, using the notation  $A \perp B | C$  to mean that A is conditionally independent of B given C.
- (d) Write down three conditional independencies which do not necessarily hold in this Bayesian network.