1. NLP using python

February 26, 2017

```
pwd
In [2]: messages = [line.rstrip() for line in open('SMS')]
In [3]: print len(messages)
5574
In [5]: for num, message in enumerate(messages[:10]):
            print num, message
            print '/n'
0 ham
             Go until jurong point, crazy.. Available only in bugis n great world
/n
             Ok lar... Joking wif u oni...
1 ham
/n
             Free entry in 2 a wkly comp to win FA Cup final tkts 21st May 2005.
2 spam
/n
3 ham
             U dun say so early hor... U c already then say...
/n
4 ham
             Nah I don't think he goes to usf, he lives around here though
/n
             FreeMsg Hey there darling it's been 3 week's now and no word back! I
5 spam
/n
6 ham
             Even my brother is not like to speak with me. They treat me like aids
/n
7 ham
             As per your request 'Melle Melle (Oru Minnaminunginte Nurungu Vettam)
/n
8 spam
              WINNER!! As a valued network customer you have been selected to receive
9 spam
              Had your mobile 11 months or more? U R entitled to Update to the late
/n
In [6]: import pandas
In [13]: messages = pandas.read_csv('SMS', sep = '\t', names=['labels', 'message'])
```

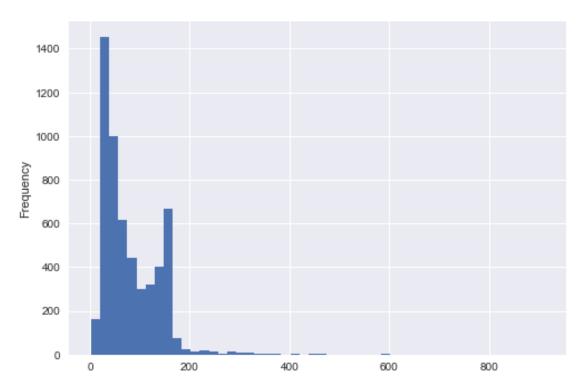
```
In [14]: messages.head()
Out[14]:
           labels
                                                              message
                   Go until jurong point, crazy.. Available only ...
              ham
         1
              ham
                                        Ok lar... Joking wif u oni...
             spam 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...
In [15]: messages.describe()
Out [15]:
                labels
                                        message
                  5572
         count
                                           5572
                     2
                                           5169
         unique
                   ham Sorry, I'll call later
         freq
                  4825
                                             30
In [16]: messages.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 5572 entries, 0 to 5571
Data columns (total 2 columns):
labels
         5572 non-null object
          5572 non-null object
message
dtypes: object(2)
memory usage: 87.1+ KB
In [18]: messages.groupby('labels').describe()
Out[18]:
                                                                   message
         labels
         ham
               count
                                                                       4825
                unique
                                                                       4516
                top
                                                    Sorry, I'll call later
                                                                         30
                freq
         spam
                count
                                                                        747
                                                                        653
                unique
                        Please call our customer service representativ...
                top
                freq
                                                                          4
In [20]: messages['length'] = messages['message'].apply(len)
         messages.head()
Out [20]:
           labels
                                                              message
                                                                        length
              ham Go until jurong point, crazy.. Available only ...
         0
                                                                           111
              ham
                                        Ok lar... Joking wif u oni...
                                                                            29
         1
         2
             spam Free entry in 2 a wkly comp to win FA Cup fina...
                                                                           155
              ham U dun say so early hor... U c already then say...
                                                                            49
              ham Nah I don't think he goes to usf, he lives aro...
                                                                            61
```

In [21]: %matplotlib inline

import matplotlib.pyplot as plt
import seaborn as sns

In [27]: messages['length'].plot(bins = 50,kind = 'hist')

Out[27]: <matplotlib.axes._subplots.AxesSubplot at 0x118973950>



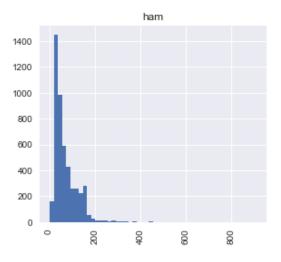
In [28]: messages['length'].describe()

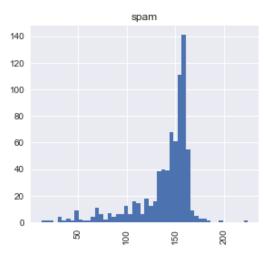
5572.000000 Out[28]: count 80.616296 mean 60.015593 std min 2.000000 25% 36.000000 50% 62.000000 75% 122.000000 910.000000 max

Name: length, dtype: float64

In [30]: messages[messages['length'] == 910]#['message'].iloc[0]

Out[30]: labels message length
1085 ham For me the love should start with attraction.i... 910





```
In [37]: import string
In [38]: mess = 'Sample message! Notice: it has punctuation'
In [41]: nopunc = [char for char in mess if char not in string.punctuation]
In [43]: nopunc
Out[43]: ['S',
           'a',
           'm',
           'p',
           '1',
           'e',
           'm',
           'e',
           's',
           's',
           'a',
           'g',
           'e',
```

```
'N',
          '0',
          't',
          'i',
          'c',
           'e',
           '',
           'i',
           't',
           '',
          'h',
          'a',
           's',
           '',
           'p',
          'u',
          'n',
          'c',
          'u',
          't',
          'a',
          't',
          'i',
          'o',
          'n']
In [44]: nopunc = ''.join(nopunc)
In [45]: nopunc
Out[45]: 'Sample message Notice it has puncutation'
In [46]: from nltk.corpus import stopwords
In [52]: stopwords.words('english')[:10]
Out[52]: [u'i',
          u'me',
          u'my',
          u'myself',
          u'we',
          u'our',
          u'ours',
          u'ourselves',
          u'you',
          u'your']
In [53]: len(stopwords.words('english'))
Out[53]: 153
```

```
In [54]: nopunc.split()
Out[54]: ['Sample', 'message', 'Notice', 'it', 'has', 'puncutation']
In [56]: clean_mess = [word for word in nopunc.split() if word.lower() not in stopy
In [57]: clean_mess
Out[57]: ['Sample', 'message', 'Notice', 'puncutation']
In [58]: def text_process(mess):
             # Check characters to see if they are in punctuation
             nopunc = [char for char in mess if char not in string.punctuation]
             # Join the characters again to form the string.
             nopunc = ''.join(nopunc)
             # Now just remove any stopwords
             return [word for word in nopunc.split() if word.lower() not in stopword
In [59]: messages.head()
Out [591:
           labels
                                                             message length
              ham Go until jurong point, crazy.. Available only ...
                                                                          111
                                       Ok lar... Joking wif u oni...
         1
                                                                           29
             spam Free entry in 2 a wkly comp to win FA Cup fina...
                                                                          155
              ham U dun say so early hor... U c already then say...
                                                                           49
         4
                   Nah I don't think he goes to usf, he lives aro...
              ham
                                                                           61
In [60]: messages['message'].head(5).apply(text_process)
Out[60]: 0
              [Go, jurong, point, crazy, Available, bugis, n...
         1
                                 [Ok, lar, Joking, wif, u, oni]
              [Free, entry, 2, wkly, comp, win, FA, Cup, fin...
                  [U, dun, say, early, hor, U, c, already, say]
              [Nah, dont, think, goes, usf, lives, around, t...
         Name: message, dtype: object
In [65]: from sklearn.feature_extraction.text import CountVectorizer
In [66]: bow_transformer = CountVectorizer (analyzer = text_process)
In [67]: bow_transformer.fit(messages['message'])
/Users/arnavsomani/anaconda/lib/python2.7/site-packages/ipykernel/__main__.py:9: Un
Out[67]: CountVectorizer(analyzer=<function text_process at 0x11b4ea140>, binary=Fa
                 decode_error=u'strict', dtype=<type 'numpy.int64'>,
                 encoding=u'utf-8', input=u'content', lowercase=True, max_df=1.0,
                 max_features=None, min_df=1, ngram_range=(1, 1), preprocessor=None
                 stop_words=None, strip_accents=None,
                 token_pattern=u'(?u)\\b\\w\\w+\\b', tokenizer=None,
```

vocabulary=None)

```
In [69]: message4 = messages['message'][3]
In [70]: print message4
U dun say so early hor... U c already then say...
In [71]: bow4 = bow_transformer.transform([message4])
In [84]: print bow4 #bag of words
  (0, 4068)
                   2
  (0, 4629)
                   1
  (0, 5261)
                   1
  (0, 6204)
                   1
  (0, 6222)
                   1
  (0, 7186)
                   1
  (0, 9554)
                   2
In [75]: print bow_transformer.get_feature_names()[4073]
UIN
In [77]: messages_bow = bow_transformer.transform(messages['message'])
/Users/arnavsomani/anaconda/lib/python2.7/site-packages/ipykernel/__main__.py:9: Un
In [78]: print 'Shape of Sparse Matrix: ', messages_bow.shape
         print 'Amount of Non-Zero occurences: ', messages_bow.nnz
         print 'sparsity: %.2f%%' % (100.0 * messages_bow.nnz / (messages_bow.shape
Shape of Sparse Matrix: (5572, 11425)
Amount of Non-Zero occurences: 50548
sparsity: 0.08%
In [83]: from sklearn.feature_extraction.text import TfidfTransformer
         tfidf_transformer = TfidfTransformer().fit(messages_bow)
         tfidf4 = tfidf_transformer.transform(bow4)
         print tfidf4
  (0, 9554)
                   0.538562626293
                   0.438936565338
  (0, 7186)
  (0, 6222)
                   0.318721689295
                   0.299537997237
  (0, 6204)
  (0, 5261)
                   0.297299574059
  (0, 4629)
                   0.266198019061
  (0, 4068)
                   0.408325899334
```

```
In [85]: print tfidf_transformer.idf_[bow_transformer.vocabulary_['u']]
3.28005242674
In [86]: messages_tfidf = tfidf_transformer.transform(messages_bow)
In [87]: print messages_tfidf.shape
(5572, 11425)
In [89]: from sklearn.naive_bayes import MultinomialNB
In [90]: spam_detect_model = MultinomialNB().fit(messages_tfidf, messages['labels'])
In [93]: print 'Predicted: ', spam_detect_model.predict(tfidf4)[0]
         print 'Expected: ', messages['labels'][3]
Predicted: ham
Expected: ham
In [94]: all_predictions = spam_detect_model.predict(messages_tfidf)
         print all predictions
['ham' 'ham' 'spam' ..., 'ham' 'ham' 'ham']
In [96]: from sklearn.metrics import classification_report
         print classification_report(messages['labels'], all_predictions)
             precision
                          recall f1-score
        ham
                  0.98
                            1.00
                                      0.99
                                                4825
                  1.00
                            0.85
                                      0.92
                                                 747
       spam
avg / total
                 0.98
                            0.98
                                      0.98
                                                5572
In [105]: from sklearn.cross_validation import train_test_split
          msg_train, msg_test, label_train, label_test = \
          train_test_split(messages['message'], messages['labels'], test_size=0.2)
          print len(msq_train), len(msq_test), len(msq_train) + len(msq_test)
4457 1115 5572
```

```
In [99]: from sklearn.pipeline import Pipeline
         pipeline = Pipeline([
             ('bow', CountVectorizer(analyzer=text_process)), # strings to token
             ('tfidf', TfidfTransformer()), # integer counts to weighted TF-IDF so
             ('classifier', MultinomialNB()), # train on TF-IDF vectors w/ Naive N
         1)
In [101]: pipeline.fit(msg_train, label_train)
/Users/arnavsomani/anaconda/lib/python2.7/site-packages/ipykernel/__main__.py:9: Un
Out[101]: Pipeline(steps=[('bow', CountVectorizer(analyzer=<function text_process a
                  decode_error=u'strict', dtype=<type 'numpy.int64'>,
                  encoding=u'utf-8', input=u'content', lowercase=True, max_df=1.0,
                  max_features=None, min_df=1, ngram_range=(1, 1), preprocessor=None
In [103]: predictions = pipeline.predict(msg_test)
/Users/arnavsomani/anaconda/lib/python2.7/site-packages/ipykernel/__main__.py:9: Un
In [104]: print classification_report(predictions, label_test)
             precision
                          recall f1-score
                                             support
                  1.00
                            0.96
                                      0.98
                                                 996
        ham
                  0.75
                            1.00
                                      0.86
                                                 119
       spam
```

0.97

1115

In []:

avg / total

0.97

0.96