Air Quality

July 5, 2023

```
[1]: import pandas as pd
     import os
     %matplotlib inline
[2]: os.chdir("C:\\Users\\ddaya\\OneDrive\Documents\\Python_programming")
     air_quality=pd.read_csv("air_quality_no2.csv",index_col=0,parse_dates=True)
[3]: air_quality
[3]:
                           station_antwerp
                                            station_paris
                                                           station_london
     datetime
     2019-05-07 02:00:00
                                       NaN
                                                       NaN
                                                                       23.0
     2019-05-07 03:00:00
                                      50.5
                                                      25.0
                                                                       19.0
     2019-05-07 04:00:00
                                      45.0
                                                      27.7
                                                                       19.0
     2019-05-07 05:00:00
                                       NaN
                                                      50.4
                                                                       16.0
     2019-05-07 06:00:00
                                       NaN
                                                      61.9
                                                                        NaN
     2019-06-20 22:00:00
                                       NaN
                                                      21.4
                                                                        NaN
     2019-06-20 23:00:00
                                       NaN
                                                      24.9
                                                                        NaN
     2019-06-21 00:00:00
                                                      26.5
                                                                        NaN
                                       NaN
     2019-06-21 01:00:00
                                       NaN
                                                      21.8
                                                                        NaN
     2019-06-21 02:00:00
                                                      20.0
                                       NaN
                                                                        NaN
     [1035 rows x 3 columns]
[4]: # How to create new columns derived from existing columns?
     air_quality["london_mg_per_cubic"] = air_quality["station_london"] *1.882
[5]: air_quality
[5]:
                           station_antwerp
                                            station_paris station_london \
     datetime
     2019-05-07 02:00:00
                                       NaN
                                                       NaN
                                                                       23.0
     2019-05-07 03:00:00
                                      50.5
                                                      25.0
                                                                       19.0
     2019-05-07 04:00:00
                                      45.0
                                                      27.7
                                                                       19.0
     2019-05-07 05:00:00
                                       NaN
                                                      50.4
                                                                       16.0
     2019-05-07 06:00:00
                                                      61.9
                                       NaN
                                                                        NaN
```

```
2019-06-20 22:00:00
                                       NaN
                                                      21.4
                                                                        NaN
     2019-06-20 23:00:00
                                       NaN
                                                      24.9
                                                                        NaN
     2019-06-21 00:00:00
                                       NaN
                                                      26.5
                                                                        NaN
     2019-06-21 01:00:00
                                                      21.8
                                       NaN
                                                                        NaN
     2019-06-21 02:00:00
                                       NaN
                                                      20.0
                                                                        NaN
                           london_mg_per_cubic
     datetime
     2019-05-07 02:00:00
                                        43.286
     2019-05-07 03:00:00
                                        35.758
     2019-05-07 04:00:00
                                        35.758
     2019-05-07 05:00:00
                                        30.112
     2019-05-07 06:00:00
                                           NaN
     2019-06-20 22:00:00
                                           NaN
     2019-06-20 23:00:00
                                           NaN
     2019-06-21 00:00:00
                                           NaN
     2019-06-21 01:00:00
                                           NaN
     2019-06-21 02:00:00
                                            NaN
     [1035 rows x 4 columns]
[6]: air_quality["ration_paris_antwerp"]=(
     air_quality["station_paris"]/air_quality["station_antwerp"])
[7]: air_quality
[7]:
                           station_antwerp station_paris station_london \
     datetime
     2019-05-07 02:00:00
                                       NaN
                                                                       23.0
                                                       NaN
     2019-05-07 03:00:00
                                      50.5
                                                      25.0
                                                                       19.0
     2019-05-07 04:00:00
                                      45.0
                                                      27.7
                                                                       19.0
     2019-05-07 05:00:00
                                                      50.4
                                                                       16.0
                                       NaN
     2019-05-07 06:00:00
                                       NaN
                                                      61.9
                                                                        NaN
     2019-06-20 22:00:00
                                       NaN
                                                      21.4
                                                                        NaN
     2019-06-20 23:00:00
                                       NaN
                                                      24.9
                                                                        NaN
     2019-06-21 00:00:00
                                                      26.5
                                                                        NaN
                                       NaN
     2019-06-21 01:00:00
                                       NaN
                                                      21.8
                                                                        NaN
     2019-06-21 02:00:00
                                                      20.0
                                       NaN
                                                                        NaN
                           london_mg_per_cubic ration_paris_antwerp
     datetime
     2019-05-07 02:00:00
                                        43.286
                                                                  NaN
     2019-05-07 03:00:00
                                        35.758
                                                             0.495050
     2019-05-07 04:00:00
                                        35.758
                                                             0.615556
     2019-05-07 05:00:00
                                        30.112
                                                                  NaN
```

```
2019-05-07 06:00:00
                                            NaN
                                                                   NaN
     2019-06-20 22:00:00
                                            NaN
                                                                   NaN
     2019-06-20 23:00:00
                                            NaN
                                                                    NaN
     2019-06-21 00:00:00
                                            NaN
                                                                   NaN
     2019-06-21 01:00:00
                                            NaN
                                                                   NaN
     2019-06-21 02:00:00
                                            NaN
                                                                   NaN
     [1035 rows x 5 columns]
[8]: air_quality_rename=air_quality.rename(
         columns={
              "station_antwerp": "BETR801",
             "station_paris":"FR0414",
              "station_london":"London Westminster",
         })
[9]: air_quality_rename
[9]:
                           BETR801
                                    FR0414 London Westminster
                                                                  london_mg_per_cubic
     datetime
     2019-05-07 02:00:00
                                                            23.0
                                                                                43.286
                               NaN
                                        NaN
     2019-05-07 03:00:00
                              50.5
                                       25.0
                                                            19.0
                                                                                35.758
     2019-05-07 04:00:00
                              45.0
                                       27.7
                                                            19.0
                                                                                35.758
     2019-05-07 05:00:00
                                                            16.0
                                                                                30.112
                               NaN
                                       50.4
     2019-05-07 06:00:00
                               NaN
                                       61.9
                                                             {\tt NaN}
                                                                                   NaN
     2019-06-20 22:00:00
                               NaN
                                       21.4
                                                             NaN
                                                                                   NaN
     2019-06-20 23:00:00
                               NaN
                                       24.9
                                                             NaN
                                                                                   NaN
     2019-06-21 00:00:00
                               NaN
                                       26.5
                                                             NaN
                                                                                   NaN
     2019-06-21 01:00:00
                               NaN
                                       21.8
                                                             NaN
                                                                                   NaN
     2019-06-21 02:00:00
                               NaN
                                       20.0
                                                             NaN
                                                                                   NaN
                           ration_paris_antwerp
     datetime
     2019-05-07 02:00:00
                                             NaN
     2019-05-07 03:00:00
                                        0.495050
                                        0.615556
     2019-05-07 04:00:00
     2019-05-07 05:00:00
                                             NaN
     2019-05-07 06:00:00
                                             NaN
     2019-06-20 22:00:00
                                             NaN
```

NaN

NaN

NaN

NaN

2019-06-20 23:00:00

2019-06-21 00:00:00

2019-06-21 01:00:00

2019-06-21 02:00:00

[1035 rows x 5 columns]

[10]:	air_quality_renar	air_quality_rename.head()									
[10]:		BETR801	FR0414	London	Westminster	london_mg_per_cubic	\				
	datetime										
	2019-05-07 02:00	:00 NaN	NaN		23.0	43.286					
	2019-05-07 03:00	50.5	25.0		19.0	35.758					
	2019-05-07 04:00	:00 45.0	27.7		19.0	35.758					
	2019-05-07 05:00	:00 NaN	50.4		16.0	30.112					
	2019-05-07 06:00	:00 NaN	61.9		NaN	NaN					
	ration_paris_antwerp										
	datetime										
	2019-05-07 02:00	:00	NaN								
	2019-05-07 03:00	:00	0.495050								
	2019-05-07 04:00	:00	0.615556								
	2019-05-07 05:00	:00		NaN							
	2019-05-07 06:00:00 NaN										
[11]:	air_quality_rename=air_quality_rename.rename(columns=str.lower)										
[12]:	air_quality_rename										
[12]:		betr801	fr0414	london	westminster	london_mg_per_cubic	\				
	datetime	00 N N	N. N.		00.0	40,000					
	2019-05-07 02:00:		NaN		23.0	43.286					
	2019-05-07 03:00:		25.0		19.0	35.758					
	2019-05-07 04:00		27.7		19.0	35.758					
	2019-05-07 05:00:		50.4		16.0	30.112					
	2019-05-07 06:00	:00 NaN	61.9		NaN	NaN					
	2019-06-20 22:00:		21.4		NaN	NaN					
	2019-06-20 23:00:		24.9		NaN	NaN					
	2019-06-21 00:00:		26.5		NaN	NaN					
	2019-06-21 01:00:		21.8		NaN	NaN					
	2019-06-21 02:00	:00 NaN	20.0		NaN	NaN					
	ration_paris_antwerp										
	datetime										
	2019-05-07 02:00	:00		NaN							
	2019-05-07 03:00		0.49								
	2019-05-07 04:00	:00	0.61	5556							
	2019-05-07 05:00	:00		NaN	aN						
	2019-05-07 06:00	:00		NaN							
		0.0	•••								
	2019-06-20 22:00	: 00		NaN							

```
      2019-06-20
      23:00:00
      NaN

      2019-06-21
      00:00:00
      NaN

      2019-06-21
      01:00:00
      NaN

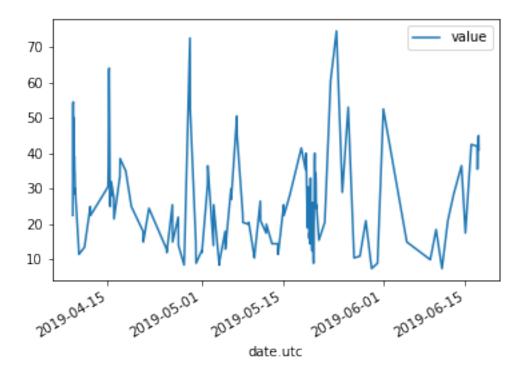
      2019-06-21
      02:00:00
      NaN
```

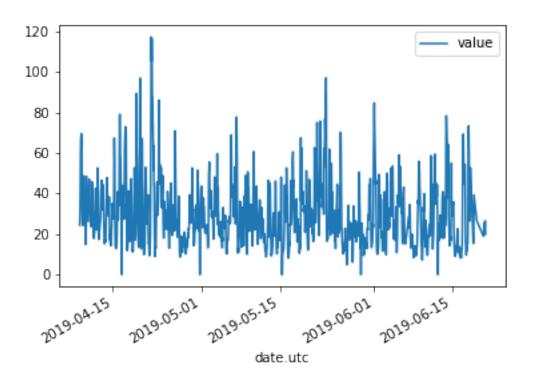
[1035 rows x 5 columns]

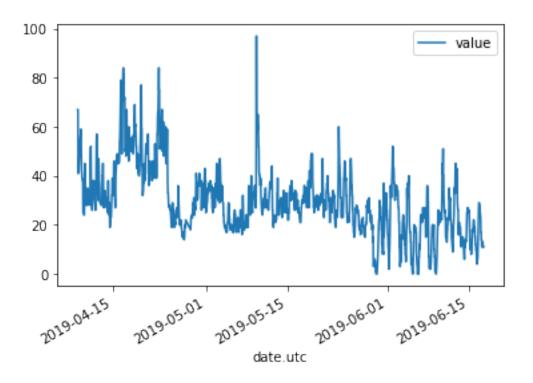
1 Air quality Long

```
[13]: air_quality=pd.read_csv("air_quality_long.csv",index_col="date.
       →utc",parse_dates=True)
[14]: air quality
[14]:
                                                                   location parameter \
                                         city country
      date.utc
      2019-06-18 06:00:00+00:00
                                    Antwerpen
                                                    ΒE
                                                                     BETR801
                                                                                   pm25
      2019-06-17 08:00:00+00:00
                                    Antwerpen
                                                    ΒE
                                                                     BETR801
                                                                                   pm25
      2019-06-17 07:00:00+00:00
                                    Antwerpen
                                                    BE
                                                                     BETR801
                                                                                   pm25
      2019-06-17 06:00:00+00:00
                                    Antwerpen
                                                    ΒE
                                                                     BETR801
                                                                                   pm25
      2019-06-17 05:00:00+00:00
                                    Antwerpen
                                                    BE
                                                                     BETR801
                                                                                   pm25
      2019-04-09 06:00:00+00:00
                                       London
                                                        London Westminster
                                                                                    no2
      2019-04-09 05:00:00+00:00
                                       London
                                                        London Westminster
                                                                                    no2
      2019-04-09 04:00:00+00:00
                                                        London Westminster
                                       London
                                                                                    no2
      2019-04-09 03:00:00+00:00
                                       London
                                                    GB
                                                        London Westminster
                                                                                    no2
      2019-04-09 02:00:00+00:00
                                       London
                                                    GB London Westminster
                                                                                    no2
                                    value
                                            unit
      date.utc
      2019-06-18 06:00:00+00:00
                                     18.0
                                           μg/m<sup>3</sup>
      2019-06-17 08:00:00+00:00
                                      6.5
                                           μg/m³
      2019-06-17 07:00:00+00:00
                                     18.5
                                           μg/m<sup>3</sup>
      2019-06-17 06:00:00+00:00
                                     16.0
                                           μg/m³
      2019-06-17 05:00:00+00:00
                                      7.5
                                           μg/m<sup>3</sup>
      2019-04-09 06:00:00+00:00
                                     41.0
                                           μg/m³
      2019-04-09 05:00:00+00:00
                                     41.0
                                           μg/m³
      2019-04-09 04:00:00+00:00
                                     41.0
                                           μg/m<sup>3</sup>
      2019-04-09 03:00:00+00:00
                                     67.0
                                           μg/m<sup>3</sup>
      2019-04-09 02:00:00+00:00
                                     67.0 \mu g/m^3
      [5272 rows x 6 columns]
[15]: no2=air_quality[air_quality["parameter"]=="no2"]
```

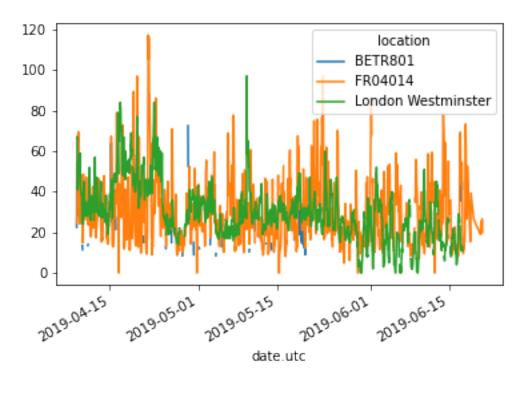
[16]: no2_subset=no2.sort_index().groupby(["location"]).plot()







:	location	BETR801	FR04014	London Westminster	
	date.utc				
	2019-04-09 01:00:00+00:0	22.5	24.4	NaN	
	2019-04-09 02:00:00+00:0	53.5	27.4	67.0	
	2019-04-09 03:00:00+00:0	54.5	34.2	67.0	
	2019-04-09 04:00:00+00:0	34.5	48.5	41.0	
	2019-04-09 05:00:00+00:0	46.5	59.5	41.0	
	•••	•••	•••	•••	
	2019-06-20 20:00:00+00:0	O NaN	21.4	NaN	
	2019-06-20 21:00:00+00:0	O NaN	24.9	NaN	
	2019-06-20 22:00:00+00:0	O NaN	26.5	NaN	
	2019-06-20 23:00:00+00:0	O NaN	21.8	NaN	
	2019-06-21 00:00:00+00:0	O NaN	20.0	NaN	



[24]:	air_quality	air_quality							
[24]:			city		country	location		parameter	\
	date.utc								
	2019-06-18	06:00:00+00:00	Antwer	pen	BE		BETR801	pm25	
	2019-06-17	08:00:00+00:00	Antwer	pen	BE		BETR801	pm25	
	2019-06-17	07:00:00+00:00	Antwerpen		BE	BETR801		pm25	
	2019-06-17	06:00:00+00:00	Antwerpen Antwerpen		BE	BETR801 BETR801		pm25	
	2019-06-17	05:00:00+00:00			BE			pm25	
	•••		•••						
	2019-04-09	06:00:00+00:00	Lon	don	GB	London	Westminster	no2	
	2019-04-09	05:00:00+00:00	London London London London		GB	London	Westminster	no2	
	2019-04-09	04:00:00+00:00			GB	London	Westminster	no2	
	2019-04-09	03:00:00+00:00			GB	London	Westminster	no2	
	2019-04-09	02:00:00+00:00			GB	London	Westminster	no2	
			value	un	it				
	date.utc								
	2019-06-18	06:00:00+00:00	18.0	μg/r	n³				
	2019-06-17	08:00:00+00:00	6.5	μg/r	n³				
	2019-06-17	07:00:00+00:00	18.5	μg/r	n³				
	2019-06-17	06:00:00+00:00	16.0	μg/r	n³				
	2019-06-17	05:00:00+00:00	7.5	μg/r	n³				
	•••								

```
2019-04-09 06:00:00+00:00
                                  41.0 \mu g/m^3
      2019-04-09 05:00:00+00:00
                                  41.0 \mu g/m^3
      2019-04-09 04:00:00+00:00
                                  41.0 \mu g/m^3
      2019-04-09 03:00:00+00:00
                                  67.0 \mu g/m^3
      2019-04-09 02:00:00+00:00
                                  67.0 \mu g/m^3
      [5272 rows x 6 columns]
[25]: air_quality.pivot_table(
          values="value", index="location", columns="parameter",aggfunc="mean")
[25]: parameter
                                no2
                                           pm25
      location
      BETR801
                          26.950920 23.169492
      FR04014
                          29.374284
      London Westminster 29.740050 13.443568
[26]: air_quality.pivot_table(
          values="value",
          index="location",
          columns="parameter",
          aggfunc="mean",
          margins=True,
[26]: parameter
                                no2
                                                       A11
                                           pm25
      location
      BETR801
                          26.950920 23.169492 24.982353
      FR04014
                          29.374284
                                            NaN 29.374284
      London Westminster 29.740050 13.443568 21.491708
      All
                          29.430316 14.386849 24.222743
[27]: air_quality.groupby(["parameter","location"]).mean()
[27]:
                                         value
      parameter location
      no2
                BETR801
                                     26.950920
                FR04014
                                     29.374284
                London Westminster 29.740050
      pm25
                                     23.169492
                London Westminster 13.443568
[28]: no2_pivioted=no2.pivot(columns="location", values="value").reset_index()
[29]: no2 pivioted.head()
```

```
date.utc BETR801 FR04014 London Westminster
[29]: location
               2019-04-09 01:00:00+00:00
                                             22.5
                                                       24.4
                                                                            NaN
      1
               2019-04-09 02:00:00+00:00
                                             53.5
                                                       27.4
                                                                           67.0
      2
               2019-04-09 03:00:00+00:00
                                             54.5
                                                       34.2
                                                                           67.0
      3
               2019-04-09 04:00:00+00:00
                                              34.5
                                                                           41.0
                                                       48.5
               2019-04-09 05:00:00+00:00
                                             46.5
                                                       59.5
                                                                           41.0
[33]: no2=no2_pivioted.melt(id_vars="date.utc")
[31]: no2.location.unique()
[31]: array(['BETR801', 'FR04014', 'London Westminster'], dtype=object)
[36]: no2=no2_pivioted.melt(
          id vars="date.utc",
          value_vars=["BETR801","FR04014","London Westminster"],
          value_name="NO_2",
          var_name="id_location",
[37]: no2.head()
[37]:
                         date.utc id location NO 2
      0 2019-04-09 01:00:00+00:00
                                      BETR801
                                               22.5
      1 2019-04-09 02:00:00+00:00
                                      BETR801 53.5
      2 2019-04-09 03:00:00+00:00
                                      BETR801
                                               54.5
      3 2019-04-09 04:00:00+00:00
                                      BETR801
                                               34.5
      4 2019-04-09 05:00:00+00:00
                                      BETR801 46.5
       Page=47
[39]: import pandas as pd
[40]: air_quality_no2=pd.read_csv("air_quality_long.csv")
      air_quality_no2=air_quality_no2[["date.utc","location","parameter","value"]]
[42]: air_quality_no2
[42]:
                                                  location parameter
                             date.utc
                                                                      value
            2019-06-18 06:00:00+00:00
                                                                       18.0
                                                   BETR801
                                                                pm25
      1
            2019-06-17 08:00:00+00:00
                                                   BETR801
                                                                pm25
                                                                        6.5
            2019-06-17 07:00:00+00:00
                                                   BETR801
                                                                pm25
                                                                       18.5
      3
            2019-06-17 06:00:00+00:00
                                                   BETR801
                                                                pm25
                                                                       16.0
      4
            2019-06-17 05:00:00+00:00
                                                                        7.5
                                                                pm25
                                                   BETR801
      5267 2019-04-09 06:00:00+00:00 London Westminster
                                                                 no2
                                                                       41.0
```

```
5269 2019-04-09 04:00:00+00:00
                                      London Westminster
                                                                     41.0
                                                               no2
      5270 2019-04-09 03:00:00+00:00
                                      London Westminster
                                                               no2
                                                                      67.0
      5271 2019-04-09 02:00:00+00:00 London Westminster
                                                                      67.0
                                                               no2
      [5272 rows x 4 columns]
[43]: air_quality_no2.head()
[43]:
                          date.utc location parameter value
      0 2019-06-18 06:00:00+00:00 BETR801
                                                pm25
                                                        18.0
      1 2019-06-17 08:00:00+00:00 BETR801
                                                pm25
                                                        6.5
      2 2019-06-17 07:00:00+00:00 BETR801
                                                pm25
                                                       18.5
      3 2019-06-17 06:00:00+00:00 BETR801
                                                pm25
                                                       16.0
      4 2019-06-17 05:00:00+00:00 BETR801
                                                pm25
                                                        7.5
[44]: air_quality_pm25=pd.read_csv("air_quality_pm25_long.csv")
[45]: air_quality_pm25=air_quality_pm25[["date.utc","location","parameter","value"]]
[46]: air_quality_pm25.head()
[46]:
                          date.utc location parameter value
      0 2019-06-18 06:00:00+00:00
                                   BETR801
                                                pm25
                                                        18.0
      1 2019-06-17 08:00:00+00:00
                                   BETR801
                                                pm25
                                                        6.5
      2 2019-06-17 07:00:00+00:00
                                   BETR801
                                                pm25
                                                       18.5
      3 2019-06-17 06:00:00+00:00 BETR801
                                                pm25
                                                        16.0
      4 2019-06-17 05:00:00+00:00 BETR801
                                                pm25
                                                        7.5
[47]: air_quality=pd.concat([air_quality_pm25,air_quality_no2],axis=0)
[48]: air_quality.head()
[48]:
                          date.utc location parameter value
      0 2019-06-18 06:00:00+00:00 BETR801
                                                pm25
                                                        18.0
      1 2019-06-17 08:00:00+00:00 BETR801
                                                pm25
                                                        6.5
      2 2019-06-17 07:00:00+00:00 BETR801
                                                pm25
                                                       18.5
      3 2019-06-17 06:00:00+00:00 BETR801
                                                pm25
                                                        16.0
      4 2019-06-17 05:00:00+00:00 BETR801
                                                pm25
                                                        7.5
[49]: print('shape of the ``air_quality_pm25`` table: ',air_quality_pm25.shape)
      print('shape of the ``air_quality_no2`` table: ', air_quality_no2.shape)
      print('shape of the resulting ``air_quality`` table: ',air_quality.shape)
     shape of the ``air_quality_pm25`` table: (1110, 4)
     shape of the ``air_quality_no2`` table: (5272, 4)
     shape of the resulting ``air_quality`` table: (6382, 4)
```

no2

41.0

5268 2019-04-09 05:00:00+00:00 London Westminster

```
[50]: air_quality=air_quality.sort_values("date.utc")
[51]: air_quality
[51]:
                             date.utc
                                                 location parameter
                                                                      value
      3500 2019-04-09 01:00:00+00:00
                                                  FR04014
                                                                no2
                                                                       24.4
      176
            2019-04-09 01:00:00+00:00
                                                  BETR801
                                                                pm25
                                                                       76.0
      3663 2019-04-09 01:00:00+00:00
                                                                       22.5
                                                  BETR801
                                                                 no2
      5271 2019-04-09 02:00:00+00:00
                                       London Westminster
                                                                 no2
                                                                       67.0
      1824 2019-04-09 02:00:00+00:00
                                       London Westminster
                                                                       42.0
                                                                pm25
      1826 2019-06-20 23:00:00+00:00
                                                  FR04014
                                                                       21.8
                                                                no2
      178
           2019-06-20 23:00:00+00:00
                                       London Westminster
                                                               pm25
                                                                       7.0
      1825 2019-06-21 00:00:00+00:00
                                                  FR04014
                                                                no2
                                                                       20.0
      177
            2019-06-21 00:00:00+00:00 London Westminster
                                                               pm25
                                                                        7.0
      101
            2019-06-21 00:00:00+00:00 London Westminster
                                                                pm25
                                                                        7.0
      [6382 rows x 4 columns]
[52]: air_quality=pd.concat([air_quality_pm25,air_quality_no2], keys=["PM25","N02"])
[53]: air_quality.head()
[53]:
                               date.utc location parameter
                                                            value
     PM25 0 2019-06-18 06:00:00+00:00 BETR801
                                                      pm25
                                                              18.0
           1 2019-06-17 08:00:00+00:00
                                                               6.5
                                         BETR801
                                                      pm25
           2 2019-06-17 07:00:00+00:00
                                         BETR801
                                                      pm25
                                                              18.5
           3 2019-06-17 06:00:00+00:00
                                         BETR801
                                                      pm25
                                                             16.0
           4 2019-06-17 05:00:00+00:00
                                         BETR801
                                                              7.5
                                                      pm25
[54]: stations_coord=pd.read_csv("air_quality_stations.csv")
[55]: stations coord.head()
[55]:
       location coordinates.latitude coordinates.longitude
      0 BELAL01
                              51.23619
                                                      4.38522
      1 BELHB23
                              51.17030
                                                      4.34100
      2 BELLD01
                              51.10998
                                                      5.00486
      3 BELLD02
                              51.12038
                                                      5.02155
      4 BELR833
                              51.32766
                                                      4.36226
[56]: air_quality=pd.merge(air_quality, stations_coord, how="left", on="location")
[57]: air_quality
[57]:
                             date.utc
                                                 location parameter
                                                                     value \
      0
            2019-06-18 06:00:00+00:00
                                                  BETR801
                                                                pm25
                                                                       18.0
            2019-06-17 08:00:00+00:00
      1
                                                  BETR801
                                                               pm25
                                                                        6.5
```

```
3
            2019-06-17 06:00:00+00:00
                                                                         16.0
                                                    BETR801
                                                                 pm25
      4
            2019-06-17 05:00:00+00:00
                                                    BETR801
                                                                 pm25
                                                                          7.5
      8053 2019-04-09 06:00:00+00:00
                                        London Westminster
                                                                         41.0
                                                                  no2
      8054 2019-04-09 05:00:00+00:00
                                        London Westminster
                                                                  no2
                                                                         41.0
      8055 2019-04-09 04:00:00+00:00
                                        London Westminster
                                                                         41.0
                                                                  no2
      8056 2019-04-09 03:00:00+00:00
                                        London Westminster
                                                                         67.0
                                                                  no2
      8057 2019-04-09 02:00:00+00:00 London Westminster
                                                                         67.0
                                                                  no2
                                  coordinates.longitude
            coordinates.latitude
      0
                        51.20966
                                                  4.43182
                         51.20966
                                                  4.43182
      1
      2
                         51.20966
                                                  4.43182
      3
                         51.20966
                                                  4.43182
      4
                         51.20966
                                                  4.43182
      8053
                                                 -0.13193
                         51.49467
      8054
                         51.49467
                                                 -0.13193
      8055
                         51,49467
                                                 -0.13193
      8056
                         51.49467
                                                 -0.13193
      8057
                         51.49467
                                                 -0.13193
      [8058 rows x 6 columns]
[58]: air quality parameters=pd.read csv("air quality parameters.csv")
[59]: air_quality_parameters
[59]:
           id
                                                       description
                                                                      name
      0
           bc
                                                      Black Carbon
                                                                       BC
                                                   Carbon Monoxide
                                                                        CO
      1
           СО
      2
          no2
                                                                       NO2
                                                  Nitrogen Dioxide
      3
           о3
                                                             Ozone
                                                                        03
               Particulate matter less than 10 micrometers in...
         pm10
                                                                   PM10
               Particulate matter less than 2.5 micrometers i... PM2.5
         pm25
          so2
                                                    Sulfur Dioxide
                                                                       S02
[60]: air_quality=pd.
       →merge(air_quality,air_quality_parameters,how='left',left_on='parameter',right_on='id')
[61]: air_quality
[61]:
                              date.utc
                                                   location parameter
                                                                       value
      0
            2019-06-18 06:00:00+00:00
                                                    BETR801
                                                                 pm25
                                                                         18.0
      1
            2019-06-17 08:00:00+00:00
                                                    BETR801
                                                                 pm25
                                                                          6.5
      2
            2019-06-17 07:00:00+00:00
                                                    BETR801
                                                                 pm25
                                                                         18.5
```

BETR801

pm25

18.5

2

2019-06-17 07:00:00+00:00

```
3
            2019-06-17 06:00:00+00:00
                                                    BETR801
                                                                  pm25
                                                                         16.0
      4
            2019-06-17 05:00:00+00:00
                                                                          7.5
                                                    BETR801
                                                                  pm25
            2019-04-09 06:00:00+00:00
      8053
                                        London Westminster
                                                                   no2
                                                                         41.0
      8054 2019-04-09 05:00:00+00:00
                                        London Westminster
                                                                         41.0
                                                                   no2
      8055
            2019-04-09 04:00:00+00:00
                                        London Westminster
                                                                         41.0
                                                                   no2
      8056 2019-04-09 03:00:00+00:00
                                        London Westminster
                                                                         67.0
                                                                   no2
            2019-04-09 02:00:00+00:00
                                        London Westminster
      8057
                                                                   no2
                                                                         67.0
                                   coordinates.longitude
            coordinates.latitude
                                                             id
      0
                         51.20966
                                                  4.43182
                                                           pm25
      1
                         51.20966
                                                  4.43182
                                                           pm25
      2
                         51.20966
                                                  4.43182
                                                           pm25
      3
                         51.20966
                                                  4.43182 pm25
      4
                         51.20966
                                                  4.43182
                                                           pm25
      8053
                         51.49467
                                                 -0.13193
                                                            no2
      8054
                         51.49467
                                                 -0.13193
                                                            no2
      8055
                         51.49467
                                                 -0.13193
                                                            no2
      8056
                         51,49467
                                                 -0.13193
                                                            no2
      8057
                         51.49467
                                                 -0.13193
                                                            no2
                                                    description
            Particulate matter less than 2.5 micrometers i... PM2.5
      0
            Particulate matter less than 2.5 micrometers i... PM2.5
      1
      2
            Particulate matter less than 2.5 micrometers i... PM2.5
            Particulate matter less than 2.5 micrometers i... PM2.5
      4
            Particulate matter less than 2.5 micrometers i...
      8053
                                                                    NO2
                                               Nitrogen Dioxide
      8054
                                               Nitrogen Dioxide
                                                                    NO2
      8055
                                                                    NO2
                                               Nitrogen Dioxide
      8056
                                               Nitrogen Dioxide
                                                                    N<sub>0</sub>2
      8057
                                               Nitrogen Dioxide
                                                                    NO2
      [8058 rows x 9 columns]
[62]: import pandas as pd
[63]: import matplotlib.pylab as plt
[64]: air_quality=pd.read_csv("air_quality_no2_long.csv")
[65]:
      air_quality
              city country
                                               date.utc
                                                                    location parameter
      0
             Paris
                         FR 2019-06-21 00:00:00+00:00
                                                                     FR04014
                                                                                    no2
```

[65]:

```
FR 2019-06-20 23:00:00+00:00
      1
             Paris
                                                                      FR04014
                                                                                     no2
      2
                         FR 2019-06-20 22:00:00+00:00
                                                                                     no2
             Paris
                                                                      FR04014
      3
             Paris
                         FR 2019-06-20 21:00:00+00:00
                                                                      FR04014
                                                                                     no2
      4
                         FR 2019-06-20 20:00:00+00:00
             Paris
                                                                      FR04014
                                                                                     no2
                         GB 2019-05-07 06:00:00+00:00
      2063
            London
                                                          London Westminster
                                                                                     no2
      2064 London
                         GB 2019-05-07 04:00:00+00:00
                                                          London Westminster
                                                                                     no2
      2065 London
                         GB 2019-05-07 03:00:00+00:00 London Westminster
                                                                                     no2
      2066 London
                         GB
                            2019-05-07 02:00:00+00:00 London Westminster
                                                                                     no2
      2067 London
                            2019-05-07 01:00:00+00:00 London Westminster
                                                                                     no2
            value
                     unit
      0
              20.0
                    μg/m<sup>3</sup>
      1
              21.8
                   μg/m³
      2
                    μg/m<sup>3</sup>
              26.5
      3
              24.9
                    μg/m<sup>3</sup>
      4
                    μg/m<sup>3</sup>
              21.4
             26.0 \mu g/m^3
      2063
      2064
             16.0
                   μg/m³
      2065
              19.0 \mu g/m^3
      2066
              19.0
                    μg/m<sup>3</sup>
      2067
             23.0 µg/m<sup>3</sup>
      [2068 rows x 7 columns]
[66]: air_quality=air_quality.rename(columns={"date.utc":"datetime"})
[67]: air_quality.head()
[67]:
          city country
                                           datetime location parameter
                                                                           value
                                                                                   unit
                         2019-06-21 00:00:00+00:00
                                                      FR04014
                                                                                  μg/m³
      0 Paris
                     FR
                                                                     no2
                                                                            20.0
      1 Paris
                     FR
                         2019-06-20 23:00:00+00:00 FR04014
                                                                            21.8
                                                                                  μg/m³
                                                                     no2
      2 Paris
                     FR
                         2019-06-20 22:00:00+00:00
                                                      FR04014
                                                                     no2
                                                                            26.5
                                                                                  μg/m³
      3 Paris
                         2019-06-20 21:00:00+00:00
                                                                            24.9
                                                                                  μg/m³
                                                      FR04014
                                                                     no2
                         2019-06-20 20:00:00+00:00 FR04014
```

no2

21.4 $\mu g/m^3$

4 Paris