

1. Random Forest Classification

Confusion Matrix Result:

[72 7]

[6 35]

True Not Purchased, $T(NP) = 72$

False Not Purchased, $F(NP) = 7$

False Purchased, $F(P) = 6$

True Purchased, $T(P) = 35$

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?

$$\text{Accuracy} = (T(P) + T(NP)) / (T(P) + T(NP) + F(P) + F(NP))$$

$$\text{Accuracy} = (35 + 72) / (35 + 72 + 6 + 7)$$

Accuracy = 0.89

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

$$\text{Recall Purchased} = T(P) / (\text{Total count of Purchased})$$

$$\text{Recall Purchased} = 35 / 41$$

Recall [P] = 0.85

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

$$\text{Recall Not Purchased} = T(\text{NP}) / (\text{Total count of Not Purchased})$$

$$\text{Recall Not Purchased} = 72/79$$

$$\text{Recall [NP]} = 0.91$$

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?

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

$$\text{Precision Purchased} = 35/[35+7]$$

$$\text{Precision [P]} = 0.83$$

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?

$$\text{Precision Not Purchased} = T(\text{NP}) / [T(\text{NP})+F(P)]$$

$$\text{Precision Not Purchased} = 72/[72+6]$$

$$\text{Precision [NP]} = 0.92$$

6. What is the overall performance of Purchased?

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

$$\text{F1 Measure Purchased} = (2 * [0.85 * 0.83] / [0.85 + 0.83])$$

$$\text{F1 Measure [P]} = 0.84$$

7. What is the overall performance of Not Purchased?

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

F1 Measure Not Purchased = $(2 * [0.91 * 0.92] / [0.91 + 0.92])$

F1 Measure [NP] = 0.92

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

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

Macro Average Precision = $[0.83 + 0.92] / 2$

Macro Average Precision = 0.88

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

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

Macro Average Recall = $[0.85 + 0.91] / 2$

Macro Average Recall = 0.88

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

Macro Average F1 Measure = $[\text{F1 Measure [P]} + \text{F1 Measure [NP]}] / 2$

Macro Average F1 Measure = $[0.84 + 0.92] / 2$

Macro Average F1 Measure = 0.88

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

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

$$\text{Weighted Average (Precision)} = \{ 0.83 * (41/120) \} + \{ 0.92 * (79/120) \}$$

$$\text{Weighted Average (Precision)} = 0.2835 + 0.6056$$

$$\text{Weighted Average (Precision)} = 0.89$$

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

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

$$\text{Weighted Average (Recall)} = \{ 0.85 * (41/120) \} + \{ 0.91 * (79/120) \}$$

$$\text{Weighted Average (Recall)} = 0.2904 + 0.5990$$

$$\text{Weighted Average (Recall)} = 0.89$$

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

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

$$\text{Weighted Average (F1 Measure)} = \{ 0.84 * (41/120) \} + \{ 0.92 * (79/120) \}$$

$$\text{Weighted Average (F1 Measure)} = 0.2870 + 0.6056$$

$$\text{Weighted Average (F1 Measure)} = 0.89$$

1. Decision Tree Classification

Confusion Matrix Result:

[71 8]

[3 38]

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?

$$\text{Accuracy} = (T(P) + T(NP)) / (T(P) + T(NP) + F(P) + F(NP))$$

$$\text{Accuracy} = (38 + 71) / (38 + 71 + 3 + 8)$$

Accuracy = 0.91

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

$$\text{Recall Purchased} = T(P) / (\text{Total count of Purchased})$$

$$\text{Recall Purchased} = 38 / 41$$

Recall [P] = 0.93

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

$$\text{Recall Not Purchased} = T(\text{NP}) / (\text{Total count of Not Purchased})$$

$$\text{Recall Not Purchased} = 71/79$$

$$\text{Recall [NP]} = 0.90$$

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?

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

$$\text{Precision Purchased} = 38/[38+8]$$

$$\text{Precision [P]} = 0.83$$

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?

$$\text{Precision Not Purchased} = T(\text{NP}) / [T(\text{NP})+F(P)]$$

$$\text{Precision Not Purchased} = 71/[71+3]$$

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

6. What is the overall performance of Purchased?

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

$$\text{F1 Measure Purchased} = (2 * [0.93 * 0.83] / [0.93 + 0.83])$$

$$\text{F1 Measure [P]} = 0.87$$

7. What is the overall performance of Not Purchased?

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

F1 Measure Not Purchased = $(2 * [0.90 * 0.96] / [0.90 + 0.96])$

F1 Measure [NP] = 0.93

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

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

Macro Average Precision = $[0.83 + 0.96] / 2$

Macro Average Precision = 0.89

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

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

Macro Average Recall = $[0.93 + 0.90] / 2$

Macro Average Recall = 0.91

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

Macro Average F1 Measure = $[\text{F1 Measure [P]} + \text{F1 Measure [NP]}] / 2$

Macro Average F1 Measure = $[0.87 + 0.93] / 2$

Macro Average F1 Measure = 0.90

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

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

$$\text{Weighted Average (Precision)} = \{0.83 * (41/120)\} + \{0.96 * (79/120)\}$$

$$\text{Weighted Average (Precision)} = 0.2835 + 0.6320$$

$$\text{Weighted Average (Precision)} = 0.91$$

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

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

$$\text{Weighted Average (Recall)} = \{0.93 * (41/120)\} + \{0.90 * (79/120)\}$$

$$\text{Weighted Average (Recall)} = 0.3177 + 0.5925$$

$$\text{Weighted Average (Recall)} = 0.91$$

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

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

$$\text{Weighted Average (F1 Measure)} = \{0.87 * (41/120)\} + \{0.93 * (79/120)\}$$

$$\text{Weighted Average (F1 Measure)} = 0.2972 + 0.6122$$

$$\text{Weighted Average (F1 Measure)} = 0.91$$

1. SVM Classification

Confusion Matrix Result:

[77 2]

[23 18]

True Not Purchased, $T(NP) = 77$

False Not Purchased, $F(NP) = 2$

False Purchased, $F(P) = 23$

True Purchased, $T(P) = 18$

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?

$$\text{Accuracy} = (T(P) + T(NP)) / (T(P) + T(NP) + F(P) + F(NP))$$

$$\text{Accuracy} = (18 + 77) / (18 + 77 + 23 + 2)$$

Accuracy = 0.79

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

$$\text{Recall Purchased} = T(P) / (\text{Total count of Purchased})$$

$$\text{Recall Purchased} = 18 / 41$$

Recall [P] = 0.44

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

$$\text{Recall Not Purchased} = T(\text{NP}) / (\text{Total count of Not Purchased})$$

$$\text{Recall Not Purchased} = 77/79$$

$$\text{Recall [NP]} = 0.97$$

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?

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

$$\text{Precision Purchased} = 18/[18+2]$$

$$\text{Precision [P]} = 0.90$$

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?

$$\text{Precision Not Purchased} = T(\text{NP}) / [T(\text{NP})+F(P)]$$

$$\text{Precision Not Purchased} = 77/[77+23]$$

$$\text{Precision [NP]} = 0.77$$

6. What is the overall performance of Purchased?

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

$$\text{F1 Measure Purchased} = (2 * [0.44 * 0.90] / [0.44 + 0.90])$$

$$\text{F1 Measure [P]} = 0.59$$

7. What is the overall performance of Not Purchased?

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

F1 Measure Not Purchased = $(2 * [0.97 * 0.77] / [0.97 + 0.77])$

F1 Measure [NP] = 0.86

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

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

Macro Average Precision = $[0.90 + 0.77] / 2$

Macro Average Precision = 0.83

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

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

Macro Average Recall = $[0.44 + 0.97] / 2$

Macro Average Recall = 0.71

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

Macro Average F1 Measure = $[\text{F1 Measure [P]} + \text{F1 Measure [NP]}] / 2$

Macro Average F1 Measure = $[0.59 + 0.86] / 2$

Macro Average F1 Measure = 0.73

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

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

$$\text{Weighted Average (Precision)} = \{ 0.90 * (41/120) \} + \{ 0.77 * (79/120) \}$$

$$\text{Weighted Average (Precision)} = 0.3075 + 0.5069$$

$$\text{Weighted Average (Precision)} = 0.81$$

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

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

$$\text{Weighted Average (Recall)} = \{ 0.44 * (41/120) \} + \{ 0.97 * (79/120) \}$$

$$\text{Weighted Average (Recall)} = 0.1503 + 0.6385$$

$$\text{Weighted Average (Recall)} = 0.79$$

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

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

$$\text{Weighted Average (F1 Measure)} = \{ 0.59 * (41/120) \} + \{ 0.86 * (79/120) \}$$

$$\text{Weighted Average (F1 Measure)} = 0.2015 + 0.5661$$

$$\text{Weighted Average (F1 Measure)} = 0.77$$

Final Result:

The **Decision Tree Classification Algorithm** giving the **best result**.