import pandas as pd In [2]: import numpy as np from sklearn.model_selection import train_test_split from sklearn.feature_extraction.text import TfidfVectorizer from sklearn.linear_model import LogisticRegression from sklearn.metrics import accuracy_score In [3]: # Loading the data from csv file to a pandas Dataframe raw_mail_data = pd.read_csv(r"C:\Users\annu\Downloads\mail_data.csv") In [5]: raw_mail_data.sample(10) Out[5]: **Category** Message I'm leaving my house now. ham 4675 Oh all have to come ah? 929 ham 2607 ham R U &SAM P IN EACHOTHER. IF WE MEET WE CAN GO ... 614 ham THANX4 TODAY CER IT WAS NICE 2 CATCH UP BUT WE... Sex up ur mobile with a FREE sexy pic of Jorda... 1194 spam 650 You have won ?1,000 cash or a ?2,000 prize! To... spam Yup i thk cine is better cos no need 2 go down... 152 ham Ok. ham 3492 4871 Dip's cell dead. So i m coming with him. U bet... ham Come to medical college at 7pmforward i... 3253 ham raw_mail_data.isnull().sum() 0 Category Message dtype: int64 In [12]: # replace the null values with a null string raw_mail=raw_mail_data.where((pd.notnull(raw_mail_data)),'') raw_mail.shape (5572, 2)In [14]: raw_mail.head() Out[14]: Category Message Go until jurong point, crazy.. Available only ... 0 ham Ok lar... Joking wif u oni... 1 ham spam Free entry in 2 a wkly comp to win FA Cup fina... U dun say so early hor... U c already then say... 3 Nah I don't think he goes to usf, he lives aro... ham In [18]: #Label Encoding for target column # label spam mail as 0; ham mail as 1; raw_mail.loc[raw_mail['Category']=='spam','Category']=0 raw_mail.loc[raw_mail['Category'] == 'ham', 'Category',] = 1 # separating the data as texts and label In [19]: X = raw_mail['Message'] Y = raw_mail['Category'] print(X) In [20]: Go until jurong point, crazy.. Available only ... Ok lar... Joking wif u oni... Free entry in 2 a wkly comp to win FA Cup fina... U dun say so early hor... U c already then say... Nah I don't think he goes to usf, he lives aro... This is the 2nd time we have tried 2 contact u... 5567 Will ü b going to esplanade fr home? 5568 Pity, * was in mood for that. So...any other s... 5569 The guy did some bitching but I acted like i'd... 5570 Rofl. Its true to its name 5571 Name: Message, Length: 5572, dtype: object In [21]: print(Y) 5567 5568 5569 5570 5571 Name: Category, Length: 5572, dtype: object Splitting the data into training data & test data In [22]: X_train,X_test,Y_train,Y_test=train_test_split(X,Y,test_size=0.2, random_state=3) In [23]: print(X.shape) print(X_train.shape) print(X_test.shape) (5572,)(4457,)(1115,)Feature Extraction In [25]: # transform the text data to feature vectors that can be used as input to the Logistic regression feature_extraction = TfidfVectorizer(min_df = 1, stop_words='english', lowercase=True) X_train_features = feature_extraction.fit_transform(X_train) X_test_features = feature_extraction.transform(X_test) # convert Y_train and Y_test values as integers Y_train = Y_train.astype('int') Y_test = Y_test.astype('int') In [26]: print(X_train) Don know. I did't msg him recently. 3075 Do you know why god created gap between your f... 1787 Thnx dude. u guys out 2nite? 1614 4304 Yup i'm free... 44 7732584351, Do you want a New Nokia 3510i c... 3266 5 Free Top Polyphonic Tones call 087018728737,... 789 What do u want when i come back?.a beautiful n... 968 Guess who spent all last night phasing in and ... 1667 Eh sorry leh... I din c ur msg. Not sad alread... 3321 Free Top ringtone -sub to weekly ringtone-get ... 1688 Name: Message, Length: 4457, dtype: object In [27]: print(X_train_features) (0, 5413) 0.6198254967574347 (0, 4456)0.4168658090846482 (0, 2224) 0.413103377943378 (0, 3811) 0.34780165336891333 (0, 2329) 0.38783870336935383 (1, 4080)0.18880584110891163 (1, 3185) 0.29694482957694585 (1, 3325) 0.31610586766078863 (1, 2957) 0.3398297002864083 (1, 2746) 0.3398297002864083 (1, 918)0.22871581159877646 (1, 1839) 0.2784903590561455 0.3226407885943799 (1, 2758) (1, 2956) 0.33036995955537024 (1, 1991)0.33036995955537024 (1, 3046) 0.2503712792613518 (1, 3811) 0.17419952275504033 (2, 407)0.509272536051008 (2, 3156) 0.4107239318312698 (2, 2404)0.45287711070606745 (2, 6601) 0.6056811524587518 (3, 2870) 0.5864269879324768 (3, 7414) 0.8100020912469564 (4, 50)0.23633754072626942 0.15743785051118356 (4, 5497) (4454, 4602) 0.2669765732445391 (4454, 3142) 0.32014451677763156 0.37052851863170466 (4455, 2247) (4455, 2469) 0.35441545511837946 (4455, 5646) 0.33545678464631296 0.29731757715898277 (4455, 6810) (4455, 6091) 0.23103841516927642 (4455, 7113) 0.30536590342067704 (4455, 3872) 0.3108911491788658 (4455, 4715)0.30714144758811196 0.19636985317119715 (4455, 6916) (4455, 3922) 0.31287563163368587 (4455, 4456)0.24920025316220423 0.292943737785358 (4456, 141) (4456, 647) 0.30133182431707617 (4456, 6311) 0.30133182431707617 (4456, 5569) 0.4619395404299172 (4456, 6028) 0.21034888000987115 (4456, 7154) 0.24083218452280053 (4456, 7150) 0.3677554681447669 (4456, 6249) 0.17573831794959716 (4456, 6307) 0.2752760476857975 (4456, 334) 0.2220077711654938 (4456, 5778) 0.16243064490100795 (4456, 2870) 0.31523196273113385 Training the Model with Logistic Regression In [28]: model = LogisticRegression() In [29]: # training the Logistic Regression model with the training data model.fit(X_train_features, Y_train) Out[29]: ▼ LogisticRegression LogisticRegression() In [30]: # prediction on training data prediction_on_training_data = model.predict(X_train_features) accuracy_on_training_data = accuracy_score(Y_train, prediction_on_training_data) In [31]: print('Accuracy on training data : ', accuracy_on_training_data) Accuracy on training data: 0.9670181736594121 In [32]: # prediction on test data prediction_on_test_data = model.predict(X_test_features) accuracy_on_test_data = accuracy_score(Y_test, prediction_on_test_data) In [33]: print('Accuracy on test data : ', accuracy_on_test_data) Accuracy on test data : 0.9659192825112107 Building a Predictive System In [38]: input_mail = ["You have won ?1,000 cash or a ?2,000 prize! To..."] # convert text to feature vectors input_data_features = feature_extraction.transform(input_mail) # making prediction prediction = model.predict(input_data_features) print(prediction) if (prediction[0]==1): print('Ham mail') else: print('Spam mail') Spam mail In []: