In [1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns

In [3]: data = pd.read_csv("county_facts.csv")
 primary_results = pd.read_csv("primary_results.csv")

In [4]: data.loc[:, "PST045214":"POP060210"].describe()

max 3.188571e+08 3.087581e+08

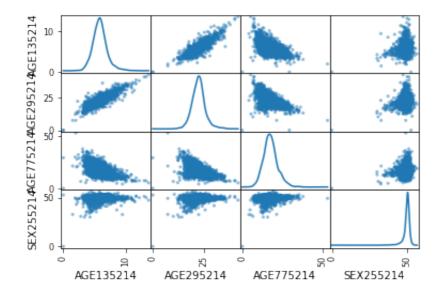
Out [4]: PST045214 PST040210 PST120214 POP010210 AGE135214 AGE295214 **count** 3.195000e+03 3.195000e+03 3195.000000 3.195000e+03 3195.000000 3195.000000 3 2.993963e+05 2.899137e+05 0.508545 2.899019e+05 5.900782 22.545290 mean std 5.768468e+06 5.584181e+06 4.180066 5.583955e+06 1.211925 3.418896 0.000000e+00 0.000000e+00 -17.000000 8.200000e+01 0.000000 0.000000 25% 1.113450e+04 1.129500e+04 -1.900000 1.129500e+04 5.200000 20.500000 50% 2.655300e+04 2.644600e+04 -0.100000 2.642400e+04 5.800000 22.500000 75% 7.247600e+04 7.150450e+04 2.300000 7.144800e+04 6.500000 24.200000

In [6]: pd.plotting.scatter_matrix(data.loc[:, "AGE135214":"SEX255214"], di plt.show()

72.900000 3.087455e+08

13.700000

42.000000



```
In [9]: sns.lmplot("AGE295214", "AGE775214", data, hue="SEX255214", fit_reg
                                                                  45.0
                                                                  45.1
                                                                  45.2
                                                                  45.3
                                                                  45.4
                                                                  45.5
                                                                  45.6
                                                                  45.7
                                                                  45.8
                                                                  45.9
                                                                  46.0
              40
                                                                  46.1
                                                                  46.2
                                                                  46.3
            AGE775214
              30
                                                                  46.4
                                                                  46.5
                                                                  46.6
              20
                                                                  46.8
                                                                  46.9
                                                                  47.0
              10
                                                                  47.1
In [10]: | ax = data.loc[:, "AGE135214":"SEX255214"].plot()
           ax.legend(loc='center right', bbox_to_anchor=(1, 0.5));
            50
            40
            30
                                                     AGE775214
                                                     SEX255214
            20
            10
             0
                       500
                             1000
                                    1500
                                           2000
                                                 2500
                                                        3000
In [11]: y = primary_results.candidate
           Trump = primary_results[y=='Donald Trump']
           Hillary = primary_results[y=='Hillary Clinton']
           Bernie = primary_results[y=='Bernie Sanders']
           Trump = Trump.query('fraction_votes > 0')
           Hillary = Hillary.query('fraction_votes > 0')
           Bernie = Bernie.query('fraction_votes > 0')
In [12]: data = data.replace(to_replace='County', value="", regex=True)
In [13]: Trump.columns = ['state','state_abbreviation', 'area_name','fips','
           Hillary.columns = ['state','state_abbreviation', 'area_name','fips'
Bernie.columns = ['state','state_abbreviation', 'area_name','fips',
```

```
In [14]: Trump.result = pd.merge(data, Trump, on='area_name')
Hillary.result = pd.merge(data, Hillary, on='area_name')
Bernie.result = pd.merge(data, Bernie, on='area_name')
```

/usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:1: Us erWarning: Pandas doesn't allow columns to be created via a new at tribute name - see https://pandas.pydata.org/pandas-docs/stable/indexing.html#attribute-access (https://pandas.pydata.org/pandas-docs/stable/indexing.html#attribute-access)

"""Entry point for launching an IPython kernel.

/usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:2: Us erWarning: Pandas doesn't allow columns to be created via a new at tribute name - see https://pandas.pydata.org/pandas-docs/stable/indexing.html#attribute-access (https://pandas.pydata.org/pandas-docs/stable/indexing.html#attribute-access)

/usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:3: Us erWarning: Pandas doesn't allow columns to be created via a new at tribute name - see https://pandas.pydata.org/pandas-docs/stable/indexing.html#attribute-access (https://pandas.pydata.org/pandas-docs/stable/indexing.html#attribute-access)

This is separate from the ipykernel package so we can avoid doin g imports until

```
In [15]: result = pd.concat([Trump.result, Hillary.result, Bernie.result], i
In [16]: y = result.candidate
In [17]: X = result.loc[:, "PST045214":"POP060210"]
In [18]: def printMeanAndSdByGroup(variables, groupvariable):
    data_groupby = variables.groupby(groupvariable)
    print("## Means:")
    display(data_groupby.apply(np.mean))
    print("\n## Standard deviations:")
    display(data_groupby.apply(np.std))
    print("\n## Sample sizes:")
    display(pd.DataFrame(data_groupby.apply(len)))
```

In [19]: printMeanAndSdByGroup(X, y)

Means:

	PST045214	PST040210	PST120214	POP010210	AGE135214	AGE295214
candidate						
Bernie Sanders	6.382734e+06	6.097231e+06	4.238333	6.097058e+06	6.32000	23.030000
Donald Trump	6.359328e+06	6.075599e+06	4.212069	6.075421e+06	6.32069	23.041379
Hillary Clinton	6.382734e+06	6.097231e+06	4.238333	6.097058e+06	6.32000	23.030000

Standard deviations:

	PST045214	PST040210	PST120214	POP010210	AGE135214	AGE295214
candidate						
Bernie Sanders	5.144650e+06	4.844391e+06	1.68514	4.844192e+06	0.424185	1.435769
Donald Trump	5.231028e+06	4.925782e+06	1.70790	4.925579e+06	0.431421	1.458983
Hillary Clinton	5.144650e+06	4.844391e+06	1.68514	4.844192e+06	0.424185	1.435769

Sample sizes:

0

candidate

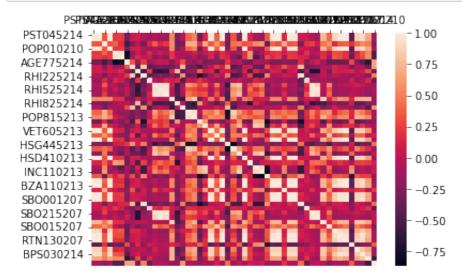
Bernie Sanders 60

Donald Trump 58

Hillary Clinton 60

In [21]: corrmat = X.corr()

In [22]: sns.heatmap(corrmat, vmax=1., square=False).xaxis.tick_top()



In []: