07 other libraries

November 23, 2022

1 Other libraries and cool things

```
[2]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
```

1.1 seaborn

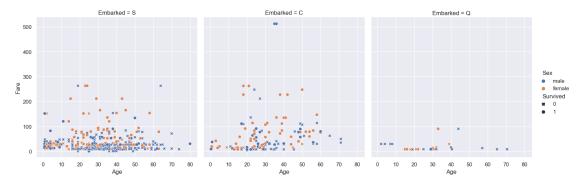
seaborn is a Python data visualisation library for making statistical graphics. It is built on top of matplotlib and integrates very closely with pandas.

Exploratory visualisations are often much easier with **seaborn**. For example, with only a few lines of code, we can visualise 5 columns from the titanic dataset.

```
[71]: sns.set_theme(context='notebook', style='darkgrid')

df = pd.read_csv('../data/titanic.csv')

ax = sns.relplot(
    data=df,
    x='Age', y='Fare', col='Embarked',
    hue='Sex',
    style='Survived',
    markers={0: 'X', 1: 'o'},
);
```



1.2 Matplotlib figure anatomy

A matplotlib figure is a collection of Artist objects stored together in a logical parent-child hierarchy. Here's a neat way to visualise it.

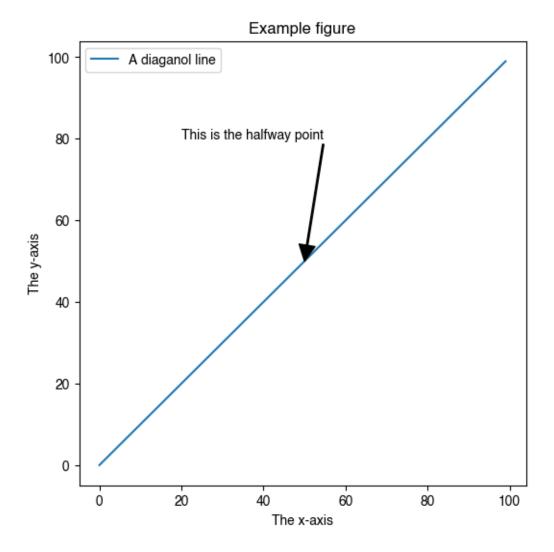
```
[9]: from matplotlib.artist import Artist
     # Make a basic example figure
     fig, ax = plt.subplots(figsize=(6, 6))
     ax.plot(range(100), range(100), label='A diaganol line')
     ax.set(
         xlabel='The x-axis',
         ylabel='The y-axis',
         title='Example figure'
     )
     ax.legend()
     ax.annotate(
         text='This is the halfway point',
         xy=(50, 50),
         xytext=(20, 80),
         arrowprops={'width':1, 'facecolor':'k', 'edgecolor':'k'}
     )
     # A function to plot all of the Artists
     def recursive get children(artist, depth=0):
         if isinstance(artist, Artist):
             print(' ' * depth + str(artist))
             for child in artist.get_children():
                 recursive_get_children(child, depth + 2)
     # Call the function on our figure
     recursive_get_children(fig)
```

```
Figure(600x600)
    Rectangle(xy=(0, 0), width=1, height=1, angle=0)
    AxesSubplot(0.125,0.11;0.775x0.77)
        Line2D(A diaganol line)
        Annotation(50, 50, 'This is the halfway point')
        Spine
        Spine
        Spine
        Spine
        Spine
        Spine
        XAxis(75.0,65.999999999999)
              Text(0.5, 0, 'The x-axis')
              Text(1, 0, '')
```

```
<matplotlib.axis.XTick object at 0x7fbc8112e310>
   Line2D()
    Line2D()
   Line2D()
    Text(0, 0, '')
    Text(0, 1, '')
<matplotlib.axis.XTick object at 0x7fbc8112e2e0>
   Line2D()
   Line2D()
   Line2D()
   Text(0, 0, '')
    Text(0, 1, '')
<matplotlib.axis.XTick object at 0x7fbc915d8670>
   Line2D()
    Line2D()
   Line2D()
    Text(0, 0, '')
    Text(0, 1, '')
<matplotlib.axis.XTick object at 0x7fbc915de8e0>
   Line2D()
   Line2D()
   Line2D()
   Text(0, 0, '')
    Text(0, 1, '')
<matplotlib.axis.XTick object at 0x7fbc915e4070>
   Line2D()
    Line2D()
    Line2D()
    Text(0, 0, '')
    Text(0, 1, '')
<matplotlib.axis.XTick object at 0x7fbc915e4730>
   Line2D()
   Line2D()
   Line2D()
   Text(0, 0, '')
    Text(0, 1, '')
<matplotlib.axis.XTick object at 0x7fbc915e4e80>
    Line2D()
   Line2D()
   Line2D()
    Text(0, 0, '')
    Text(0, 1, '')
<matplotlib.axis.XTick object at 0x7fbc915ec610>
   Line2D()
    Line2D()
   Line2D()
    Text(0, 0, '')
    Text(0, 1, '')
```

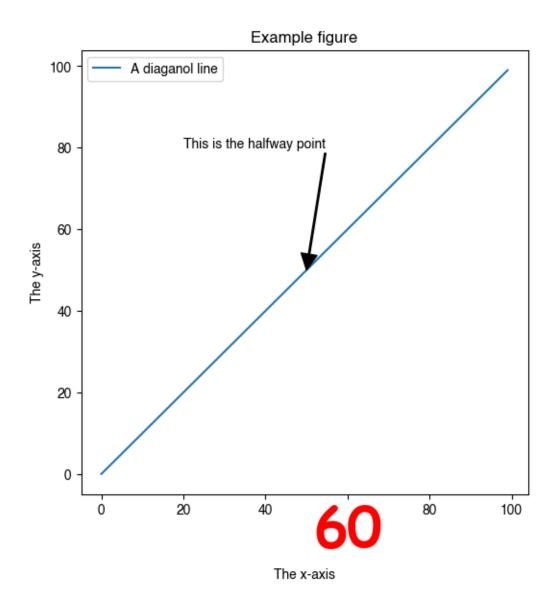
```
YAxis(75.0,65.999999999999)
    Text(0, 0.5, 'The y-axis')
    Text(0, 0.5, '')
    <matplotlib.axis.YTick object at 0x7fbc811351f0>
        Line2D()
        Line2D()
        Line2D()
        Text(0, 0, '')
        Text(1, 0, '')
    <matplotlib.axis.YTick object at 0x7fbc8112ea30>
        Line2D()
        Line2D()
        Line2D()
        Text(0, 0, '')
        Text(1, 0, '')
    <matplotlib.axis.YTick object at 0x7fbc915ecf40>
        Line2D()
        Line2D()
        Line2D()
        Text(0, 0, '')
        Text(1, 0, '')
    <matplotlib.axis.YTick object at 0x7fbc915ecd90>
       Line2D()
        Line2D()
        Line2D()
        Text(0, 0, '')
        Text(1, 0, '')
    <matplotlib.axis.YTick object at 0x7fbc915e4be0>
        Line2D()
        Line2D()
        Line2D()
        Text(0, 0, '')
        Text(1, 0, '')
    <matplotlib.axis.YTick object at 0x7fbc915f3490>
        Line2D()
        Line2D()
        Line2D()
        Text(0, 0, '')
        Text(1, 0, '')
    <matplotlib.axis.YTick object at 0x7fbc915f3a90>
        Line2D()
        Line2D()
        Line2D()
        Text(0, 0, '')
        Text(1, 0, '')
    <matplotlib.axis.YTick object at 0x7fbc915fb220>
        Line2D()
        Line2D()
```

```
Line2D()
                Text(0, 0, '')
                Text(1, 0, '')
        Text(0.5, 1.0, 'Example figure')
        Text(0.0, 1.0, '')
        Text(1.0, 1.0, '')
        Legend
            <matplotlib.offsetbox.VPacker object at 0x7fbc915d8fd0>
                <matplotlib.offsetbox.TextArea object at 0x7fbc915d8d90>
                    Text(0, 0, '')
                <matplotlib.offsetbox.HPacker object at 0x7fbc915d8c40>
                    <matplotlib.offsetbox.VPacker object at 0x7fbc915d8be0>
                        <matplotlib.offsetbox.HPacker object at 0x7fbc915d8c10>
                            <matplotlib.offsetbox.DrawingArea object at</pre>
0x7fbc915d8700>
                                Line2D(A diaganol line)
                            <matplotlib.offsetbox.TextArea object at</pre>
0x7fbc915d86d0>
                                Text(0, 0, 'A diaganol line')
            FancyBboxPatch((0, 0), width=1, height=1)
        Rectangle(xy=(0, 0), width=1, height=1, angle=0)
```



Now, to demonstrate the power of matplotlib, let's traverse this hierarchy in true object-oriented fashion and make some changes to a single element.

[10]:



This may seem like a silly exercise, but it reveals much about matplotlib. What else about the plot can you change?

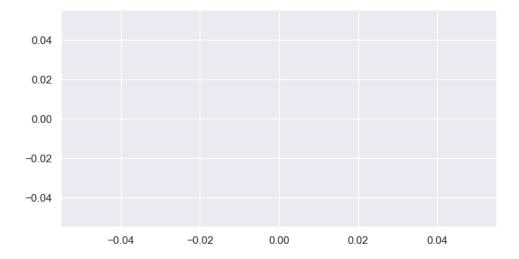
1.3 Animations with matplotlib

With matplotlib, it is also possible to make animated plots. Here's one that shows the number of cycling accidents over time. Note you may need to install some additional libraries for this to work in a Jupyter notebook.

```
[137]: from matplotlib.animation import FuncAnimation
%matplotlib widget

df = (
```

```
pd.read_csv('../data/gb_cycling_accidents.csv')
    .assign(index=lambda df_: pd.DatetimeIndex(df_.Date + ' ' + df_.Time))
    .set_index('index')
    .assign(Year=lambda df_: df_.index.year)
    .groupby(['Year', 'Gender'])['Accident_Index']
    .count()
    .unstack()
)
fig, ax = plt.subplots(figsize=(8, 4))
ln_male, = ax.plot([], [], 'ro-')
ln_female, = ax.plot([], [], 'bo-')
ln_other, = ax.plot([], [], 'go-')
def init():
    ax.set_ylim(-1000, df.Male.max()*1.05)
    ax.set_xlim((df.index.min(), df.index.max()))
    ax.set_xlabel('Year')
    ax.set_ylabel('Number of accidents')
    ax.set_title('Cycling accidents in Great Britain (1979-2018)')
    ax.legend([ln_male, ln_female, ln_other], ['Males', 'Females', 'Other'])
    return ln_male, ln_female, ln_other,
def update(frame):
    data = df.iloc[0:frame]
    ln male.set data(data.index, data.Male)
    ln_female.set_data(data.index, data.Female)
    ln_other.set_data(data.index, data.Other)
    return ln_male, ln_female, ln_other,
ani = FuncAnimation(fig, update, frames=len(df.index.to_numpy()),
                    init_func=init, blit=True)
plt.show()
```



2 Geographical plots with cartopy

There are various libraries for plotting geospatial data in Python. A good example is the cartopy library. Here, I use cartopy to plot the night-time shading for the current time on a flat map of the earth, along with the location of the University of York, and the 10 most populated cities.

The city data are freely available at the following web page:

• https://simplemaps.com/data/world-cities

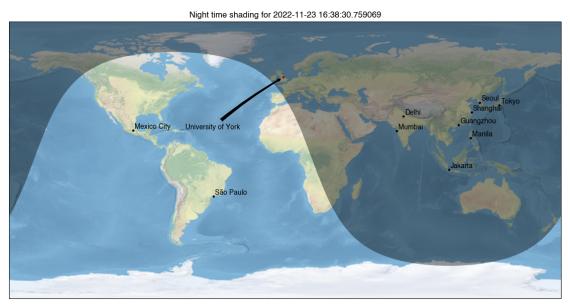
```
[2]: import pandas as pd

# Load the city data
df = (
    pd.read_csv('../data/worldcities.csv')
        .sort_values('population', ascending=False)
        .head(10)
)
df
```

```
[2]:
                        city_ascii
                                                              country iso2 iso3
                city
                                         lat
                                                    lng
               Tokyo
                             Tokyo
                                     35.6839
                                               139.7744
     0
                                                                 Japan
                                                                         JΡ
                                                                              JPN
                                                            Indonesia
     1
             Jakarta
                           Jakarta
                                     -6.2146
                                               106.8451
                                                                         ID
                                                                             IDN
     2
               Delhi
                             Delhi
                                     28.6667
                                                77.2167
                                                                 India
                                                                         IN
                                                                             IND
     3
              Manila
                            Manila
                                     14.6000
                                               120.9833
                                                          Philippines
                                                                         PH
                                                                             PHL
     4
          São Paulo
                         Sao Paulo -23.5504
                                               -46.6339
                                                               Brazil
                                                                         BR
                                                                             BRA
     5
               Seoul
                             Seoul
                                     37.5600
                                               126.9900
                                                          South Korea
                                                                         KR
                                                                             KOR
     6
              Mumbai
                            Mumbai
                                     19.0758
                                                72.8775
                                                                 India
                                                                         IN
                                                                              IND
     7
            Shanghai
                          Shanghai
                                     31.1667
                                               121.4667
                                                                         CN
                                                                             CHN
                                                                China
```

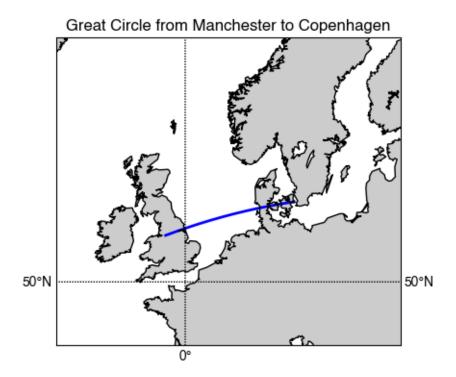
```
8 Mexico City Mexico City 19.4333 -99.1333
                                                          Mexico
                                                                  MX MEX
     9
                                                                   CN CHN
          Guangzhou
                       Guangzhou 23.1288
                                           113.2590
                                                           China
              admin_name
                          capital population
     0
                   Tōkyō
                          primary 39105000.0 1392685764
     1
                 Jakarta primary 35362000.0 1360771077
     2
                   Delhi
                            admin 31870000.0 1356872604
                  Manila primary 23971000.0 1608618140
     3
                            admin 22495000.0 1076532519
     4
               São Paulo
     5
                   Seoul primary 22394000.0 1410836482
                          admin 22186000.0 1356226629
     6
             Mahārāshtra
     7
                Shanghai
                            admin 22118000.0 1156073548
     8 Ciudad de México primary 21505000.0 1484247881
     9
               Guangdong
                            admin 21489000.0 1156237133
[13]: import datetime
     import matplotlib.pyplot as plt
     import numpy as np
     import cartopy.crs as ccrs
     from cartopy.feature.nightshade import Nightshade
     # Create a figure with a GeoAxes by specifying
     fig = plt.figure(figsize=(12, 6))
     ax = fig.add_subplot(1, 1, 1, projection=ccrs.PlateCarree())
     # Get current date and time
     dt = datetime.datetime.now()
     # Location of University of York
     location = (-1.0311947681813436, 53.94930227196749)
      # Arrow props
     arrowprops=dict(
         arrowstyle='fancy',
         shrinkA=5,
         shrinkB=5,
         fc="k", ec="k",
         connectionstyle="arc3, rad=-0.05",
     )
      # Add title
     ax.set_title(f'Night time shading for {dt}')
      # Draw a standard flat map of the world
     ax.stock_img()
      # Add the nightshade feature
```

```
ax.add_feature(Nightshade(dt, alpha=0.4))
# Add University of York location and annotate
ax.scatter(*location, c='r', s=5)
ax.annotate(
    text='University of York',
    xy=location,
    xytext=(-65, 20),
    arrowprops=arrowprops
)
# Plot the city locations
ax.scatter(df.lng, df.lat, c='k', s=5)
# Annotate with the names of the cities
for idx, row in df.iterrows():
    ax.annotate(
        text=row.city,
        xy=(row.lng+1, row.lat+1)
plt.tight_layout()
plt.show()
```



matplotlib has its own Basemap Toolkit which predates cartopy. Soon I'll be off to Copenhagen, so I decided to use it to plot the great circle route between airports.

```
[103]: from mpl_toolkits.basemap import Basemap
       import numpy as np
       import matplotlib.pyplot as plt
       # create new figure, axes instances.
       fig=plt.figure(figsize=(12, 4))
       ax=fig.add_axes([0.1,0.1,0.8,0.8])
       # setup mercator map projection.
       m = Basemap(
           llcrnrlon=-15.,llcrnrlat=45.,urcrnrlon=25.,urcrnrlat=65.,
           rsphere=(6378137.00,6356752.3142),
           resolution='l',projection='merc',
           lat_0=40.,lon_0=-20.,lat_ts=20.
       # lat/lon for manchester and copenhagen
       cop_lat, cop_lon = 55.62798787190983, 12.643942953245418
       man_lat, man_lon = 53.35544507391249, -2.277185420260674
       # draw great circle route between manchster and copenhagen
       m.drawgreatcircle(cop_lon,cop_lat,man_lon,man_lat,linewidth=2,color='b')
       m.drawcoastlines()
       m.fillcontinents()
       # draw parallels
       m.drawparallels(np.arange(10,90,20), labels=[1,1,0,1])
       # draw meridians
       m.drawmeridians(np.arange(-180,180,30),labels=[1,1,0,1])
       ax.set_title('Great Circle from Manchester to Copenhagen')
       plt.show()
```



[]: