```
In [280...
          import pandas as pd
          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, classification_report, confusion_matrix
           import matplotlib.pyplot as plt
           import seaborn as sns
          data = pd.read_csv('spam.csv')
In [12]:
In [14]:
          data.keys()
Out[14]:
          Index(['v1', 'v2', 'Unnamed: 2', 'Unnamed: 3', 'Unnamed: 4'], dtype='object')
          data.head()
In [16]:
Out[16]:
                                                           Unnamed:
                                                                        Unnamed:
                                                                                    Unnamed:
                                                      v2
                v1
                                                                   2
                                                                                3
                        Go until jurong point, crazy.. Available
           0
              ham
                                                                 NaN
                                                                             NaN
                                                                                          NaN
                                                   only ...
                                   Ok lar... Joking wif u oni...
              ham
                                                                 NaN
                                                                             NaN
                                                                                          NaN
                     Free entry in 2 a wkly comp to win FA Cup
           2 spam
                                                                 NaN
                                                                             NaN
                                                                                          NaN
                      U dun say so early hor... U c already then
           3
              ham
                                                                 NaN
                                                                             NaN
                                                                                          NaN
                                                    say...
                      Nah I don't think he goes to usf, he lives
           4
              ham
                                                                 NaN
                                                                             NaN
                                                                                          NaN
                                                    aro...
In [18]:
         data.info()
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 5572 entries, 0 to 5571
         Data columns (total 5 columns):
              Column
                           Non-Null Count Dtype
              -----
                           _____
                           5572 non-null
                                            object
          0
              v1
          1
                           5572 non-null
                                            object
          2
              Unnamed: 2 50 non-null
                                            object
              Unnamed: 3 12 non-null
                                            object
              Unnamed: 4 6 non-null
                                            object
         dtypes: object(5)
         memory usage: 217.8+ KB
In [20]:
          data["v1"].value_counts()
Out[20]:
          v1
           ham
                   4825
           spam
                    747
           Name: count, dtype: int64
```

```
In [22]:
           data.describe()
Out[22]:
                                                                                                 Unnamed:
                                      v2
                                                            Unnamed: 2
                                                                                 Unnamed: 3
                       v1
                                                                       50
                                                                                           12
                                                                                                          6
             count 5572
                                    5572
                        2
                                    5169
                                                                      43
                                                                                           10
                                                                                                          5
            unique
                             Sorry, I'll call
                                           bt not his girlfrnd... G o o d n i
                                                                                   MK17 92H.
                     ham
                                                                                                    GNT:-)"
               top
                                    later
                                                              g h t . . . @"
                                                                                  450Ppw 16"
                    4825
                                      30
                                                                        3
                                                                                                          2
               freq
                                                                                            2
           data = data.drop(columns=['Unnamed: 2', 'Unnamed: 3', 'Unnamed: 4'])
In [24]:
In [26]:
           data
Out[26]:
                     v1
                                                                      v2
               0
                    ham
                             Go until jurong point, crazy.. Available only ...
               1
                                                Ok lar... Joking wif u oni...
                    ham
               2
                   spam
                          Free entry in 2 a wkly comp to win FA Cup fina...
               3
                    ham
                            U dun say so early hor... U c already then say...
               4
                    ham
                            Nah I don't think he goes to usf, he lives aro...
           5567
                   spam
                           This is the 2nd time we have tried 2 contact u...
           5568
                                    Will i_ b going to esplanade fr home?
                    ham
           5569
                             Pity, * was in mood for that. So...any other s...
                    ham
            5570
                            The guy did some bitching but I acted like i'd...
                    ham
           5571
                                                  Rofl. Its true to its name
                    ham
           5572 rows × 2 columns
In [28]:
           data.describe()
Out[28]:
```

t[28]: v1 v2 count 5572 5572 unique 2 5169 top ham Sorry, I'll call later freq 4825 30

```
In [30]: data.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 5572 entries, 0 to 5571
        Data columns (total 2 columns):
             Column Non-Null Count Dtype
                     -----
                                     ----
                     5572 non-null
         0
             ٧1
                                     object
         1
             v2
                     5572 non-null object
        dtypes: object(2)
        memory usage: 87.2+ KB
In [32]: data = data.where((pd.notnull(data)), '')
In [36]: data.shape
Out[36]: (5572, 2)
In [38]: data.loc[data['v1'] == 'spam', 'v1',] = 0
In [40]: data.loc[data['v1'] == 'ham', 'v1',] = 1
In [44]: X = data['v2']
         y = data['v1']
In [46]: print(X)
        0
                Go until jurong point, crazy.. Available only ...
        1
                                    Ok lar... Joking wif u oni...
        2
                Free entry in 2 a wkly comp to win FA Cup fina...
        3
                U dun say so early hor... U c already then say...
        4
                Nah I don't think he goes to usf, he lives aro...
        5567
                This is the 2nd time we have tried 2 contact u...
        5568
                            Will <u>i</u> b going to esplanade fr home?
        5569
                Pity, * was in mood for that. So...any other s...
        5570
                The guy did some bitching but I acted like i'd...
        5571
                                       Rofl. Its true to its name
        Name: v2, Length: 5572, dtype: object
In [48]: print(y)
        0
                1
        1
                1
        2
                0
        3
                1
        4
                1
        5567
                0
        5568
                1
        5569
                1
        5570
                1
        5571
        Name: v1, Length: 5572, dtype: object
```

```
In [66]: X_train, X_test, y_train,y_test = train_test_split(X,y, test_size=0.2, random_state
 In [68]: print(X.shape)
          print(X_train.shape)
          print(X_test.shape)
         (5572,)
         (4457,)
         (1115,)
In [70]: print(y.shape)
          print(y_train.shape)
          print(y_test.shape)
         (5572,)
         (4457,)
         (1115,)
In [234... feature_extraction = TfidfVectorizer(min_df = 1, stop_words = 'english', lowercase
          X_train_features = feature_extraction.fit_transform(X_train)
          X_test_features = feature_extraction.transform(X_test)
          y_train = y_train.astype('int')
          y_test = y_test.astype('int')
In [238... print(X_train_features)
```

```
Coords
              Values
(0, 4513)
              0.2909649098524696
(0, 3380)
              0.21807195185332803
(0, 3262)
              0.25877035357606315
(0, 3136)
              0.440116181574609
(0, 2122)
              0.38613577623520473
(0, 3386)
              0.3219352588930141
(0, 6599)
              0.20296878731699391
(0, 4296)
              0.3891385935794867
(0, 3979)
              0.2410582143632299
(0, 741)
              0.3219352588930141
(1, 7443)
              0.35056971070320353
(1, 6442)
              0.5652509076654626
(1, 6417)
              0.4769136859540388
(1, 6872)
              0.4306015894277422
(1, 4061)
              0.380431198316959
(2, 5825)
              0.4917598465723273
(2, 2226)
              0.413484525934624
(2, 3917)
              0.40088501350982736
(2, 2109)
              0.42972812260098503
(2, 933)
              0.4917598465723273
(3, 7453)
              0.5202633571003087
(3, 1842)
              0.3708680641487708
(3, 1599)
              0.5927091854194291
(3, 6140)
              0.4903863168693604
(4, 1842)
              0.36051481797205776
(4452, 4636) 0.4030918768627523
(4453, 1762) 0.45610005640082985
(4453, 7273)
              0.5787739591782677
(4453, 999)
              0.6760129013031282
(4454, 5370) 0.42618909997886
(4454, 7346) 0.31166263834107377
(4454, 1049)
              0.31932060116006045
(4454, 2001)
              0.4166919007849217
(4454, 3088) 0.34475593009514444
(4454, 2086)
              0.3809693742808703
(4454, 3029) 0.42618909997886
(4455, 4773)
              0.35860460546223444
(4455, 3763) 0.16807158405536876
(4455, 4251) 0.30616657078392584
(4455, 2108) 0.3136468384526087
(4455, 7407) 0.3028481995557642
(4455, 7358)
              0.2915949626395065
(4455, 2764) 0.3226323745940581
(4455, 6361) 0.25697343671652706
(4455, 6433)
             0.38998123077430413
(4455, 1148)
              0.38998123077430413
(4456, 4557)
              0.48821933148688146
(4456, 1386) 0.4460036316446079
(4456, 6133) 0.5304350313291551
(4456, 6117) 0.5304350313291551
```

```
Mum, hope you are having a great day. Hoping t...
3075
1787
                              Yes:)sura in sun tv.:)lol.
       Me sef dey laugh you. Meanwhile how's my darli...
1614
4304
                   Yo come over carlos will be here soon
3266
                        Ok then i come n pick u at engin?
789
                            Gud mrng dear hav a nice day
968
               Are you willing to go for aptitude class.
        So now my dad is gonna call after he gets out ...
1667
3321
        Ok darlin i supose it was ok i just worry too ...
1688
                        Nan sonathaya soladha. Why boss?
Name: v2, Length: 4457, dtype: object
```

In [242... print(X_test_features)

<Compressed Sparse Row sparse matrix of dtype 'float64'</pre> with 7766 stored elements and shape (1115, 7511)>

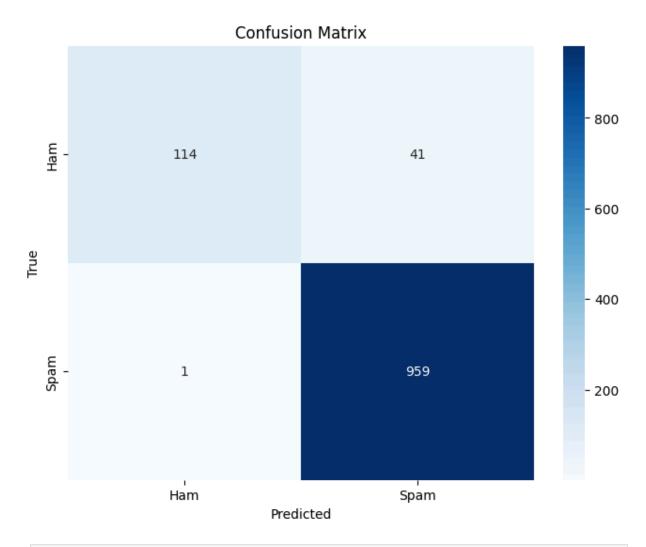
<u> </u>	oo stored elements and shape (1115) /511//
Coords	Values 0.667337188824809
	0.5159375448718375
	0.537093591660729
	0.21260233518669944
, , ,	0.24547458936715755
	0.28671640581392144
(1, 520)	0.1934450786526249
(1, 602)	0.28671640581392144
(1, 2899)	0.1385795841356552
(1, 3300)	0.37297727661877506
(1, 3365)	0.28671640581392144
(1, 4045)	0.250549335510249
(1, 5250)	0.28671640581392144
(1, 5347)	0.2733682162643466
(1, 5501)	0.28671640581392144
(1, 6579)	0.2733682162643466
	0.14954692788663673
	0.23059492898537964
	0.47195476517479323
	0.6068486133983123
(2, 4070)	0.44361668503137164
(2, 6648)	0.3410121739015846
(2, 6701)	0.30969080396105314
(3, 1606)	0.28517759021090444
(3, 2649)	0.303870736800912
: :	
(1111, 2458)	0.42325261089251354
(1111, 3259)	0.44776220819286267
(1111, 6093)	0.467191431141905
(1111, 6848)	0.3968546202564372
(1111, 6848) (1111, 7415)	<pre>0.3968546202564372 0.49457538286455366</pre>
(1111, 6848) (1111, 7415) (1112, 2114)	0.3968546202564372 0.49457538286455366 0.32870972643480745
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704)	<pre>0.3968546202564372 0.49457538286455366</pre>
(1111, 6848) (1111, 7415) (1112, 2114)	0.3968546202564372 0.49457538286455366 0.32870972643480745
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 3259) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239) (1113, 3963)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463 0.3910346709289789
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239) (1113, 3963) (1113, 5806)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463 0.3910346709289789 0.488439471695463
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239) (1113, 3963) (1113, 5806) (1113, 6846)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463 0.3910346709289789 0.488439471695463 0.4168758749641195
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239) (1113, 3963) (1113, 5806) (1113, 6846) (1114, 2352)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463 0.3910346709289789 0.488439471695463 0.4168758749641195 0.270495916357943
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 3259) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239) (1113, 3963) (1113, 5806) (1113, 6846) (1114, 2352) (1114, 2862)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463 0.3910346709289789 0.488439471695463 0.4168758749641195 0.270495916357943 0.38140394975458775
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 3259) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239) (1113, 3963) (1113, 5806) (1113, 6846) (1114, 2352) (1114, 2862) (1114, 2899)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463 0.3910346709289789 0.488439471695463 0.4168758749641195 0.270495916357943 0.38140394975458775 0.2421646568502054
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239) (1113, 3963) (1113, 5806) (1113, 6846) (1114, 2352) (1114, 2862) (1114, 2899) (1114, 3564)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463 0.3910346709289789 0.488439471695463 0.4168758749641195 0.270495916357943 0.38140394975458775 0.2421646568502054 0.40844238751288037
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239) (1113, 3963) (1113, 5806) (1113, 6846) (1114, 2352) (1114, 2862) (1114, 2899) (1114, 3564) (1114, 5073)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463 0.3910346709289789 0.488439471695463 0.4168758749641195 0.270495916357943 0.38140394975458775 0.2421646568502054 0.40844238751288037 0.3194139844000448
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239) (1113, 3963) (1113, 5806) (1113, 6846) (1114, 2352) (1114, 2862) (1114, 2899) (1114, 3564) (1114, 5073) (1114, 5565)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463 0.3910346709289789 0.488439471695463 0.4168758749641195 0.270495916357943 0.38140394975458775 0.2421646568502054 0.40844238751288037 0.3194139844000448 0.5010303679312903
(1111, 6848) (1111, 7415) (1112, 2114) (1112, 2704) (1112, 2780) (1112, 3259) (1112, 3432) (1112, 4282) (1112, 4903) (1113, 1657) (1113, 3239) (1113, 3963) (1113, 5806) (1113, 6846) (1114, 2352) (1114, 2862) (1114, 2899) (1114, 3564) (1114, 5073) (1114, 5565)	0.3968546202564372 0.49457538286455366 0.32870972643480745 0.3704547809702327 0.3745139316876871 0.3631408033721114 0.3631408033721114 0.35091845697551116 0.47703903024985594 0.44289971323548966 0.488439471695463 0.3910346709289789 0.488439471695463 0.4168758749641195 0.270495916357943 0.38140394975458775 0.2421646568502054 0.40844238751288037 0.3194139844000448

```
454
                 Loan for any purpose å£500 - å£75,000. Homeown...
         983
                 LOOK AT THE FUCKIN TIME. WHAT THE FUCK YOU THI...
         1282
                 Ever green quote ever told by Jerry in cartoon...
         4610
                                                Wat time <u>l</u> finish?
                 Lol no. Just trying to make your day a little ...
         4827
         5291
                   Xy trying smth now. U eat already? We havent...
         3325
                 Huh so fast... Dat means u havent finished pai...
         3561
                 Still chance there. If you search hard you wil...
         1136
                 Dont forget you can place as many FREE Request...
         Name: v2, Length: 1115, dtype: object
In [246...
         print(y_train)
         3075
                 1
         1787
                 1
         1614
                 1
         4304
                 1
         3266
                 1
                . .
         789
                 1
         968
                 1
         1667
                 1
         3321
                 1
         1688
         Name: v1, Length: 4457, dtype: int32
In [248...
          print(y_test)
         2632
         454
                 0
         983
                 1
         1282
                 1
         4610
                 1
         4827
                 1
         5291
                 1
         3325
                 1
         3561
                 1
         1136
         Name: v1, Length: 1115, dtype: int32
In [250...
          model = LogisticRegression()
In [252...
          model.fit(X_train_features, y_train_features)
Out[252...
               LogisticRegression
          LogisticRegression()
In [254...
          prediction = model.predict(X_train_features)
          accuracy = accuracy_score(y_train_features, prediction)
          print("Accuracy on Training data :", accuracy)
In [258...
```

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Accuracy on Training data : 0.9661207089970832

```
In [260...
          prediction_test = model.predict(X_test_features)
          accuracy_test = accuracy_score(y_test, prediction_test)
In [262... print("Accuracy on Testing data :", accuracy_test)
         Accuracy on Testing data : 0.9623318385650225
          predictions = model.predict(X test features)
In [278...
          report = classification_report(y_test, predictions)
          print(report)
                      precision recall f1-score support
                                     0.74
                           0.99
                                               0.84
                                                          155
                   1
                           0.96
                                     1.00
                                               0.98
                                                          960
                                               0.96
                                                         1115
            accuracy
                                     0.87
           macro avg
                           0.98
                                               0.91
                                                         1115
         weighted avg
                           0.96
                                     0.96
                                               0.96
                                                         1115
          predictions = model.predict(X_test_features)
In [282...
          cm = confusion_matrix(y_test, predictions)
          plt.figure(figsize=(8, 6))
          sns.heatmap(cm, annot=True, fmt='d', cmap='Blues', xticklabels=['Ham', 'Spam'], yti
          plt.xlabel('Predicted')
          plt.ylabel('True')
          plt.title('Confusion Matrix')
          plt.show()
```



```
input_your_mail = ['Go until jurong point, crazy.. Available only in bugis n great
input_data_features = feature_extraction.transform(input_your_mail)
prediction = model.predict(input_data_features)
if (prediction[0]==1):
    print("Ham mail")
else:
    print("Spam mail")
```

Ham mail