8d0szfrko

August 2, 2023

```
[1]: import numpy as np
     import pandas as pd
     import matplotlib.pyplot as plt
     import seaborn as sns
     from sklearn.linear_model import LogisticRegression
     from sklearn.preprocessing import StandardScaler
[2]: from google.colab import drive
     drive.mount('/content/drive')
    Mounted at /content/drive
[3]: df=pd.read_csv("/content/drive/MyDrive/mydatasets/C3_bot_detection_data.csv")
     df
[3]:
            User ID
                             Username \
             132131
                                flong
     1
             289683
                      hinesstephanie
     2
                          roberttran
             779715
     3
             696168
                               pmason
     4
             704441
                               noah87
     49995
             491196
                                uberg
     49996
             739297
                        jessicamunoz
     49997
             674475
                      lynncunningham
                     richardthompson
     49998
             167081
     49999
             311204
                             daniel29
                                                                 Retweet Count \
     0
            Station activity person against natural majori...
                                                                          85
     1
            Authority research natural life material staff...
                                                                          55
     2
            Manage whose quickly especially foot none to g...
                                                                           6
     3
            Just cover eight opportunity strong policy which.
                                                                            54
                                                                            26
     4
                                 Animal sign six data good or.
     49995
            Want but put card direction know miss former h...
                                                                          64
            Provide whole maybe agree church respond most ...
     49996
                                                                          18
     49997
            Bring different everyone international capital...
                                                                          43
```

	49998 49999	Than about sing Here morning cl	45 91						
		Mention Count	Follower Count	Verified	Bot Label	Location	\		
	0	1	2353	False	1	Adkinston			
	1	5	9617	True	0	Sanderston			
	2	2	4363	True	0	Harrisonfurt			
	3	5	2242	True	1	Martinezberg			
	4	3	8438	False	1	Camachoville			
	•••	•••	•••			•••			
	49995	0	9911	True	1	Lake Kimberlyburgh			
	49996	5	9900	False	1	Greenbury			
	49997	3	6313	True	1	Deborahfort			
	49998	1	6343	False	0	Stephenside			
	49999	4	4006	False	0	Novakberg			
						G			
		Create	d At		Hashtag	3			
	0	2020-05-11 15:2	9:50		Na	V			
	1	2022-11-26 05:1	3:10		both liv	е			
	2	2022-08-08 03:1	6:54		phone ahea	d			
	3	2021-08-14 22:2	7:05	ever qu	uickly new	I			
	4	2020-04-13 21:2	4:21	_	eign mentio				
	49995 2023-04-20 11:06:26 teach quality ten education any				У				
	49996 2022-10-18 03:57:35 add walk among believe			e					
	49997	49997 2020-07-08 03:54:08		onto admit artist first					
	49998	2022-03-22 12:1	3:44		r				
	49999				е				
	[50000	rows x 11 column	ns]						
[4]:	df.hea	df.head()							
[4]:	Use	r ID User	name			Tweet	\		
				activity per	rson agains	t natural majori…	·		
		9683 hinessteph	•	v -	•	e material staff…			
		9715 robert				y foot none to g			
			•		-	trong policy which.			
		-	ah87	0 F1		n six data good or.			
	Ret	Bot Label \							
	0	85	1	2353	False	1			
	1	55	5	9617	True	0			
	2	6	2	4363	True	0			
	3	54	5	2242	True	1			
	4	26	3	8438		1			

	Location	Created At	Hashtags
0	Adkinston	2020-05-11 15:29:50	NaN
1	Sanderston	2022-11-26 05:18:10	both live
2	Harrisonfurt	2022-08-08 03:16:54	phone ahead
3	Martinezberg	2021-08-14 22:27:05	ever quickly new I
4	Camachoville	2020-04-13 21:24:21	foreign mention

1 Data Cleaning and Data Preprocessing

[5]: df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 50000 entries, 0 to 49999

Data columns (total 11 columns):

#	Column	Non-Null Count	Dtype
0	User ID	50000 non-null	int64
1	Username	50000 non-null	object
2	Tweet	50000 non-null	object
3	Retweet Count	50000 non-null	int64
4	Mention Count	50000 non-null	int64
5	Follower Count	50000 non-null	int64
6	Verified	50000 non-null	bool
7	Bot Label	50000 non-null	int64
8	Location	50000 non-null	object
9	Created At	50000 non-null	object
10	Hashtags	41659 non-null	object

dtypes: bool(1), int64(5), object(5)

memory usage: 3.9+ MB

[6]: df.describe()

[6]: User ID Retweet Count Mention Count Follower Count 50000.000000 50000.00000 50000.000000 50000.000000 count mean548890.680540 50.00560 2.513760 4988.602380 std 259756.681425 29.18116 1.708563 2878.742898 min 100025.000000 0.00000 0.000000 0.000000 25% 323524.250000 25.00000 1.000000 2487.750000 50% 548147.000000 50.00000 3.000000 4991.500000 75% 772983.000000 75.00000 4.000000 7471.000000 999995.000000 100.00000 5.000000 10000.000000 maxBot Label count 50000.000000 mean 0.500360 std 0.500005

```
min
                 0.000000
      25%
                 0.000000
      50%
                 1.000000
      75%
                 1.000000
                 1.000000
      max
 [7]: df.columns
 [7]: Index(['User ID', 'Username', 'Tweet', 'Retweet Count', 'Mention Count',
             'Follower Count', 'Verified', 'Bot Label', 'Location', 'Created At',
             'Hashtags'],
            dtype='object')
 [8]: feature_matrix = df[['User ID', 'Retweet Count', 'Mention Count',
             'Follower Count', 'Bot Label']]
      target_vector = df[["Verified"]]
 [9]: fs = StandardScaler().fit transform(feature matrix)
      logr = LogisticRegression()
      logr.fit(fs,target vector)
     /usr/local/lib/python3.10/dist-packages/sklearn/utils/validation.py:1143:
     DataConversionWarning: A column-vector y was passed when a 1d array was
     expected. Please change the shape of y to (n_samples, ), for example using
     ravel().
       y = column_or_1d(y, warn=True)
 [9]: LogisticRegression()
[10]: observation=[[1,2,3,4,5]]
      prediction = logr.predict(observation)
      print(prediction)
     [ True]
[11]: logr.classes_
[11]: array([False,
                    True])
[12]: logr.predict_proba(observation)
[12]: array([[0.48759575, 0.51240425]])
     Random Forest
[13]: df['Verified'].value_counts()
```

```
[13]: True
               25004
               24996
      False
      Name: Verified, dtype: int64
[14]: x=df[['User ID', 'Retweet Count', 'Mention Count',
              'Follower Count', 'Bot Label']]
      y=df['Verified']
[17]: g1={"Verified":{True:1, False:2}}
      df=df.replace(g1)
      df
[17]:
             User ID
                              Username \
              132131
                                 flong
      0
              289683
      1
                       hinesstephanie
      2
              779715
                            roberttran
              696168
                                pmason
              704441
                                noah87
      49995
              491196
                                 uberg
      49996
              739297
                          jessicamunoz
      49997
              674475
                        lynncunningham
      49998
                      richardthompson
              167081
      49999
                              daniel29
              311204
                                                           Tweet Retweet Count \
      0
             Station activity person against natural majori...
                                                                            85
      1
             Authority research natural life material staff...
                                                                            55
      2
             Manage whose quickly especially foot none to g...
                                                                             6
      3
             Just cover eight opportunity strong policy which.
                                                                              54
      4
                                  Animal sign six data good or.
                                                                              26
             Want but put card direction know miss former h...
      49995
                                                                            64
      49996
             Provide whole maybe agree church respond most ...
                                                                            18
      49997
             Bring different everyone international capital...
                                                                            43
             Than about single generation itself seek sell ...
      49998
                                                                            45
      49999
             Here morning class various room human true bec...
                                                                            91
             Mention Count Follower Count Verified Bot Label
                                                                              Location \
      0
                                        2353
                                                                             Adkinston
                          1
                          5
                                                                 0
      1
                                        9617
                                                     1
                                                                            Sanderston
                          2
      2
                                        4363
                                                     1
                                                                 0
                                                                          Harrisonfurt
      3
                          5
                                        2242
                                                     1
                                                                          Martinezberg
      4
                          3
                                        8438
                                                     2
                                                                 1
                                                                          Camachoville
      49995
                          0
                                        9911
                                                     1
                                                                    Lake Kimberlyburgh
      49996
                          5
                                        9900
                                                                             Greenbury
```

```
49997
                         3
                                       6313
                                                                         Deborahfort
                                                    1
                                                               1
      49998
                                                    2
                                                               0
                         1
                                       6343
                                                                         Stephenside
      49999
                         4
                                      4006
                                                    2
                                                               0
                                                                           Novakberg
                      Created At
                                                          Hashtags
             2020-05-11 15:29:50
      0
                                                               NaN
      1
             2022-11-26 05:18:10
                                                         both live
      2
             2022-08-08 03:16:54
                                                       phone ahead
      3
             2021-08-14 22:27:05
                                                ever quickly new I
      4
             2020-04-13 21:24:21
                                                   foreign mention
      49995 2023-04-20 11:06:26
                                  teach quality ten education any
      49996 2022-10-18 03:57:35
                                           add walk among believe
      49997 2020-07-08 03:54:08
                                          onto admit artist first
      49998 2022-03-22 12:13:44
                                                              star
      49999 2022-12-03 06:11:07
                                                              home
      [50000 rows x 11 columns]
[18]: from sklearn.model_selection import train_test_split
      x_train,x_test,y_train,y_test=train_test_split(x,y,train_size=0.70)
[19]: from sklearn.ensemble import RandomForestClassifier
      rfc = RandomForestClassifier()
      rfc.fit(x_train,y_train)
[19]: RandomForestClassifier()
[20]: parameters = {'max_depth': [1,2,3,4,5], 'min_samples_leaf': [5,10,15,20,25],
                    'n estimators': [10,20,30,40,50]
                    }
[21]: from sklearn.model_selection import GridSearchCV
      grid_search = |
       GridSearchCV(estimator=rfc,param_grid=parameters,cv=2,scoring="accuracy")
      grid_search.fit(x_train,y_train)
[21]: GridSearchCV(cv=2, estimator=RandomForestClassifier(),
                   param_grid={'max_depth': [1, 2, 3, 4, 5],
                                'min_samples_leaf': [5, 10, 15, 20, 25],
                                'n_estimators': [10, 20, 30, 40, 50]},
                   scoring='accuracy')
[22]:
      grid_search.best_score_
[22]: 0.5062571428571429
```

```
[23]: rfc_best = grid_search.best_estimator_
```

```
[24]: from sklearn.tree import plot_tree plt.figure(figsize=(89,40)) plot_tree(rfc_best.estimators_[5], feature_names=x.columns, class_names=['Yes',__ o'No'], filled=True)
```

```
[24]: [Text(0.5, 0.75, 'Retweet Count <= 1.5\ngini = 0.5\nsamples = 22157\nvalue =
        [17525, 17475]\nclass = Yes'),
        Text(0.25, 0.25, 'gini = 0.497\nsamples = 438\nvalue = [374, 324]\nclass =
        Yes'),
        Text(0.75, 0.25, 'gini = 0.5\nsamples = 21719\nvalue = [17151, 17151]\nclass =
        Yes')]</pre>
```

Retweet Count <= 1.5 gini = 0.5 samples = 22157 value = [17525, 17475] class = Yes

gini = 0.497 samples = 438 value = [374, 324] class = Yes gini = 0.5 samples = 21719 value = [17151, 17151] class = Yes