## CS440 Assignment2

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## **P**1

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A)
All five True = P(A,B,C,D,E) = P(A)P(B)P(C)P(D|A+B)P(E|B+C)
P(A) = 0.2
P(B) = 0.5
P(C) = 0.8
P(D|A+B) = 0.1
P(E|B+C) = 0.3
P(A,B,C,D,E) = 0.2*0.5*0.8*0.1*0.3 = 0.0024
B)
All five false = P(!A, !B, !C, !D, !E) = P(!A)P(!B)P(!C)P(!D|!A+!B)P(!E|!B+!C)
P(!A) = 0.8
P(!B) = 0.5
P(!C) = 0.2
P(!D|!A+!B) = 0.1
P(!E|!B+!C) = 0.8
P(!A,!B,!C,!D,!E) = 0.8*0.5*0.2*0.1*0.8 = 0.0064
P(!A|B+C+D+E) = P(!A+B+C+D+E) / P(B+C+D+E)
P(!A+B+C+D+E) = P(!A)P(B)P(C)P(D|!A+B)P(E|B+C) = 0.8*0.5*0.8*0.6*0.3
P(B+C+D+E) = P(B)P(C)P(D|B)P(E|B+C) = 0.5*0.8*0.7*0.3 = 0.084
P(!A|B+C+D+E) = 0.0576 / 0.084 = 0.6857
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## P2

A) 
$$P(Burglary|JohnCalls + MaryCalls) = P(B,J,M,A,E) + P(B,J,M,A,!E) + P(B,J,M,!A,E) + P(B,J,M,!A,E) / P(B,J,M) + P(!B,J,M)$$

```
P(B,J,M,A,E) = P(B)P(J|A)P(M|A)P(A|B+E)P(E) = 0.001*0.9*0.7*0.95*0.002
= 0.000001197
   P(B,J,M,A,!E) = P(B)P(J|A)P(M|A)P(A|B+!E)P(!E) = 0.001*0.9*0.7*0.94*0.998
= 0.000591
   P(B,J,M,!A,E) = P(B)P(J|!A)P(M|!A)P(-A|B+E)P(E) = 0.001*0.05*0.01*0.05*0.002
= 0.000000000005
   P(B,J,M,!A,!E) = P(B)P(J|!A)P(M|!A)P(!A|B+!E)P(!E) = 0.001*0.05*0.01*0.06*0.998
= 0.0000000299
   P(B,J,M) = P(B)(P(J|A) + P(J|A))(P(M|A) + P(M|A)) = 0.001*(0.9+0.05)*(0.7+0.01)
= 0.0006745
   P(!B,J,M) = P(!B)(P(J|A) + P(J|!A))(P(M|A) + P(M|!A)) = 0.999*(0.9 + 0.05)*(0.7 + 0.01)
= 0.674
   P(Burglary|JohnCalls + MaryCalls) = (0.000001197 + 0.000591 + 0.00000000000005)
+ 0.0000000299)/(0.0006745 + 0.674) = 0.001
   B) enumeration tree would be a straight line. Therefore worst case is that
all n variables must be checked.
   complexity using enumeration = O(n)
   complexity using variable elimination = O(n)
P3
   A)
   OC : card holder owns a computer or smart phone.
   Fraud: current transaction is fraudulent.
   Trav: card holder is currently travelling.
   FP: current transaction is a foreign purchase.
   IP : current purchase is an internet purchase.
   CRP: a computer related purchase was made in the past week
   Trav | P(Fraud)
   True 0.01
   False 0.004
   P(Trav) = 0.05
   Trav Fraud | P(FP)
   True True 0.9
   True False 0.9
   False True 0.1
   False False 0.01
   P(OC) = 0.75
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OC Fraud | P(IP)
                              True True 0.01
                              True False 0.02
                              False True 0.001
                              False False 0.011
                              OC | P(CRP)
                              True 0.1
                              False 0.001
                              P(Fraud) = (P(Fraud + Trav) + P(Fraud + !Trav)) / (P(Fraud) + P(!Fraud))
                              P(Fraud) = (P(Fraud|Trav)P(Trav) + P(Fraud|Trav)P(Trav)) / (1)
                              P(Fraud) = 0.01*0.05 + 0.004*0.95
                            P(Fraud) = 0.0043
                              P(Fraud \mid FP + !IP + CRP) = (P(Fraud + FP + !IP + CRP + Trav + OC))
+ P(Fraud + FP + !IP + CRP + Trav + !OC) + P(Fraud + FP + !IP + CRP)
 +!Trav + OC) + P(Fraud + FP + !IP + CRP + !Trav + !OC))/(P(Fraud +
FP + !IP + CRP) + P(!Fraud + FP + !IP + CRP + Trav + OC))
                              P(Fraud + FP + !IP + CRP + Trav + OC) = P(Fraud | Trav)P(FP | Trav + Fraud)P(!IP | OC + Fraud)P(CRP + Trav + OC) = P(Fraud | Trav)P(FP | Trav + Fraud)P(!IP | OC + 
 = 0.01 * 0.9 * 0.99 * 0.1 * 0.05 * 0.75 = 0.0000334125
                            P(Fraud + FP + !IP + CRP + Trav + !OC) = P(Fraud | Trav)P(FP | Trav + Fraud)P(!IP | Trav + 
OC+Fraud)P(CRP|!OC)P(Trav)P(!OC) = 0.01 * 0.9 * 0.999 * 0.001 * 0.05 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000 * 0.000
0.25 = 0.0000001124
                              P(Fraud + FP + !IP + CRP + !Trav + OC) = P(Fraud)!Trav)P(FP| !Trav + Fraud)P(!IP|OC + Fraud)P(OC + Fraud)P(
= 0.004 * 0.1 * 0.99 * 0.1 * 0.95 * 0.75 = 0.000028215
                              OC+Fraud)P(CRP|!OC)P(!Trav)P(!OC) = 0.004 * 0.1 * 0.999 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.001 * 0.95 * 0.95 * 0.001 * 0.95 * 0.95 * 0.001 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 0.95 * 
0.25 = 0.0000000949
                              P(Fraud + FP + !IP + CRP) = (P(Fraud | Trav) + P(Fraud | Trav))(P(FP | Trav + Fraud) + P(FP | Trav + Fraud))(P(FP | Trav + Fraud)) + P(FP | Trav + Fraud))(P(FP | Trav + Fraud)) + P(FP | Trav + Fraud))(P(FP | Trav + Fraud)) + P(FP | Trav + Fraud
= (0.01+0.004)(0.9+0.1)(0.99+0.999)(0.1+0.001) = 0.014*1*1.989*0.101 =
0.002812446
                              P(!Fraud + FP + !IP + CRP) = (P(!Fraud | Trav) + P(!Fraud | !Trav))(P(FP | Trav + !Fraud) + P(FP | !Trav + |Trav + |Trav + | |Trav + |Trav +
 = (0.99+0.996)(0.9+0.01)(0.98+0.989)(0.1+0.001) = 1.986 * 0.91 * 1.969 *
0.101 = 0.3594079889
                              P(Fraud | FP + !IP + CRP) = (0.0000334125 + 0.0000001124 + 0.000028215)
 +0.0000000949)/(0.002812446 + 0.3594079889) = 0.00017
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