

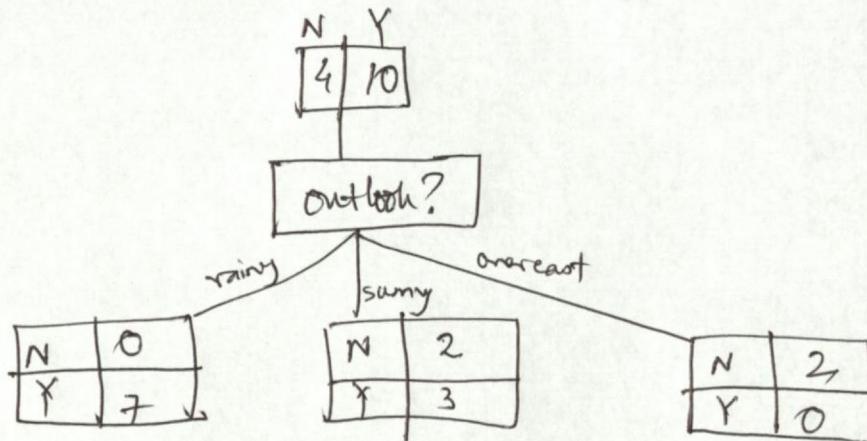
Ans to 1(a)

Gini

The goal is to maximize gain i.e. minimize gini for a selection of split

Step-1:-

For attribute outlook, multi-way split has the lowest weighted gini (0.1714). The gini index for split combinations {sunny, overcast + rainy} {sunny + overcast, rainy}, and {overcast, sunny + rainy} are respectively 0.3936, 0.2448, 0.2381



Step-2:-

The splits for humidity has the smallest gini index; so the tree becomes:

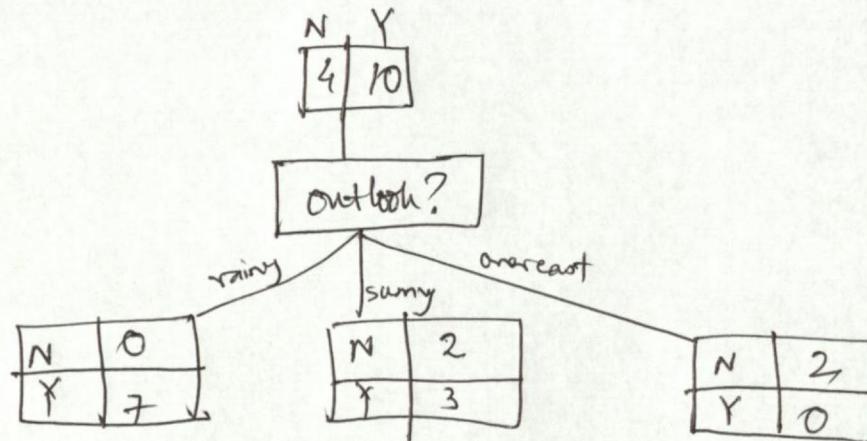
Ans to 1(a)

Gini

The goal is to maximize gain i.e. minimize gini for a selection of split

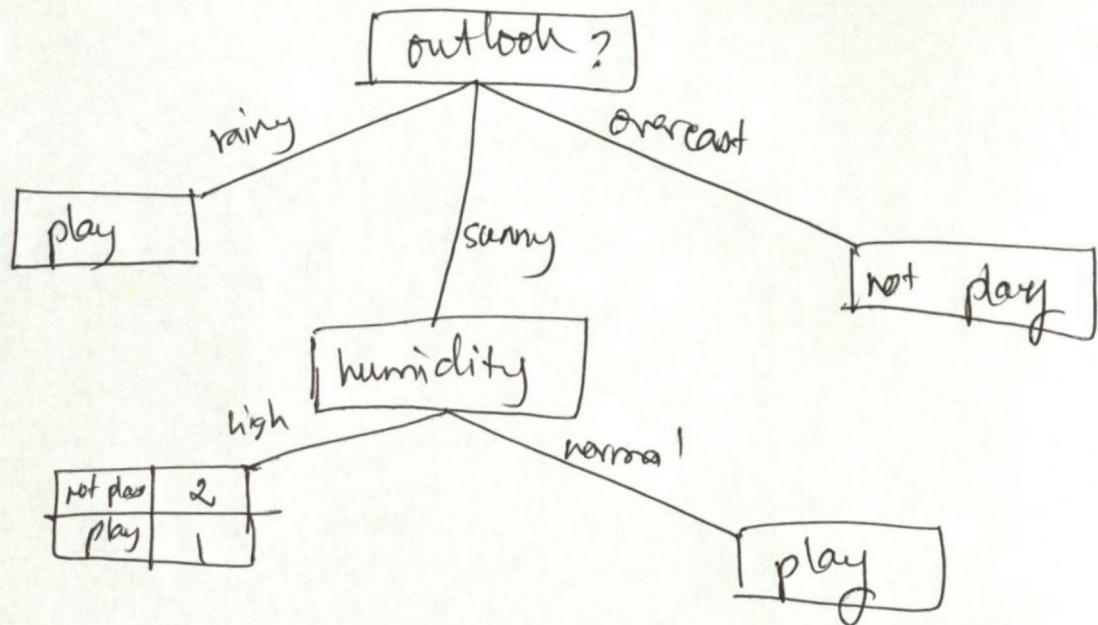
Step-1:-

For attribute outlook, multi-way split has the lowest weighted gini (0.1714). The gini index for split combinations {sunny, overcast}, rainy, {sunny, overcast, rainy}, and {overcast, sunny, rainy} are respectively 0.3936, 0.2448, 0.2381



Step-2:-

The splits for humidity has the smallest gini index; so the tree becomes:



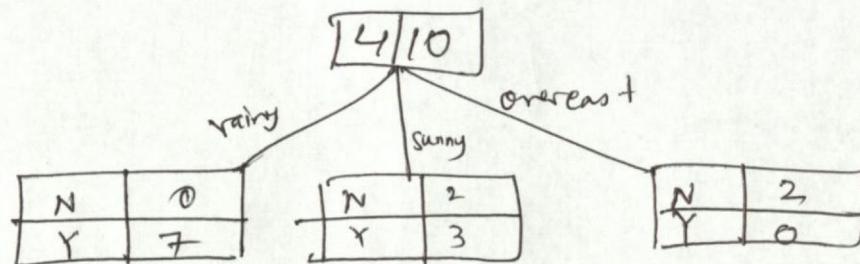
Ans. to 1(a)

Entropy

Step-1 :-

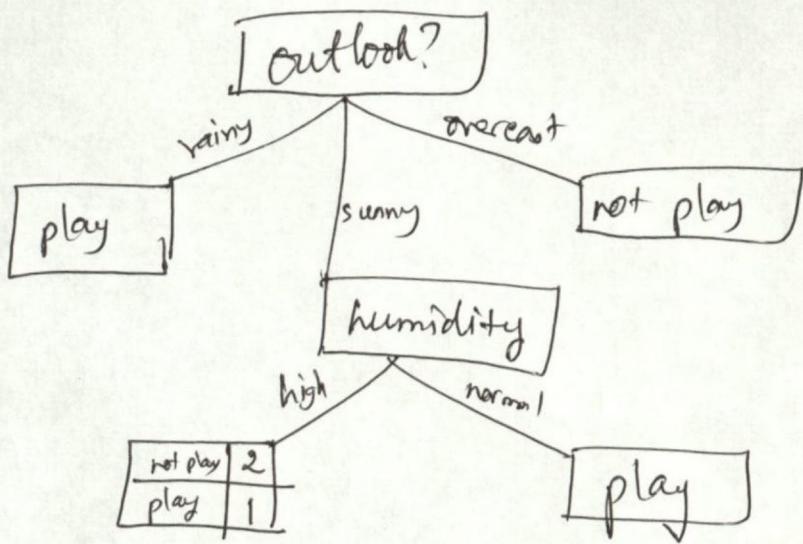
The entropy for the two classes initially is 1.052; a split that maximizes gain, will be selected

for attribute outlook, with splits {overcast, sunny, rainy} gives the lowest entropy than other splits (0.528792), such as {overcast + rainy, sunny}, {sunny + overcast, rainy} and {overcast, rainy + sunny}. So the tree becomes



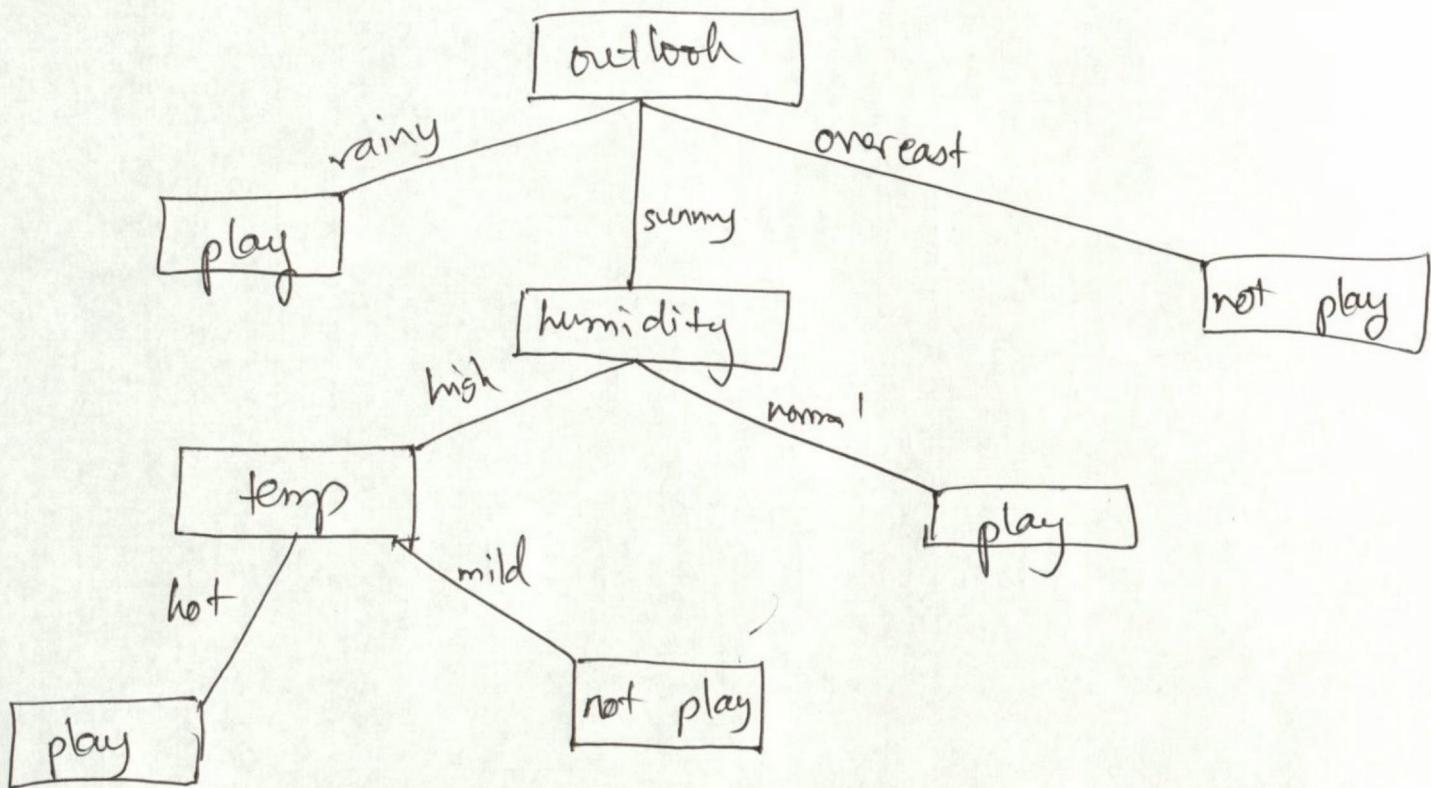
Step-2:-

For attribute humidity we have one possible split that has the entropy of 0.91829 so, the tree becomes



Step-3:-

For attribute temp, the multi-split gives the smallest entropy and the final tree is



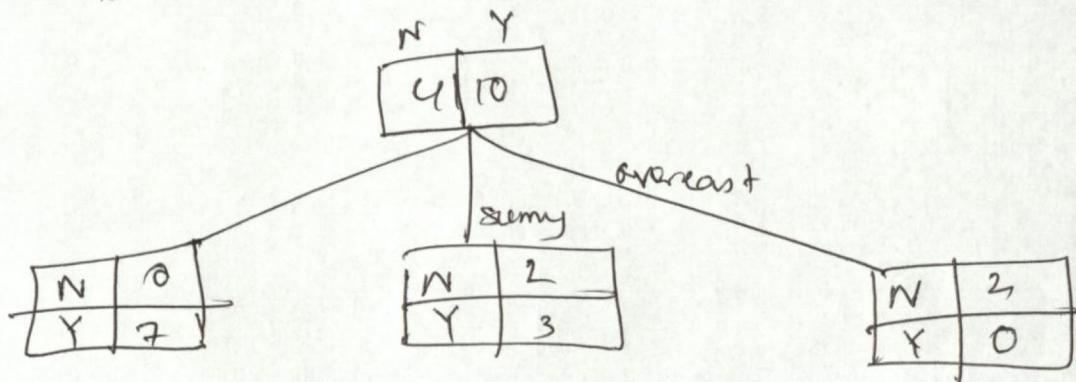
Ans. to Q 1(a)

classification error!:-

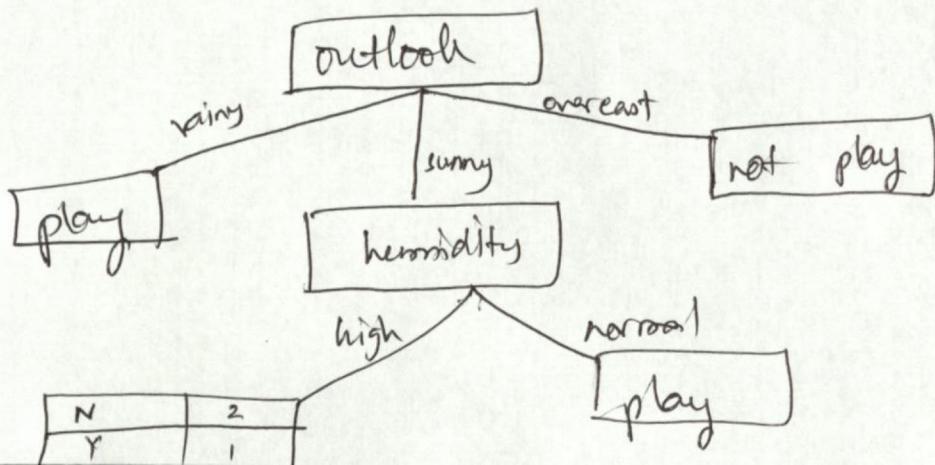
Step-1:-

For attribute outlook, with splits {overcast, sunny, rainy} gives the smallest classification error ( $0.07142$ ) from other splits such as {overcast + sunny, rainy}, {overcast, sunny + rainy}, and {sunny, overcast + rainy}.

The tree becomes

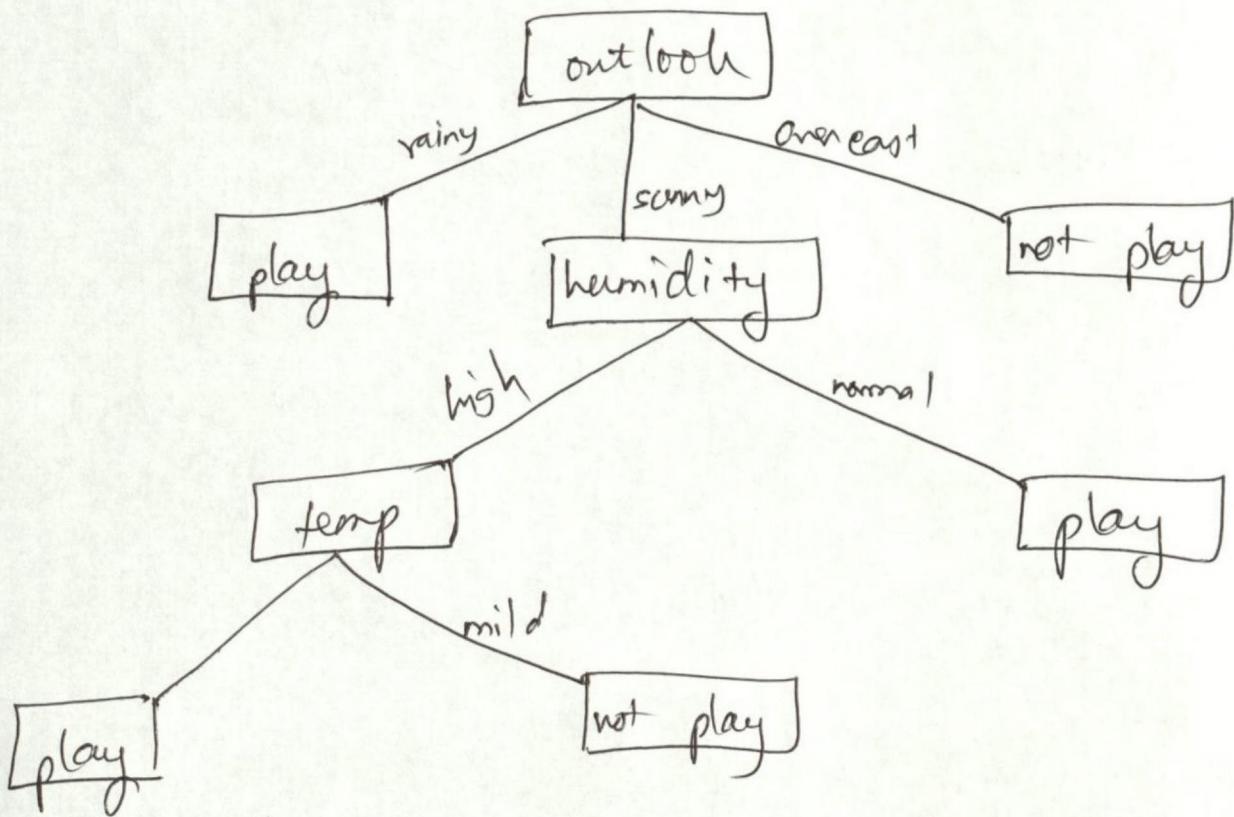


Step-2:- For attribute humidity we have one possible split that has the classification error of  $\frac{1}{5}$ , so the tree becomes,



Step-3:-

For attribute temp, the multi-split gives the strongest classification, and the final tree is



Ans. to. 1(b)

indi. class accuracy for 'play' =  $\frac{10}{10} = 100\%$ .

indi. .. .. .. 'not play' =  $\frac{3}{4} = 75\%$ .

overall class accuracy =  $\frac{13}{14} = 92.85\%$ .

Ans. to. 1(c)

	Gini index	Entropy	Mis. classification error
1	Not play	Not play	Not play
2	Not play	Not play	Not play
3	Play	play	play
4	play	play	play
5	play	play	play

Ans. to. 2(a)

optimistic generalization error rate =  $\frac{26}{100} = 0.26$

pessimistic " " " " =  $\frac{26 + 6 \times 12}{100} = 0.38$

Ans. to 2(b)

Error rate for test set =  $\frac{21}{50} = 0.42$

Ans. to 2(c)

optimistic general error rate =  $\frac{32}{100} = 0.32$

pessimistic " " " " =  $\frac{32 + 9 \times 2}{100} = 0.40$

Error rate for test set =  $\frac{14}{50} = 0.28$

Ans to Q6:-

Three circles were misclassified as squares  
One square was " . circle

$$\text{Error rate} = \frac{3+1}{20} = 20\%$$

Ans to Q3:-

a.  $P(\text{play} = \text{yes}) = \frac{10}{14}$ ,  $P(\text{play} = \text{no}) = \frac{4}{14}$

as,  $P(\text{play} = \text{yes}) > P(\text{play} = \text{no})$ , will play

b.

$$P(\text{play} = \text{yes} | \text{humidity} = \text{normal} \wedge \text{temp} = \text{mild} \wedge \text{outlook} = \text{sunny})$$

$$= P(\text{humidity} = \text{normal} | \text{play} = \text{yes}) \times P(\text{temp} = \text{mild} | \text{play} = \text{yes})$$

$$\times P(\text{outlook} = \text{sunny} | \text{play} = \text{yes})$$

$$= \frac{6}{10} \times \frac{4}{10} \times \frac{3}{10} = 0.072$$

$$P(\text{play} = \text{no} | \text{humidity} = \text{normal} \wedge \text{temp} = \text{mild} \wedge \text{outlook} = \text{sunny})$$

$$= P(\text{humidity} = \text{normal} | \text{play} = \text{no}) \times P(\text{temp} = \text{mild} | \text{play} = \text{no}) \times$$

$$P(\text{outlook} = \text{sunny} | \text{play} = \text{no}) = \frac{1}{4} \times \frac{2}{4} \times \frac{2}{4} = 0.0625$$

as the probability score is higher for playing,  
so will play

c.

$$P(\text{play} = \text{yes} | \text{temp} = \text{mild}) = \frac{P(\text{temp} = \text{mild} | \text{play} = \text{yes}) * P(\text{play} = \text{yes})}{P(\text{temp} = \text{mild})}$$

$$= \frac{\frac{9}{10} * \frac{10}{14}}{\frac{6}{14}} = 0.47619$$

$$P(\text{play} = \text{no} | \text{temp} = \text{mild}) = \frac{P(\text{temp} = \text{mild} | \text{play} = \text{no}) * P(\text{play} = \text{no})}{P(\text{temp} = \text{mild})}$$

$$= 0.333$$

as the prob. score is higher for playing, will play.

d.

$$P(\text{play} = \text{yes} | \text{temp} = \text{mild} \wedge \text{humidity} = \text{high})$$

$$= P(\text{temp} = \text{mild} | \text{play} = \text{yes}) * P(\text{humidity} = \text{high} | \text{play} = \text{yes})$$

$$= 0.16$$

$$P(\text{play} = \text{no} | \text{temp} = \text{mild} \wedge \text{humidity} = \text{high})$$

$$= P(\text{temp} = \text{mild} | \text{play} = \text{no}) * P(\text{humidity} = \text{high} | \text{play} = \text{no})$$

$$= \frac{2}{11} * \frac{3}{4} = 0.375$$

as prob. for not playing is higher, will not play

e.

$$P(\text{play} = \text{yes} | \text{outlook} = \text{overcast} \wedge \text{temp} = \text{mild} \wedge \text{humidity} = \text{high})$$

$$= P(\text{overcast} \mid \text{play}=\text{yes}) * P(\text{mild} \mid \text{play}=\text{yes}) * P(\text{humidity-high} \mid \text{play}=\text{yes})$$
$$= \frac{0}{10} * \frac{4}{10} * \frac{4}{10} = 0$$

$P(\text{play}=\text{no} \mid \text{outlook}=\text{overcast} \wedge \text{temp}=\text{mild} \wedge \text{humidity-high})$

$$= P(\text{outlook}=\text{overcast} \mid \text{play}=\text{no}) * P(\text{mild} \mid \text{play}=\text{no}) * P(\text{humidity-high} \mid \text{play}=\text{no})$$

$$= \frac{2}{4} * \frac{2}{4} * \frac{3}{4} = 0.1875$$

Will not play, as prob. for not playing is higher.

As there were no entries for outlook=overcast,  
for play=yes, the conditional prob. was zero;  
one way to solve this is to use Laplace  
(add-one) smoothing to the numerator

$$= P(\text{overcast} \mid \text{play}=\text{yes}) \times P(\text{mild} \mid \text{play}=\text{yes}) \times P(\text{humidity-high} \mid \text{play}=\text{yes})$$
$$= \frac{0}{10} \times \frac{4}{10} \times \frac{4}{10} = 0$$

$P(\text{play}=\text{no} \mid \text{outlook}=\text{overcast} \wedge \text{temp}=\text{mild} \wedge \text{humidity-high})$

$$= P(\text{outlook}=\text{overcast} \mid \text{play}=\text{no}) \times P(\text{mild} \mid \text{play}=\text{no}) \times P(\text{humidity-high} \mid \text{play}=\text{no})$$
$$= \frac{2}{4} \times \frac{2}{4} \times \frac{3}{4} = 0.1875$$

Will not play, as prob. for not playing is higher.

As there were no entries for outlook=overcast, for play=yes, the conditional prob. was zero; one way to solve this is to use Laplace (add-one) smoothing to the numerator

Ans- to Q4

attribute temp:-

	play = yes	play = no
hot	3	1
cool	3	1
mild	4	2

R1:-

if temp = hot then play  
 elseif temp = cool then play  
 elseif temp = mild then play

$$\text{accuracy} = 0.71428$$

attribute:- outlook:-

R2:-

if outlook = sunny, then play  
 elseif outlook = overcast, then dont play  
 elseif outlook = rainy, then play

	play = yes	play = no
sunny	3	2
overcast	0	2
rainy	7	0

$$\text{accuracy} = 0.85714$$

attribute = humidity

if humidity = high then play  
 " " = normal then play

$$\text{accuracy} = 0.71428$$

The best attribute is 'outlook', as it has the  
smallest total error rate = 0.14286

The best attribute is 'outlook', as it has the  
smallest total error rate = 0.14286

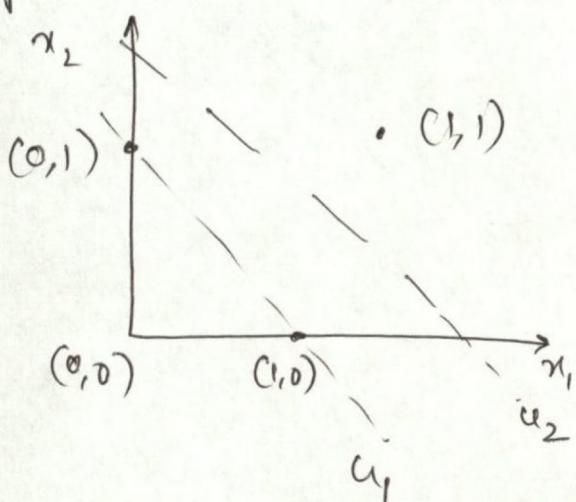
The best attribute is 'outlook', as it has the  
smallest total error rate = 0.14286

The best attribute is 'outlook', as it has the  
smallest total error rate = 0.14286

Anoto. Q5)-

The added neuron will solve the XOR problem

Hyperplanes:-



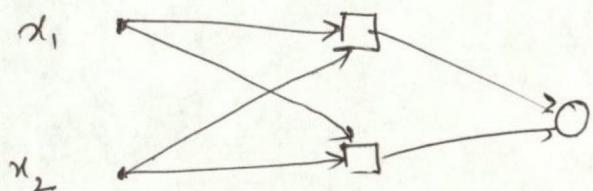
for 1<sup>st</sup> neuron:-

$$u_1 = b_1 + w_{11}x_1 + w_{12}x_2 > 0$$

for 2<sup>nd</sup> neuron:-

$$u_2 = b_2 + w_{21}x_1 + w_{22}x_2 < 0$$

Network:-



weights:-

$$w_{11} = -1$$

$$w_{21} = 1$$

$$b_1 = -\frac{1}{2}$$

$$w_{21} = 1$$

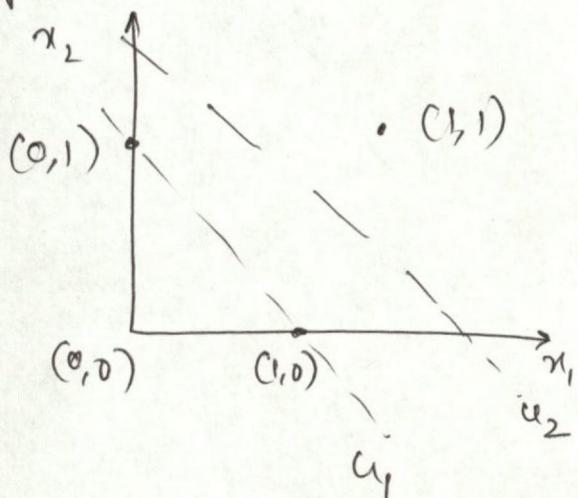
$$w_{22} = -1$$

$$b_2 = -\frac{1}{2}$$

Anso. Q 5)-

The added neuron will solve the XOR problem

Hyperplanes:-



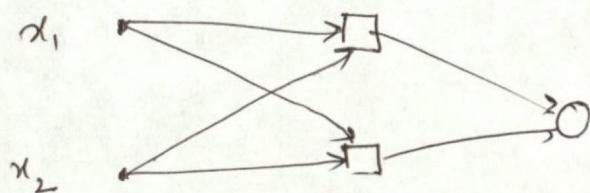
for 1<sup>st</sup> neuron:-

$$u_1 = b_1 + w_{11}x_1 + w_{12}x_2 > 0$$

for 2<sup>nd</sup> neuron:-

$$u_2 = b_2 + w_{21}x_1 + w_{22}x_2 < 0$$

Network:-



weights:-

$$w_{11} = -1$$

$$w_{21} = 1$$

$$w_{12} = 1$$

$$w_{22} = -1$$

$$b_1 = -\frac{1}{2}$$

$$b_2 = -\frac{1}{2}$$