## IHME\_Covid\_EIA\_manipulation

### January 5, 2021

- 1 This notebook created the dbf files that were joined into the ArcGIS map that created a cartogram that showed Covid rates vs Net Energy generation rates. The dbf files came from csv files which came from manipulated Pandas Data Frames in this notebook.
- 1.0.1 This is the working notebook that was used to manipulate both Covid19 data as well as Net Energy Generation data from EIA. Regrettably, there was not much time left to create a cleaner presentation. Some commenting was used as well as Markdown cells such as this which should make the code somewhat more readable.
- 1.0.2 The main tasks completed in terms of manipulation were summarizing the daily Covid data into a form that could be joined to the ArcGIS State shapefile and was in the same level of detail (interval) as the monthly EIA Net Energy Generation. There was also much manipulation involed in "unpivoting" the EIA data to create monthly averages and apply them to the 2020 EIA records which resulted in a "% of the norm"
- 1.0.3 Ultimately, the Covid data and Net Gen data were not merged to use in ArcGIS until after there were separately joined in ArcGIS. They were only merged in this notebook at the end where a correlation coefficient was created between the number of covid cases per 100k and the Net Gen for March-July as a % of the average Net Gen. While there was a noticable decrease in Net Gen in earlier "lock down" months, there was almost a 0 correlation coefficient between these two variables specifically.

### [2]: pip install geopandas

WARNING: The directory '/home/jovyan/.cache/pip/http' or its parent directory is not owned by the current user and the cache has been disabled. Please check the permissions and owner of that directory. If executing pip with sudo, you may want sudo's -H flag.

WARNING: The directory '/home/jovyan/.cache/pip' or its parent directory is not owned by the current user and caching wheels has been disabled. check the permissions and owner of that directory. If executing pip with sudo, you may want sudo's -H flag.

Requirement already satisfied: geopandas in /opt/conda/lib/python3.7/site-packages (0.8.1)

Requirement already satisfied: shapely in /opt/conda/lib/python3.7/site-packages

```
(from geopandas) (1.7.1)
   Requirement already satisfied: pyproj>=2.2.0 in /opt/conda/lib/python3.7/site-
   packages (from geopandas) (2.6.1.post1)
   Requirement already satisfied: fiona in /opt/conda/lib/python3.7/site-packages
   (from geopandas) (1.8.17)
   Requirement already satisfied: pandas>=0.23.0 in /opt/conda/lib/python3.7/site-
   packages (from geopandas) (0.25.0)
   Requirement already satisfied: click<8,>=4.0 in /opt/conda/lib/python3.7/site-
   packages (from fiona->geopandas) (7.0)
   Requirement already satisfied: click-plugins>=1.0 in
   /opt/conda/lib/python3.7/site-packages (from fiona->geopandas) (1.1.1)
   Requirement already satisfied: munch in /opt/conda/lib/python3.7/site-packages
   (from fiona->geopandas) (2.5.0)
   Requirement already satisfied: attrs>=17 in /opt/conda/lib/python3.7/site-
   packages (from fiona->geopandas) (19.1.0)
   Requirement already satisfied: cligj>=0.5 in /opt/conda/lib/python3.7/site-
   packages (from fiona->geopandas) (0.5.0)
   Requirement already satisfied: six>=1.7 in /opt/conda/lib/python3.7/site-
   packages (from fiona->geopandas) (1.12.0)
   Requirement already satisfied: numpy>=1.13.3 in /opt/conda/lib/python3.7/site-
   packages (from pandas>=0.23.0->geopandas) (1.17.0)
   Requirement already satisfied: python-dateutil>=2.6.1 in
   /opt/conda/lib/python3.7/site-packages (from pandas>=0.23.0-yeopandas) (2.8.0)
   Requirement already satisfied: pytz>=2017.2 in /opt/conda/lib/python3.7/site-
   packages (from pandas>=0.23.0->geopandas) (2019.2)
   Note: you may need to restart the kernel to use updated packages.
[3]: import pandas as pd
   import geopandas as gpd
   import ison
   import numpy as np
[4]: pd.set_option('display.max_columns', None)
[5]: ihme_covid = pd.read_csv('Worse_hospitalization_all_locs.csv')
   state_names = ["Alaska", "Alabama", "Arkansas", "American Samoa", "Arizona", u
    →"California", "Colorado", "Connecticut", "District ", "of Columbia", ⊔
    _{\rightarrow} "Delaware", "Florida", "Georgia", "Guam", "Hawaii", "Iowa", "Idaho", _{\sqcup}
    →"Illinois", "Indiana", "Kansas", "Kentucky", "Louisiana", "Massachusetts", □
    →"Maryland", "Maine", "Michigan", "Minnesota", "Missouri", "Mississippi", ⊔
    →"Montana", "North Carolina", "North Dakota", "Nebraska", "New Hampshire", □
    →"New Jersey", "New Mexico", "Nevada", "New York", "Ohio", "Oklahoma", □
    _{\rightarrow} "Oregon", "Pennsylvania", "Puerto Rico", "Rhode Island", "South Carolina", _{\sqcup}
     → "South Dakota", "Tennessee", "Texas", "Utah", "Virginia", "Virgin Islands", □
     →"Vermont", "Washington", "Wisconsin", "West Virginia", "Wyoming"]
[6]: | ihme_locations = ihme_covid['location_name'].unique()
```

```
[7]: state_matches = [state_names[i] if state_names[i] in ihme_locations else_
      →print(state_names[i],' no match') \
                     for i in range(len(state_names))]
    American Samoa no match
    District
               no match
    of Columbia no match
    Virgin Islands no match
 [8]: #take only the rows that pertain to states in state names AND remove the
     →country of Georgia id 35 as it is also a state name
     ihme_covid_US_all = ihme_covid[ihme_covid['location_name'].isin(state_names)]
     ihme covid US all = ihme covid US all[ihme covid US all['location id'] != 35]
     # ihme_covid_US_all[ihme_covid_US_all['location_name'] == 'New York']
 [9]: ihme_covid_US = ihme_covid_US_all[ihme_covid_US_all['mobility_data_type'] ==_
      ihme_covid_US =_
      -ihme_covid_US[['location_name','location_id','date','confirmed_infections_p100k_rate']]
     ihme_covid_US.fillna(value = {'confirmed_infections_p100k_rate':0}, inplace =__
      →True)
     ihme_covid_US.reset_index(inplace = True)
     ihme_covid_US.drop(columns = 'index', inplace = True)
     ihme_covid_US.head()
 [9]:
      location_name
                      location_id
                                               confirmed_infections_p100k_rate
                                         date
                                    2/8/2020
                                                                            0.0
     0
                Guam
                              351
     1
                Guam
                              351
                                    2/9/2020
                                                                            0.0
     2
                Guam
                              351
                                   2/10/2020
                                                                            0.0
     3
                Guam
                                                                            0.0
                              351
                                   2/11/2020
                              351 2/12/2020
                                                                            0.0
                Guam
[10]: | ihme_covid_US['Month'] = [str(ihme_covid_US['date'][i]).split('/')[0] for i in_
      →range(len(ihme_covid_US))]
[11]: ihme_covid_US.head()
[11]:
      location_name
                      location_id
                                         date
                                               confirmed_infections_p100k_rate Month
                Guam
                                                                           0.0
                                                                                    2
     0
                              351
                                    2/8/2020
                                                                            0.0
     1
                Guam
                              351
                                    2/9/2020
                                                                                    2
     2
                Guam
                                                                            0.0
                                                                                    2
                              351
                                   2/10/2020
     3
                Guam
                              351
                                   2/11/2020
                                                                            0.0
                                                                                    2
                Guam
                              351 2/12/2020
                                                                            0.0
                                                                                    2
[12]: | ihme_covid_US_grouped = ihme_covid_US.groupby(['location_name', 'Month']).
      →mean().reset_index()
[13]: ihme_covid_US_grouped.head(5)
      location_name Month location_id confirmed_infections_p100k_rate
             Alabama
                                                                 0.000000
                                    523
```

1	Alabama	3	523	0.639628
2	Alabama	4	523	4.085565
3	Alabama	5	523	7.040449
4	Alabama	6	523	13.455376

### 2 Try to run calc on all states

```
[18]: #Pivot to get the dates as columns
     ihme_covid_US_pivot_monthly = ihme_covid_US_grouped.pivot(index =_u
      →'location_name',columns = 'Month', values = \
                                                 ['confirmed_infections_p100k_rate']).
      →reset index()
[19]: ihme_covid_US_pivot_monthly.tail(5)
[19]:
            location_name confirmed_infections_p100k_rate
     Month
                                                                    3
                                                  0.000000 0.463351
     47
                 Virginia
                                                                       5.596051
     48
               Washington
                                                  0.180534
                                                             3.609030
                                                                       3.612462
     49
            West Virginia
                                                  0.000000
                                                            0.280910
                                                                       1.725517
                Wisconsin
                                                  0.000000 0.774388
     50
                                                                       3.086247
                                                  0.000000 0.766414
     51
                  Wyoming
                                                                       2.261185
     Month
                    5
                               6
                                                      8
     47
            10.669320
                       6.969188
                                  10.053868
                                            11.384194
                                                         11.707315
     48
                                  10.302238
                                              6.686138
             3.264430
                       6.379900
                                                          4.711311
     49
             1.534602
                       1.603674
                                   6.370768
                                              6.363832
                                                         14.191171
     50
             6.338349
                       5.816346
                                  13.325955
                                             12.437960
                                                         16.690236
             1.818251 3.189691
                                   6.548873
                                              5.777174
                                                          5.243327
[20]: | ihme_covid_US_pivot_monthly.columns = ihme_covid_US_pivot_monthly.columns.
      →droplevel(0)
     ihme_covid_US_pivot_monthly.head()
[20]: Month
                                          3
                                                               5
                                                                          6
     0
               Alabama
                        0.000000
                                  0.639628
                                             4.085565
                                                       7.040449
                                                                  13.455376
     1
                Alaska
                        0.000000
                                  0.487129
                                             0.998273
                                                       0.425726
                                                                   2.021926
     2
               Arizona 0.000000 0.573107
                                             2.935302
                                                       5.464535
                                                                  27.261894
     3
              Arkansas
                        0.000000 0.539156
                                             2.937186
                                                       4.088510
                                                                  14.386104
            California 0.001254 0.663251
                                             3.504545 5.001565
                                                                   9.971985
                    7
                                8
                                           9
     Month
     0
            32.193983
                       24.843117
                                   31.299670
     1
             7.241437
                        9.304571
                                    4.314570
     2
            42.174055
                       12.380970
                                    6.993412
     3
            22.377602
                       20.827661
                                    8.929306
```

```
21.789386 17.145092
                                  7.880210
[21]: columns_renaming = {}
    cols = ihme_covid_US_pivot_monthly.columns
    for i in range(len(cols)):
         if cols[i] == '':
             columns_renaming[cols[i]] = 'State'
        else:
             columns_renaming[cols[i]] = str(cols[i]) + '_2020'
    columns_renaming
[21]: {'': 'State',
      '2': '2_2020',
      '3': '3 2020',
      '4': '4_2020',
      '5': '5_2020',
      '6': '6_2020',
      '7': '7_2020',
      '8': '8_2020',
      '9': '9_2020'}
[22]: | ihme_covid_US_pivot_monthly.rename(columns = columns_renaming, inplace = True)
[23]: ihme_covid_US_pivot_monthly.head()
                         2_2020
[23]: Month
                State
                                   3_2020
                                             4_2020
                                                       5_2020
                                                                  6_2020 \
    0
              Alabama 0.000000 0.639628 4.085565 7.040449 13.455376
    1
               Alaska 0.000000 0.487129 0.998273 0.425726
                                                               2.021926
    2
              Arizona 0.000000 0.573107 2.935302 5.464535 27.261894
    3
             Arkansas 0.000000 0.539156 2.937186 4.088510 14.386104
           California 0.001254 0.663251 3.504545 5.001565
                                                              9.971985
    Month
              7_2020
                         8_2020
                                    9_2020
    0
           32.193983 24.843117 31.299670
            7.241437
                                  4.314570
    1
                      9.304571
    2
           42.174055 12.380970 6.993412
    3
           22.377602 20.827661
                                  8.929306
           21.789386 17.145092 7.880210
[24]: #All values are currently strings, convert values for all columns except,
     →'state' to float
    cols = ihme_covid_US_pivot_monthly.columns
    for i in cols:
         if i != 'State':
             ihme_covid_US_pivot_monthly[i] = ihme_covid_US_pivot_monthly[i].
     →astype(float)
     #Fix any new NaN values
```

```
columns_na_fix = {}
    cols = ihme_covid_US_pivot_monthly.columns
    for i in range(len(cols)):
         columns_na_fix[cols[i]] = 0
     # columns na fix
    ihme_covid_US_pivot_monthly.fillna(value = columns_na_fix, inplace = True)
[25]: #write table to csv
    ihme_covid_US_pivot_monthly.to_csv('ihme_covid_US_pivot_monthly.csv',__
     →index=False)
    reread_monthly = pd.read_csv('ihme_covid_US_pivot_monthly.csv')
    reread_monthly.head()
[25]:
            State
                     2 2020
                               3 2020
                                         4_2020
                                                   5 2020
                                                              6_2020
                                                                        7 2020
          Alabama 0.000000 0.639628 4.085565 7.040449 13.455376 32.193983
    1
           Alaska 0.000000 0.487129 0.998273 0.425726
                                                            2.021926
                                                                      7.241437
    2
          Arizona 0.000000 0.573107 2.935302 5.464535 27.261894 42.174055
    3
         Arkansas 0.000000 0.539156 2.937186 4.088510 14.386104 22.377602
    4 California 0.001254 0.663251 3.504545 5.001565
                                                           9.971985 21.789386
          8_2020
                     9_2020
    0 24.843117 31.299670
      9.304571 4.314570
    1
    2 12.380970 6.993412
    3 20.827661
                   8.929306
    4 17.145092
                 7.880210
[26]: #write table to dbf using geopandas as gpd
    gf_monthly = gpd.read_file('ihme_covid_US_pivot_monthly.csv')
    cols = gf_monthly.columns
    for i in cols:
        print(i)
        if i != 'State':
              print('loop before convert')
     #
            gf_monthly[i] = gf_monthly[i].astype(float)
              print('after before convert')
     # type(qf['2020-02-08'][0])
    gf_monthly.to_file('ihme_covid_US_pivot_monthly.dbf')
    State
    2 2020
    3_2020
    4 2020
    5_2020
    6_2020
```

7\_2020 8\_2020 9\_2020 geometry

## 3 Import EIA Net Gen data

```
[27]:
     eia_netgen_df = pd.read_csv('EIA_Net_generation_for_all_sectors_July_update.

csv¹)
     eia_netgen_df.head()
[27]:
                                                      200104
                                                                              200106 \
        State
                   200101
                               200102
                                          200103
                                                                  200105
     O US-AK
                  590.145
                             546.167
                                         587.115
                                                     488.698
                                                                 484.687
                                                                             488.004
       US-AL
               11326.642
                                        9364.445
     1
                            9576.039
                                                    7714.348
                                                               10048.668
                                                                          11170.299
     2 US-AR
                 3903.323
                            3372.020
                                        3125.261
                                                    3349.774
                                                                3690.531
                                                                            4132.866
     3 US-AZ
                 7573.925
                            6616.639
                                        7325.900
                                                    7159.997
                                                                7965.507
                                                                            8174.259
     4 US-CA
               16618.887
                           14380.392
                                       15848.633
                                                   15841.018
                                                               16874.504
                                                                          18071.777
           200107
                       200108
                                   200109
                                               200110
                                                          200111
                                                                      200112
     0
          553.925
                      586.796
                                  640.166
                                              579.703
                                                         564.436
                                                                     633.924
     1
        12083.310
                    12520.917
                                11014.510
                                           10321.847
                                                        9886.874
                                                                   10317.214
     2
         4564.078
                     4538.995
                                 4220.271
                                             4087.246
                                                        3626.715
                                                                    4580.956
     3
         8443.619
                     8257.966
                                 7456.615
                                             6386.127
                                                        6814.355
                                                                    7736.363
                                                       13419.388
        19794.556
                    20307.443
                                16852.629
                                           15929.260
                                                                   14657.585
           200201
                       200202
                                   200203
                                               200204
                                                          200205
                                                                      200206
     0
          646.618
                      550.132
                                  585.608
                                             539.384
                                                         530.593
                                                                     524.325
        11220.297
     1
                     9697.976
                                 9429.392
                                             9161.933
                                                       10444.214
                                                                   11882.481
     2
         4225.011
                     3760.693
                                 3131.356
                                             3795.037
                                                        3498.511
                                                                    4120.910
     3
         7638.722
                     6911.775
                                 7346.834
                                             6960.495
                                                        7870.515
                                                                    8043.142
        14591.101
                    12655.472
                                15788.658
                                           13995.827
                                                       13934.158
                                                                   16343.680
           200207
                       200208
                                   200209
                                               200210
                                                          200211
                                                                      200212
     0
          531.314
                      507.302
                                  539.958
                                              578.506
                                                         584.503
                                                                     649.079
                                11567.529
        13067.536
                    12925.950
                                           10343.719
                                                       11349.447
                                                                   11830.201
     1
     2
         4755.258
                     4927.186
                                 4528.195
                                             3667.881
                                                        3548.753
                                                                    3652.850
     3
                                 8185.059
                                                        7797.474
         8906.931
                     8837.457
                                             7184.421
                                                                    8448.838
                                16987.396
                                           14336.933
        19633.136
                    18765.891
                                                       12642.570
                                                                   14535.214
           200301
                       200302
                                   200303
                                               200304
                                                          200305
                                                                      200306
     0
          609.407
                      539.875
                                  557.686
                                              489.725
                                                         479.760
                                                                     457.662
                    10347.090
     1
        11998.910
                               10122.699
                                             9287.219
                                                       11678.712
                                                                   12249.635
     2
         3934.354
                                 3575.540
                                             3461.058
                                                        4017.478
                                                                    4975.779
                     3640.880
     3
         7712.985
                     6826.508
                                 7203.211
                                             6290.091
                                                        7363.669
                                                                    7860.177
                                14464.511
        14215.326
                    13116.456
                                           13673.534
                                                       15699.591
                                                                   16354.813
           200307
                       200308
                                   200309
                                               200310
                                                          200311
                                                                      200312
```

```
0
     492.110
                 472.271
                            502.055
                                        540.416
                                                    566.108
                                                               631.656
   13553.964
                                                  10397.157
                                                             11508.267
1
              14083.709
                          11762.841
                                     10497.018
2
    5307.824
                5192.639
                           4324.690
                                       3875.780
                                                   4029.835
                                                              4065.243
3
    9948.056
                9905.323
                           9159.867
                                       7975.217
                                                   6916.873
                                                              7234.241
              19727.905
                          18012.674
   21007.159
                                      16924.678
                                                  14342.394
                                                             15249.501
                                                               200405
        200401
                      200402
                                    200403
                                                  200404
                                                                        \
0
     630.13411
                   566.72351
                                548.70260
                                              484.84629
                                                            493.88789
1
   11708.40290
                 10680.46205
                               9497.50582
                                             9053.43392
                                                          11607.25115
2
    4518.17312
                  3941.51523
                               3847.57910
                                             3366.89517
                                                           4021.32083
                  7765.21799
3
    8746.79253
                               8337.05838
                                             7874.96021
                                                           8950.59014
   15284.72566
                14469.30193
                              15867.47192
                                            15347.64255
                                                          15718.95182
        200406
                      200407
                                    200408
                                                  200409
                                                               200410
                                                                        \
0
     500.42705
                                 549.45831
                                              524.07059
                                                            521.29793
                   556.77577
1
   12318.16591
                 13731.13143
                              13007.01880
                                            11649.26645
                                                          11093.33507
2
                  5323.91642
    4863.28395
                               4946.99535
                                             4334.32109
                                                           3998.82669
3
    9196.03036
                 10722.92218
                               10539.04202
                                             9405.41923
                                                           7698.02023
   16367.12348
                 20382.98814
                               19763.23865
                                            17634.58585
                                                          15236.01696
        200411
                      200412
                                    200501
                                                  200502
                                                               200503
0
     543.03235
                   607.36046
                                 627.25294
                                              525.35246
                                                            536.08074
   10742.14840
                 12266.64894
                                            10184.83929
                                                          11411.95804
1
                              12093.78573
2
    4091.93061
                  4672.87465
                                4577.27678
                                             4120.19484
                                                           3229.68963
3
    7086.99595
                  8241.09384
                               8200.25808
                                             6578.33806
                                                           7066.50554
   13774.63510
                14933.67294
                              14708.32836
                                            13294.16640
                                                          15260.66792
        200504
                                                               200508
                                                                       \
                      200505
                                    200506
                                                  200507
0
     492.11086
                   497.43653
                                 496.88940
                                              562.44439
                                                            568.03328
1
    9583.05085
                 10869.41774
                              12177.98822
                                            13377.98264
                                                          13646.35575
2
    3327.25454
                  4112.60931
                               4624.43095
                                             4919.10550
                                                           4782.06712
                  8127.64736
3
    7449.84143
                                8531.34492
                                            11084.11456
                                                          10423.07658
   15411.80797
                 17041.82414
                               17707.49813
                                            21940.26101
                                                          21248.72095
        200509
                      200510
                                    200511
                                                  200512
                                                               200601
0
     498.94292
                   558.52560
                                 576.34982
                                              637.23961
                                                            630.04298
                 10596.52698
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4	14038.57784	14811.40862	15932.21339	17513.98758	22356.08129	
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[28]: eia_netgen_df['State'] = [eia_netgen_df['State'][i].split('-')[1] for i in_
      →range(len(eia_netgen_df))]
     eia_netgen_df.head()
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2	4843.94780	3120.63601	3088.88778	3829.50260	5114.51988	
3	11252.84156	9503.67258	7956.94775	8895.65296	8599.69691	
4	19034.01811	17230.29106	14125.99144	15464.27750	14715.75869	
	201602	201603	201604	201605	201606	\
0	547.81802	575.82951	489.54473	449.66508	445.19996	
1	11433.14435	11059.52798	9630.50621	11120.13371	12472.84039	
2	4182.24325	4724.46905	4372.17737	4147.48096	6007.46063	
3	7302.89535	7518.56099	7359.01960	8404.30755	10840.93780	
4	13465.15989	14168.98808	14042.95386	15123.08358	18914.90727	
	201607	201608	201609	201610	201611	\
0	479.00506	508.56639	523.61710	519.56652	569.36559	
1	13882.41951	14064.90778	12967.71963	10307.04102	10675.50565	
2	6596.71684	6548.62330	5539.34601	4030.07988	4011.80082	
3	12181.12004	12112.72294	10378.07782	8707.76002	7191.82364	
4	21094.70257	21239.76388	17988.47506	16864.77788	13875.05555	
	201612	201701	201702	201703	201704	\
0	630.09979	603.92717	542.52110	612.95084	534.84453	
1	11829.01721	10936.54781	9920.52656	11115.55416	11205.56996	
2	5170.14139	5571.14961	4387.96694	4115.89599	4193.29209	
3	8166.52665	7959.69780	6656.67671	7153.66818	7011.37900	
4	15469.58907	16944.26423	14061.51304	15460.99616	15030.82222	
	201705	201706	201707	201708	201709	\
0	536.42723	533.72101	543.52712	524.60240	466.34307	
1			11105 00050	12220 15010	11101 50700	
	11889.01185	12135.53738	14165.83876	13330.45210	11461.56709	
2	3838.24771	4977.73502	6515.87230	6219.85536	5526.92630	
2 3	3838.24771 8353.09413	4977.73502 10373.10899	6515.87230 11843.18556	6219.85536 11431.98902	5526.92630 10161.39744	
2	3838.24771	4977.73502	6515.87230	6219.85536	5526.92630	
2 3	3838.24771 8353.09413	4977.73502 10373.10899	6515.87230 11843.18556	6219.85536 11431.98902	5526.92630 10161.39744	\

```
11031.66892
                10793.76506
                              11978.21047
                                            13582.30942
                                                           9983.73215
1
2
    4857.34945
                 4512.21851
                               6058.70701
                                             6293.81744
                                                           4987.43638
3
    8711.25783
                  7879.04433
                               8317.26605
                                             8164.13687
                                                           7277.29323
   16799.09156
                14209.30482
                              14589.17088
                                            13693.12450
                                                          12702.29864
                                                 201806
        201803
                      201804
                                    201805
                                                               201807
                                              515.23249
0
     563.56765
                   493.30542
                                539.94781
                                                            514.15454
1
   10679.37786
                 11040.03710
                              12492.18797
                                            13477.39956
                                                          14484.81628
2
                  4847.48371
    4813.64951
                               5432.79144
                                             6519.37103
                                                           7175.86846
                 7274.00936
3
    7943.93447
                               8718.03118
                                            10143.36276
                                                          12063.69619
                 14811.40862
   14038.57784
                              15932.21339
                                            17513.98758
                                                          22356.08129
        201808
                      201809
                                    201810
                                                 201811
                                                               201812
0
     506.84993
                   487.92000
                                417.92384
                                              520.26381
                                                            544.46290
   13839.79191
                12640.19847
                              10579.32895
                                            10724.02615
                                                          11534.78805
1
2
    6909.43908
                  5361.61464
                               5208.90693
                                             5013.66584
                                                           5435.30706
3
   12297.90703
                 11380.25088
                               9250.47959
                                             8044.81335
                                                           9367.22919
                 17591.57544
                                            14604.62357
   20994.23493
                              16863.71762
                                                          14363.79477
        201901
                      201902
                                                 201904
                                                               201905
                                    201903
0
     536.45806
                   467.41421
                                497.59705
                                              459.34850
                                                            434.68003
                              11018.34870
                10813.86116
                                                          12089.21593
1
   12562.72168
                                             9599.76711
2
                  5004.37460
                                             3860.74270
                                                           4845.26538
    5840.68044
                               4944.08851
3
    9018.49393
                  8419.33626
                               8691.90148
                                             7661.55800
                                                           8425.35651
   14677.04934
                14460.26578
                              16901.04075
                                            16467.51186
                                                          16382.55111
        201906
                      201907
                                    201908
                                                 201909
                                                               201910
0
     506.02103
                   632.60762
                                                            521.69447
                                645.20915
                                              540.23654
   12525.16021
1
                 13598.72795
                              13508.59529
                                            12362.21775
                                                          10994.85131
                 5771.93318
2
    5183.37656
                               6322.04045
                                             5853.16646
                                                           4444.56283
                 12135.86444
3
   10175.92453
                              12319.38305
                                            10814.40168
                                                           9090.33046
   17795.07672
                20833.44642
                              21729.55679
                                            18368.00567
                                                          16927.97231
        201911
                      201912
                                    202001
                                                 202002
                                                               202003
0
                   571.24533
                                              582,98042
     527.86132
                                607.17855
                                                            529.81320
1
   11172.63894
                 11450.08465
                              11509.55516
                                            10551.43952
                                                          10626.62373
2
                  4837.11038
                               4207.47332
                                             3780.48224
    4697.86733
                                                           4069.97858
    7552.65440
                  8982.72116
                                             7546.65939
                                                           7117.47238
3
                               8534.28599
   15065.73011
                 15425.17931
                              14466.49064
                                            13289.91172
                                                          14823.10536
        202004
                      202005
                                    202006
                                                 202007
0
     462.78025
                   475.76947
                                521.94763
                                              644.67858
                 10574.93269
1
    9195.38186
                              12385.47834
                                            13310.79060
2
    2775.15453
                  3531.76460
                               4555.69440
                                             5944.46648
    7000.10467
3
                  9350.47862
                               9968.06511
                                            11468.90529
   14097.84274
               15465.12990
                                            19763.46928
                              17143.36636
```

### 3.1 Reduce the data down to the last 5 years before taking an average for each month

```
[29]: eia_cols = eia_netgen_df.columns
     keep_years = ['2015', '2016', '2017', '2018', '2019', '2020']
     eia_keep_cols = []
     for i in eia_cols:
         year = str(i[:4])
         if year in keep_years:
             eia_keep_cols.append(i)
         elif i == 'State':
             eia_keep_cols.append(i)
[30]: eia_netgen_df = eia_netgen_df[eia_keep_cols]
     eia_netgen_df.head()
[30]:
       State
                   201501
                                 201502
                                               201503
                                                            201504
                                                                          201505
                                                                                  \
                605.60887
                              577.97062
                                                         509.99251
     0
          ΑK
                                           552.50192
                                                                       501.18377
     1
          ΑL
             13558.68054
                           12241.32183
                                         11691.75443
                                                                     12312.56047
                                                       10328.12155
     2
          AR
               4536.97571
                             4845.05039
                                           4828.41033
                                                        4330.64923
                                                                      4773.53162
     3
                             6692.96089
                                                        7299.07876
          ΑZ
               8410.40682
                                           7932.53381
                                                                      8741.34128
     4
              14246.53253
                           12303.54033
                                         14346.53259
                                                       14568.67886
                                                                     15435.01408
             201506
                           201507
                                        201508
                                                      201509
                                                                    201510 \
     0
          474.24377
                       467.23019
                                     481.55903
                                                   470.64824
                                                                490.13224
     1
        13776.65374
                     15029.14117
                                  14174.17608
                                                12893.95029
                                                              12263.17005
     2
                      6169.33382
         5338.40247
                                    5854.09978
                                                  4843.94780
                                                               3120.63601
       11349.30149
                     12459.02939
                                   12648.28040
                                                11252.84156
                                                                9503.67258
     3
                                   20851.43236
        18726.65189
                     20370.89691
                                                 19034.01811
                                                              17230.29106
                                        201601
                                                      201602
             201511
                           201512
                                                                    201603
     0
          554.89957
                       598.96660
                                     596.75576
                                                   547.81802
                                                                575.82951
                     12523.18235
                                  12942.33479
                                                11433.14435
     1
        11684.71421
                                                              11059.52798
     2
         3088.88778
                       3829.50260
                                    5114.51988
                                                  4182.24325
                                                                4724.46905
     3
         7956.94775
                      8895.65296
                                    8599.69691
                                                  7302.89535
                                                               7518.56099
        14125.99144
                     15464.27750
                                   14715.75869
                                                 13465.15989
                                                              14168.98808
             201604
                           201605
                                        201606
                                                      201607
                                                                    201608
     0
          489.54473
                       449.66508
                                     445.19996
                                                   479.00506
                                                                508.56639
     1
         9630.50621
                     11120.13371
                                  12472.84039
                                                13882.41951
                                                              14064.90778
     2
                      4147.48096
                                    6007.46063
         4372.17737
                                                  6596.71684
                                                               6548.62330
                                   10840.93780
         7359.01960
                      8404.30755
     3
                                                 12181.12004
                                                              12112.72294
        14042.95386
                     15123.08358
                                   18914.90727
                                                 21094.70257
                                                              21239.76388
             201609
                           201610
                                        201611
                                                      201612
                                                                    201701
     0
          523.61710
                       519.56652
                                     569.36559
                                                   630.09979
                                                                603.92717
                     10307.04102
     1
        12967.71963
                                  10675.50565
                                                11829.01721
                                                              10936.54781
         5539.34601
     2
                      4030.07988
                                    4011.80082
                                                  5170.14139
                                                               5571.14961
```

3 4	10378.07782 17988.47506	8707.76002 16864.77788	7191.82364 13875.05555	8166.52665 15469.58907	7959.69780 16944.26423	
1	17300.47300	10004.77700	10070.00000	10400.00001	10344.20420	
	201702	201703	201704	201705	201706	\
0	542.52110	612.95084	534.84453	536.42723	533.72101	
1	9920.52656	11115.55416	11205.56996	11889.01185	12135.53738	
2	4387.96694	4115.89599	4193.29209	3838.24771	4977.73502	
3	6656.67671	7153.66818	7011.37900	8353.09413	10373.10899	
4	14061.51304	15460.99616	15030.82222	17173.69472	18889.72132	
	201707	201708	201709	201710	201711	\
0	543.52712	524.60240	466.34307	475.15574	545.70776	
1	14165.83876	13330.45210	11461.56709	11031.66892	10793.76506	
2	6515.87230	6219.85536	5526.92630	4857.34945	4512.21851	
3	11843.18556	11431.98902	10161.39744	8711.25783	7879.04433	
4	21552.92056	22609.67451	18825.34589	16799.09156	14209.30482	
	004740	004.004	004000	004000	004004	,
_	201712	201801	201802	201803	201804	\
0	577.73765	598.85155	544.87858	563.56765	493.30542	
1	11978.21047	13582.30942	9983.73215	10679.37786	11040.03710	
2	6058.70701	6293.81744	4987.43638	4813.64951	4847.48371	
3	8317.26605	8164.13687	7277.29323	7943.93447	7274.00936	
4	14589.17088	13693.12450	12702.29864	14038.57784	14811.40862	
	201805	201806	201807	201808	201809	\
0	539.94781	515.23249	514.15454	506.84993	487.92000	`
1	12492.18797	13477.39956	14484.81628	13839.79191	12640.19847	
2	5432.79144	6519.37103	7175.86846	6909.43908	5361.61464	
3	8718.03118	10143.36276	12063.69619	12297.90703	11380.25088	
4	15932.21339	17513.98758	22356.08129	20994.23493	17591.57544	
	201810	201811	201812	201901	201902	\
0	417.92384	520.26381	544.46290	536.45806	467.41421	
1	10579.32895	10724.02615	11534.78805	12562.72168	10813.86116	
2	5208.90693	5013.66584	5435.30706	5840.68044	5004.37460	
3	9250.47959	8044.81335	9367.22919	9018.49393	8419.33626	
4	16863.71762	14604.62357	14363.79477	14677.04934	14460.26578	
	201002	201004	201005	201006	201007	\
^	201903	201904	201905	201906	201907	\
0	497.59705	459.34850	434.68003	506.02103	632.60762	
1	11018.34870	9599.76711	12089.21593	12525.16021	13598.72795	
2	4944.08851	3860.74270	4845.26538	5183.37656	5771.93318	
3	8691.90148	7661.55800	8425.35651	10175.92453	12135.86444	
4	16901.04075	16467.51186	16382.55111	17795.07672	20833.44642	
	201908	201909	201910	201911	201912	\
0	645.20915	540.23654	521.69447	527.86132	571.24533	`
U	040.20310	070.20004	021.03441	021.00102	011.24000	

```
13508.59529
                12362.21775
                             10994.85131
                                          11172.63894
                                                         11450.08465
1
2
    6322.04045
                 5853.16646
                                            4697.86733
                                                          4837.11038
                               4444.56283
3 12319.38305
                10814.40168
                               9090.33046
                                            7552.65440
                                                          8982.72116
4 21729.55679
                18368.00567
                             16927.97231
                                           15065.73011
                                                         15425.17931
        202001
                     202002
                                   202003
                                                202004
                                                              202005
                  582.98042
0
     607.17855
                                529.81320
                                             462.78025
                                                           475.76947
1
  11509.55516
                10551.43952
                             10626.62373
                                            9195.38186
                                                         10574.93269
2
    4207.47332
                 3780.48224
                               4069.97858
                                            2775.15453
                                                          3531.76460
    8534.28599
                 7546.65939
                               7117.47238
                                            7000.10467
3
                                                          9350.47862
 14466.49064
                13289.91172
                             14823.10536
                                           14097.84274
                                                         15465.12990
        202006
                     202007
0
     521.94763
                  644.67858
  12385.47834
                13310.79060
1
2
   4555.69440
                 5944.46648
3
    9968.06511
                11468.90529
 17143.36636
                19763.46928
```

#### 3.1.1 Try melting

```
[31]: eia_netgen_melt = eia_netgen_df.melt(id_vars = 'State', var_name = 'Date',
      →value name = 'Thousand MWh')
[32]: eia netgen melt.head(5)
[32]:
       State
                Date
                      Thousand MWh
          AK 201501
                         605.60887
     0
          AL 201501
     1
                       13558.68054
     2
          AR 201501
                        4536.97571
     3
          AZ 201501
                        8410.40682
     4
          CA 201501
                       14246.53253
```

# 3.1.2 Add a month column to allow grouping by state and month to take each states avg for the month.

#### 3.1.3 This controls for seasonality

```
[33]: eia_netgen_melt['Month'] = [eia_netgen_melt['Date'][i][4:] for i in_
      →range(len(eia_netgen_melt))]
[34]: eia_netgen_melt.head()
[34]:
       State
                Date
                      Thousand_MWh Month
     0
          AK
              201501
                          605.60887
                                       01
          AL 201501
                       13558.68054
                                       01
     1
     2
          AR 201501
                        4536.97571
                                       01
     3
          ΑZ
              201501
                        8410.40682
                                       01
```

```
4 CA 201501 14246.53253 01
```

### 3.1.4 Group by State and month and take the mean of each state over its months

```
[35]: eia_date_grouped = eia_netgen_melt.groupby(['State', 'Month']).mean().
      →reset_index()
[36]: eia_date_grouped.head(5)
[36]:
       State Month
                    Thousand_MWh
          AK
                01
                      591.463327
     1
          AK
                02
                       543.930492
     2
          ΑK
                03
                      555.376695
     3
          ΑK
                04
                      491.635990
          ΑK
                05
                      489.612232
[37]: eia_date_grouped.rename(columns = {'Thousand_MWh':'ThsdMWh_avg'}, inplace = ___
      →True)
[38]: eia_netgen_melt_merge = eia_netgen_melt.merge(eia_date_grouped, how = 'left', \
                                                     left_on=['State', 'Month'],_
      →right_on=['State', 'Month'])
[39]: eia_netgen_melt_merge.head(5)
[39]:
       State
                Date Thousand_MWh Month
                                            ThsdMWh_avg
          AK 201501
                          605.60887
                                              591.463327
                                       01
          AL 201501
     1
                       13558.68054
                                       01 12515.358233
     2
          AR 201501
                         4536.97571
                                       01
                                            5260.769400
     3
          AZ 201501
                        8410.40682
                                       01
                                            8447.786387
          CA 201501
                       14246.53253
                                       01 14790.536655
          Calculate average column, then pivot dates back out to prepare to join back to arcgis
[40]: eia_netgen_melt_merge['ThsdMWh_%norm'] =__
      →round(eia_netgen_melt_merge['Thousand_MWh']/\
```

```
→eia_netgen_melt_merge['ThsdMWh_avg'] * 100, 2)
[41]: eia_netgen_melt_merge.head(50)
[41]:
        State
                 Date Thousand MWh Month
                                                           ThsdMWh %norm
                                             ThsdMWh avg
                                              591.463327
                           605.60887
     0
           AK
              201501
                                        01
                                                                   102.39
     1
               201501
                         13558.68054
                                        01
                                            12515.358233
                                                                   108.34
           AL
     2
           AR 201501
                          4536.97571
                                        01
                                             5260.769400
                                                                   86.24
     3
           AZ 201501
                                             8447.786387
                         8410.40682
                                        01
                                                                   99.56
     4
           CA 201501
                        14246.53253
                                        01
                                            14790.536655
                                                                   96.32
     5
           CO 201501
                                                                   97.33
                         4682.75358
                                        01
                                             4811.128125
     6
           CT
              201501
                          3502.33279
                                        01
                                             3453.224020
                                                                   101.42
           DC
              201501
                             1.71289
                                        01
                                                7.482503
                                                                   22.89
```

```
8
          201501
                      656.85482
                                     01
                                           466.095357
                                                                140.93
      DE
9
           201501
                                                                 97.48
      FL
                    17985.57273
                                     01
                                         18450.567073
10
      GA
          201501
                    10953.43920
                                     01
                                         10804.877332
                                                                101.37
11
          201501
                      731.09633
                                     01
                                           785.512195
                                                                 93.07
      ΗI
12
      ΙA
          201501
                     5404.02534
                                     01
                                          5431.670523
                                                                 99.49
13
          201501
                     1201.85674
                                          1432.336255
      ID
                                     01
                                                                 83.91
14
      IL
          201501
                    17955.97148
                                     01
                                         16889.928402
                                                                106.31
15
      IN
          201501
                    10170.84337
                                     01
                                          9686.710528
                                                                105.00
          201501
                     4007.81750
                                          4381.509613
                                                                 91.47
16
      KS
                                     01
17
      ΚY
          201501
                     8206.29180
                                     01
                                          7226.629880
                                                                113.56
18
      LA
          201501
                     9382.95970
                                     01
                                          8582.300012
                                                                109.33
19
          201501
                     2272.24466
                                     01
                                          2365.779892
                                                                 96.05
      MA
20
      MD
          201501
                     3230.05888
                                     01
                                          3192.297980
                                                                101.18
21
      ME
          201501
                     1289.16604
                                     01
                                          1077.474940
                                                                119.65
                                                                 96.76
22
          201501
                    10124.48308
                                         10463.529150
      MΙ
                                     01
23
      MN
          201501
                     5274.47477
                                     01
                                          5320.471388
                                                                 99.14
24
                     8151.09508
                                          7810.956565
                                                                104.35
      MO
          201501
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          201501
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      OR
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```
[42]: eia_netgen_pivot = eia_netgen_melt_merge.pivot(index = 'State', columns = 

→ 'Date', values = 'ThsdMWh_%norm').reset_index()
```

<sup>[43]: #</sup> eia\_netgen\_pivot.columns = eia\_netgen\_pivot.columns.droplevel(0)

[44]:	eia_	netgen_	pivot.he	ad(50)							
[44]:	Date	State	201501	201502	201503	201504	201505	201506	201507	201508	\
	0	AK	102.39	106.26	99.48	103.73	102.36	94.96	85.44	90.29	
	1	AL	108.34	113.09	105.98	101.59	104.82	107.67	106.75	102.83	
	2	AR	86.24	106.93	105.36	106.58	107.80	98.31	96.97	91.89	
	3	AZ	99.56	91.48	102.67	100.43	100.88	108.35	103.61	104.00	
	4	CA	96.32	91.95	95.92	98.19	96.96	103.10	97.03	97.05	
	5	CO	97.33	94.91	97.47	92.82	95.33	98.09	92.62	96.72	
	6	CT	101.42	105.04	97.82	105.89	106.74	95.39	90.23	96.15	
	7	DC	22.89	24.09	22.97	27.98	39.41	83.40	89.69	119.07	
	8	DE	140.93	129.45	93.51	147.82	134.98	115.05	95.50	97.59	
	9	FL	97.48	100.74	101.55	102.41	99.28	97.54	95.23	95.13	
	10	GA	101.37	114.91	107.84	105.76	102.53	104.54	103.62	100.27	
	11	HI	93.07	101.43	100.43	104.31	101.20	101.56	107.15	106.69	
	12	IA	99.49	109.09	110.59	98.25	100.74	88.35	91.08	97.21	
	13	ID	83.91	96.88	85.08	103.84	89.79	100.86	99.44	91.47	
	14	IL	106.31	111.61	107.33	104.82	106.71	105.93	102.25	102.90	
	15	IN	105.00	120.26	104.57	100.27	107.02	104.22	99.68	101.91	
	16	KS	91.47	90.21	77.94	90.30	95.36	92.83	95.61	94.27	
	17	KY	113.56	138.54	121.25	123.15	121.23	105.99	106.64	98.71	
	18	LA	109.33	110.98	97.30	100.54	101.33	100.25	103.91	104.15	
	19	MA	96.05	112.91	102.65	110.73	121.41	118.44	122.94	118.17	
	20	MD	101.18	122.67	89.36	93.74	104.48	109.34	98.52	83.63	
	21	ME	119.65	133.17	114.80	93.54	83.46	91.33	87.65	99.51	
	22	MI	96.76	104.41	103.07	106.14	106.49	95.22	93.99	96.80	
	23	MN	99.14	103.82	98.64	93.09	95.24	97.92	99.29	92.91	
	24	MO	104.35	110.99	105.14	107.04	95.73	109.41	104.25	102.30	
	25	MS	102.11	115.51	108.24	97.96	97.38	104.11	99.33	93.15	
	26	MT	109.54	95.87	106.72	114.34	123.05	128.59	103.64	93.81	
	27	NC	100.79	118.13	102.60	95.93	98.18	106.18	98.65	94.50	
	28	ND	93.73	93.04	95.11	100.92	100.37	90.88	92.82	92.82	
	29	NE	100.10	101.99	109.97	112.33	107.63	106.16	106.67	108.05	
	30	NH		132.56			123.28			103.08	
	31	NJ	101.95	104.04	98.48	93.39	112.61	101.66	97.11	93.60	
	32	NM	90.77	93.99	97.30	109.96	104.83	94.35	93.64	97.83	
	33	NV	89.84	96.20	95.09	109.15	95.30	99.54	90.93	97.51	
	34	NY	102.88	109.95	107.69	106.23	109.30	101.93	98.47	101.15	
	35	OH	110.89	122.28	110.93	95.28	97.33	101.82	99.47	99.59	
	36	OK	95.01	103.70	97.23	91.83	89.54	92.61	97.17	95.34	
	37	OR	93.16	94.11	94.01	89.30	85.48	88.64	88.39	91.19	
	38	PA	102.28	104.56	108.77	102.21	97.26	97.22	91.86	97.17	
	39	RI	72.42	81.17	86.29	63.70	121.85	115.02	105.11	107.13	
	40	SC	99.59	108.86	94.96	101.92	100.86	99.94	99.23	98.20	
	41	SD	89.33	86.88	69.26	79.23	70.73	64.16	65.09	100.07	
	42	TN	103.48	107.88	97.21	100.91	93.30	101.40	95.50	95.76	
	43	TX	101.57	100.81	97.15	96.45	92.54	96.25	96.80	98.37	

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15	87.35	105.92	91.82	99.77	93.79	108.31	87.55	78.40	86.08
16	92.22	102.11	104.18	112.23	97.41	114.09	99.46	100.07	102.76
17	93.43	91.96	91.35	103.83	91.14	88.42	89.96	79.82	85.62
18	100.81	100.22	103.32	105.81	100.74	97.29	92.11	96.79	105.75
19	63.81	77.47	61.36	61.50	68.32	73.72	83.69	80.45	72.35
20	97.14	103.28	102.87	98.70	102.63	106.34	101.55	88.77	99.60
21	96.93	98.38	85.35	96.40	85.03	90.59	96.87	79.75	82.77
22	100.42	108.22	104.11	105.79	104.40	99.98	108.50	100.98	96.91
23	103.70	103.31	102.96	99.40	96.16	95.64	90.84	94.11	94.47
24	86.34	94.48	91.64	92.15	95.10	102.56	93.95	87.22	93.50
25	95.93	108.62	111.04	119.97	117.14	103.40	105.90	107.21	115.30
26	95.08	97.81	103.77	96.82	85.55	96.76	90.73	89.35	97.89
27	97.13	104.01	103.32	110.16	104.33	106.78	97.35	90.54	100.02
28	94.74	96.66	102.90	95.78	94.62	108.12	109.36	106.90	115.00
29	96.19	98.13	97.88	102.97	102.99	106.30	103.51	101.74	106.06
30	98.40	104.53	97.42	92.56	134.60	96.26	96.71	92.08	98.68
31	91.01	100.04	91.92	92.88	96.19	103.06	101.08	91.12	88.67
32	99.63	103.91	113.68	117.23	104.22	99.37	97.28	112.73	109.28
33	97.01	100.51	103.40	102.51	102.33	101.84	100.89	102.78	103.57
34	98.06	104.13	97.77	98.00	98.74	102.58	103.81	101.64	105.61
35	102.54	98.20	94.02	97.89	91.69	94.46	99.40	98.78	97.18
36	95.64	102.95	113.28	112.64	107.52	97.31	103.89	105.99	111.27
37	100.66	100.16	104.19	99.11	107.43	108.86	101.39	107.82	116.17
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41	104.04	96.50	109.15	104.02	103.36	110.34	109.40	119.25	135.56
42	93.21	105.13	101.08	105.95	93.57	111.07	100.34	92.18	104.28
43	99.87	100.22	105.67	109.47	105.75	107.20	103.52	99.18	108.49
44	91.72	96.88	95.84	95.22	93.97	103.36	100.74	90.93	93.47
45	105.12	107.91	108.11	104.49	108.53	98.24	105.62	108.83	108.10
46	96.55	119.20	122.05	133.40	109.38	105.84	101.74	102.80	109.51
47	90.63	93.02	100.09	95.10	98.68	102.92	96.00	97.95	106.68
48	88.72	95.28	97.44	93.48	99.23	95.17	94.14	94.46	99.55
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3	92.12	96.32	107.91	95.16	95.37				
4	99.11	95.02	97.15	94.38	94.13				
5	101.28	99.87	95.81	98.94	96.17				
6	109.19	107.79	96.26	117.28	118.71				
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     41
                                     136.45
                                             126.44
           127.21
                    112.70
                            121.61
     42
           101.19
                     90.51
                             77.06
                                      96.59
                                             103.81
     43
           103.48
                    101.89
                             99.67
                                     101.46
                                             102.13
     44
            91.81
                     89.42
                             87.76
                                      88.51
                                              88.55
     45
           117.23
                    128.79
                            108.69
                                     100.59
                                             113.71
     46
           100.46
                     91.62
                            109.48
                                     106.85
                                             106.27
     47
            90.58
                     84.17
                            106.03
                                     105.21
                                              105.82
     48
            97.67
                     95.91
                             93.05
                                     100.93
                                               98.95
     49
            75.66
                     75.08
                                              92.76
                             90.46
                                      82.83
[45]: #write table to csv
     eia_netgen_pivot.to_csv('eia_netgen_pivot.csv', index=False)
     reread = pd.read_csv('eia_netgen_pivot.csv')
     reread.columns
```

```
[45]: Index(['State', '201501', '201502', '201503', '201504', '201505', '201506',
            '201507', '201508', '201509', '201510', '201511', '201512', '201601',
            '201602', '201603', '201604', '201605', '201606', '201607', '201608',
            '201609', '201610', '201611', '201612', '201701', '201702', '201703',
            '201704', '201705', '201706', '201707', '201708', '201709', '201710',
            '201711', '201712', '201801', '201802', '201803', '201804', '201805',
           '201806', '201807', '201808', '201809', '201810', '201811', '201812',
           '201901', '201902', '201903', '201904', '201905', '201906', '201907',
            '201908', '201909', '201910', '201911', '201912', '202001', '202002',
           '202003', '202004', '202005', '202006', '202007'],
          dtype='object')
[46]: | #Read csv back in with geopandas then use geopandas to write file to dbf format
    eia_netgen_gf = gpd.read_file('eia_netgen_pivot.csv')
    eia_netgen_gf.columns
    gf_fix_columns = {}
    bad columns = eia netgen gf.columns
     # print(bad columns)
     # print(len(bad_columns))
    good columns = reread.columns
     # print(len(good_columns))
     # print(good columns)
    for i in range(len(bad_columns)-1):
        gf_fix_columns[bad_columns[i]] = good_columns[i]
[47]: eia_netgen_gf.rename(columns = gf_fix_columns, inplace = True)
[48]: eia_netgen_gf.drop([0], inplace = True)
[49]: eia_netgen_gf.head()
[49]:
      State 201501 201502 201503
                                     201504
                                             201505
                                                     201506
                                                             201507
                                                                     201508
                                                              85.44
         AK 102.39 106.26
                              99.48
                                    103.73
                                             102.36
                                                      94.96
                                                                      90.29
    1
    2
         AL 108.34 113.09 105.98
                                    101.59
                                             104.82 107.67 106.75
                                                                     102.83
    3
         AR
              86.24 106.93 105.36
                                    106.58
                                              107.8
                                                      98.31
                                                              96.97
                                                                      91.89
    4
          ΑZ
              99.56
                      91.48
                            102.67
                                     100.43
                                             100.88 108.35 103.61
                                                                      104.0
    5
         CA
              96.32
                      91.95
                              95.92
                                      98.19
                                              96.96
                                                      103.1
                                                              97.03
                                                                      97.05
       201509 201510 201511 201512 201601 201602 201603 201604 201605
    1
        94.55 101.08 102.07 102.47
                                       100.89
                                              100.71
                                                      103.68
                                                                99.57 91.84
    2 103.44 111.13 106.13 105.56 103.41 105.63 100.25
                                                                94.73 94.67
               72.03
                       72.43
                               75.59
                                        97.22
                                                 92.3 103.09
    3
       89.29
                                                                107.6 93.66
    4 104.22 104.98
                        103.0 101.71
                                        101.8
                                                99.82
                                                        97.31 101.26 96.99
    5 103.66
               101.73
                        98.26
                               102.67
                                        99.49 100.63
                                                        94.73
                                                                94.65
                                                                        95.0
       201606 201607 201608 201609
                                       201610 201611 201612 201701
                                                                       201702
        89.15
                87.59
                        95.35
                                105.2 107.15 104.74
                                                        107.8 102.11
                                                                        99.74
```

```
2
         97.48
                 98.61
                        102.04
                                104.03
                                           93.4
                                                  96.96
                                                          99.71
                                                                   87.39
                                                                           91.65
                        102.79
                                 102.11
                                          93.02
                                                  94.07
                                                                   105.9
                                                                           96.84
     3 110.63
                103.68
                                                         102.05
     4 103.49
                 101.3
                         99.59
                                 96.12
                                          96.19
                                                   93.1
                                                          93.38
                                                                   94.22
                                                                           90.99
     5 104.13
                100.47
                         98.86
                                 97.97
                                          99.57
                                                  96.51
                                                                  114.56
                                                                          105.09
                                                          102.7
                201704
                        201705
                                201706
                                         201707
                                                 201708
                                                                          201711
        201703
                                                         201709
                                                                 201710
     1 110.37
                108.79
                        109.56
                                106.87
                                          99.39
                                                  98.36
                                                                   97.99
                                                                          100.38
                                                          93.69
        100.76
                110.22
                                 94.84
                                         100.62
                                                                           98.03
                        101.21
                                                  96.71
                                                          91.95
                                                                   99.97
                                                                           105.8
         89.81
                 103.2
                         86.68
                                 91.67
                                         102.41
                                                  97.63
                                                         101.88
                                                                 112.12
     3
         92.59
                 96.48
                          96.4
                                 99.03
                                          98.49
                                                   94.0
                                                          94.11
                                                                   96.23
                                                                          101.99
     4
      103.37
                101.31
                        107.88
                                 104.0
                                         102.66
                                                 105.24
                                                         102.53
                                                                   99.18
                                                                           98.84
        201712
                201801
                       201802
                                201803
                                         201804
                                                 201805
                                                         201806 201807
                                                                          201808
     1
         98.84
                101.25
                        100.17
                                101.47
                                         100.34
                                                 110.28
                                                         103.17
                                                                   94.02
                                                                           95.03
       100.97
                         92.24
                                  96.8
                                         108.59
                                                 106.35
                                                         105.33
                                                                 102.89
                                                                          100.41
     2
                108.53
     3 119.59
                119.64 110.07
                                 105.04
                                          119.3
                                                 122.69
                                                         120.05
                                                                 112.79
                                                                          108.45
                                 102.82
                                         100.09
                                                 100.61
                                                                 100.32
     4
          95.1
                 96.64
                         99.47
                                                          96.83
                                                                          101.12
     5
         96.86
                 92.58
                         94.93
                                 93.86
                                          99.83
                                                 100.09
                                                          96.42
                                                                 106.48
                                                                           97.72
       201809
               201810
                       201811
                               201812
                                        201901
                                                201902
                                                        201903
                                                                 201904
                                                                         201905
     1 98.02
                86.19
                         95.7
                                 93.15
                                          90.7
                                                 85.93
                                                          89.6
                                                                  93.43
                                                                          88.78
     2 101.4
                95.87
                         97.4
                                 97.23
                                        100.38
                                                 99.91
                                                         99.88
                                                                  94.42
                                                                         102.92
     3 98.83
              120.23
                       117.56 107.29
                                        111.02
                                               110.44
                                                       107.88
                                                                 95.02
                                                                         109.42
     4 105.4
               102.18
                       104.14
                                        106.76
                                                115.08
                                                                 105.42
                                                                          97.23
                                 107.1
                                                         112.5
     5 95.81
                99.57
                       101.59
                                 95.36
                                         99.23
                                                108.07
                                                         113.0
                                                                 110.99
                                                                         102.91
                                201909
                                         201910
                                                                 202001
        201906
                201907
                        201908
                                                 201911 201912
                                                                          202002
        101.33
                115.68
                        120.97
                                108.54
                                         107.59
                                                   97.1
                                                          97.73
                                                                 102.66
                                                                          107.18
                                          99.63
     2
         97.89
                 96.59
                          98.0
                                 99.17
                                                 101.48
                                                          96.52
                                                                   91.96
                                                                           97.48
         95.45
                 90.72
                         99.23
                                107.89 102.59
                                                 110.15
                                                          95.48
                                                                   79.98
                                                                           83.43
     3
     4
         97.14
                100.92
                        101.29
                                100.16
                                         100.42
                                                  97.77
                                                         102.71 101.02
                                                                          103.15
         97.97
                 99.23 101.14
                                100.04
                                          99.95
                                                  104.8
                                                         102.41
                                                                   97.81
                                                                           99.32
       202003 202004 202005
                              202006
                                       202007 geometry
         95.4 94.13
                       97.17
                              104.52
                                       117.89
                                                  None
     2 96.33
              90.45
                       90.03
                                 96.8
                                        94.55
                                                  None
     3 88.81
                68.3
                       79.76
                               83.89
                                        93.43
                                                  None
     4 92.12 96.32
                      107.91
                               95.16
                                        95.37
                                                  None
       99.11 95.02
                       97.15
                               94.38
                                        94.13
                                                  None
[50]: eia_netgen_gf_cols = eia_netgen_gf.columns
     for i in eia_netgen_gf_cols:
         if i != 'State':
             eia_netgen_gf[i] = eia_netgen_gf[i].astype(float)
[51]: eia_netgen_gf.to_file('eia_netgen_pivot.dbf',)
```

### 3.2 Merge covid and EIA netgen dfs to run correlation coefficient

```
[52]: eia_netgen_melt_merge.head(5)
[52]:
      State
               Date Thousand_MWh Month
                                           ThsdMWh_avg
                                                        ThsdMWh_%norm
                         605.60887
                                            591.463327
                                                               102.39
          ΑK
             201501
                                      01
     1
          AL 201501
                       13558.68054
                                      01 12515.358233
                                                               108.34
     2
          AR 201501
                        4536.97571
                                      01
                                           5260.769400
                                                                86.24
          AZ 201501
                                           8447.786387
                                                                99.56
     3
                        8410.40682
                                      01
     4
         CA 201501
                       14246.53253
                                      01 14790.536655
                                                                96.32
[53]: #Get only values for 2020 in EIA. Also remove the month of January as it does ...
     →not exist in the covid data
     eia_netgen_melt_merge['year'] = [eia_netgen_melt_merge['Date'][i][:4] for i in_
      →range(len(eia netgen melt merge))]
[54]: eia_netgen_2020 = eia_netgen_melt_merge[eia_netgen_melt_merge['year'] == '2020']
     eia_netgen_2020 = eia_netgen_2020[(eia_netgen_2020['Month'] != '01') &__
     # eia_netqen_2020['Month'] = [str(eia_netqen_2020['Month'][i])[1:] for i in_l
     →range(len(eia_netgen_2020))]
     month_dict = {}
     for i in eia_netgen_2020['Month'].unique():
        month_dict[i] = str(i)[1:]
     month_dict
     eia_netgen_2020['Month'] = [month_dict[i] for i in eia_netgen_2020['Month']]
[55]: eia_netgen_2020.head()
[55]:
         State
                   Date
                        Thousand MWh Month
                                              ThsdMWh_avg
                                                           ThsdMWh %norm
                                                                          year
     3162
            AK 202003
                            529.81320
                                               555.376695
                                                                   95.40
                                                                          2020
                                          3
     3163
                202003
                                                                   96.33
            AL
                          10626.62373
                                          3 11031.864477
                                                                          2020
     3164
            AR 202003
                           4069.97858
                                          3
                                              4582.748662
                                                                   88.81
                                                                          2020
     3165
            AZ 202003
                          7117.47238
                                          3
                                              7726.345218
                                                                   92.12
                                                                          2020
     3166
            CA 202003
                                          3 14956.540130
                          14823.10536
                                                                   99.11
                                                                          2020
[56]: ihme_covid_US_grouped.head(5)
[56]:
      location_name Month
                            location_id
                                         confirmed_infections_p100k_rate
            Alabama
                                                                0.000000
                         2
                                    523
                         3
     1
            Alabama
                                    523
                                                                0.639628
     2
            Alabama
                         4
                                    523
                                                                4.085565
     3
                                                                7.040449
            Alabama
                         5
                                    523
            Alabama
                                    523
                                                               13.455376
[57]: #Reduce covid of down to month 7 as the eai data is only months 3-7
     include_months = ['3', '4', '5', '6', '7']
```

```
# ihme_covid_US_eai_months = ihme_covid_US_grouped[True if_
      → ihme_covid_US_grouped['Month'][i] in include_months \
                                                          for i in
      →range(len(ihme covid US grouped))]
     ihme_covid_US_eia_months = ihme_covid_US_grouped[ihme_covid_US_grouped['Month'].
      →isin(include_months)]
[58]: ihme_covid_US_eia_months.tail()
         location name Month location id
[58]:
                                            confirmed_infections_p100k_rate
     408
               Wyoming
                           3
                                       573
                                                                    0.766414
     409
               Wyoming
                           4
                                       573
                                                                    2.261185
     410
               Wyoming
                           5
                                       573
                                                                    1.818251
                                       573
     411
               Wyoming
                            6
                                                                    3.189691
     412
               Wyoming
                           7
                                       573
                                                                    6.548873
[59]: #Give covid state names corresponding abbreviations to join dia data to.
     us_state_abbrev = {
         'Alabama': 'AL',
         'Alaska': 'AK',
         'American Samoa': 'AS',
         'Arizona': 'AZ',
         'Arkansas': 'AR',
         'California': 'CA',
         'Colorado': 'CO',
         'Connecticut': 'CT',
         'Delaware': 'DE',
         'District of Columbia': 'DC',
         'Florida': 'FL',
         'Georgia': 'GA',
         'Guam': 'GU',
         'Hawaii': 'HI',
         'Idaho': 'ID',
         'Illinois': 'IL',
         'Indiana': 'IN',
         'Iowa': 'IA',
         'Kansas': 'KS',
         'Kentucky': 'KY',
         'Louisiana': 'LA',
         'Maine': 'ME',
         'Maryland': 'MD',
         'Massachusetts': 'MA',
         'Michigan': 'MI',
         'Minnesota': 'MN'
         'Mississippi': 'MS',
         'Missouri': 'MO',
         'Montana': 'MT',
```

```
'Nebraska': 'NE',
         'Nevada': 'NV',
         'New Hampshire': 'NH',
         'New Jersey': 'NJ',
         'New Mexico': 'NM',
         'New York': 'NY',
         'North Carolina': 'NC',
         'North Dakota': 'ND',
         'Northern Mariana Islands': 'MP',
         'Ohio': 'OH',
         'Oklahoma': 'OK',
         'Oregon': 'OR',
         'Pennsylvania': 'PA',
         'Puerto Rico': 'PR',
         'Rhode Island': 'RI',
         'South Carolina': 'SC',
         'South Dakota': 'SD',
         'Tennessee': 'TN',
         'Texas': 'TX',
         'Utah': 'UT',
         'Vermont': 'VT',
         'Virgin Islands': 'VI',
         'Virginia': 'VA',
         'Washington': 'WA',
         'West Virginia': 'WV',
         'Wisconsin': 'WI',
         'Wyoming': 'WY'
     }
[60]: | ihme_covid_US_eia_months['State'] = [us_state_abbrev[i] for i in_
      →ihme_covid_US_eia_months['location_name']]
[61]: | ihme_covid_US_eia_months[ihme_covid_US_eia_months['State'] == 'NY']
[61]:
         location_name Month location_id confirmed_infections_p100k_rate State
     257
              New York
                           3
                                       555
                                                                   12.869898
     258
              New York
                            4
                                       555
                                                                   39.319803
                                                                                 NY
              New York
                            5
                                       555
     259
                                                                   10.737384
                                                                                 NY
     260
              New York
                            6
                                       555
                                                                    3.803534
                                                                                 NY
     261
              New York
                           7
                                       555
                                                                    3.517678
                                                                                 NY
[62]: eia_netgen_2020[eia_netgen_2020['State'] == 'NY']
[62]:
                   Date Thousand_MWh Month
                                                             ThsdMWh %norm
          State
                                               ThsdMWh_avg
                                                                            year
             NY 202003
     3196
                           10460.63245
                                           3 10301.463820
                                                                    101.55
                                                                             2020
     3247
             NY 202004
                            9234.29933
                                               9368.273927
                                                                     98.57
                                                                            2020
     3298
             NY
                 202005
                           9284.43924
                                           5 10260.597458
                                                                     90.49
                                                                            2020
     3349
             NY 202006
                           11346.79500
                                           6 11233.499627
                                                                    101.01
                                                                            2020
     3400
             NY 202007
                           14318.77774
                                           7 13595.523858
                                                                    105.32 2020
```

# 3.2.1 Merge covid data with eia data on combination of state abbrev and month columns and calc r squared

```
[63]: ihme_covid_US_eia_netgen = ihme_covid_US_eia_months.merge(eia_netgen_2020, on =__
      →['State', 'Month'], how = 'inner')
[73]: ihme_covid_US_eia_netgen_ny =
     →ihme_covid_US_eia_netgen[ihme_covid_US_eia_netgen['State'] == 'FL']
[74]: line_fig = px.line(ihme_covid_US_eia_netgen_ny, y = 'ThsdMWh_%norm', x = 'Date')
    line fig.show()
[75]: regression_line = px.scatter(ihme_covid_US_eia_netgen,
                                 x = 'confirmed_infections_p100k_rate', y = __
     regression_line.show()
[76]: results = px.get_trendline_results(regression_line)
    print(results)
    results.px_fit_results.iloc[0].summary()
                                         px_fit_results
    0 <statsmodels.regression.linear_model.Regressio...</pre>
[76]: <class 'statsmodels.iolib.summary.Summary'>
                                OLS Regression Results
```

## ULS Regression Results

Dep. Variable:  Model:  Method:  Date:  Date:  Sun, 27 Sep 2020  No. Observations:  y R-squared: Adj. R-squared: F-statistic: Prob (F-statist) Log-Likelihood: AIC:	ic):	-0.003 0.3340 0.564
Method: Least Squares F-statistic: Date: Sun, 27 Sep 2020 Prob (F-statist Time: 22:45:58 Log-Likelihood:	ic):	0.3340
Date: Sun, 27 Sep 2020 Prob (F-statist Time: 22:45:58 Log-Likelihood:	ic):	
Time: 22:45:58 Log-Likelihood:		0.00-
C		-988.17
No. observations. 200 Ato.		1980.
Df Residuals: 248 BIC:		1987.
Df Model:		1907.
Covariance Type: nonrobust		
and and any + DNI+I	[0 025	0.075]
coef std err t P> t	[0.025	0.975]
const 95.4775 1.079 88.491 0.000	93.352	97.603
x1 0.0543 0.094 0.578 0.564	-0.131	0.240
Omnibus: 48.854 Durbin-Watson:		2.134
Prob(Omnibus): 0.000 Jarque-Bera (JB	) •	136.834
Skew: -0.848 Prob(JB):		1.94e-30
,		
Kurtosis: 6.203 Cond. No.		15.5

### Warnings:

[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

11 11 11

[]: