To improve my understanding of data handling with Python and Numpy I will be doing this weather data project.

Numpy library of SciPY stack has functions which help to manage data in array form. I will load NOAA station and temperature data from text files. Plot them visually to understand insights from the data. I will be doing comparison's with different locations and parameters.

```
In [207]:
```

```
import numpy as np
import matplotlib.pyplot as pp
import seaborn  # matplotlib extension to improve ploting
```

In [208]:

```
%matplotlib inline
```

I will be using weather data from NOAA National centres for Environmental Information https://www.ncdc.noaa.gov/ (https://www.ncdc.noaa.gov/) From there I will use GCOS Surface Network data.

In [209]:

```
import urllib.request
urllib.request.urlretrieve('ftp://ftp.ncdc.noaa.gov/pub/data/ghcn/daily/ghcnd-stations.
txt','stations.txt')
```

Out[209]:

('stations.txt', <email.message.Message at 0x1be95c90>)

```
open('stations.txt','r').readlines()[:20]
```

Out[210]:

```
['ACW00011604 17.1167 -61.7833
                                   10.1
                                           ST JOHNS COOLIDGE FLD
\n',
 'ACW00011647 17.1333 -61.7833
                                   19.2
                                           ST JOHNS
\n',
 'AE000041196 25.3330
                         55.5170
                                   34.0
                                           SHARJAH INTER. AIRP
GSN
       41196\n',
 'AEM00041194 25.2550
                         55.3640
                                   10.4
                                           DUBAI INTL
41194\n',
 'AEM00041217 24.4330
                                   26.8
                                           ABU DHABI INTL
                         54.6510
41217\n',
 'AEM00041218 24.2620
                         55.6090 264.9
                                           AL AIN INTL
41218\n',
 'AF000040930 35.3170
                         69.0170 3366.0
                                           NORTH-SALANG
GSN
       40930\n',
 'AFM00040938 34.2100
                         62.2280 977.2
                                           HERAT
40938\n',
 'AFM00040948 34.5660
                         69.2120 1791.3
                                           KABUL INTL
40948\n',
                                           KANDAHAR AIRPORT
 'AFM00040990 31.5000
                         65.8500 1010.0
40990\n',
 'AG000060390 36.7167
                          3.2500
                                   24.0
                                           ALGER-DAR EL BEIDA
GSN
       60390\n',
 'AG000060590 30.5667
                          2.8667 397.0
                                           EL-GOLEA
       60590\n',
GSN
 'AG000060611 28.0500
                          9.6331 561.0
                                           IN-AMENAS
       60611\n',
GSN
 'AG000060680 22.8000
                          5.4331 1362.0
                                           TAMANRASSET
       60680\n',
GSN
 'AGE00135039 35.7297
                          0.6500
                                   50.0
                                           ORAN-HOPITAL MILITAIRE
\n',
 'AGE00147704 36.9700
                          7.7900 161.0
                                           ANNABA-CAP DE GARDE
 'AGE00147705 36.7800
                          3.0700
                                  59.0
                                           ALGIERS-VILLE/UNIVERSITE
\n',
 'AGE00147706 36.8000
                          3.0300 344.0
                                           ALGIERS-BOUZAREAH
\n',
                                           ALGIERS-CAP CAXINE
 'AGE00147707
              36.8000
                          3.0400
                                  38.0
                                           TIZI OUZOU
 'AGE00147708 36.7200
                          4.0500 222.0
60395\n']
```

To sanitize the data as we only need data from the weather stations. That is we will only use the one with GSN in 6th column

In [211]:

```
stations = {}
for lines in open('stations.txt','r'):
   if 'GSN' in lines:
      fields = lines.split() # split by white space
      stations[fields[0]] = ' '.join(fields[4:])
```

```
In [212]:
def locateStation(s):
   found = {locate: name for locate, name in stations.items() if s in name}
   print(found)
In [213]:
locateStation('SAN DIEGO')
{'USW00023188': 'CA SAN DIEGO LINDBERGH FLD GSN 72290'}
In [214]:
locateStation('DELHI')
{'IN022021900': 'NEW DELHI/SAFDARJUN GSN 42182'}
In [215]:
locateStation('BARCELONA')
{'SP000008181': 'BARCELONA/AEROPUERTO GSN 08181'}
In [216]:
locateStation('BEIJING')
{'CHM00054511': 'BEIJING GSN 54511'}
In [217]:
dataStations = ['USW00023188','IN022021900','SP000008181','CHM00054511']
In [218]:
urllib.request.urlretrieve('ftp://ftp.ncdc.noaa.gov/pub/data/ghcn/daily/gsn/USW0002318
8.dly','USW00023188.dly')
open('USW00023188.dly', 'r').readlines()[:3]
Out[218]:
['USW00023188193907TMAX 244 0 233 0 217 0 217 0 222 0 222 0 2
39 0 239 0 244 0 244 0 267 0 261 0
                                           228 0 233 0 217
0 206 0 222 0
                 233 0 233
                               250 0
                                       244
                                            0 244 0 256 0
                            0
256 0 239 0 250 0 239
                          0
                             244 0
                                    244 0\n',
 'USW00023188193907TMIN 172 0 183 0 167 0 172 0 178 0 183 0 1
61 0 172 0 183 0 183 0 172 0 178 0 172 0 167 0 156
0 156 0 167 0 156 0 189 0 172 0 178 0 178 0 183 0 194 0
178 0 178 0 172 0
                     183
                          0
                             183
                                  0
                                     189 0\n',
 'USW00023188193907PRCP
                                                         0
                         0 0
                                0 0
                                        0 0
                                               0 0
                                                      0
       0
         0
              0
                0
                      0T 0
                             0 0
                                     0 0
                                            0 0
                                                      0
                                                           0
                                                              0
                                                                   0
                                                    0
       0
            0
              0
                   0
                      0
                          0
                             0
                                  0 0
                                         0 0
                                                 0 0
                                                        0 0
  0
       0
          0
              0
                 0
                      0
                        0
                             0
                                0
                                     0
                                       0\n']
```

In [219]:

```
urllib.request.urlretrieve('ftp://ftp.ncdc.noaa.gov/pub/data/ghcn/daily/gsn/IN02202190
0.dly','IN022021900.dly')
open('IN022021900.dly', 'r').readlines()[:3]
```

Out[219]:

```
['IN022021900190101PRCP
                        79
                            Ι
                                 0 I
                                         0 I
                                                0
                                                  Ι
                                                          Ι
                                                        0
                                                                0
                                                                  Ι
       5 I
              41
                      0
                        I
                              0
                                 Ι
                                      0
                                         Ι
                                            18
                                                Ι
                                                  130
                                                        Ι
                                                            25
Ι
       Ι
                              Ι
                                 25
                                           0 I
                                                  0 I
                                                          0 I
              Ι
                    0
                      Ι
                          20
                                      Ι
                                        I\n',
0 I
       0
          Ι
                  Ι
                         Ι
                                 Ι
               0
                       0
                              0
                                      0
 'IN022021900190102PRCP
                                                0
                                                  Ι
                                                        5 I
                                                                  Ι
                         0
                            Ι
                                 0 I
                                         0 I
                                         Ι
                                                        Ι
       0 I
               0
                  Ι
                      0
                         Ι
                              0
                                 Ι
                                      0
                                             0
                                                Ι
                                                     0
                                                             0
                                                                Ι
                                         41 I
    0 I
                           0 I
                                   0 I
                                                  0 I
                                                          0 I
                                                                    Ι
Ι
          51 I
                   30
                      Ι
 Ι
       0 I
               0
                  I-9999
                          -9999
                                  -9999
                                          \n',
'IN022021900190103PRCP
                            Ι
                                 0 I
                                         0 I
                                                0 I
                                                        0 I
46 I
       0 I
                0 I
                       0
                          Ι
                               0
                                  Ι
                                       0
                                         Ι
                                             0
                                                 Ι
                                                      0 I
                                                              0
                                                                Ι
                                           0 I
                                                  0 I
       Ι
              Ι
                    0
                      Ι
                           0
                              Ι
                                   0
                                      Ι
                                                         97 I
                                Ι
       0 I
               0
                  Ι
                       0 I
                              0
                                         I\n']
```

In [220]:

```
urllib.request.urlretrieve('ftp://ftp.ncdc.noaa.gov/pub/data/ghcn/daily/gsn/SP00000818
1.dly','SP000008181.dly')
urllib.request.urlretrieve('ftp://ftp.ncdc.noaa.gov/pub/data/ghcn/daily/gsn/CHM0005451
1.dly','CHM00054511.dly')
```

Out[220]:

```
('CHM00054511.dly', <email.message.Message at 0x1be99af0>)
```

Data cleaning and Required data will be taken from .dly files. Readme file contains all legends.

```
In [221]:
```

```
open('readme.txt','r').readlines()[65:89]
```

Out[221]:

```
['----\n',
          Columns
 'Variable
                   Type\n',
 '----\n',
             1-11
                   Character\n',
 'YEAR
            12-15
                   Integer\n',
 'MONTH
                   Integer\n',
            16-17
            18-21
                   Character\n',
'ELEMENT
'VALUE1
            22-26
                   Integer\n',
'MFLAG1
            27-27
                   Character\n',
 'QFLAG1
            28-28
                   Character\n',
'SFLAG1
            29-29
                   Character\n',
 'VALUE2
            30-34
                   Integer\n',
                   Character\n',
            35-35
 'MFLAG2
                   Character\n',
 'QFLAG2
            36-36
 'SFLAG2
            37-37
                   Character\n',
                       .\n',
                       .\n',
                       .\n',
 'VALUE31
           262-266
                    Integer\n',
 'MFLAG31
           267-267
                   Character\n',
 'QFLAG31
           268-268
                   Character\n',
'SFLAG31
           269-269
                   Character\n',
 '----\n',
'\n']
```

In [222]:

In [223]:

```
dly_delimiter = [11,4,2,4] + [5,1,1,1] * 31  # describing the size of columns which we
will use
dly_usecolumns = [1,2,3] + [4*i for i in range(1,32)] # year,month,element and all val
ues 4,8,12 th columns
dly_dtype = [np.int32, np.int32, (np.str_,4)] + [np.int32] * 31
dly_names = ['year', 'month', 'observation'] + [str(day) for day in range(1,31+1)]
```

In [224]:

```
beijing = parseFile('CHM00054511.dly')
```

```
beijing
```

Out[225]:

```
array([(1945, 10, 'TAVG', -9999, -9999, -9999, -9999, -9999, -9999, -9999,
-9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999,
9, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -
                                                            96),
9999, -9999,
                           (1945, 11, 'TAVG',
                                                                                                          116,
                                                                                                                                     116,
                                                                                                                                                                   97,
                                                                                                                                                                                          119,
                                                                                                                                                                                                                    126.
                                                                                                                                                                                                                                                   93,
                                                                                                                                                                                                                                                                          105,
                                                                                                                                                                   76,
102,
                           114,
                                                     100,
                                                                                  46.
                                                                                                           77,
                                                                                                                                         83,
                                                                                                                                                                                             63.
                                                                                                                                                                                                                       79,
                                                                                                                                                                                                                                                   82.
                                                                                                                                                                                                                                                                              88.
                                                     38,
                                                                                22,
                                                                                                          34,
                                                                                                                                     45,
                                                                                                                                                                68,
                                                                                                                                                                                                                                                   7,
56,
                           63,
                                                                                                                                                                                          61,
                                                                                                                                                                                                                    18,
                                                                                                                                                                                                                                                                              6,
-25, -9999),
                           (1945, 12, 'TAVG',
                                                                                                           -7,
                                                                                                                                        38,
                                                                                                                                                                   31,
                                                                                                                                                                                                                        37,
                                                                                                                                                                                             12,
                                                                                                                                                                                                                                                   50,
-9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -99
9, -9999,
                                                -9,
                                                                           -8,
                                                                                            -37, -45, -27,
                                                                                                                                                                                -12,
                                                                                                                                                                                                      -27,
-54,
                                                     -67),
                           -61,
                            . . . ,
                                                                                                                                                                                                                        48,
                           (2020,
                                                    1, 'PRCP',
                                                                                                                 0,
                                                                                                                                            0,
                                                                                                                                                                       0,
                                                                                                                                                                                                 0,
                                                                                                                                                                                                                                                      3,
                                                                                                                                                                                                                                                                                 0,
                                                                                                          0,
                                                                                                                                                               0,
                                                                                                                                                                                         0,
                                                                                                                                                                                                                                               0,
0,
                           0,
                                                     0,
                                                                                0,
                                                                                                                                     0,
                                                                                                                                                                                                                    0,
                                                                                                                                     0, -9999, -9999, -9999, -9999, -
                                                     0,
                                                                                0,
                                                                                                          0,
                           0,
9999, -9999),
                                                      1, 'SNWD', -9999, -9999, -9999, -9999,
                                                                                                                                                                                                                                                   71, -9999,
30, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999,
-9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999, -9999,
9, -9999, -9999),
                           (2020, 1, 'TAVG',
                                                                                                          -65,
                                                                                                                                     -27,
                                                                                                                                                               -14,
                                                                                                                                                                                                 2,
                                                                                                                                                                                                                                                      5,
                                                                                                                                                                                         -32,
                                                                                                                                                                                                                    -39,
                                                                                                                                                                                                                                               -32,
-20,
                                                                             -27,
                                                                                                          -36,
                                                                                                                                     -33,
                                                                                                                                                               -59,
                                                                                                                                                                                                                                                                          -32,
                                                            3,
17,
                       -18,
                                                  -23,
                                                                            -23,
                                                                                                            1,
                                                                                                                                 -24, -9999, -9999, -9999, -9999,
-9999, -9999)],
                       dtype=[('year', '<i4'), ('month', '<i4'), ('observation', '<U4'),</pre>
('1', '<i4'), ('2', '<i4'), ('3', '<i4'), ('4', '<i4'), ('5', '<i4'), ('6', '<i4'), ('7', '<i4'), ('8', '<i4'), ('9', '<i4'), ('10', '<i4'), 1', '<i4'), ('12', '<i4'), ('13', '<i4'), ('14', '<i4'), ('15', '<\i15', ('
                                                                                                                                                                                                                                             '<i4'), ('1
('16', '<i4'), ('17', '<i4'), ('18', '<i4'), ('19', '<i4'), ('20', '<i4'),
                          '<i4'), ('22', '<i4'), ('23', '<i4'), ('24', '<i4'), ('25',
('26', '<i4'), ('27', '<i4'), ('28', '<i4'), ('29', '<i4'), ('30', '<i4'),
('31', '<i4')])
```

Crearting a numpy array for better access to data

In [226]:

```
def transform(record):
    startdate = np.datetime64('{}-{:02}'.format(record['year'],record['month']))
    dates = np.arange(startdate,startdate + np.timedelta64(1,'M'),np.timedelta64(1,'D')))

    rows = [(date,record[str(i+1)]/10) for i,date in enumerate(dates)]
    return np.array(rows,dtype=[('date','M8[D]'),('value','d')])
```

```
In [227]:
```

```
transform(beijing[0])
```

Out[227]:

```
array([('1945-10-01', -999.9), ('1945-10-02', -999.9),
       ('1945-10-03', -999.9), ('1945-10-04', -999.9),
       ('1945-10-05', -999.9), ('1945-10-06', -999.9),
       ('1945-10-07', -999.9), ('1945-10-08', -999.9),
       ('1945-10-09', -999.9), ('1945-10-10', -999.9),
       ('1945-10-11', -999.9), ('1945-10-12', -999.9),
       ('1945-10-13', -999.9), ('1945-10-14', -999.9),
       ('1945-10-15', -999.9), ('1945-10-16', -999.9),
       ('1945-10-17', -999.9), ('1945-10-18', -999.9),
       ('1945-10-19', -999.9), ('1945-10-20', -999.9),
       ('1945-10-21', -999.9), ('1945-10-22', -999.9),
       ('1945-10-23', -999.9), ('1945-10-24', -999.9),
       ('1945-10-25', -999.9), ('1945-10-26', -999.9),
       ('1945-10-27', -999.9), ('1945-10-28', -999.9),
       ('1945-10-29', -999.9), ('1945-10-30', -999.9),
       ('1945-10-31',
                         9.6)],
      dtype=[('date', '<M8[D]'), ('value', '<f8')])</pre>
```

In [228]:

```
def getValues(filename,observation):
    data = np.concatenate([transform(row) for row in parseFile(filename) if row[2] == o
bservation])
    data['value'][data['value'] == -999.9] = np.nan
    return data
```

In [229]:

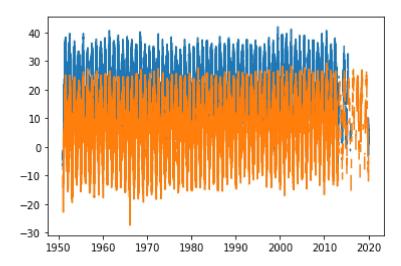
```
beijing_tMax = getValues('CHM00054511.dly','TMAX')
beijing_tMin = getValues('CHM00054511.dly','TMIN')
```

In [230]:

```
pp.plot(beijing_tMax['date'], beijing_tMax['value'])
pp.plot(beijing_tMin['date'], beijing_tMin['value'])
```

Out[230]:

[<matplotlib.lines.Line2D at 0x20aa5a90>]



In [231]:

```
# To make up for missing data add the closest neighbors through interopolation in Numpy
def fillnans(data):
    dates_float = data['date'].astype(np.float64)

    nan = np.isnan(data['value'])

    data['value'][nan] = np.interp(dates_float[nan],dates_float[~nan],data['value'][~na
n])
```

In [232]:

```
fillnans(beijing_tMax)
fillnans(beijing_tMin)
```

In [233]:

```
np.mean(beijing_tMax['value']), np.mean(beijing_tMin['value'])
```

Out[233]:

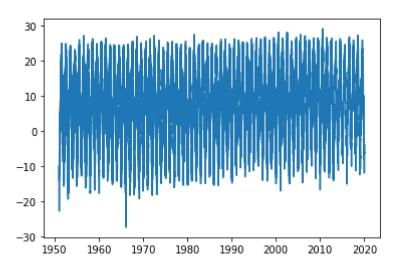
(17.835584047025602, 7.196716601276107)

In [234]:

```
pp.plot(beijing_tMin['date'],beijing_tMin['value'])
```

Out[234]:

[<matplotlib.lines.Line2D at 0x20d772f0>]

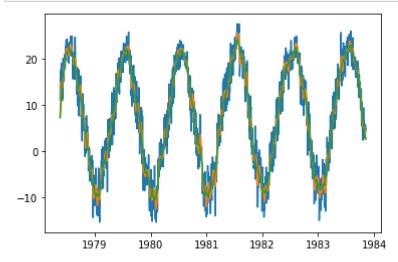


In [235]:

```
def plot_smoothed(t,win=10):
    smoothed = np.correlate(t['value'],np.ones(win)/win,'same')
    pp.plot(t['date'],smoothed)
```

In [236]:

```
pp.plot(beijing_tMin[10000:12000]['date'], beijing_tMin[10000:12000]['value'])
# Looking at small portion of smoothed graph
plot_smoothed(beijing_tMin[10000:12000])
plot_smoothed(beijing_tMin[10000:12000],30)
```



Comparing all four cities

In [237]:

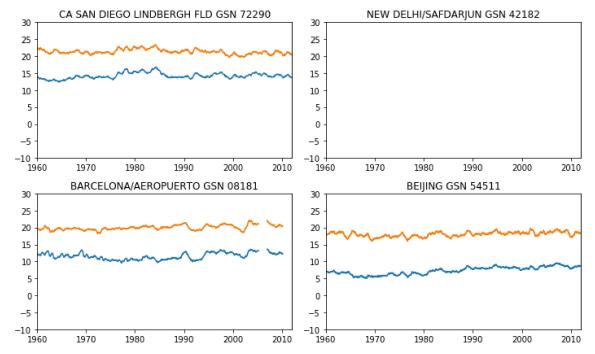
```
pp.figure(figsize=(10,6))

for i,code in enumerate(dataStations):
    pp.subplot(2,2,i+1)

    plot_smoothed(getValues('{}.dly'.format(code),'TMIN'),365)
    plot_smoothed(getValues('{}.dly'.format(code),'TMAX'),365)

    pp.title(stations[code])
    pp.axis(xmin=np.datetime64('1960'),xmax=np.datetime64('2012'),ymin=-10,ymax=30)

pp.tight_layout()
```



In [238]:

```
def selectyear(data,year):
    start = np.datetime64('{}'.format(year))
    end = start + np.timedelta64(1,'Y')
    return data[(data['date'] >= start) & (data['date'] < end)]['value']</pre>
```

In [239]:

```
Barcelona_tMax = getValues('SP000008181.dly','TMAX')
Barcelona_tMin = getValues('SP000008181.dly','TMIN')
```

In [240]:

```
Sandiego_tmax = getValues('USW00023188.dly','TMAX')
Sandiego_tmin = getValues('USW00023188.dly','TMIN')
```

```
In [241]:
```

```
fillnans(Barcelona_tMax)
fillnans(Barcelona_tMin)
fillnans(Sandiego_tmax)
fillnans(Sandiego_tmin)
```

In [260]:

```
years = np.arange(1950,2014+1)
```

In [261]:

```
Sandiego_tMax_all = np.vstack([selectyear(Sandiego_tmax,year)[:365] for year in years])
```

In [262]:

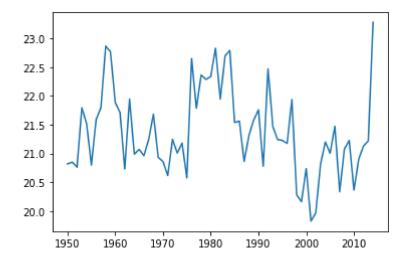
```
Sandiego_mean = np.mean(Sandiego_tMax_all,axis=1)
```

In [263]:

```
pp.plot(years,Sandiego_mean)
```

Out[263]:

[<matplotlib.lines.Line2D at 0x1e487430>]



In [264]:

```
# to find coldest year
Sandiego_tmin_all = np.vstack([selectyear(Sandiego_tmin,year)[:365] for year in years])
Sandiego_coldest = years[np.argmin(Sandiego_mean)]
Sandiego_coldest
```

Out[264]:

2001

In [265]:

```
Barcelona_tMax_all = np.vstack([selectyear(Barcelona_tMax,year)[:365] for year in years
])
```

In [266]:

```
Barcelona_mean = np.mean(Barcelona_tMax_all, axis = 1)
Barcelona_warmest = years[np.argmax(Barcelona_mean)]
```

In [267]:

```
Barcelona_warmest
```

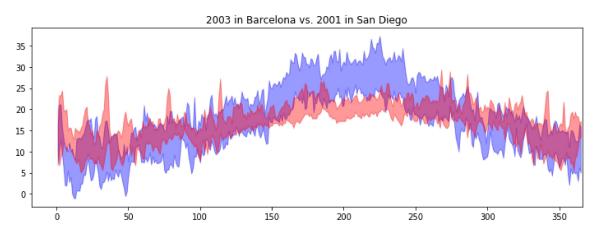
Out[267]:

2003

In [271]:

Out[271]:

Text(0.5, 1.0, '2003 in Barcelona vs. 2001 in San Diego')



More to come