data

November 18, 2017

```
In [56]: import pandas as pd
       import numpy as np
       import datetime as dt
       import matplotlib.pyplot as plt
       import matplotlib.dates as pltdt
       %matplotlib inline
       import seaborn as sns
       sns.set_style("darkgrid")
In [57]: power_countries_1986_2015 = pd.read_csv("EMHIRESPV_TSh_CF_Country_19862015.csv")
       meteorological_france_2006_2015 = pd.read_csv("france_2006_2015_ver2_0_9258_487749847
In [58]: power_countries_1986_2015.head(10)
Out[58]: <div>
       <style>
           .dataframe thead tr:only-child th {
              text-align: right;
           }
           .dataframe thead th {
              text-align: left;
           }
           .dataframe tbody tr th {
              vertical-align: top;
           }
       </style>
       <thead>
           AT
            BE
            BG
            CH
```

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CY
 CZ
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 PT
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</thead>
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0.052450
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0.030179
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9
0.166434
0.064906
```

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0.206412
         0.152344
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         ...
         0.089203
         0.058231
         0.020474
         0.108220
         0.125138
         0.111118
         0.052076
         0.238421
         0.039335
         0.047485
       10 rows E 29 columns
     </div>
In [59]: meteorological_france_2006_2015.head(10)
Out[59]: <div>
     <style>
        .dataframe thead tr:only-child th {
          text-align: right;
        .dataframe thead th {
          text-align: left;
       }
        .dataframe tbody tr th {
          vertical-align: top;
       }
     </style>
     <thead>
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         LATITUDE
         LONGITUDE
```

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ALTITUDE
 DAY
 TEMPERATURE_MAX
 TEMPERATURE_MIN
 TEMPERATURE AVG
 WINDSPEED
 VAPOURPRESSURE
 PRECIPITATION
 E0
 ESO
 ETO
 RADIATION
 SNOWDEPTH
</thead>
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 2.3898
 43
 20060101
 8.0
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 8.13
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 0.34
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 20060102
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48.76626
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93087
48.76626
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43
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-0.3
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93087
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2.3898
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4.8
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7
93087
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2.3898
43
20060108
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2.4
3.7
2.5
6.77
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0.41
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8
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2.3898
43
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3.5
6.0
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93087
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43
           20060110
           4.7
           -0.9
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           2.6
           6.57
           0.0
           0.16
           0.14
           0.26
           2632
           NaN
          </div>
In [60]: power_countries_1986_2015.shape
Out[60]: (262968, 29)
In [61]: meteorological_france_2006_2015.shape
Out[61]: (3662956, 16)
In [62]: t_h = pd.date_range('1/1/1986', periods=262968, freq='H')
In [63]: power_countries_1986_2015["HOUR"] = t_h
       power_countries_1986_2015.set_index("HOUR", inplace = True)
In [64]: power_countries_1986_2015.head(10)
Out[64]: <div>
       <style>
          .dataframe thead tr:only-child th {
             text-align: right;
          }
          .dataframe thead th {
             text-align: left;
          }
          .dataframe tbody tr th {
             vertical-align: top;
          }
       </style>
       <thead>
```

```
AT
<th>BE
BG
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LV
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0.043921
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0.043222
0.000000
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0.065217
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0.098980
0.048753
0.180386
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1986-01-01 09:00:00
0.166434
0.064906
0.206412
0.152344
0
0.127238
0.069999
0.044591
0.074671
0.146012
...
0.089203
0.058231
0.020474
0.108220
0.125138
0.111118
0.052076
0.238421
0.039335
```

```
0.047485
         10 rows @ 29 columns
      </div>
In [65]: power_countries_1986_2015['DAY']=power_countries_1986_2015.index.map(lambda x: x.strf
      power_countries_1986_2015_day = power_countries_1986_2015.groupby('DAY').mean()
In [66]: power_countries_1986_2015_day.shape
Out[66]: (10957, 29)
In [67]: power_countries_1986_2015_day.head(10)
Out[67]: <div>
      <style>
         .dataframe thead tr:only-child th {
            text-align: right;
         }
         .dataframe thead th {
            text-align: left;
         }
         .dataframe tbody tr th {
            vertical-align: top;
         }
      </style>
      <thead>
         AT
          BE
          BG
          CH
          CY
          CZ
          DE
          <th>DK
          EE
          ES
          ...
          LV
          NL
          NO
```

PL

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PT
 RO
 SI
 SK
 SE
 UK
DAY
 </thead>
1986-01-01
 0.047786
 0.023020
 0.048940
 0.065907
 0
 0.041685
 0.031583
 0.017365
 0.014149
 0.079043
 ...
 0.019004
 0.014293
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0.010351
0.029919
0.076675
0.029107
0.015193
0.054001
0.017463
0.030419
1986-01-02
0.045921
0.036297
0.067995
0.077502
0
0.026427
0.023506
0.014981
0.015682
0.119019
...
0.013771
0.020373
0.006469
0.031359
0.106900
0.044379
0.024623
0.034362
0.008086
0.022146
1986-01-03
0.067308
0.021352
0.101287
0.103680
0
0.057274
0.046181
0.023478
0.009570
0.106574
...
0.011871
0.010782
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0.007217
0.027554
0.160308
0.047235
0.032093
0.023788
0.010004
0.060345
1986-01-04
0.043833
0.050756
0.039337
0.075418
0
0.025843
0.025011
0.020003
0.008595
0.135060
...
0.013604
0.030366
0.007998
0.025986
0.208236
0.037510
0.028663
0.018115
0.009546
0.030981
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0.033055
0.090867
0
0.065186
0.028168
0.016261
0.009780
0.095232
...
0.013913
0.012728
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0.047764
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0.037254
0.057101
0.072843
0.013872
0.023346
1986-01-06
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0.010107
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0.129703
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1986-01-07
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0.026252
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0.038315
0.060745
0.075269
0.012525
0.015105
1986-01-08
0.081760
0.015187
0.098054
0.079822
0
0.030116
0.033810
0.023590
0.017004
0.095923
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1986-01-09
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0.027414
0.105907
0.049430
0
0.042179
0.036429
0.019755
0.010695
0.127086
...
0.013939
0.043137
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         0.141190
         0.095816
         0.027530
         0.065148
         0.015624
         0.019531
        1986-01-10
         0.073527
         0.006747
         0.043242
         0.064912
         0
         0.102516
         0.020375
         0.007423
         0.028644
         0.132712
         ...
         0.021272
         0.005444
         0.003677
         0.035274
         0.178932
         0.060794
         0.036451
         0.104920
         0.015396
         0.029241
        10 rows E 29 columns
     </div>
In [68]: power_countries_2006_2015_day = power_countries_1986_2015_day.loc["2006-01-01":"2015-
In [69]: power_countries_2006_2015_day.shape
Out[69]: (3652, 29)
In [87]: t_d = pd.date_range('1/1/2006', periods=3652, freq='D')
     t_d.shape
Out[87]: (3652L,)
```

0.007916

```
In [71]: power_france_2006_2015_day = power_countries_2006_2015_day["FR"]
In [80]: power_france_2006_2015_day.shape
Out[80]: (3652L,)
In [81]: power_france_2006_2015_day.head(10)
Out [81]: DAY
         2006-01-01
                      0.040878
         2006-01-02
                      0.050066
        2006-01-03
                      0.046397
         2006-01-04
                     0.061315
        2006-01-05
                     0.042258
        2006-01-06
                     0.062992
        2006-01-07
                      0.039511
        2006-01-08 0.047271
        2006-01-09
                      0.064127
        2006-01-10
                      0.076414
        Name: FR, dtype: float64
In [82]: meteorological_france_2006_2015_day = meteorological_france_2006_2015.groupby('DAY').
In [83]: meteorological_france_2006_2015_day.shape
Out[83]: (3652, 15)
In [84]: meteorological_france_2006_2015_day["DAY"] = t_d
        meteorological_france_2006_2015_day.set_index("DAY", inplace=True)
In [85]: meteorological_france_2006_2015_day.shape
Out[85]: (3652, 15)
In [86]: meteorological_france_2006_2015_day.head(10)
Out[86]: <div>
         <style>
             .dataframe thead tr:only-child th {
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             }
             .dataframe thead th {
                text-align: left;
             }
             .dataframe tbody tr th {
                vertical-align: top;
         </style>
```

```
<thead>
 GRID NO
  LATITUDE
  LONGITUDE
  ALTITUDE
  TEMPERATURE_MAX
  TEMPERATURE_MIN
  TEMPERATURE_AVG
  WINDSPEED
  VAPOURPRESSURE
  PRECIPITATION
  E0
  ESO
  ETO
  RADIATION
  SNOWDEPTH
 DAY
  </thead>
2006-01-01
  82982.985045
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  2.589603
  290.929212
  7.536590
  2.931306
```

```
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5.722333
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7.942857
2006-01-02
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290.929212
6.788734
3.453141
5.121934
3.652941
7.303749
0.465204
0.439681
0.380588
0.664437
3304.593220
11.835813
2006-01-03
82982.985045
46.453877
2.589603
290.929212
6.067498
1.962014
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2.862612
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0.389910
0.617697
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2006-01-04
```

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3584.273180
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          6.592064
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         2006-01-10
          82982.985045
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          2.589603
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          0.154327
          0.400120
          4515.381854
          12.586921
         </div>
In [77]: france_2006_2015_day = pd.concat([power_france_2006_2015_day, meteorological_france_2006_2015_day)
In [78]: france_2006_2015_day.shape
Out[78]: (3652, 16)
In [79]: france_2006_2015_day.head(10)
Out[79]: <div>
      <style>
         .dataframe thead tr:only-child th {
            text-align: right;
         }
         .dataframe thead th {
            text-align: left;
         }
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```
.dataframe tbody tr th {
  vertical-align: top;
 }
</style>
<thead>
 FR
  GRID_NO
  LATITUDE
  LONGITUDE
  ALTITUDE
  TEMPERATURE_MAX
  TEMPERATURE_MIN
  TEMPERATURE_AVG
  WINDSPEED
  VAPOURPRESSURE
  PRECIPITATION
  E0
  ESO
  ETO
  RADIATION
  SNOWDEPTH
 DAY
  </thead>
```

```
2006-01-01
0.040878
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