

# Machine Data and Learning-Assignment 4

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## Question to do → Question 8

Following is the question table after modification:

| Country | Flu/Cough | SFT | Positive Case |
|---------|-----------|-----|---------------|
| China   | Yes       | Yes | No            |
| China   | Yes       | No  | Yes           |
| China   | No        | Yes | Yes           |
| Italy   | Yes       | No  | No            |
| Italy   | Yes       | Yes | Yes           |
| Italy   | No        | Yes | Yes           |
| India   | Yes       | Yes | Yes           |
| India   | Yes       | No  | Yes           |
| India   | No        | No  | No            |
| USA     | No        | Yes | Yes           |
| USA     | Yes       | No  | No            |

## Theory :

Following are the concepts, formulas and notations used in this report→

- $$E = -p(+) * \log(p(+)) - p(-) * \log(p(-))$$

- Here  $p(-)$  refers to the negative booleans or the number of options in negative for the event and vice versa for  $p(+)$
- This formula is analogous to :  $B(q) = -(q \log_2 q + (1 - q) \log_2 (1 - q))$
- $Avg E = n_1/n * E_1 + n_2/n * E_2 + n_3/n * E_3 \dots$
- $Gain(E) = E(parent) - E(Avg E)$

where  $E_i$  is the entropy of the  $i$ th child of the node we want to calculate Avg E for.  $n_i$  is the number of entries in the  $i$ th child and  $n$  is the total entries in parent.

## Solution:

### Level 0 choice:

$E(Parent) \rightarrow$  Here the parent is the entire class attribute or the entire output from the training set.

So

$n(No)=4$  ,  $n(Yes)=7$

So  $E(Parent)= 0.94566$

$F[0] \rightarrow Country$

$Avg E(Country)= (3/11 * E(China) ) + (3/11 * E(Italy)) + (3/11 * E(India)) + (2/11 * E(USA))$

$\rightarrow E(China) \Rightarrow n(No)=1$  ,  $n(Yes)=2$

◆  $E(China)=0.918295$

$\rightarrow E(Italy) \Rightarrow n(No)=1$  ,  $n(Yes)=2$

◆  $E(Italy)=0.918295$

$\rightarrow E(India) \Rightarrow n(No)=1$  ,  $n(Yes)=2$

◆  $E(India)=0.918295$

$\rightarrow E(USA) \Rightarrow n(No)=1$  ,  $n(Yes)=1$

◆  $E(USA)=1$

Gain =0.0125

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### F[1] → Flu/Cough

$$\text{Avg } E(\text{Flu/Cough}) = (7/11 * E(\text{Yes})) + (4/11 * E(\text{No}))$$

$$\rightarrow E(\text{Yes}) \Rightarrow n(\text{No})=3, n(\text{Yes})=4$$

$$\blacklozenge E(\text{Yes})=0.98523$$

$$\rightarrow E(\text{No}) \Rightarrow n(\text{No})=1, n(\text{Yes})=3$$

$$\blacklozenge E(\text{No})=0.811278$$

$$\text{Gain} = 0.023689$$

### F[2] → SFT

$$\text{Avg } E(\text{SFT}) = (6/11 * E(\text{Yes})) + (5/11 * E(\text{No}))$$

$$\rightarrow E(\text{Yes}) \Rightarrow n(\text{No})=1, n(\text{Yes})=5$$

$$\blacklozenge E(\text{Yes})=0.65002$$

$$\rightarrow E(\text{No}) \Rightarrow n(\text{No})=3, n(\text{Yes})=2$$

$$\blacklozenge E(\text{No})=0.970951$$

$$\text{Gain} = 0.149762$$

**Conclusion** → Now we have **SFT** with the maximum gain so it will become the root node now and its children will act as the parents for the further levels.

So splitting of the parameter of SFT

### **Level 1 choice(SKf):**

**Parents → Yes and No**

**SO when Parent is Yes →**

**Level 1 → SubLevel 0 ⇒ choice(SKf="Yes"):**

$$E(\text{Parent}) \rightarrow E(\text{Yes}) = 0.65002$$

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### F[0] → Country

Avg E(Country)(given → SKF="YES")= (2/6 \* E(China) ) + (2/6 \* E(Italy)) + (1/6 \* E(India)) + (1/6 \* E(USA))

→ E(China) ⇒ n(No)=1 , n(Yes)=1

◆ E(China)=1

→ E(Italy) ⇒ n(No)=0 , n(Yes)=2

◆ E(Italy)=0

→ E(India) ⇒ n(No)=0 , n(Yes)=1

◆ E(India)=0

→ E(USA) ⇒ n(No)=0 , n(Yes)=1

◆ E(USA)=0

Gain=0.31668

### F[1] → Flu/Cough

Avg E(Flu/Cough)(given → SKF="YES")= (3/6 \* E(Yes) ) + (3/6 \* E(No))

→ E(Yes) ⇒ n(No)=1 , n(Yes)=2

◆ E(Yes)=0.918295

→ E(No) ⇒ n(No)=0 , n(Yes)=3

◆ E(No)=0

Gain =0.1908725

**Conclusion**→ Now we have **Country** with the maximum gain so it will become the root node now and its children will act as the parents for the further levels. And the sub level is still the **Yes** Of SFT.

### **Level 1 → SubLevel 0 → Level 2 ⇒ Choice (country):**

Parents which are available are China , Italy , India and the USA.

Except China, all others are pure, so no more splitting, and we select the only valid parent which is China.

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$$E(\text{Parent}) = E(\text{China}) = 1$$

F[1] → Flu/Cough

$$\text{Avg } E(\text{Flu/Cough})(\text{given} \rightarrow \text{SKF}=\text{"YES"} \text{ and Country}=\text{China}) = (1/2 * E(\text{Yes})) + (1/2 * E(\text{No}))$$

$$\rightarrow E(\text{Yes}) \Rightarrow n(\text{No})=1, n(\text{Yes})=0$$

$$\blacklozenge E(\text{Yes})=0$$

$$\rightarrow E(\text{No}) \Rightarrow n(\text{No})=0, n(\text{Yes})=1$$

$$\blacklozenge E(\text{No})=0$$

$$\text{Gain} = 1$$

**Conclusion-** This is the final level since all the nodes are pure for this sublevel. Now we move towards the next sublevel i.e No for SFT.

**NOW when Parent is No →**

**Level 1 → SubLevel 1 choice(SKf="No"):**

$$E(\text{Parent}) \rightarrow E(\text{No}) = 0.970951$$

F[0] → Country

$$\text{Avg } E(\text{Country})(\text{given} \rightarrow \text{SKF}=\text{"No"}) = (1/5 * E(\text{China})) + (1/5 * E(\text{Italy})) + (2/5 * E(\text{India})) + (1/5 * E(\text{USA}))$$

$$\rightarrow E(\text{China}) \Rightarrow n(\text{No})=0, n(\text{Yes})=1$$

$$\blacklozenge E(\text{China})=0$$

$$\rightarrow E(\text{Italy}) \Rightarrow n(\text{No})=1, n(\text{Yes})=0$$

- ◆  $E(\text{Italy})=0$
- $E(\text{India}) \Rightarrow n(\text{No})=1, n(\text{Yes})=1$
- ◆  $E(\text{India})=1$
- $E(\text{USA}) \Rightarrow n(\text{No})=1, n(\text{Yes})=0$
- ◆  $E(\text{USA})=0$

Gain=0.570951

#### F[1] → Flu/Cough

Avg  $E(\text{Flu/Cough})(\text{given} \rightarrow \text{SKF}=\text{"No"}) = (4/5 * E(\text{Yes})) + (1/5 * E(\text{No}))$

- $E(\text{Yes}) \Rightarrow n(\text{No})=2, n(\text{Yes})=2$
- ◆  $E(\text{Yes})=1$
- $E(\text{No}) \Rightarrow n(\text{No})=1, n(\text{Yes})=0$
- ◆  $E(\text{No})=0$

Gain=0.170951

**Conclusion**→ Now we have **Country** with the maximum gain so it will become the root node now and its children will act as the parents for the further levels. And the sub level is still the **No** Of SFT.

#### **Level 1 → SubLevel 1 → Level 2 choice(Country):**

Parents which are available are China , Italy , India and the USA.

Except India, all others are pure, so no more splitting, and we select the only valid parent which is India.

$E(\text{Parent}) = E(\text{India}) = 1$

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F[1] → Flu/Cough

Avg E(Flu/Cough)(given → SKF="No" and Country=India)=  $(1/2 * E(\text{Yes}) ) + (1/2 * E(\text{No}))$

→  $E(\text{Yes}) \Rightarrow n(\text{No})=0, n(\text{Yes})=1$

◆  $E(\text{Yes})=0$

→  $E(\text{No}) \Rightarrow n(\text{No})=1, n(\text{Yes})=0$

◆  $E(\text{No})=0$

Gain =1

Max Gain is also 1. But we have reached the terminal stage.

**Conclusion** - Now all nodes are pure thus this is the final level.

**So Our decision tree will have 3 levels.**

**Following is the script used for calculating entropy.**

```
entropy.py ×
home > anubhav > entropy.py > ...
1  import math
2  val=input("enter the number p ")
3  val2=input("enter the number n ")
4  val=float(val)
5  val2=float(val2)
6
7  prob = val/(val+val2)
8  part1=(prob)*(math.log(prob,2)) + (1-prob)*(math.log((1-prob),2))
9  part1*=-1
10
11  print(part1)
12
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**Decision TREE →**

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