

Question 1

(a)

$$\text{Info}(D) = -\frac{1}{2} \log_2 \frac{1}{2} - \frac{1}{2} \log_2 \frac{1}{2} = 1$$

$$\begin{aligned} \text{Info}_{\text{univ}}(D) &= \frac{5}{12} \left(-\frac{3}{5} \log_2 \frac{3}{5} - \frac{2}{5} \log_2 \frac{2}{5} \right) + \frac{3}{12} \left(-\frac{2}{3} \log_2 \frac{2}{3} - \frac{1}{3} \log_2 \frac{1}{3} \right) \\ &\quad + \frac{4}{12} \left(-\frac{1}{4} \log_2 \frac{1}{4} - \frac{3}{4} \log_2 \frac{3}{4} \right) = 0.9046 \end{aligned}$$

$$\text{Gain}(\text{univ}) = \text{Info}(D) - \text{Info}_{\text{univ}}(D) = 0.0954$$

(b)

$$\text{gini}(D) = 1 - \left(\frac{1}{2} \right)^2 - \left(\frac{1}{2} \right)^2 = 0.5$$

$$\text{gini}_{\text{published}}(D) = \frac{5}{12} \left(1 - \left(\frac{2}{5} \right)^2 - \left(\frac{3}{5} \right)^2 \right) + \frac{7}{12} \left(1 - \left(\frac{3}{7} \right)^2 - \left(\frac{4}{7} \right)^2 \right) = 0.4857$$

$$\Delta \text{gini}(\text{univ}) = \text{gini}(D) - \text{gini}_{\text{published}}(D) = 0.0143$$

Question 2

(a)

$$P(\text{accepted}=\text{yes})=0.5$$

$$P(\text{accepted}=\text{no})=0.5$$

(b)

$$P(\text{GPA}=4.0 | \text{accepted}=\text{yes})=0.5$$

$$P(\text{GPA}=3.7 | \text{accepted}=\text{yes})=0.5$$

$$P(\text{GPA}=3.5 | \text{accepted}=\text{yes})=0$$

$$P(\text{univ}=\text{top-10} | \text{accepted}=\text{yes})=0.5$$

$$P(\text{univ}=\text{top-20} | \text{accepted}=\text{yes})=1/3$$

$$P(\text{univ}=\text{top-30} | \text{accepted}=\text{yes})=1/6$$

$$P(\text{published=yes} | \text{accepted=yes})=0.5$$

$$P(\text{published=no} | \text{accepted=yes})=0.5$$

$$P(\text{recommendation=good} | \text{accepted=yes})=5/6$$

$$P(\text{recommendation=normal} | \text{accepted=yes})=1/6$$

(c)

$$P(\text{GPA}=4.0 | \text{accepted=no})=0$$

$$P(\text{GPA}=3.7 | \text{accepted=no})=1/3$$

$$P(\text{GPA}=3.5 | \text{accepted=no})=2/3$$

$$P(\text{univ=top-10} | \text{accepted=no})=1/3$$

$$P(\text{univ=top-20} | \text{accepted=no})=1/6$$

$$P(\text{univ=top-30} | \text{accepted=no})=1/2$$

$$P(\text{published=yes} | \text{accepted=no})=1/3$$

$$P(\text{published=no} | \text{accepted=no})=2/3$$

$$P(\text{recommendation=good} | \text{accepted=no})=1/2$$

$$P(\text{recommendation=normal} | \text{accepted=no})=1/2$$

(d)

$$X1 = (\text{GPA}=3.7, \text{university=top-20}, \text{published=yes}, \text{recommendation=good})$$

$$P(X1 | \text{accepted=yes}) = 0.5 * 1/3 * 0.5 * 5/6 = 0.0694$$

$$P(X1 | \text{accepted=no}) = 1/3 * 1/6 * 1/3 * 1/2 = 0.00925$$

$$\begin{aligned} P(X1) &= P(X1 | \text{accepted=yes}) * P(\text{accepted=yes}) + P(X1 | \text{accepted=no}) * P(\text{accepted=no}) \\ &= 0.0393 \end{aligned}$$

$$P(\text{accepted} = \text{yes} | X1) = \frac{P(X1 | \text{accepted} = \text{yes}) * P(\text{accepted} = \text{yes})}{P(X1)}$$

$$= \frac{0.0694 * 0.5}{0.0393} = 0.8829$$

X2= (GPA=3.7, university=top-30, publication=no, recommendation=normal)

$$P(X2 | \text{accepted} = \text{yes}) = 0.5 * 1/6 * 0.5 * 1/6 = 0.00694$$

$$P(X2 | \text{accepted} = \text{no}) = 1/3 * 1/2 * 2/3 * 1/2 = 0.0555$$

$$P(X2) = P(X2 | \text{accepted} = \text{yes}) * P(\text{accepted} = \text{yes}) + P(X2 | \text{accepted} = \text{no}) * P(\text{accepted} = \text{no})$$

$$= 0.03122$$

$$P(\text{accepted} = \text{yes} | X2) = \frac{P(X2 | \text{accepted} = \text{yes}) * P(\text{accepted} = \text{yes})}{P(X2)}$$

$$= \frac{0.00694 * 0.5}{0.03122} = 0.1111$$

Question 3

(a)

C1:

a:4 b:4 c:3 d:3 e:3 f:3

L1:

a:4 b:4 c:3 d:3 e:3 f:3

(b)

C2:

aa:1 ab:2 ac:2 ad:2 ae:3 af:3

ba:1 bb:1 bc:1 bd:3 be:3 bf:3

ca:2 cb:1 cd:3 ce:3 cf:3

da:1 db:1 de:2 df:3

ef:3

(ab):1 (ad):1 (bc):2 (de):1

L2:

ae:3 af:3 bd:3 be:3 bf:3 cd:3 ce:3 cf:3 df:3 ef:3

(c)

C3:

aef:3 bdf:3 bef:3 cdf:3 cef:3

L3:

aef:3 bdf:3 bef:3 cdf:3 cef:3

Then, the algorithm terminates.