```
In [2]: #Case Study: Testing Hypothesis
        #Hypothesis: Articles about Climate Change are more likely to be publish
        ed by "Liberal" sources
        import pandas as pd
        import numpy as np
        import string
        import re
        import matplotlib.pyplot as plt
        from collections import Counter
In [3]: | #Step 1: Load data into a dataframe
        addr1 = "data/articles1.csv"
        articles = pd.read csv(addr1)
In [4]: #Step 2: check the dimension of the table/look at the data
        print("The dimension of the table is: ", articles.shape)
        The dimension of the table is: (50000, 10)
In [5]: #Display the 1st five rows of data
        print(articles.head(5))
           Unnamed: 0
                          id
                                                                         title
        \
        0
                    0 17283 House Republicans Fret About Winning Their Hea...
                    1 17284 Rift Between Officers and Residents as Killing...
        1
                    2 17285 Tyrus Wong, 'Bambi' Artist Thwarted by Racial ...
        2
        3
                    3 17286 Among Deaths in 2016, a Heavy Toll in Pop Musi...
                             Kim Jong-un Says North Korea Is Preparing to T...
                    4 17287
              publication
                                                 author
                                                               date
                                                                       year mon
        th \
        0 New York Times
                                             Carl Hulse 2016-12-31 2016.0
                                                                              1
        2.0
        1 New York Times Benjamin Mueller and Al Baker 2017-06-19 2017.0
        6.0
        2 New York Times
                                           Margalit Fox 2017-01-06 2017.0
        1.0
        3 New York Times
                                      William McDonald 2017-04-10 2017.0
        4.0
        4 New York Times
                                          Choe Sang-Hun 2017-01-02 2017.0
        1.0
           url
                                                         content
        0 NaN WASHINGTON - Congressional Republicans have...
        1 NaN After the bullet shells get counted, the blood...
        2 NaN When Walt Disney's "Bambi" opened in 1942, cri...
        3 NaN Death may be the great equalizer, but it isn't...
        4 NaN SEOUL, South Korea - North Korea's leader, ...
```

```
#what type of variables are in the table
In [6]:
        print("Describe Data")
        print(articles.describe())
         # This shows the statistics applied only to numeric features of the datas
        Describe Data
                  Unnamed: 0
                                        id
                                                                  month
                                                                         url
                                                    year
        count
               50000.000000
                              50000.000000
                                            50000.000000
                                                          50000.000000
                                                                         0.0
               25694.378380
                             44432.454800
                                                               5.508940
        mean
                                             2016.273700
                                                                         NaN
        std
                              15773.615179
               15350.143677
                                                0.634694
                                                               3.333062
                                                                         NaN
        min
                    0.000000
                              17283.000000
                                             2011.000000
                                                               1.000000
                                                                         NaN
        25%
               12500.750000
                              31236.750000
                                             2016.000000
                                                               3.000000
                                                                         NaN
        50%
               25004.500000
                             43757.500000
                                             2016.000000
                                                               5.000000
                                                                         NaN
        75%
               38630.250000
                             57479.250000
                                             2017.000000
                                                              8.000000
                                                                         NaN
               53291.000000
                             73469.000000
                                             2017.000000
                                                              12.000000
        max
                                                                         NaN
In [7]:
        print("Summarized Data on features of object type ")
        print(articles.describe(include=np.object))
        Summarized Data on features of object type
                                                              title publication \
                                                              50000
                                                                          50000
        count
                                                              49920
                                                                              5
        unique
                The 10 most important things in the world righ...
                                                                      Breitbart
        top
                                                                          23781
        freq
                         author
                                       date
                                                   content
                          43694
        count
                                      50000
                                                     50000
                                                     49888
        unique
                           3603
                                        983
                Breitbart News
                                 2016-08-22 advertisement
        top
        freq
                           1559
                                        221
                                                        42
        #display length of data or number of rows
In [8]:
        print(len(articles))
        50000
```

In [9]: #display publishers (publications)
print(articles.publication.unique())

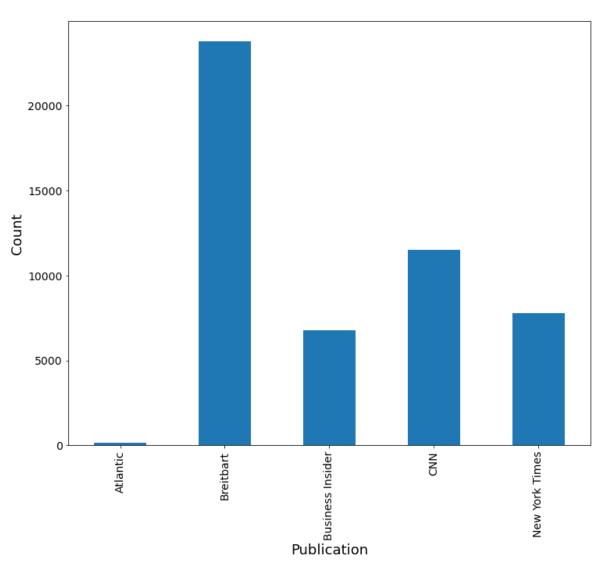
['New York Times' 'Breitbart' 'CNN' 'Business Insider' 'Atlantic']

```
#display min, max of years published
In [10]:
          print(articles['year'].min())
print(articles['year'].max())
          print("\n")
          #display how many articles from each year
          print(articles['year'].value_counts())
          2011.0
          2017.0
          2016.0
                     28451
          2017.0
                     17908
          2015.0
                      3326
          2013.0
                        212
          2014.0
                         76
          2012.0
                         26
          2011.0
                          1
```

Name: year, dtype: int64

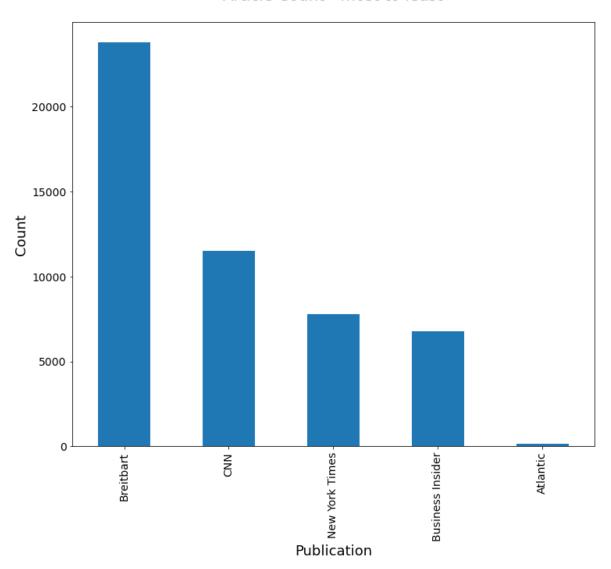
```
In [11]: #Step 3: Create some bar charts to show articles
    #display bar chart of articles sorted by Publication Name
    ax = articles['publication'].value_counts().sort_index().plot(kind='bar',
    fontsize=14, figsize=(12,10))
    ax.set_title('Article Publication\n', fontsize=20)
    ax.set_xlabel('Publication', fontsize=18)
    ax.set_ylabel('Count', fontsize=18);
    plt.show()
```

Article Publication



```
In [12]: #display bar chart of articles sorted by counts
ax = articles['publication'].value_counts().plot(kind='bar', fontsize=14,
    figsize=(12,10))
ax.set_title('Article Count - most to least\n', fontsize=20)
ax.set_xlabel('Publication', fontsize=18)
ax.set_ylabel('Count', fontsize=18);
plt.show()
```

Article Count - most to least



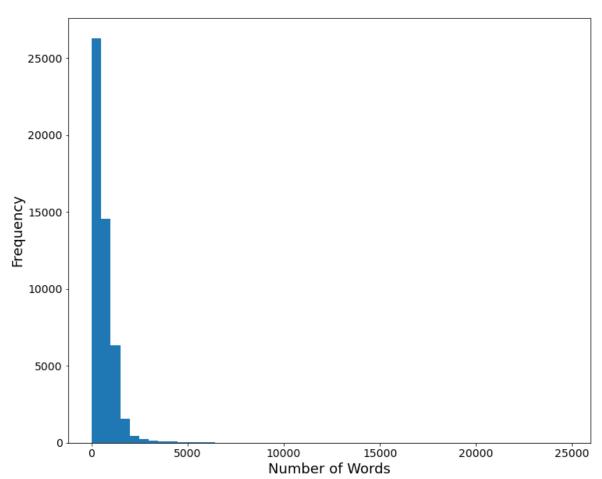
```
In [13]: #Step 4: clean text: no punctuation/all lowercase
    def clean_text(article):
        clean1 = re.sub(r'['+string.punctuation + ''-"'+']', "", article.lowe
    r())
        return re.sub(r'\W+', ' ', clean1)
```

```
articles['tokenized'] = articles['content'].map(lambda x: clean text(x))
In [14]:
         print("clean text: ",articles['tokenized'].head())
         clean text:
                            washington congressional republicans have a ne...
              after the bullet shells get counted the blood ...
         2
              when walt disneys bambi opened in 1942 critics...
         3
              death may be the great equalizer but it isnt n...
              seoul south korea north koreas leader kim said...
         Name: tokenized, dtype: object
In [15]: #look at mean, min, max article lengths
         articles['num wds'] = articles['tokenized'].apply(lambda x: len(x.split
         ()))
         print("Mean: ",articles['num_wds'].mean())
         print("Min: ",articles['num wds'].min())
         print("Max: ",articles['num wds'].max())
                 636.26046
         Mean:
         Min:
                24736
         Max:
In [16]: | #Step 5: remove articles with no words
         len(articles[articles['num wds']==0])
         articles = articles[articles['num wds']>0]
         print("new mean: ",articles['num_wds'].mean())
         print("new min: ",articles['num_wds'].min())
                     637.0886752778612
         new mean:
                    1
```

new min:

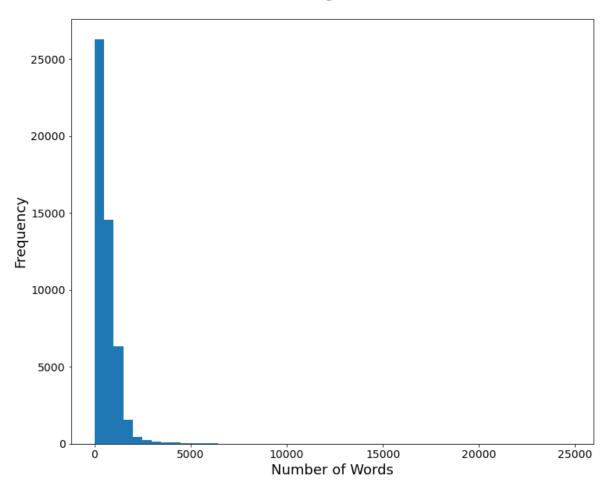
```
In [17]: #Step 6: Check for Outliers: show bar graph of outliers
ax=articles['num_wds'].plot(kind='hist', bins=50, fontsize=14, figsize=(1
2,10))
ax.set_title('Article Length in Words\n', fontsize=20)
ax.set_ylabel('Frequency', fontsize=18)
ax.set_xlabel('Number of Words', fontsize=18);
plt.show()
```

Article Length in Words



```
In [18]: #Step 6: Check for Outliers: show bar graph of outliers
ax=articles['num_wds'].plot(kind='hist', bins=50, fontsize=14, figsize=(1
2,10))
ax.set_title('Article Length in Words\n', fontsize=20)
ax.set_ylabel('Frequency', fontsize=18)
ax.set_xlabel('Number of Words', fontsize=18);
plt.show()
```

Article Length in Words



```
In [ ]:
```