

1) (R2N 13.10)

→ Slot machine with 3 independent wheels

→ Payout scheme: (bet = 1 coin)

$$BR / BR / BR = 20 \text{ coins}$$

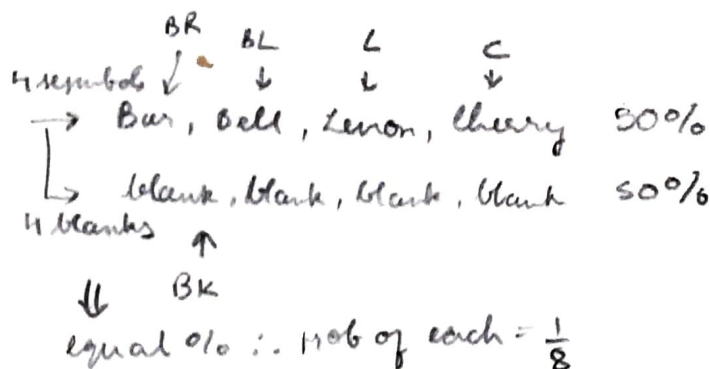
$$BL / BL / BL = 15$$

$$L / L / L = 5$$

$$C / C / C = 3$$

$$C / C / ? = 2$$

$$C / ? / ? = 1$$



(a) "Payback" % = ? for each coin played, expected coin return

→ Total outcomes = $8 \times 8 \times 8 = 512$ ∴ each core prob = $\frac{1}{512}$

$$P(\text{symbol / symbol / symbol}) = \frac{1}{512}, P(C / C / ?) = \left(\frac{1}{8}\right)^2 - \frac{1}{512} = \frac{7}{512}$$

$$P(BR / BR / BR) = \frac{1}{512} \times 20 = \frac{20}{512}$$

$$P(C / ? / ?) = \left(\frac{1}{8}\right) - \frac{1}{512} - \frac{7}{512} = \frac{56}{512}$$

$$P(BL / BL / BL) = \frac{1}{512} \times 15 = \frac{15}{512}$$

$$P(\text{all other results}) = \frac{512 - 56 - 7 - 4}{512}$$

$$P(L / L / L) = \frac{1}{512} \times 5 = \frac{5}{512}$$

$$= \frac{445}{512}$$

$$P(C / C / C) = \frac{1}{512} \times 3 = \frac{3}{512}$$

∴ Payback in $\frac{67}{512}$

$$P(C / C / ?) = \frac{7}{512} \times 2 = \frac{14}{512}$$

outcomes only

$$P(C / ? / ?) = \frac{56}{512} \times 1 = \frac{56}{512}$$

$$\therefore \text{Payback \%} = \frac{20 + 15 + 5 + 3 + 14 + 56}{512} = \frac{113}{512} \times 100 = \boxed{22.07\%}$$

$$(b) P(\text{win at 1 play}) = \text{sum of outcomes for payback scheme} = \frac{56 + 7 + 4}{512} = \frac{67}{512}$$

(c) Mean and median no. of plays until broke (starting with 10 coins).

→ Using python simulation to compute mean and median.

$$\begin{aligned} \text{Mean} &\approx 18 \\ \text{Median} &\approx 16 \end{aligned}$$

[* code attached for simulation]

↳ "prob1_sim.py"

1) (R&N 13.10)

equal probability $\therefore 1/4$ each
↓

Slot machine with 3 independent wheels $\xrightarrow{4}$ BAR, BELL, LEMON, CHERRY

↓ ↓ ↓ ↓
BR BL L C

Payout scheme:

→ BR / BR / BR = 20 coins

• BL / BL / BL = 15

• L / L / L = 5

• C / C / C = 3

• C / C / ? = 2

• C / ? / ? = 1

• anything else = 0
assumed

} for 1 coin

(a) "Payback" % = ? for each coin played, expected coin return

Total outcomes = $4 \times 4 \times 4 = 64$ $\therefore P(\text{each outcome}) = \frac{1}{64}$

Prob
→ (i) $P(\text{symbol} \wedge \text{symbol} \wedge \text{symbol}) = \frac{1}{64}$

(ii) $P(C \wedge C \wedge \text{symbol}) = \frac{4}{64} - \frac{1}{64} = \frac{3}{64}$
1 symbol $\neq C$ (i)

(iii) $P(C \wedge \text{symbol} \wedge \text{symbol}) = \frac{4 \times 4}{64} - \frac{1}{64} - \frac{3}{64} = \frac{12}{64}$
1 symbol $\neq C$ 1 symbol $\neq C$ (i) (ii)

(iv) $P(\text{all other non-scheme}) = \frac{64 - 12 - 3 - 4}{64} = \frac{45}{64}$

$P(\text{same } C) = 1 - P(\text{no } C)$
 $= \frac{61}{64}$

\therefore Payback at $\frac{19}{64}$ outcomes only.

Expectation

→ (i) $P(BR / BR / BR) = \frac{1}{64} \times 20 = \frac{20}{64}$

(ii) $P(BL / BL / BL) = \frac{1}{64} \times 15 = \frac{15}{64}$

(iii) $P(L / L / L) = \frac{1}{64} \times 5 = \frac{5}{64}$

(iv) $P(C / C / C) = \frac{1}{64} \times 3 = \frac{3}{64}$

(v) $P(C / C / ?) = \frac{2}{64} \times 2 = \frac{4}{64}$

(vi) $P(C / ? / ?) = \frac{12}{64} \times 1 = \frac{12}{64}$

$\therefore \text{Payback \%} = \frac{20 + 15 + 5 + 3 + 4 + 12}{64} \times 100$

$= \boxed{95.3125\%}$

(because expectation = $\frac{61}{64} = 0.953125$)

(b) $P(\text{win at 1 play}) = \text{sum of outcomes for payback scheme} = \frac{19}{64}$

(c) Mean = } simulation
Median = }

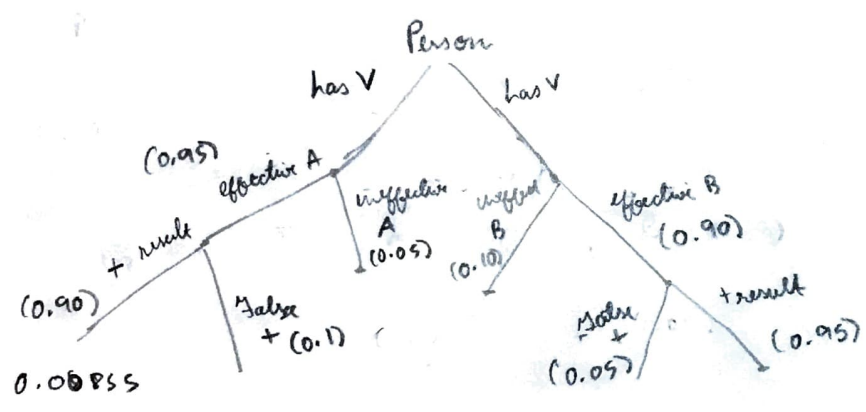
2) (R&N 13.13)

2 medical tests \rightarrow A
 \rightarrow B
 \hookrightarrow independent methods

	Effective	False Pos
A	0.95	0.1
B	0.90	0.05

$\therefore P(V) = 0.01$
 $P(A|V) = 0.95$
 $P(B|V) = 0.90$

People carrying virus = 10/100 = $\frac{1}{100}$ $\therefore P(\text{no virus \& person}) = 1 - \frac{1}{100} = \frac{99}{100}$



2) (R&N 13.13)

2 medical tests $\begin{matrix} \nearrow A \\ \searrow B \end{matrix}$ \hookrightarrow independent methods

$$\text{People carrying virus} = \frac{1}{100} = P(V) \quad \therefore P(\neg V) = \frac{99}{100}$$

$$P(\text{test A} | \text{virus}) = \frac{95}{100} = P(A|V)$$

$$P(\text{test B} | \text{virus}) = \frac{90}{100} = P(B|V)$$

$$P(\text{test A} | \neg \text{virus}) = \frac{10}{100} \quad (\text{false +}) \\ = P(A|\neg V)$$

$$P(\text{test B} | \neg \text{virus}) = \frac{5}{100} \quad (\text{false +}) \\ = P(B|\neg V)$$

 \rightarrow Which test is better indicator of having the virus? \therefore

$$P(V|A) = ? \quad P(V|B) = ?$$

$$\therefore P(V|A) = \frac{P(A|V)P(V)}{P(A|V)P(V) + P(A|\neg V)P(\neg V)} = \frac{0.95 \times 0.01}{0.95 \times 0.01 + 0.1 \times 0.99} = \underline{\underline{0.088}}$$

$$\therefore P(V|B) = \frac{P(B|V)P(V)}{P(B|V)P(V) + P(B|\neg V)P(\neg V)} = \frac{0.9 \times 0.01}{0.9 \times 0.01 + 0.05 \times 0.99} = \underline{\underline{0.154}}$$

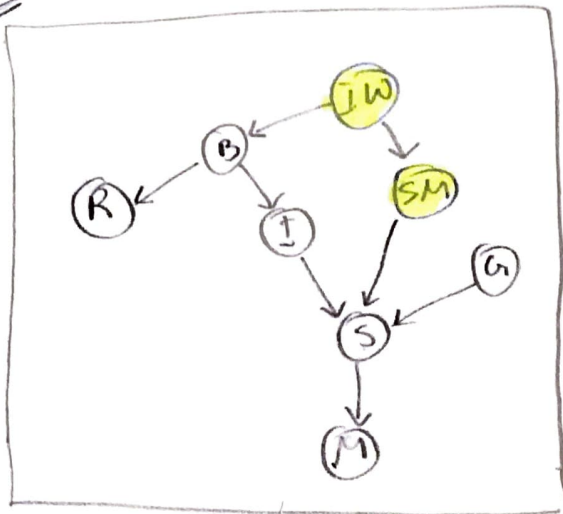
 \therefore test B is more indicative of carrying the virus!

3) (R&N 14.5) Modified

Car diagnosis figure 14.21

(a) Extend BN with 'JugWeather' and 'StarterMotor'

Ans



- R = Radio
- B = Battery
- I = Ignition
- S = Starts
- G = Gas
- M = Moves
- JW = JugWeather
- SM = StarterMotor

(b) How many independent values are contained in the full JPD for 8 boolean nodes? (No C.I relations amongst them)

Ans

→ 8 bool nodes: $\therefore 2^8 - 1 = 256 - 1 = \boxed{255}$ independent values.

(c) How many indep. prob. values does BN contain?

Ans

→ $2^0 + 2^1 + 2^1 + 2^1 + 2^1 + 2^0 + 2^3 + 2^1 = \boxed{20}$ indep. prob. values

(for JW, B, SM, R, I, G, S, M)

(d) What nodes are C.I. of S given M and B?

$P(X|S, M, B) = P(X|M, B)$ for C.I. between X and S

Ans

→ B is C.I. of S given I → Node \perp S given B, M

JW is C.I. of S given SM

~~I is \perp G given M as evidence~~

Rule 1: None

Rule 2: R

Rule 3: None

→ Node \perp S given M

Rule 1: None (Moves not breaking dependencies)

Rule 2: None (Moves \neq parent of S)

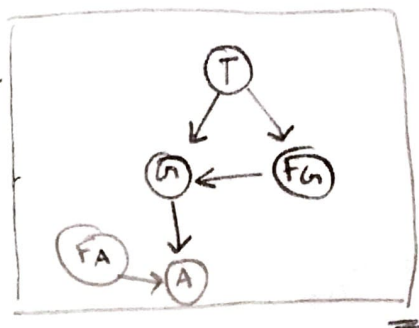
Rule 3: None (None)

\therefore only Radio \perp Starts | Moves, Battery

4) (R&N 14.11)

Bool. Variable ; A = Alarm sounds
 F_A = Faulty Alarm
 F_G = Faulty Gauge
 G = Gauge reading
 T = Actual core temp.

(a) ~~Ans~~ $F_G \propto T \uparrow$



(b) Is this BN a polytree?

Ans

→ No because a polytree has at most one undirected path between any 2 nodes in a network and the above network has T affecting G in more than one way.

(c) T $\begin{cases} \text{Normal} \\ \text{High} \end{cases}$ } actual measurement

$P(G \text{ is correct} \wedge \neg F_G) = \pi$

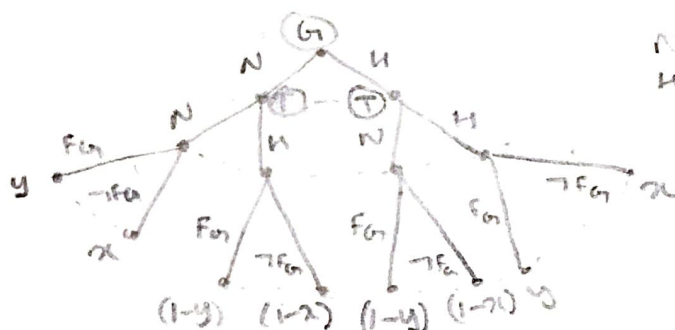
$P(G \text{ is correct} \wedge F_G) = y$

Ans CPT associated with G ?

→ \therefore CPT as follows:

	$G=N$		$G=H$	
	F_G	$\neg F_G$	F_G	$\neg F_G$
$T=N$	y	π	$1-y$	$1-\pi$
$T=H$	$1-y$	$1-\pi$	y	π

G $\begin{cases} \text{Normal} \\ \text{High} \end{cases}$ } measured maintenance



N = Normal
 H = High

(d) Alarm works correctly unless its faulty ($F_A \rightarrow$ no sound)

CPT for A?

Ans

→ \therefore

	$G=N$		$G=H$	
	F_A	$\neg F_A$	F_A	$\neg F_A$
A	F	F	F	T
$\neg A$	T	T	T	F

alarm is sound or no sound \therefore binary.

F = false

T = true

(c) A and G \rightarrow working and A \rightarrow sounds
 $P(T = \text{high})$ in terms of various cond. not in the BN.

Ans

$\rightarrow \neg FA$ and $\neg FG$ (given in question)

A \rightarrow alarm sounds

$\therefore P(T = \text{high} | A, \neg FA, \neg FG)$

\rightarrow From (c) and (d), since alarm sounds and not faulty alarm, gauge reading should be high (from ^{observing} previous CPT's)

$\therefore P(T = \text{high} | A, \neg FA, G = \text{high}, \neg FG)$

Bayes Rule

$$\Rightarrow P(T | A, \neg FA, G, \neg FG) = \frac{P(T, A, \neg FA, G, \neg FG)}{P(A, \neg FA, G, \neg FG)} \quad \left[\begin{array}{l} \text{let } T = \text{high} \text{ be } T \\ \text{let } G = \text{high} \text{ be } G \end{array} \right]$$

Chain Rule

$$\begin{aligned} \Rightarrow P(T | A, \neg FA, G, \neg FG) &= \frac{P(A | \neg FA, G) P(\neg FA) \cdot P(G | \neg FG, T) P(\neg FG | T) P(T)}{P(A | \neg FA, G) P(\neg FA) P(G, \neg FG) P(\neg FG)} \\ &= \frac{P(T) P(\neg FG | T) P(G | \neg FG, T)}{P(\neg FG) P(G, \neg FG)} \\ &= \frac{P(T) P(\neg FG | T) P(G | \neg FG, T)}{P(G, \neg FG)} \quad \text{using Bayes's Rule} \\ &= \frac{P(T) P(\neg FG | T) P(G | \neg FG, T)}{P(G, \neg FG | T) + P(G, \neg FG, \neg T)} \\ &= \frac{P(T) P(\neg FG | T) P(G | \neg FG, T)}{P(T) P(\neg FG | T) P(G | \neg FG, T) + P(\neg T) P(\neg FG | \neg T) P(G | \neg FG, \neg T)} \end{aligned}$$

$$P(T | A, \neg FA, G, \neg FG) = \frac{p \cdot (1 - q)}{p \cdot (1 - q) + (1 - p)(1 - r)(1 - s)}$$

$p = P(T)$
 $q = P(\neg FG | T)$
 $r = P(\neg FG | \neg T)$
 $s = P(G | \neg FG, T)$

5)

$$P(A) = 0.3$$

Sample BN

$$* P(\text{Var}) = P(\text{Var} = \text{true})$$

$$P(\neg \text{Var}) = P(\text{Var} = \text{false})$$

$$P(B|\neg A) = 0.8$$

$$P(B|A) = 0.4$$

$$P(C) = 0.8$$

$$P(D|\neg B, \neg C) = 0.7$$

$$P(D|\neg B, C) = 0.2$$

$$P(D|B, \neg C) = 0.6$$

$$P(D|B, C) = 0.3$$

$$(a) P(A, \neg B, \neg C, D) = ?$$

Ans

$$P(A, \neg B, \neg C, D) = P(A) P(\neg C) P(\neg B|A) P(D|\neg B, \neg C)$$

$$= 0.3 \times (1-0.8) \times (1-0.6) \times 0.7 = \boxed{0.0168}$$

$$(b) P(D|\neg A, B, C) = \frac{P(D, \neg A, B, C)}{P(\neg A, B, C)} = \frac{P(\neg A) P(C) P(B|\neg A) P(D|B, C)}{P(\neg A) P(C) P(B|\neg A)}$$

$$= P(D|B, C) = \boxed{0.3}$$

$$(c) P(\neg A|\neg B, C, \neg D) = \frac{P(\neg A, \neg B, C, \neg D)}{P(\neg B, C, \neg D)} = \frac{P(\neg A) P(C) P(\neg B|\neg A) P(\neg D|\neg B, C)}{P(\neg B|\neg A) P(C) P(\neg D|\neg B, C)}$$

$$= \frac{P(\neg A) P(\neg B|\neg A)}{P(\neg B)} = \frac{1-0.3 \cdot 1-0.8}{0.32 \text{ (from c)}} = \boxed{0.4375}$$

$$(d) P(B|A, \neg C) = \frac{P(B, A, \neg C)}{P(A, \neg C)} = \frac{P(A) P(\neg C) P(B|A)}{P(A) P(\neg C)}$$

$$P(A) \because A \perp\!\!\!\perp C \text{ from rule 3!}$$

$$= \boxed{0.4}$$

$$(e) P(\neg B) = 1 - P(B) \text{ where } P(B) = P(B|\neg A)P(\neg A) + P(B|A)P(A)$$

$$= 0.8 \cdot 0.7 + 0.4 \cdot 0.3$$

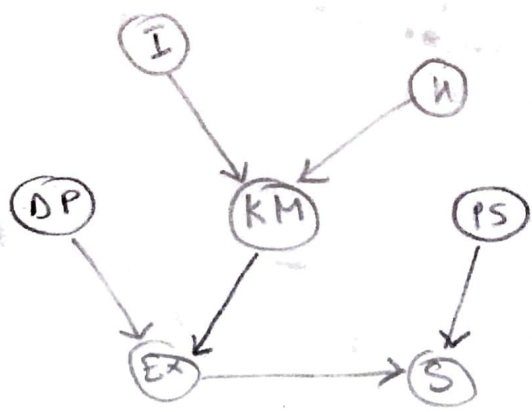
$$= 0.56 + 0.12 = 0.68$$

$$= 1 - 0.68$$

$$= \boxed{0.32}$$

6) Exam BN

- I: Intelligent
- H: hard-working
- DP: doesn't panic
- Ex: high exam score
- KM: knows material
- PS: gains practical skill
- S: success



- $P(I) = 0.75$
- $P(H) = 0.6$
- $P(DP) = 0.4$
- $P(PS) = 0.8$
- $P(KM|I, H) = 1$
- $P(KM|I, \sim H) = 0.4$
- $P(KM|\sim I, H) = 0.6$
- $P(KM|\sim I, \sim H) = 0.05$
- $P(S|PS, Ex) = 0.8$
- $P(S|\sim PS, Ex) = 0.7$
- $P(S|PS, \sim Ex) = 0.7$
- $P(S|\sim PS, \sim Ex) = 0.3$
- $P(Ex|DP, KM) = 0.85$
- $P(Ex|\sim DP, KM) = 0.7$
- $P(Ex|DP, \sim KM) = 0.2$
- $P(Ex|\sim DP, \sim KM) = 0.1$

- (a) $DP \perp\!\!\!\perp I | Ex$
- | | | |
|----|---|----|
| PS | I | Ex |
| S | I | Ex |
- (b) $I \perp\!\!\!\perp S | KM$
- | | | |
|----|---|----|
| I | S | KM |
| H | S | KM |
| DP | S | KM |
| PS | S | KM |
| Ex | S | KM |

- (c) $PS \perp\!\!\!\perp Ex | S$
- | | | |
|----|----|---|
| I | Ex | S |
| H | Ex | S |
| DP | Ex | S |
| KM | Ex | S |
- \therefore None

(d) $P(KM) = P(KM|I, H)P(I)P(H) + P(KM|\sim I, H)P(H)P(\sim I) + P(KM|I, \sim H)P(I)P(\sim H) + P(KM|\sim I, \sim H)P(\sim I)P(\sim H)$

$$= (1 \cdot 0.75 \cdot 0.6) + (0.6 \cdot 0.6 \cdot (1 - 0.75)) + (0.4 \cdot 0.75 \cdot (1 - 0.6)) + (0.05 \cdot (1 - 0.75) \cdot (1 - 0.6))$$

$$= 0.45 + 0.09 + 0.12 + 0.005$$

$$= \boxed{0.665}$$

(e) $P(S|KM) = \frac{P(S, KM)}{P(KM)} = \frac{P(S|Ex, PS)P(PS)P(Ex|DP, KM)P(DP)}{P(KM)}$

$$= \frac{0.8 \cdot 0.8 \cdot 0.85 \cdot 0.4}{0.665} = \boxed{0.694}$$

[using code from P7]

(f) $P(PS|S) = \frac{P(S|PS)P(PS)}{P(S)}$ where $P(S) = \frac{P(S|KM)P(KM)}{P(S)}$

$$= \frac{(0.327) \cdot (0.665)}{0.2176} = \boxed{0.864}$$

[using code from P7]

(g) $P(KM|S) = \boxed{0.671}$

[using code from P7]

* code files attached -
 "p6_bn.txt"
 "p6_in.txt"