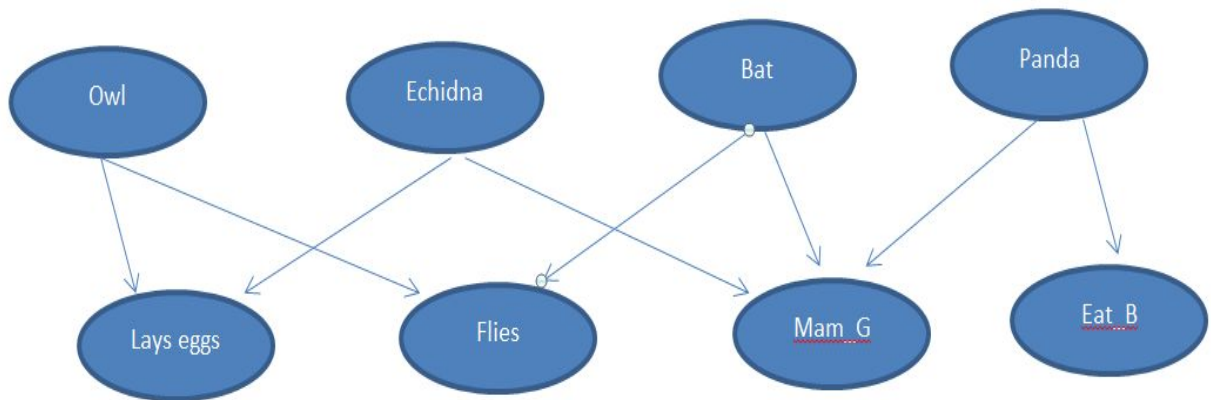


Q1.

1). Using the knowledge base, show the corresponding Bayes Net.



2). Using the ideas of conditional independence discussed in class and in Ch. 14 of R&N, identify which variables in this network are conditionally independent of which others given what conditions.

Using markov blanket rule:

1. Lays\_eggs is conditionally independent of the network given owl and Ech
2. Flies is conditionally independent of the network given owl, Bat
3. Mam\_G is conditionally independent of the given network given Ech, Bat and Panda
4. Eat\_B is conditionally independent of the given network given Panda
5. Owl is conditionally independent of the network given Lays\_eggs, Flies, Echidna, Bat
6. Ech is conditionally independent of the network given Lays\_eggs ,Mam\_G , Owl, BAT and Panda
7. Bat is conditionally independent of the network given Mam\_G,Flies, Echidna, Panda, Owl
8. Panda is conditionally independent of the network given Eat\_Bamboo, Mam\_G, Echidna, Bat.

Using d-separation: X and Y are d-separated if all the paths that connect them are inactive.

Using common cause rule:  $(a \leftarrow c \rightarrow b)$

1. Lays\_eggs and Flies are conditionally independent given Owl
2. Lays\_eggs and Mam\_G are conditionally independent given Echidna
3. Flies and Mam\_G are conditionally independent given Bat
4. Mam\_G and Eat\_B are conditionally independent given Panda

3) Use the prior and conditional probabilities provided to construct probability tables for each node of this network.

For each node:

P(O):

$P(Owl)$	Owl	$P(Owl)$
	T	0.05
	F	0.95

P(E):

$e$	$P(e)$
T	0.01
F	0.99

P(B):

$P(Bat)$	Bat	$P(Bat)$
	T	0.03
	F	0.97

P(P):

$e$	$P(e)$
T	0.01
F	0.99

P(L\_E):

e	o	LE	P(LE/o, e)
T	T	T	0.7 x 0.05 = 0.035
T	F	T	0.03 x 0.95 = 0.0285
T	T	F	0.3 x 0.05 = 0.015
T	F	F	0.97 x 0.95 = 0.9215
F	T	T	0.57 x 0.05 = 0.0285
F	F	T	0.04 x 0.95 = 0.038
F	T	F	0.43 x 0.05 = 0.0215
F	F	F	0.46 x 0.95 = 0.437

P(F):

F	O	B	P(F/O,B)
T	T	T	$0.9 \times 0.03 = 0.027$
T	T	F	$0.95 \times 0.97 = 0.9215$
T	F	T	$0.86 \times 0.03 = 0.0258$
T	F	F	$0.03 \times 0.97 = 0.0291$
F	T	T	$0.1 \times 0.03 = 0.003$
F	T	F	$0.05 \times 0.97 = 0.0485$
F	F	T	$0.14 \times 0.03 = 0.0042$
F	F	F	$0.97 \times 0.97 = 0.9409$

P(M\_G):

a	b	P	M	P(M/a,b,P)
T	T	T	T	$0.9 \times 0.02 = 0.018 \times 0.03 = 0.00054$
T	T	F	T	$0.75 \times 0.98 \times 0.735 \times 0.03 = 0.0220$
T	F	T	T	$0.4 \times 0.02 = 0.008 \times 0.97 = 0.00776$
T	F	F	T	$0.02 \times 0.98 = 0.0196 \times 0.97 = 0.01901$
T	T	T	F	$0.1 \times 0.02 = 0.02 \times 0.03 = 0.0006$
T	T	F	F	$0.25 \times 0.98 = 0.245 \times 0.03 = 0.00735$
T	F	T	F	$0.6 \times 0.02 = 0.012 \times 0.97 = 0.01164$
T	F	F	F	$0.98 \times 0.98 = 0.9604 \times 0.97 = 0.93158$
F	T	T	T	$0.5 \times 0.02 = 0.01 \times 0.03 = 0.0003$
F	T	F	T	$0.08 \times 0.98 = 0.0784 \times 0.03 = 0.0235$
F	F	T	T	$0.5 \times 0.02 = 0.01 \times 0.97 = 0.0097$
F	F	F	T	$0.01 \times 0.98 = 0.0098 \times 0.97 = 0.0095$
F	T	T	F	$0.5 \times 0.02 = 0.01 \times 0.03 = 0.0003$
F	T	F	F	$0.92 \times 0.98 = 0.9016 \times 0.03 = 0.027$
F	F	T	F	$0.5 \times 0.02 = 0.01 \times 0.97 = 0.0097$
F	F	F	F	$0.99 \times 0.98 = 0.9702 \times 0.97 = 0.941094$

P(E\_B):

P	E_B	P(E_B)
T	T	$0.7 \times 0.02 = 0.014$
F	T	$0.03 \times 0.98 = 0.0294$
<del>F</del>	F	$0.3 \times 0.02 = 0.006$
F	F	$0.97 \times 0.98 = 0.9506$

Convention adopted:

OWL:O

BAT:B

Panda: P

Echidna:e

Flies: F

Lays\_eggs:L\_E

Eats Bamboo: E\_B

Mammary glands: M\_G



Then use exact inference to answer the following questions. What is the probability that

--

- a) The animal can fly.
- b) The animal is an echidna.
- c) The patient is a bat, given that it eats bamboo.

a)  $P(\text{Flies}=T)=T$

Initial calculation and reduction:

$$\begin{aligned}
 P(F=T) &= T. \\
 P(F) &\propto \sum_{o, b, e, p, le, e-b, MG} P(o) P(b) P(e) P(p) \cdot P(F/o, b) P(E-b/p) \\
 &\quad P(le/o, e) \cdot P(MG/e, b, p) \\
 &= \propto \sum_{\substack{o, le, \\ eB, MG}} P(o) \sum_b P(b) \cdot P(F/o, b) \sum_e P(e) \cdot P(le/o, e) \\
 &\quad \sum_p P(p) \cdot P(E-b/p). \\
 \text{we can see that} \\
 \sum_p P(p) \cdot P(E-b/p) &= 1, \quad \sum_o \sum_e P(e) \cdot P(o) \cdot P(le/o, e) = 1 \\
 \text{Hence } P(F) &\propto \sum_o P(o) \cdot \sum_b P(b) \cdot P(F/o, b)
 \end{aligned}$$

With the given priors of o and b

$$P(F=T)=T$$

$$P(F=T) = \sum_o P(o) \cdot \sum_B P(B) \cdot P(F=T/o, B)$$

$P(o) =$	o	$P(o)$
	T	0.05
	F	0.95

$P(B) :$	B	$P(B)$
	T	0.03
	F	0.97

Calculating  $P(F=T/b, o) \cdot P(b)$ :

1) Calc.  $P(F=T \wedge o/B) = \sum_B P(F=T/o, b) \cdot P(B)$

F	o	B	$P(F \wedge o/B)$
T	T	T	$0.9 \times 0.03 = 0.027$
T	T	F	$0.95 \times 0.97 = 0.9215$
T	<del>F</del>	<del>T</del>	$0.86 \times 0.03 = 0.0258$
T	F	F	$0.03 \times 0.97 = 0.0291$
T	F	T	$0.1 \times 0.03 = 0.003$
F	T	F	$0.05 \times 0.97 = 0.0485$
F	T	T	$0.14 \times 0.03 = 0.0042$
F	F	T	$0.97 \times 0.97 = 0.9409$
F	F	F	

Combining common values of b: calculating  $P(F=T/o)$ :

2) combining of over B :  $P(F=T/o)$

F	O	$P(F/o)$
T	T	0.9485
F	T	0.0515
T	F	0.0549
F	F	0.9451

Calculating  $P(F=T/o) \cdot P(o)$

Calc :  $P(F=T) = \sum_o P(o) \cdot P(F=T/o)$

F	O	$P(F=T)$
T	T	$0.9485 \times 0.05 = 0.047425$
F	T	$0.0515 \times 0.05 = 0.002575$
T	F	$0.0549 \times 0.95 = 0.052155$
F	F	$0.9451 \times 0.95 = 0.897845$



Combining over all values of o :  $P(F=T)$

4) Combining  
 $P(F=T)$   
 $T = 0.09958$   
 $F = 0.90042$   
 $P(F=T)=T (0.09958)$

Calculating  $P(F=T)=T$

$$P(F=T) = 0.09958/0.90042 = 0.09958$$

b)  $P(\text{Echidna}) = P(E=T)=T$

Given :

$$P(E) \propto \sum_{o, b, p, L, F, M, G, E, B} P(o) P(E) P(B) P(P) P(L/E) P(F) P(M/G) P(E/B)$$

Moving summation inside:

$$P(E=T) \propto \sum_o P(o) \cdot P(E) \cdot \sum_{B, P} P(B) \cdot P(P) \cdot \frac{P(L/E, o, E=T)}{P(M/E, B, P)} P(F/o, B) P(EB/P)$$

Rewriting,  $P(E)$  to  $P(E=T)$ :

$$\propto \sum_O P(O) P(E=T) \cdot P(L E / O, E=T) \sum_B P(B) \cdot P(F / O, B) \\ \sum_P P(P) \cdot P(E=B / P) \cdot P(M / E=T, B, P)$$

Using variable elimination:

Knowing that

$$(i) \sum_O P(O) \cdot P(E=T) \cdot P(L E / O, E=T) = 1$$

$$(ii) \sum_O \sum_B P(B) \cdot P(F / O, B) = 1$$

$$(iii) \sum_P P(P) \cdot P(E=B / P) = 1$$

we have

$$P(E=T) \propto \sum_{B, P} P(P) \cdot P(B) \cdot P(M / E=T, B, P) \cdot P(E=T)$$

by var elimination  $\sum_{B, P} P(P) \cdot P(B) \cdot P(E=T) \cdot P(M / E=T, B, P) = P(E=T)$

$$P(E=T) \propto P(E=T) = \text{prior probability} = 0.01$$

**$P(E=T)$  is left after variable elimination of all other variables: which gives prior probability of 0.01**

c)  $P(B=T/E\_B=T)$

With the following equation:

Calculating  $P(B=T, E\_B=T)$

$$P(B=T/E\_B=T) \propto P(B/E\_B=T)$$

$$P(B/E\_B=T) \propto \sum_{O, E, P, L_e, F, M_g} P(O) P(B) P(e) P(P) P(L_e/O, e) P(F/O, B) P(M_g/e, b, P) \cdot P(E\_B=T/P)$$

Moving summation inside:

$$\propto \sum_O P(O) \cdot P(B) \cdot \sum_e P(e) \cdot P(L_e/O, e) \cdot P(F/O, B) \cdot \sum_P P(P) \cdot P(E\_B=T/P) \cdot P(M_g/e, b, P)$$

$$\propto P(B) \sum_O P(O) \cdot P(F/O, B) \sum_{e, L_e} P(e) \cdot P(L_e/O, e) \cdot \sum_{P, M_g} P(P) \cdot P(E\_B=T/P) \cdot P(M_g/e, b, P)$$

Starting with variable elimination:

$$\sum_e P(e) \cdot P(L_e/O, e) = 1$$

$$\sum_P P(P) \cdot P(E\_B=T/P) = P(E\_B=T)$$

P	E-B	$P(P) \cdot P(E\_B=T/P)$
T	T	$0.7 \times 0.02$
F	F	$0.03 \times 0.02$

Summing over all values of  $p$  to get  $P(E_B=T)$ :

$E_B$	$P(E_B=T)$
T	$0.73 \times 0.02 = 0.0146$

Substituting the value:

$$P(B/E_B=T) \propto P(B) \cdot \sum_o P(o) \cdot P(F/o, B) \cdot \sum_e P(e) \cdot \sum_p P(p) \cdot P(M_{G1}/e, b, p)$$

$\propto 0.0146$

For  $P(B=T)$ :

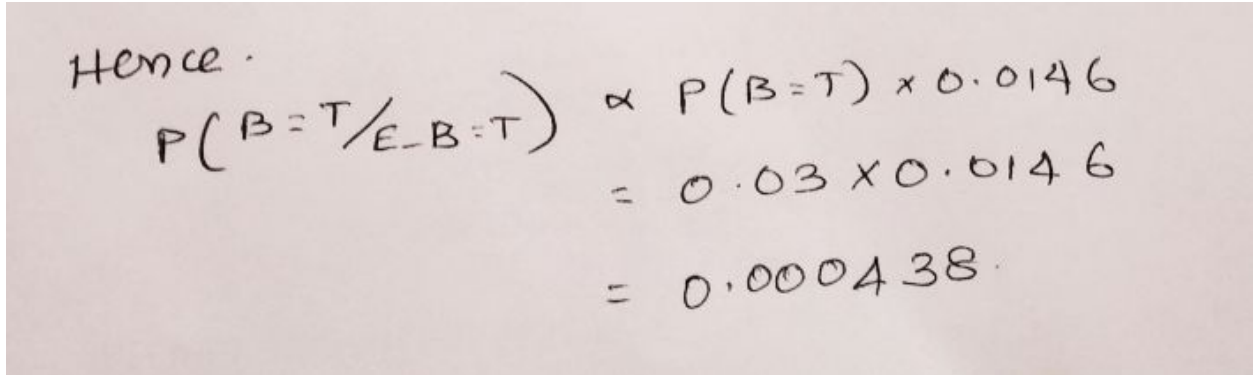
$$P(B=T/E_B=T) \propto P(B=T) \times 0.0146 \cdot \sum_{o, F} P(o) \cdot P(F/o, B=T) \cdot \sum_{p, M_{G1}} P(p) \cdot P(M_{G1}/e, b=T, p)$$

$$\sum_{M_{G1}} P(M_{G1}/e, b=T, p) = 1, \sum_p P(p) = 1, \sum_o P(o) = 1, \sum_F P(F/o, B=T) = 1$$

Doing variable elimination:

$$\sum_{M_{G1}} P(M_{G1}/e, b=T, p) = 1, \sum_p P(p) = 1, \sum_o P(o) = 1, \sum_F P(F/o, B=T) = 1$$

Finally:



Handwritten calculation showing the derivation of  $P(B=T | E_B=T)$  from  $P(B=T)$  and  $P(E_B=T)$ .

$$\begin{aligned} \text{Hence} \cdot \\ P(B=T | E_B=T) &\propto P(B=T) \times 0.0146 \\ &= 0.03 \times 0.0146 \\ &= 0.000438 \end{aligned}$$

$$P(B=T, E_B=t) = 0.000438$$

$$\begin{aligned} P(B=T | E_B=T) &= P(B=T, E_B=t) / P(E_B=T) \\ &= 0.000438 / 0.0146 \text{ as calculated above:} \end{aligned}$$

Hence

$$P(B=T | E_B=T) = 0.03$$