

Decision Tree - Confusion Matrix

Test Data Count 134	Predicted (0) Not Purchased	Predicted (1) Purchased
Actual (0) Not Purchased	76 True - Not Purchased	9 False - Not Purchased
Actual (1) Purchased	8 False - Purchased	41 True - Purchased

Accuracy: What is the correct Classification of this model ?

$$\begin{aligned}
 &= \frac{\text{True(Purchased)} + \text{True(Not Purchased)}}{\text{True(Purchased)} + \text{True(Not Purchased)} + \text{False(Purchased)} + \text{False(Not purchased)}} \\
 &= \frac{41+76}{41+76+9+8} \\
 \text{Accuracy} &= 0.87
 \end{aligned}$$

Recall for Purchased: Out of all actual purchases, how many did we correctly identify ?

$$\begin{aligned}
 &= \frac{\text{True(Purchased)}}{\text{True(Purchased)} + \text{False(Not Purchased)}} \\
 &= \frac{41}{41+8} = \frac{41}{49} = 0.83
 \end{aligned}$$

Recall for Purchased = 0.83

Recall for Not Purchased:

$$\begin{aligned}
 &= \frac{\text{True(Not Purchased)}}{\text{True(Not Purchased)} + \text{False(Purchased)}} \\
 &= \frac{76}{76+9} = \frac{76}{85} = 0.89
 \end{aligned}$$

Recall for Not Purchased = 0.89

Precision for Purchased:

Out of all predicted purchases, how many did we correctly identify ?

$$= \frac{\text{True(Purchased)}}{\text{True(Purchased)} + \text{False(Purchased)}}$$
$$= \frac{41}{41+9}$$

Precision for Purchased = 0.82

Precision for Not Purchased:

$$= \frac{\text{True(Not Purchased)}}{\text{True(Not Purchased)} + \text{False(Not Purchased)}}$$
$$= \frac{76}{76+8}$$

Precision for Not Purchased = 0.90

F1 score: Overall performance of Purchased

$$= 2 * \frac{\text{Recall} * \text{Precision}}{\text{Recall} + \text{Precision}}$$
$$= 2 * \frac{0.83 * 0.82}{0.83 + 0.82} = 2 * \frac{0.6806}{1.65} = 2 * 0.4124$$

F1 score for Purchased = 0.82

F1 score: Overall performance of Not Purchased

$$= 2 * \frac{\text{Recall} * \text{Precision}}{\text{Recall} + \text{Precision}}$$
$$= 2 * \frac{0.89 * 0.90}{0.89 + 0.90} = 2 * \frac{0.801}{1.79} = 2 * 0.44$$

F1 score for Not Purchased = 0.89

Macro Average: Average performance of Precision.

$$\begin{aligned}\text{Macro Average} &= \frac{\text{Precision(Purchased)} + \text{Precision(Not Purchased)}}{2} \\ &= \frac{0.82 + 0.90}{2} \\ &= \frac{1.72}{2} = 0.86\end{aligned}$$

Macro Average of Precision = 0.86

Macro Average: Average performance of Recall

$$\begin{aligned}\text{Macro Average} &= \frac{\text{Recall(Purchased)} + \text{Recall(Not Purchased)}}{2} \\ &= \frac{0.83 + 0.89}{2} \\ &= \frac{1.72}{2}\end{aligned}$$

Macro Average of Recall = 0.86

Macro Average: Average performance of F1-Score

$$\begin{aligned}\text{Macro Average} &= \frac{\text{F1(Purchased)} + \text{F1(Not Purchased)}}{2} \\ &= \frac{0.82 + 0.89}{2} \\ &= \frac{1.71}{2}\end{aligned}$$

Macro Average of F1-Score = 0.85

Weighted Average: What is the sum of the product of each class ?

$$\begin{aligned}\text{Weighted Average of Precision} &= \text{Precision of Purchased} * \frac{\text{Total count of Purchased in Test Set}}{\text{Total count of Test set}} + \\ &\quad \text{Precision Not Purchased} * \frac{\text{Total count of Not Purchased in Test Set}}{\text{Total count of Test set}} \\ &= 0.82 * \frac{50}{134} + 0.90 * \frac{84}{134}\end{aligned}$$

$$= 0.82 * 0.37 + 0.92 * 0.62$$

Weighted Average of Precision = 0.87

Weighted Average: Recall

$$\begin{aligned} &= \text{Recall of Purchased} * \frac{\text{Total count of Purchased in Test Set}}{\text{Total count of Test set}} + \\ &\quad \text{Recall Not Purchased} * \frac{\text{Total count of Not Purchased in Test Set}}{\text{Total count of Test set}} \\ &= 0.83 * \frac{50}{134} + 0.89 * \frac{84}{134} \\ &= 0.83 * 0.37 + 0.89 * 0.62 \end{aligned}$$

Weighted Average of Recall = 0.85

Weighted Average: F1 measure

$$\begin{aligned} &= \text{F1 score of Purchased} * \frac{\text{Total count of Purchased in Test Set}}{\text{Total count of Test set}} + \\ &\quad \text{F1 score of Not Purchased} * \frac{\text{Total count of Not Purchased in Test Set}}{\text{Total count of Test set}} \\ &= 0.82 * \frac{50}{134} + 0.89 * \frac{84}{134} \\ &= 0.82 * 0.37 + 0.89 * 0.62 \end{aligned}$$

Weighted Average of F1 score = 0.85