

2.

- Check if use https and Issuer Is Trusted & and Age of Certificate≥ 1 Years or Using https and Issuer Is Not Trusted
 - If YES, check if % of URL Of Anchor <31%.
 - If **YES** then the website is LEGITIMATE
 - If **NO** then it also should be LEGITIMATE, but with lower confidence
 - If NO, check if % of URL Of Anchor <31%.
 - If YES then the website is LEGITIMATE
 - If NO, check the traffic on the website and Alexa database
 - If the website **HAS** significant traffic or **IS** recognised by Alexa database, then still it can be PHISING
 - ➤ If the website **HAS NO** significant traffic or **IS NOT** recognised by Alexa database, then with high confidence it is PHISING

3.

The accuracy is 91%

4.

```
from sklearn import datasets, model_selection, svm, metrics
import numpy as np
import pandas as pd
import threading
from sklearn.model_selection import train_test_split
from sklearn import tree
import matplotlib.pyplot as plt
from sklearn import preprocessing as pp
```

```
##Prepare data##
filename=r'phishing.csv'
data train=pd.read csv(filename, index col=None, na values='?', sep = ';')
data_train=data_train.dropna()
colnames = data train.columns.get values()
print("\nDESCRIBE DATA:\n", data train.describe())
data train.shape
DESCRIBE DATA:
        having IP Address
                               URL Length Shortining Service having At Symb
ol
             11055.000000 11055.000000
                                                 11055.000000
                                                                    11055.00000
count
0
                 0.313795
                               -0.633198
                                                     0.738761
                                                                        0.70058
mean
8
                                0.766095
                                                     0.673998
                                                                        0.71359
std
                 0.949534
8
                -1.000000
                               -1.000000
                                                    -1.000000
                                                                       -1.00000
min
0
25%
                -1.000000
                               -1.000000
                                                     1.000000
                                                                        1.00000
0
50%
                 1.000000
                               -1.000000
                                                     1.000000
                                                                        1.00000
0
75%
                 1.000000
                               -1.000000
                                                     1.000000
                                                                        1.00000
0
                 1.000000
                                1.000000
                                                     1.000000
                                                                        1.00000
max
0
       double slash redirecting Prefix Suffix having Sub Domain
                    11055.000000
                                    11055.000000
                                                        11055.000000
count.
                        0.741474
                                       -0.734962
                                                             0.063953
mean
                        0.671011
                                        0.678139
                                                             0.817518
std
                       -1.000000
                                       -1.000000
                                                           -1.000000
min
25%
                        1.000000
                                       -1.000000
                                                           -1.000000
                        1.000000
                                                             0.000000
50%
                                       -1.000000
75%
                        1.000000
                                       -1.000000
                                                             1.000000
                        1.000000
                                        1.000000
                                                             1.000000
max
       SSLfinal State
                        Domain registeration length
                                                            Favicon
         11055.000000
count
                                        11055.000000
                                                       11055.000000
                                                                      . . .
mean
              0.250927
                                            -0.336771
                                                           0.628584
                                                                      . . .
std
              0.911892
                                            0.941629
                                                           0.777777
                                                                      . . .
min
             -1.000000
                                            -1.000000
                                                          -1.000000
                                                                      . . .
25%
             -1.000000
                                            -1.000000
                                                           1.000000
                                                                      . . .
50%
              1.000000
                                            -1.000000
                                                           1.000000
                                                                      . . .
75%
              1.000000
                                             1.000000
                                                           1.000000
                                                                      . . .
              1.000000
                                             1.000000
                                                           1.000000
max
                                                                      . . .
        popUpWindow
                            Iframe
                                     age of domain
                                                        DNSRecord web traffic
\
       11055.000000
                      11055.000000
                                      11055.000000
                                                     11055.000000
                                                                    11055.00000
count
mean
           0.613388
                          0.816915
                                          0.061239
                                                         0.377114
                                                                        0.28729
1
           0.789818
                          0.576784
                                          0.998168
                                                         0.926209
                                                                        0.82773
std
3
          -1.000000
                         -1.000000
                                         -1.000000
                                                        -1.000000
                                                                       -1.00000
min
```

```
25%
           1.000000
                          1.000000
                                         -1.000000
                                                       -1.000000
                                                                       0.00000
0
           1.000000
                          1.000000
                                          1.000000
                                                        1.000000
50%
                                                                       1.00000
0
           1.000000
                          1.000000
                                          1.000000
                                                        1.000000
75%
                                                                       1.00000
0
           1.000000
                          1.000000
                                          1.000000
                                                        1.000000
                                                                       1.00000
max
\cap
          Page_Rank Google_Index Links_pointing_to_pageStatistical_report
      11055.000000
                     11055.000000
                                               11055.000000
                                                                    11055.0000
count
0.0
                          0.721574
                                                   0.344007
                                                                        0.7195
          -0.483673
mean
84
           0.875289
                          0.692369
                                                   0.569944
                                                                        0.6944
std
37
          -1.000000
                         -1.000000
                                                  -1.000000
                                                                       -1.0000
min
0.0
25%
          -1.000000
                          1.000000
                                                   0.000000
                                                                        1.0000
00
                          1.000000
50%
          -1.000000
                                                   0.000000
                                                                        1.0000
00
75%
           1.000000
                          1.000000
                                                   1.000000
                                                                        1.0000
0.0
max
           1.000000
                          1.000000
                                                   1.000000
                                                                        1.0000
             Result
count 11055.000000
mean
        0.113885
           0.993539
std
          -1.000000
min
          -1.000000
25%
           1.000000
50%
75%
           1.000000
           1.000000
max
[8 rows x 31 columns]
(11055, 31)
```

```
from sklearn.tree import DecisionTreeClassifier
###MAKE DECISION TREE###

#data_train
X_all = data_train.drop(['Result'], axis=1)
y_all = data_train['Result']

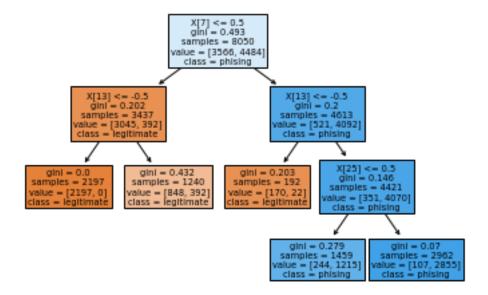
test_size=2050
train_size=8050

X_train, X_test, y_train, y_test = model_selection.train_test_split(X_a ll, y_all, test_size=test_size, train_size=train_size)
```

Notes

On default settings on tree makes bit unbalanced classification. fine tuned min_samples_split value to 1500. min_samples_leaf value tuning didn't really do nothing special between range 2-100 but if it is increased to 200 balance of the classification gets worse.

```
from sklearn.metrics import confusion matrix
from sklearn.metrics import precision score, confusion matrix, f1 score, c
lassification report
clf = DecisionTreeClassifier(criterion="gini",
                             min_samples_split=1500,
                             min samples leaf=50,
                             splitter='best',
                             max depth=3)
clf.fit(X_train, y_train)
pre = clf.predict(X test)
accuracy score = metrics.accuracy score(y test, pre)
print("accuracy:", accuracy score)
cf matrix = confusion matrix(y test, pre)
print()
print(pd.crosstab(y test, pre, rownames=['True'], colnames=['Predicted']
], margins=True), "\n")
print(classification_report(y_test,pre))
accuracy: 0.9102439024390244
Predicted -1 1
                     All
True
-1
           809 85
                     894
           99 1057 1156
All
           908 1142 2050
                          recall f1-score support
              precision
          -1
                   0.89
                             0.90
                                       0.90
                                                  894
                   0.93
                             0.91
                                       0.92
                                                 1156
                                                 2050
                                       0.91
    accuracy
   macro avq
                   0.91
                             0.91
                                       0.91
                                                 2050
weighted avg
                   0.91
                             0.91
                                       0.91
                                                 2050
from sklearn.tree import plot tree
import graphviz
plt.figure()
plot tree(clf, filled=True, class names = ['legitimate', 'phising'])
plt.show()
from sklearn.tree import export graphviz
# Export as dot file
export_graphviz(clf, out_file='tree.dot',
                feature names = colnames[:30],
                class names = ['legitimate', 'phising'],
                rounded = True, proportion = False,
               precision = 2, filled = True)
```



```
##Edited plot
import pydotplus
import pydot
import graphviz
#Without this graphviz exetables not found
import os
os.environ['PATH'] = os.environ['PATH']+';'+os.environ['CONDA PREFIX']+
r"\Library\bin\graphviz"
tree data = export graphviz(clf, feature names=colnames[:30], out file=
None, class names = ['legitimate', 'phising'], filled=True, rounded=True)
tree_graph = pydotplus.graph_from_dot_data(tree_data)
tree graph.set size('"10,10!"')
tree graph.write png('img treeDot.png')
#tree graph.write pdf("pdf treeDot.pdf")
graphviz graph = graphviz.Source(tree graph.to string())
graphviz graph
<graphviz.files.Source at 0x1ff5f82c808>
```

Plot is on the top of the document