In [6]: ► df.head()

Out[6]:

	Maintenance Plan	Equipment	Manual/ Auto	Order	Notification	Header text:	Created on	
0	BL1000001170	BL000000005- 10-035	AUTO	913195093	713335025	* 09/19/2016 19:04:48 rick kessler (FNP_050408	2016- 09-19	01
1	Not Planned	BL000000101- 12-206	MANUAL	913195171	713335093	* 09/19/2016 19:13:49 rick kessler (FNP_050408	2016- 09-19	1(
2	Not Planned	BL000000104- 09-851	MANUAL	913195174	713335096	* 09/19/2016 19:14:44 rick kessler (FNP_050408	2016- 09-19	1(F
3	Not Planned	BL000000154- 12-730	MANUAL	913195175	713335097	* 09/19/2016 19:14:57 rick kessler (FNP_050408	2016- 09-19	1: E>
4	BL1000001170	BL000000101- 12-206	AUTO	913195180	713335112	* 09/19/2016 19:16:05 rick kessler (FNP_050408	2016- 09-19	10

5 rows × 22 columns

In [7]: M df['Tech ID'] = df['Sort field'].apply(lambda x: x.split()[0])

df.head() In [8]: 09/19/2016 BL00000104-19:14:44 rick 2016-2 Not Planned MANUAL 913195174 713335096 09-851 09-19 kessler (FNP_050408... * 09/19/2016 BL000000154-2016-19:14:57 rick 3 Not Planned MANUAL 913195175 713335097 12-730 kessler 09-19 (FNP_050408... * 09/19/2016 BL000000101-19:16:05 rick 2016-4 BL1000001170 AUTO 913195180 713335112 12-206 kessler 09-19 (FNP_050408...

In [9]: M df2 = pd.read_excel(excel, sheet_name='CYCLE')

Out[10]:

	Maint plan	cycle
0	500000770376	52
1	500000770393	52
2	500000770396	52
3	500000770397	52
4	500000770404	52
5	500000842187	1
6	500000843147	52
7	500000916370	52
8	BL1000001159	4
9	BL1000001170	1
10	BL1000001205	1
11	BL1000001271	4
12	BL1000001608	4
13	BL1000001611	4
14	BL1000001612	52
15	BL1000001614	52

```
d = dict(zip(df2['Maint plan'], df2['cycle']))
In [11]:
               df['Cycle'] = df['Maintenance Plan'].map(d)
In [12]:
               df.head()
In [13]:
                                                                                   * 09/19/2016
                                 BL000000104-
                                                                                   19:14:44 rick
                                                                                                  2016-
                2
                     Not Planned
                                                MANUAL 913195174
                                                                     713335096
                                        09-851
                                                                                        kessler
                                                                                                  09-19
                                                                                 (FNP_050408...
                                                                                   * 09/19/2016
                                  BL000000154-
                                                                                   19:14:57 rick
                                                                                                  2016-
                3
                     Not Planned
                                                MANUAL 913195175
                                                                     713335097
                                        12-730
                                                                                        kessler
                                                                                                  09-19
                                                                                 (FNP_050408...
                                                                                   * 09/19/2016
                                 BL00000101-
                                                                                   19:16:05 rick
                                                                                                  2016-
                  BL1000001170
                                                  AUTO 913195180
                                                                     713335112
                                        12-206
                                                                                        kessler
                                                                                                  09-19
                                                                                 (FNP_050408...
```

```
In [14]:
             df.info()
             <class 'pandas.core.frame.DataFrame'>
             RangeIndex: 1713 entries, 0 to 1712
             Data columns (total 24 columns):
             Maintenance Plan
                                                 1713 non-null object
                                                 1713 non-null object
             Equipment
             Manual/ Auto
                                                 1713 non-null object
             Order
                                                 1713 non-null int64
                                                 1713 non-null int64
             Notification
                                                 1556 non-null object
             Header text:
                                                 1713 non-null datetime64[ns]
             Created on
             Sort field
                                                 1713 non-null object
             Description of Technical Object
                                                 1713 non-null object
             Description
                                                 1713 non-null object
             Functional Location
                                                 1713 non-null object
                                                 1713 non-null object
             Main work center
             ABC indicator
                                                 1713 non-null object
             User Status
                                                 1713 non-null object
                                                 1713 non-null object
             System status
             Priority
                                                 1713 non-null int64
             Estimated costs
                                                 238 non-null float64
             Total planned costs
                                                 238 non-null float64
             Total actual costs
                                                 238 non-null float64
                                                 238 non-null datetime64[ns]
             Basic start date
                                                 238 non-null datetime64[ns]
             Basic finish date
                                                 238 non-null object
             MaintActivityType
             Tech ID
                                                 1713 non-null object
             Cvcle
                                                 238 non-null float64
             dtypes: datetime64[ns](3), float64(4), int64(3), object(14)
             memory usage: 321.3+ KB
```

```
In [15]: ► df['Cycle'].fillna(value='Not Planned',inplace=True)
```

```
In [16]:
              df.head()
    Out[16]:
                   Maintenance
                                             Manual/
                                                                                         Created
                                                         Order Notification
                                                                             Header text:
                                  Equipment
                          Plan
                                                Auto
                                                                                              on
                                                                              * 09/19/2016
                               BL00000005-
                                                                              19:04:48 rick
                                                                                           2016-
                 BL1000001170
                                               AUTO 913195093
                                                                 713335025
                                     10-035
                                                                                  kessler
                                                                                           09-19
                                                                           (FNP 050408...
                                                                              * 09/19/2016
                               BL00000101-
                                                                              19:13:49 rick
                                                                                           2016-
               1
                    Not Planned
                                            MANUAL 913195171
                                                                 713335093
                                      12-206
                                                                                           09-19
                                                                                  kessler
                                                                           (FNP 050408...
                                                                              * 09/19/2016
                                                                              19:14:44 rick
                               BL00000104-
                                                                                           2016-
               2
                    Not Planned
                                             MANUAL 913195174
                                                                 713335096
                                     09-851
                                                                                  kessler
                                                                                           09-19
              df['Header text:'] = df['Header text:'].astype('str')
In [17]:
In [18]:
              import string
              import nltk
In [19]:
In [20]:
              nltk.download('stopwords')
              [nltk_data] Downloading package stopwords to
                                C:\Users\brian\AppData\Roaming\nltk_data...
              [nltk data]
                              Package stopwords is already up-to-date!
              [nltk data]
    Out[20]: True
In [21]:
              from nltk.corpus import stopwords
              stopwords.words('english')[0:10]
              ['i', 'me', 'my', 'myself', 'we', 'our', 'ours', 'ourselves', 'you', "you'r
    Out[21]:
              e"1
In [22]:
              def text clean(text):
                   nopunc = [char for char in text if char not in string.punctuation]
                   nopunc = ''.join(nopunc)
                   return [word for word in nopunc.split() if word.lower() not in stopwords.
```

```
In [23]: M df['Header text:'].head(5)
   Out[23]: 0
                  * 09/19/2016 19:04:48 rick kessler (FNP 050408...
                  * 09/19/2016 19:13:49 rick kessler (FNP 050408...
             1
                  * 09/19/2016 19:14:44 rick kessler (FNP 050408...
             2
                  * 09/19/2016 19:14:57 rick kessler (FNP 050408...
             3
                  * 09/19/2016 19:16:05 rick kessler (FNP 050408...
             Name: Header text:, dtype: object
In [24]:
             df['Text Length'] = df['Header text:'].apply(text_clean).apply(len)
In [25]:
             from sklearn.feature extraction.text import CountVectorizer
In [26]:
             bowxform = CountVectorizer(analyzer=text clean).fit(df['Header text:'])
In [27]:
             print(len(bowxform.vocabulary ))
             10126
             mess3 = df['Header text:'][2]
In [28]:
             print(mess3)
             * 09/19/2016 19:14:44 rick kessler (FNP 050408 F) * 104-09-851 FC1 POLY, In
             spect Piping for CUI: OIL LOOP WHERE FLASH FIRE
                                                               STARTED, Insulation was r
             emoved and replaced. When insulation was removed, the pipe was inspected
             and spots of corrosion were noted.Remove
                                                         insulation during turnaround, in
             spect, repair if necessary, coat and replace insulation. * 11-10-2016 18:
             31:53 Jim Bowers (US_501692235) * GLOBAL COMPLETED THIS JOB 11-2-2016.
             bow3 = bowxform.transform([mess3])
In [29]:
             print(bow3)
               (0, 1521)
                             1
               (0, 1709)
                             1
               (0, 1804)
                             1
               (0, 1840)
                             1
               (0, 3001)
                             1
               (0, 3125)
               (0, 5198)
                             1
               (0, 5295)
                             1
               (0, 5337)
                             1
               (0, 5625)
                             1
               (0, 5645)
               (0, 5651)
                             1
               (0, 5667)
                             1
               (0, 5742)
                             1
               (0, 5898)
                             1
               (0, 5908)
               (0, 5924)
                             1
               (0, 5941)
                             1
               (0, 6026)
                             1
```

```
In [30]:
             print(bowxform.get feature names()[9909])
             turnaround
             bow = bowxform.transform(df['Header text:'])
In [31]:
             print(bow.shape)
In [32]:
          H
             print(bow.nnz) # amount of non-zeros
             (1713, 10126)
             42494
             sparsity = (100.0 * bow.nnz / (bow.shape[0] * bow.shape[1]))
In [33]:
             print('sparsity: {}'.format(round(sparsity)))
             sparsity: 0
In [34]:
             from sklearn.feature extraction.text import TfidfTransformer
In [35]:
             tfidfx = TfidfTransformer().fit(bow)
             tfidf3 = tfidfx.transform(bow3)
In [36]:
              print(tfidf3)
                (0, 9909)
                              0.1499075033480169
                (0, 9622)
                              0.15766665348626746
                (0, 9345)
                              0.11559200259137001
                (0, 9278)
                              0.08812751920942793
                (0, 9277)
                              0.09851815623905447
                (0, 9263)
                              0.09960782185813376
                (0, 9257)
                              0.19775137481021704
                (0, 8977)
                              0.12688113068795687
                (0, 8806)
                              0.17879659107128973
                (0, 8777)
                              0.15766665348626746
                              0.11559200259137001
                (0, 8488)
                (0, 8425)
                              0.41243424981337334
                (0, 8403)
                              0.11346184627635698
                (0, 8402)
                              0.12457317628108784
                (0, 7754)
                              0.16944644473759693
                (0, 7638)
                              0.16944644473759693
                (0, 7063)
                              0.10154680362102783
                              0.14682822960481726
                (0, 6762)
                (0, 6434)
                              0.1534622640043607
In [37]:
             print(bowxform.get_feature_names()[9909])
             turnaround
             print(tfidfx.idf [bowxform.vocabulary ['fix']])
In [38]:
             7.060290738037835
```

```
In [39]:
              tfidf = tfidfx.transform(bow)
              print(tfidf.shape)
              (1713, 10126)
              tfidf3.sum()
In [40]:
    Out[40]: 5.9782394048429985
              print(tfidf)
In [41]:
                 (0, 10086)
                                0.16093646403504225
                 (0, 9965)
                                0.6192517192130789
                 (0, 9715)
                                0.21263168468446075
                 (0, 9492)
                                0.17232928705074455
                 (0, 9345)
                                0.16395791870399865
                 (0, 9277)
                                0.13974004679729188
                 (0, 9126)
                                0.2309362528528563
                 (0, 8784)
                                0.11417979962069731
                 (0, 8488)
                                0.16395791870399865
                 (0, 8173)
                                0.22363741240834734
                 (0, 8172)
                                0.2082639836088106
                 (0, 7959)
                                0.24034609478288166
                 (0, 7528)
                                0.253608522096902
                 (0, 6615)
                                0.2044113982248156
                 (0, 5667)
                                0.16395791870399865
                 (0, 3098)
                                0.253608522096902
                 (0, 1521)
                                0.16613933823695828
                 (1, 9345)
                                0.24428015866046454
                                0.24428015866046454
                 (1, 8488)
In [42]:
              test = pd.DataFrame(tfidf)
In [43]:
              test.head()
    Out[43]:
                                                      0
               0 (0, 10086)\t0.16093646403504225\n (0, 9965)...
               1
                  (0, 9345)\t0.24428015866046454\n (0, 8488)\...
               2
                   (0, 9909)\t0.1499075033480169\n (0, 9622)\t...
                  (0, 9845)\t0.17831278967496197\n (0, 9811)\...
                  (0, 10100)\t0.11713431970231188\n (0, 9345)...
In [44]:
              test.shape
    Out[44]: (1713, 1)
```

```
In [45]:

print(test.iloc[0,0])

                (0, 10086)
                              0.16093646403504225
                (0, 9965)
                              0.6192517192130789
                (0, 9715)
                              0.21263168468446075
                (0, 9492)
                              0.17232928705074455
                (0, 9345)
                              0.16395791870399865
                (0, 9277)
                              0.13974004679729188
                (0, 9126)
                              0.2309362528528563
                (0, 8784)
                              0.11417979962069731
                (0, 8488)
                              0.16395791870399865
                (0, 8173)
                              0.22363741240834734
                (0, 8172)
                              0.2082639836088106
                (0, 7959)
                              0.24034609478288166
                (0, 7528)
                              0.253608522096902
                (0, 6615)
                              0.2044113982248156
                (0, 5667)
                              0.16395791870399865
                (0, 3098)
                              0.253608522096902
                (0, 1521)
                              0.16613933823695828
In [46]:
             arg = np.argwhere(tfidf)
             arg
In [47]:
   Out[47]: array([[
                          0, 10086],
                          0,
                              9965],
                     0,
                              9715],
                     [ 1712,
                              1417],
                     [ 1712,
                              1404],
                     [ 1712,
                                60]], dtype=int32)
             argdf = pd.DataFrame(arg)
In [48]:
```

```
In [49]:
           ▶ argdf
                  18
                            8488
                  19
                            6534
                        1
                  20
                        1
                            6302
                  21
                        1
                            6002
                  22
                            5814
                        1
                  23
                        1
                            5667
                  24
                        1
                            5454
                  25
                        1
                            3223
                            3124
                  26
                        1
                  27
                            1615
                        1
                  28
                        1
                            1521
                        2
                  29
                            9909
In [50]:
              # Series.to_dense
In [51]:
              tfidf_array = tfidf.toarray()
              print(tfidf_array)
In [52]:
              [[0. 0. 0. ... 0. 0. 0.]
               [0. 0. 0. ... 0. 0. 0.]
               [0. 0. 0. ... 0. 0. 0.]
               [0. 0. 0. ... 0. 0. 0.]
               [0. 0. 0. ... 0. 0. 0.]
               [0. 0. 0. ... 0. 0. 0.]]
              newdf = pd.DataFrame(data=tfidf_array)
In [53]:
```

```
In [54]:
             newdf.head()
   Out[54]:
                                                    9 ... 10116 10117 10118 10119 10120 1012
                  0
                     1
                         2
                             3
                                 4
                                     5
                                         6
                                            7
                                                8
                    0.0 0.0
               0.0
                           0.0
                               0.0
                                   0.0
                                       0.0
                                           0.0
                                               0.0
                                                  0.0
                                                            0.0
                                                                  0.0
                                                                        0.0
                                                                              0.0
                                                                                    0.0
                                                                                          0.
              1 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 ...
                                                            0.0
                                                                  0.0
                                                                        0.0
                                                                              0.0
                                                                                    0.0
                                                                                          0.
              0.0
                                                                  0.0
                                                                        0.0
                                                                              0.0
                                                                                    0.0
                                                                                          0.
               0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0
                                               0.0
                                                  0.0 ...
                                                                  0.0
                                                                        0.0
                                                                              0.0
                                                                                    0.0
                                                            0.0
                                                                                          0.
              0.0
                                                                  0.0
                                                                        0.0
                                                                              0.0
                                                                                    0.0
                                                                                          0.
             5 rows × 10126 columns
In [55]:

    ★ tfidf_array.shape

   Out[55]: (1713, 10126)
In [56]:
             newdf.shape
   Out[56]: (1713, 10126)
In [57]:
             newdf.info()
             <class 'pandas.core.frame.DataFrame'>
             RangeIndex: 1713 entries, 0 to 1712
             Columns: 10126 entries, 0 to 10125
             dtypes: float64(10126)
             memory usage: 132.3 MB
             newdf[newdf[0] >0][0]
In [58]:
   Out[58]: 527
                     0.125524
             1257
                     0.079642
             Name: 0, dtype: float64
In [59]:
             new array= enumerate(tfidf array)
          M
             print(tfidf array.shape)
In [60]:
             (1713, 10126)
             for counter, doc in enumerate(tfidf array):
In [61]:
                 word_num = list(zip(bowxform.get_feature_names(), doc))
                 one doc as df = pd.DataFrame.from records(word num, columns=['term', 'sco
                                                                                         \blacktriangleright
```

In [62]: ▶ one_doc_as_df

Out[62]:

	term	score
0	drawings	0.498723
1	foreman	0.326147
2	US500977992	0.326147
3	jerry	0.317714
4	loop	0.200994
5	electrical	0.160884
6	Randy	0.133996
7	engineering	0.133996
8	Went	0.121356
9	4	0.083436
10	work	0.078769