### Assignment 2

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## 1 problem 2

#### 1.1 a.

We claim the provided tree correctly categorize the provided example since every example can be inducted from this decision tree. Like GPA above 3.6 is P and below 3.3 is N, then with publication P,otherwise check University Rank, Only rank 2 will be P,other ranks are N. And recommendation doesn't matter.

#### 1.2 b.

#### Step I

$$I(\frac{6}{12},\frac{6}{12})=1$$

GPA: [3.9, 4.0] 3(PPP), (3.2, 3.9) 5(PPPNN), [3.0, 3.2] 4(NNNN)

University: Rank 1— 5(PPPNN),Rank 2— 3(PPN), Rank 3—

4(PNNN)

Publication: Yes 5(PPPNN) , No 7(PPPNNNN)

Recommendation: good 8(PPPPNNN), normal 4(PNNN)

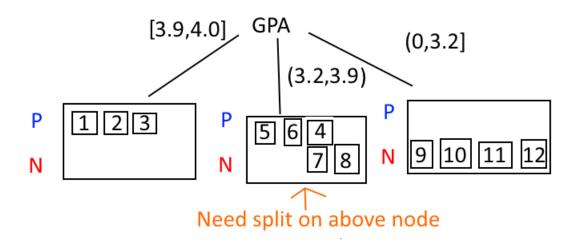
$$\begin{aligned} & \operatorname{Gain}(\operatorname{GPA}) = 1 - \left[ \frac{3}{12} \operatorname{B}\left(\frac{3}{3}\right) + \frac{5}{12} \operatorname{B}\left(\frac{3}{5}\right) + \frac{4}{12} \operatorname{B}\left(\frac{0}{4}\right) \right] = 1 - \left[ 0.0 + 0.404562747689 + 0.0 \right] \\ &= 0.595437252311 \end{aligned}$$

$$\begin{aligned} & Gain(University) \! = \! 1 \text{-} [\tfrac{5}{12} \ B(\tfrac{3}{5}) \! + \! \tfrac{3}{12} \ B(\tfrac{2}{3}) \! + \! \tfrac{4}{12} \ B(\tfrac{1}{4})] \! = \\ & 1 \text{-} [0.404562747689 \! + \! 0.229573958514 \! + \! 0.270426041486] = \! 0.095437252395 \end{aligned}$$

Gain(Publication)=1- $\left[\frac{5}{12} B\left(\frac{3}{5}\right) + \frac{7}{12} B\left(\frac{3}{7}\right)\right]$ =1- $\left[0.404562747689 + 0.574716412687\right]$ = 0.020720839624

Gain(Recommendation)= 
$$1-\left[\frac{8}{12}B\left(\frac{5}{8}\right)+\frac{4}{12}B\left(\frac{1}{4}\right)\right]=1-\left[0.636289335283+0.270426041486\right]=0.093284623231$$

So we pick GPA as the best Gain attribute in this level



# Step II

$$I(\frac{2}{5}, \frac{3}{5}) = 0.970950594455$$

University: Rank 1— 2(PN), Rank 2— 1(P), Rank 3— 2(PN)

Publication: Yes 2(PP), No 3(PNN) Recommendation: good 5(PPPNN)

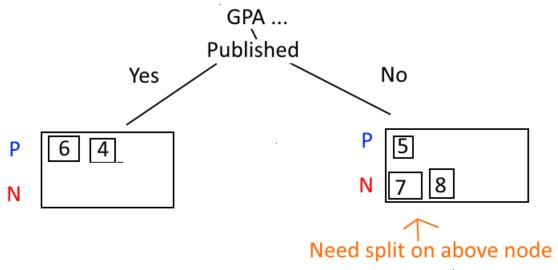
 $\begin{array}{l} Gain(University) = 0.970950594455 - [\frac{2}{5} \ B(\frac{1}{2}) + \frac{1}{5} \ B(\frac{1}{1}) + \frac{2}{5} \ B(\frac{1}{2})] = \\ 0.970950594455 - [0.4 + 0.0 + 0.4] = 0.170950594455 \end{array}$ 

Gain(Publication)=0.970950594455- $\left[\frac{3}{5} B\left(\frac{1}{3}\right) + \frac{2}{5} B\left(\frac{2}{2}\right)\right]$ =0.970950594455- $\left[0.550977500433 + 0.0\right]$ = 0.419973094022

Gain(Recommendation)=0.970950594455- $\left[\frac{5}{5} B\left(\frac{3}{5}\right)\right]$ =0.970950594455-

[0.970950594455 + 0.0 + 0.0] = 0

So we pick Publication as the best Gain attribute in this level



# Step III

$$I(\frac{1}{3}, \frac{2}{3}) = 0.918295834054$$

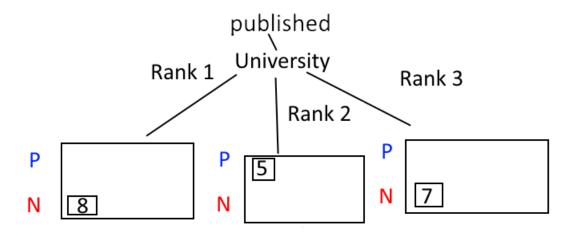
University: Rank 1 — 1(N), Rank 2 — 1(P), Rank 3 — 1(N)

Recommendation: good 3(PNN)

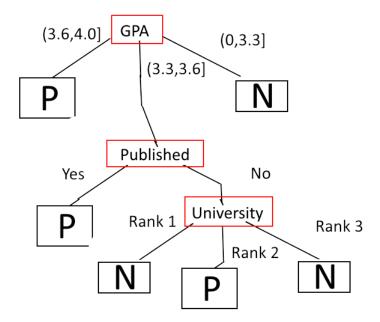
 $Gain(University) = 0.918295834054 - \left[\frac{1}{3} B(\frac{0}{1}) + \frac{1}{3} B(\frac{1}{1}) + \frac{1}{3} B(\frac{0}{1})\right] = 0.918295834054 - \left[0.0 + 0.0 + 0.0\right] = 0.918295834054$ 

Gain(Recommendation)=0.918295834054-[ $\frac{3}{3}$  B( $\frac{1}{3}$ )]=0.918295834054-[0.918295834054]= 0

So we pick University as the best Gain attribute in this level



And the final tree to be returned is



### 1.3 c.

The decision tree we got from b. is same from the provided one. This is not coincidence, it is believed both tree is generated by applying the decision tree algorithm.

# 2 problem 3

## 2.1 a.

