# **HP Machine Learning Challenge-Approach**

Machine learning model to detect the phishing attacks..

#### 1. Simple Exploratory Data Analysis

 Pandas, seaborn, matplotlib libraries are used in Exploratory data analysis.

#### 2. Data Pre-Processing

• No pre-processing is done for the data.

#### 3.Model

- Selected columns for model,
  - 0\_key
  - o 1\_having\_ip
  - o 2\_url\_length
  - 3\_shortining\_service
  - 4\_having\_at\_symbol
  - o 5\_double\_slash\_redirecting
  - 6\_prefix\_suffix
  - o 7\_having\_sub\_domain
  - o 8\_sslfinal\_state
  - o 9\_domain\_registeration\_length
  - o 10\_favicon
  - o **11\_port**
  - o 12\_https\_token
  - o 13\_request\_url
  - o 14\_url\_of\_anchor
  - 15\_links\_in\_tags
  - o 16\_sfh
  - o 17\_submitting\_to\_email
  - o 18\_abnormal\_url

- o 19\_redirect
- o 20\_on\_mouseover
- o 21\_rightclick
- o 22\_popupwidnow
- o 23\_iframe
- o 24\_age\_of\_domain
- o 25\_dnsrecord
- o 26\_web\_traffic
- o 27\_page\_rank
- o 28\_google\_index
- o 29\_links\_pointing\_to\_page
- o 30\_statistical\_report

# Compared multiple classifiers using pycaret's compare\_models function

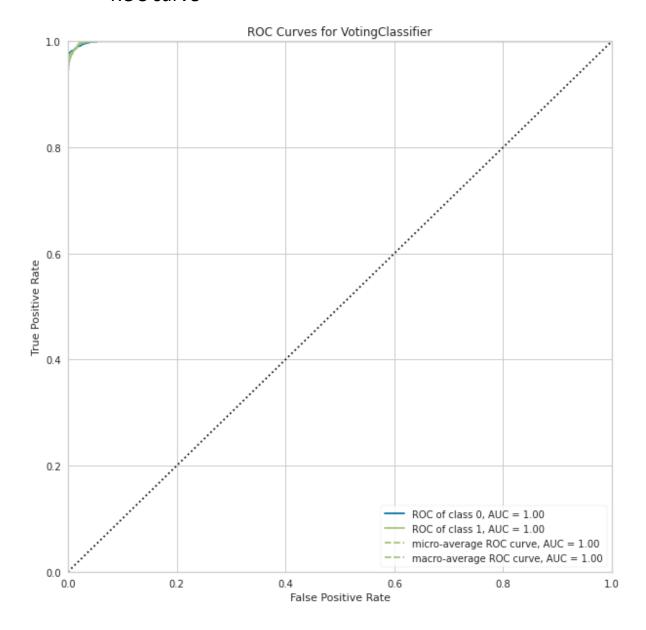
|          | Model                                 | Accuracy | AUC    | Recall | Prec.  | F1     | Карра  | мсс    | TT<br>(Sec) |
|----------|---------------------------------------|----------|--------|--------|--------|--------|--------|--------|-------------|
| rf       | Random Forest<br>Classifier           | 0.9643   | 0.9933 | 0.9747 | 0.9622 | 0.9684 | 0.9273 | 0.9274 | 1.7960      |
| et       | Extra Trees<br>Classifier             | 0.9644   | 0.9885 | 0.9722 | 0.9648 | 0.9685 | 0.9276 | 0.9277 | 1.8480      |
| catboost | CatBoost<br>Classifier                | 0.9647   | 0.9951 | 0.9722 | 0.9654 | 0.9688 | 0.9283 | 0.9284 | 4.2500      |
| lightgbm | Light Gradient<br>Boosting<br>Machine | 0.9647   | 0.9946 | 0.9702 | 0.9673 | 0.9687 | 0.9283 | 0.9285 | 0.6020      |
| dt       | Decision Tree<br>Classifier           | 0.9547   | 0.9624 | 0.9600 | 0.9595 | 0.9597 | 0.9079 | 0.9080 | 0.3840      |
| knn      | K Neighbors<br>Classifier             | 0.9461   | 0.9846 | 0.9591 | 0.9458 | 0.9524 | 0.8902 | 0.8905 | 1.7280      |
| gbc      | Gradient<br>Boosting<br>Classifier    | 0.9475   | 0.9903 | 0.9557 | 0.9512 | 0.9534 | 0.8933 | 0.8933 | 1.2880      |
| ada      | Ada Boost<br>Classifier               | 0.9363   | 0.9867 | 0.9509 | 0.9369 | 0.9438 | 0.8704 | 0.8706 | 1.0340      |
| ridge    | Ridge Classifier                      | 0.9298   | 0.0000 | 0.9503 | 0.9268 | 0.9384 | 0.8568 | 0.8573 | 0.6340      |
| lda      | Linear<br>Discriminant<br>Analysis    | 0.9298   | 0.9822 | 0.9503 | 0.9268 | 0.9384 | 0.8568 | 0.8573 | 0.6880      |
| lr       | Logistic<br>Regression                | 0.9389   | 0.9866 | 0.9495 | 0.9423 | 0.9459 | 0.8757 | 0.8758 | 0.4560      |
| svm      | SVM - Linear<br>Kernel                | 0.9324   | 0.0000 | 0.9211 | 0.9576 | 0.9386 | 0.8633 | 0.8648 | 0.7240      |
| nb       | Naive Bayes                           | 0.8615   | 0.9758 | 0.7707 | 0.9784 | 0.8622 | 0.7269 | 0.7480 | 0.6580      |

|       | Model                                 | Accuracy | AUC    | Recall | Prec.  | F1     | Карра  | мсс    | TT<br>(Sec) |
|-------|---------------------------------------|----------|--------|--------|--------|--------|--------|--------|-------------|
| qda   | Quadratic<br>Discriminant<br>Analysis | 0.5684   | 0.6162 | 0.2324 | 1.0000 | 0.3769 | 0.2096 | 0.3420 | 0.6360      |
| dummy | Dummy<br>Classifier                   | 0.4378   | 0.5000 | 0.0000 | 0.0000 | 0.0000 | 0.0000 | 0.0000 | 0.3600      |

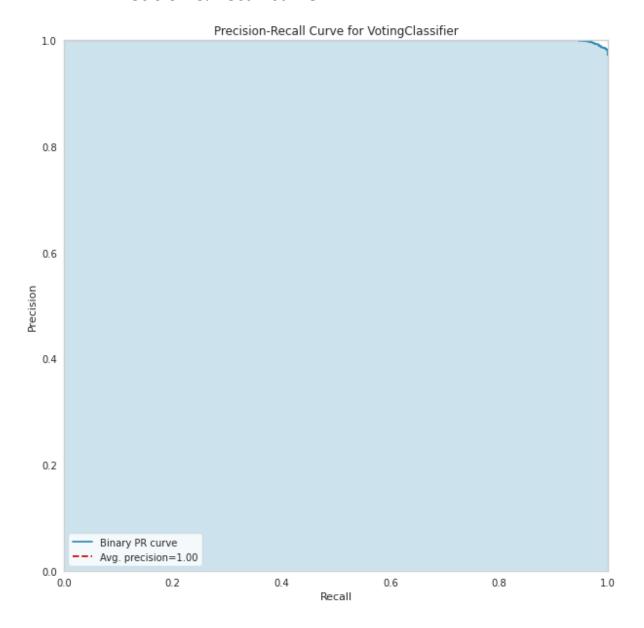
• Then took the top 3 models based on the recall then blend the model by using pycaret blend\_models function

| Fold | Accuracy | AUC    | Recall | Prec.  | F1     | Карра  | мсс    |
|------|----------|--------|--------|--------|--------|--------|--------|
| 0    | 0.9665   | 0.9956 | 0.9787 | 0.9623 | 0.9705 | 0.9318 | 0.9320 |
| 1    | 0.9665   | 0.9958 | 0.9702 | 0.9702 | 0.9702 | 0.9320 | 0.9320 |
| 2    | 0.9681   | 0.9944 | 0.9702 | 0.9730 | 0.9716 | 0.9352 | 0.9352 |
| 3    | 0.9673   | 0.9956 | 0.9759 | 0.9662 | 0.9710 | 0.9334 | 0.9335 |
| 4    | 0.9665   | 0.9954 | 0.9787 | 0.9623 | 0.9705 | 0.9317 | 0.9319 |
| Mean | 0.9670   | 0.9953 | 0.9747 | 0.9668 | 0.9708 | 0.9328 | 0.9329 |
| Std  | 0.0006   | 0.0005 | 0.0038 | 0.0042 | 0.0005 | 0.0014 | 0.0013 |

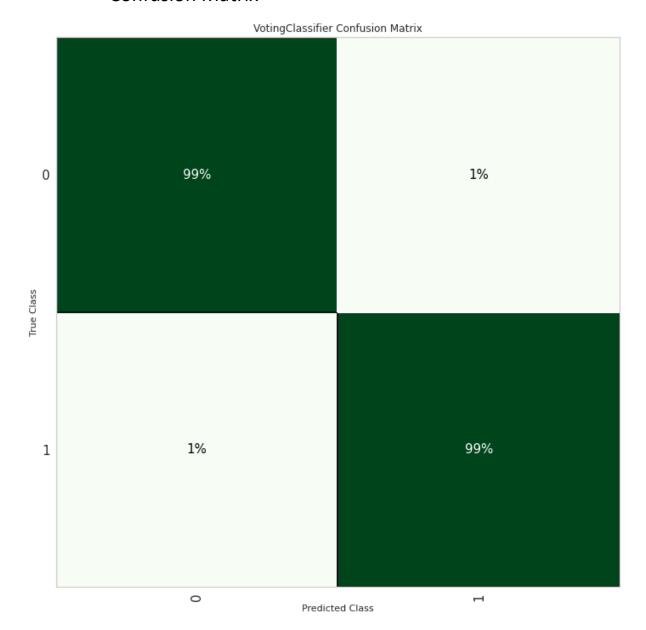
#### • ROC curve



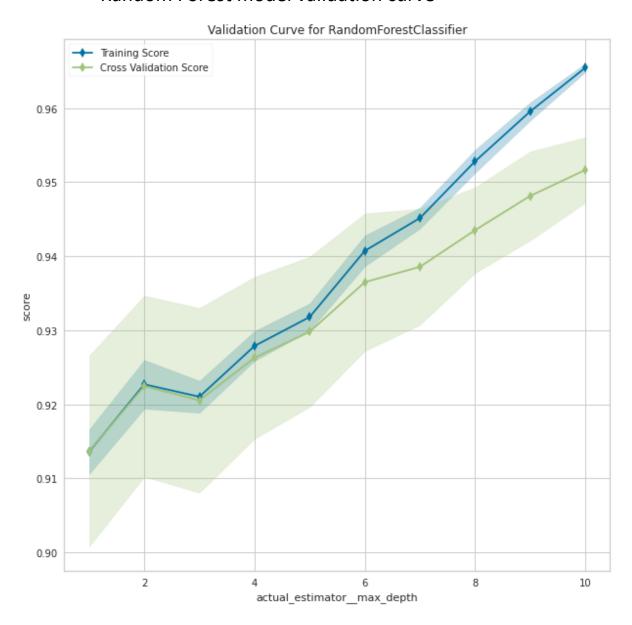
# Precision & Recall curve



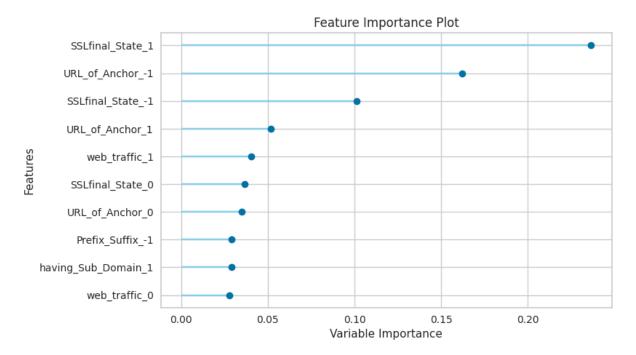
# • Confusion Matrix



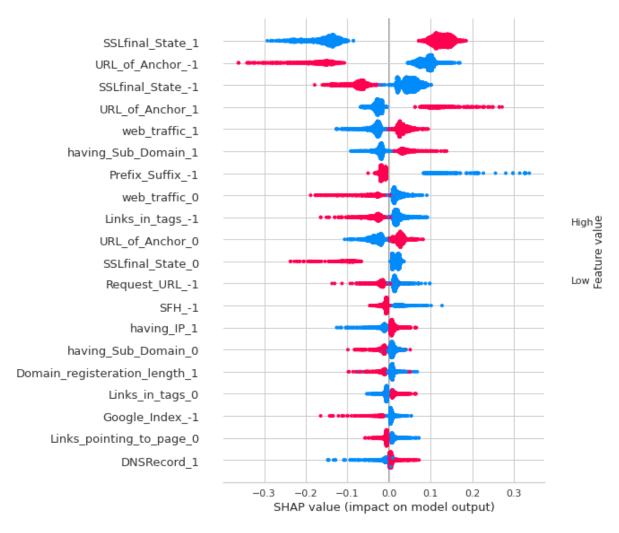
# • Random Forest model validation curve



#### Random Forest model feature Importance



# SHAP - Random Forest model feature Importance



Final score is 97.9892