

## 1.RANDOM FOREST CLASSIFICATION

Confusion matrix:-

[78 7]

[6 43]

T(Purchased) =43; F(Purchased)=6; T(Not Purchased)=78; F(Not Purchased)=7; Total count of Purchased **TC(P)**=49; Total count of Not Purchased **TC(NP)**=85; Total Count of the Purchased & Non Purchased **TC(P+NP)**=134

QUESTIONS:-

1.What is the percentage of correct classification of both(purchased and not purchased) to the total input of the test set?

$$\begin{aligned}\text{Accuracy} &= \text{TP} + \text{TN} / \text{TP} + \text{TN} + \text{FP} + \text{FN} \\ &= (78 + 43) / (78 + 43 + 7 + 6)\end{aligned}$$

Accuracy=0.90

2.What is the percentage of correct classification of purchased to the total input of purchased in the test set?

$$\begin{aligned}\text{Recall} &= \text{T(P)} / (\text{Total count of purchased}) \\ &= 43 / 43 + 6\end{aligned}$$

Recall=0.87

3.What is the percentage of correct classification of Not Purchased to the total input of not purchased in the test set?

$$\begin{aligned}\text{Recall} &= \text{T(NP)} / \text{Total count of Not Purchased} \\ &= 78 / 78 + 7\end{aligned}$$

Recall=0.92

4. What is the percentage of correct classification of Purchased to sum of correctly classified as Purchased and wrongly classified as Purchased in the test set?

$$\text{Precision} = \text{T(P)} / [\text{T(P)} + \text{F(NP)}]$$

$$= 43 / 43+7$$

Precision=0.86

**5. What is the percentage of correct classification of Not Purchased to sum of correctly classified as Not Purchased and wrongly classified as Not Purchased in the test set?**

$$\text{Precision} = T(\text{NP}) / [T(\text{NP}) + F(\text{P})]$$

$$= 78 / 78+6$$

Precision=0.92

**6. What is the overall performance of Purchased?**

$$\text{F1 Measure Purchased} = (2 * [\text{Recall [P]} * \text{Precision [P]}] / [\text{Recall [P]} + \text{Precision [P]}])$$

$$= (2 * 0.87 * 0.86) / (0.87 + 0.86)$$

F1 Measure Purchased=0.86

**7. What is the overall performance of Not Purchased?**

$$\text{F1 Measure Not Purchased} = (2 * [\text{Recall [NP]} * \text{Precision [NP]}] / [\text{Recall [NP]} + \text{Precision [NP]}])$$

$$= (2 * [0.92 * 0.92] / [0.92 + 0.92])$$

F1 Measure [NP] = 0.91

**8. What is the average performance of Precision (correctly and wrongly classified)?**

$$\text{Macro Average Precision} = [\text{Precision [P]} + \text{Precision [NP]}] / 2$$

$$= [0.86 + 0.92] / 2$$

Macro Average Precision = 0.89

**9. What is the average performance of Recall (correctly and wrongly classified)?**

$$\text{Macro Average Recall} = [\text{Recall [P]} + \text{Recall [NP]}] / 2$$

$$= [0.87 + 0.92] / 2$$

Macro Average Recall = 0.89

**10. What is the average performance of F1 Measure (correctly and wrongly classified)?**

Macro Average F1 Measure = [F1 Measure [P] + F1 Measure [NP] ] / 2

$$= [0.86 + 0.91] / 2$$

**Macro Average F1 Measure = 0.88**

**11. What is the Sum of Product of Proportion rate (weight) of each class (Precision) ?**

Weighted Average (Precision) = {Precision [P] \* (TC[P] / TC[P+NP])} + {Precision [NP] \* (TC[NP] / TC[P+NP])}

$$= \{0.86 * (49/134)\} + \{0.92 * (85/134)\}$$

**Weighted Average (Precision) = 0.90**

**12. What is the Sum of Product of Proportion rate (weight) of each class (Recall) ?**

Weighted Average (Recall) = {Recall [P] \* (TC[P] / TC[P+NP])} + {Recall [NP] \* (TC[NP] / TC[P+NP])}

$$= \{0.87 * (49/134)\} + \{0.92 * (85/134)\}$$

**Weighted Average (Recall) = 0.90**

**13. What is the Sum of Product of Proportion rate (weight) of each class (F1 Measure) ?**

Weighted Average (F1 Measure) = {F1 Measure [P] \* (TC[P] / TC[P+NP])} + {F1 Measure [NP] \* (TC[NP] / TC[P+NP])}

$$= \{0.86 * (49/134)\} + \{0.91 * (85/134)\}$$

**Weighted Average (F1 Measure) = 0.94**

## **2. DECISION TREE CLASSIFICATION**

**Confusion Matrix:-**

[76 9]

[ 8 41]

True Not Purchased, T(NP) = 71

False Not Purchased, F(NP) = 8

False Purchased, F(P) = 3

True Purchased,  $T(P) = 38$

Total Count of Not Purchased,  $TC[NP] = 79$

Total Count of Purchased,  $TC[P] = 41$

Total Count of the Purchased & Non Purchased,  $TC[P+NP] = 120$

### QUESTIONS:-

**1. What is the percentage of correct classification of both (Purchased & Not Purchased) to the total input of the test set?**

$$\begin{aligned}\text{Accuracy} &= (T(P) + T(NP)) / (T(P) + T(NP) + F(P) + F(NP)) \\ &= 41 + 76 / 41 + 76 + 8 + 9\end{aligned}$$

$$\text{Accuracy} = 0.87$$

**2. What is the percentage of correct classification of Purchased to the total input of Purchased in the test set?**

$$\begin{aligned}\text{Recall Purchased} &= T(P) / (\text{Total count of Purchased}) \\ &= 41 / 49\end{aligned}$$

$$\text{Recall Purchased} = 0.84$$

**3. What is the percentage of correct classification of Not Purchased to the total input of Not Purchased in the test set?**

$$\begin{aligned}\text{Recall Not Purchased} &= T(NP) / (\text{Total count of Not Purchased}) \\ &= 76 / 85\end{aligned}$$

$$\text{Recall Not Purchased} = 0.89$$

**4. What is the percentage of correct classification of Purchased to sum of correctly classified as Purchased and wrongly classified as Purchased in the test set?**

$$\begin{aligned}\text{Precision Purchased} &= T(P) / [T(P) + F(NP)] \\ &= 41 / [41 + 9]\end{aligned}$$

$$\text{Precision Purchased} = 0.82$$

**5. What is the percentage of correct classification of Not Purchased to sum of correctly classified as Not Purchased and wrongly classified as Not Purchased in the test set?**

$$\begin{aligned}\text{Precision Not Purchased} &= T(NP) / [T(NP) + F(P)] \\ &= 76 / [76 + 8]\end{aligned}$$

$$\text{Precision Not Purchased} = 0.90$$

## 6. What is the overall performance of Purchased?

$$\begin{aligned}\text{F1 Measure Purchased} &= (2 * [\text{Recall [P]} * \text{Precision [P]}] / [\text{Recall [P]} + \text{Precision [P]}]) \\ &= (2 * [0.84 * 0.82] / [0.84 + 0.82])\end{aligned}$$

$$\text{F1 Measure Purchased} = 0.83$$

## 7. What is the overall performance of Not Purchased?

$$\begin{aligned}\text{F1 Measure Not Purchased} &= (2 * [\text{Recall [NP]} * \text{Precision [NP]}] / [\text{Recall [NP]} + \text{Precision [NP]}]) \\ &= (2 * [0.89 * 0.90] / [0.89 + 0.90])\end{aligned}$$

$$\text{F1 Measure Not Purchased} = 0.90$$

## 8. What is the average performance of Precision (correctly and wrongly classified)?

$$\begin{aligned}\text{Macro Average Precision} &= [\text{Precision [P]} + \text{Precision [NP]}] / 2 \\ &= [0.82 + 0.90] / 2\end{aligned}$$

$$\text{Macro Average Precision} = 0.86$$

## 9. What is the average performance of Recall (correctly and wrongly classified)?

$$\begin{aligned}\text{Macro Average Recall} &= [\text{Recall [P]} + \text{Recall [NP]}] / 2 \\ &= [0.84 + 0.89] / 2\end{aligned}$$

$$\text{Macro Average Recall} = 0.87$$

## 10. What is the average performance of F1 Measure (correctly and wrongly classified)?

$$\begin{aligned}\text{Macro Average F1 Measure} &= [\text{F1 Measure [P]} + \text{F1 Measure [NP]}] / 2 \\ &= [0.83 + 0.90] / 2\end{aligned}$$

$$\text{Macro Average F1 Measure} = 0.86$$

## 11. What is the Sum of Product of Proportion rate (weight) of each class (Precision) ?

$$\begin{aligned}\text{Weighted Average (Precision)} &= \{\text{Precision [P]} * (\text{TC[P]} / \text{TC[P+NP]})\} + \{\text{Precision [NP]} * (\text{TC[NP]} / \text{TC[P+NP]})\} \\ &= \{0.82 * (49/134)\} + \{0.90 * (85/134)\}\end{aligned}$$

$$\text{Weighted Average (Precision)} = 0.87$$

## 12. What is the Sum of Product of Proportion rate (weight) of each class (Recall) ?

$$\begin{aligned}\text{Weighted Average (Recall)} &= \{\text{Recall [P]} * (\text{TC[P]} / \text{TC[P+NP]})\} + \{\text{Recall [NP]} * (\text{TC[NP]} / \text{TC[P+NP]})\} \\ &= \{0.84 * (49/134)\} + \{0.89 * (85/134)\}\end{aligned}$$

Weighted Average (Recall) = 0.87

**13. What is the Sum of Product of Proportion rate (weight) of each class (F1 Measure) ?**

Weighted Average (F1 Measure) = { F1 Measure [P]\*(TC[P] / TC[P+NP])} + { F1 Measure [NP]\*( TC[NP] / TC[P+NP])}

$$= \{0.83*(41/134)\} + \{0.90*(85/1)\}$$

Weighted Average (F1 Measure) = 0.87

### 3.SVM CLASSIFICATION

**Confusion Matrix:-**

[82 3]

[26 23]

True Not Purchased, **T(NP)**= 82

False Not Purchased, **F(NP)** = 3

False Purchased, **F(P)** = 26

True Purchased, **T(P)** = 23

Total Count of Not Purchased, **TC[NP]** = 85

Total Count of Purchased, **TC[P]** =49

Total Count of the Purchased & Non Purchased, **TC[P+NP]**= 134

**QUESTIONS:-**

**1.What is the percentage of correct classification of both (Purchased & Not Purchased) to the total input of the test set?**

Accuracy=(T(P)+T(NP)) / (T(P)+T(NP)+F(P)+F(NP))

$$=(23+82) / (23+82+26+3)$$

Accuracy= 0.78

**2.What is the percentage of correct classification of Purchased to the total input of Purchased in the test set?**

Recall Purchased = T(P) / (Total count of Purchased)

$$= 23/49$$

Recall Purchased =0.47

**3. What is the percentage of correct classification of Not Purchased to the total input of Not Purchased in the test set?**

$$\begin{aligned}\text{Recall Not Purchased} &= T(\text{NP}) / (\text{Total count of Not Purchased}) \\ &= 82/85\end{aligned}$$

$$\text{Recall [NP]} = 0.96$$

**4. What is the percentage of correct classification of Purchased to sum of correctly classified as Purchased and wrongly classified as Purchased in the test set?**

$$\begin{aligned}\text{Precision Purchased} &= T(P) / [T(P) + F(\text{NP})] \\ &= 23/[23+3]\end{aligned}$$

$$\text{Precision [P]} = 0.88$$

**5. What is the percentage of correct classification of Not Purchased to sum of correctly classified as Not Purchased and wrongly classified as Not Purchased in the test set?**

$$\begin{aligned}\text{Precision Not Purchased} &= T(\text{NP}) / [T(\text{NP}) + F(P)] \\ &= 82/[82+26]\end{aligned}$$

$$\text{Precision Not Purchased} = 0.76$$

**6. What is the overall performance of Purchased?**

$$\begin{aligned}\text{F1 Measure Purchased} &= (2 * [\text{Recall [P]} * \text{Precision [P]}] / [\text{Recall [P]} + \text{Precision [P]}]) \\ &= (2 * [0.47 * 0.88] / [0.47 + 0.88])\end{aligned}$$

$$\text{F1 Measure [P]} = 0.61$$

**7. What is the overall performance of Not Purchased?**

$$\begin{aligned}\text{F1 Measure Not Purchased} &= (2 * [\text{Recall [NP]} * \text{Precision [NP]}] / [\text{Recall [NP]} + \text{Precision [NP]}]) \\ &= (2 * [0.96 * 0.76] / [0.96 + 0.76])\end{aligned}$$

$$\text{F1 Measure Not Purchased} = 0.85$$

**8. What is the average performance of Precision (correctly and wrongly classified)?**

$$\begin{aligned}\text{Macro Average Precision} &= [\text{Precision [P]} + \text{Precision [NP]}] / 2 \\ &= [0.88 + 0.76] / 2\end{aligned}$$

$$\text{Macro Average Precision} = 0.82$$

**9. What is the average performance of Recall (correctly and wrongly classified)?**

$$\text{Macro Average Recall} = [\text{Recall [P]} + \text{Recall [NP]}] / 2$$

$$= [0.47+0.96] / 2$$

**Macro Average Recall = 0.72**

**10. What is the average performance of F1 Measure (correctly and wrongly classified)?**

Macro Average F1 Measure = [F1 Measure [P] + F1 Measure [NP] ] / 2

$$= [0.61+0.85] / 2$$

**Macro Average F1 Measure=0.73**

**11. What is the Sum of Product of Proportion rate (weight) of each class (Precision) ?**

Weighted Average (Precision) = {Precision [P]\*(TC[P] / TC[P+NP])} + {Precision [NP]\*( TC[NP] / TC[P+NP])}

$$= \{0.88*(49/134)\} + \{0.76*(85/134)\}$$

**Weighted Average (Precision) = 0.81**

**12. What is the Sum of Product of Proportion rate (weight) of each class (Recall) ?**

Weighted Average (Recall) = { Recall [P]\*(TC[P] / TC[P+NP])} + { Recall [NP]\*( TC[NP] / TC[P+NP])}

$$= \{0.47*(49/134)\} + \{0.96*(85/134)\}$$

**Weighted Average (Recall) = 0.87**

**13. What is the Sum of Product of Proportion rate (weight) of each class (F1 Measure) ?**

Weighted Average (F1 Measure) = { F1 Measure [P]\*(TC[P] / TC[P+NP])} + { F1 Measure [NP]\*( TC[NP] / TC[P+NP])}

$$= \{0.61*(49/134)\} + \{0.85*(85/134)\}$$

**Weighted Average (F1 Measure) = 0.76**

**Final Result:-**

The Random Forest Classification Algorithm giving the **best result**



