

Creating Data Visualizations with Python

June 2022

Housekeeping

- In case of technical problems:
 - Something wrong on my end (e.g. power outage), I will send you an email.
 - Something wrong on your end, please send me a text message. 508-769-6446
 - jcodygroup@gmail.com
- We have 4 hours for each session
 - I will try to give you an opportunity to stand and stretch every hour.
 - We will take at least one 15-minute break near the halfway point.

About me

Experience:

- 25+ years consulting and training experience
- Extensive work with "big data" and analytics
- 15 years working with various data visualization tools

Education

- Ed. M., Technology, Innovation & Education, Harvard University
- PhD Candidate, Education Policy, University of Massachusetts, Amherst

Learning Objective

Knowledge, skillsets, mindsets

- Knowledge of:
 - A variety of python data visualization packages
 - The structure of visualizations
 - Package documentation
- Skillsets:
 - The ability to produce basic plots with some formatting using matplotlib & seaborn
- Mindsets:
 - Think, sketch before coding

Note: We will be focusing on plotting. We will not be doing any data manipulation to prepare for plotting.

Python's Visualization Landscape graph-tool holoviews datashader toyplot ipyvolume networkx bokeh iavascript pandas Yellow brick ipyleaflet matplotlib bqplot pythreejs scikit-plot seaborn Vispy Glumpy OpenGL Altair chaco GR framework Vega-Lite PyQTgraph d3po Lightning eScience Institute Vincent



seaborn: statistical data visualization

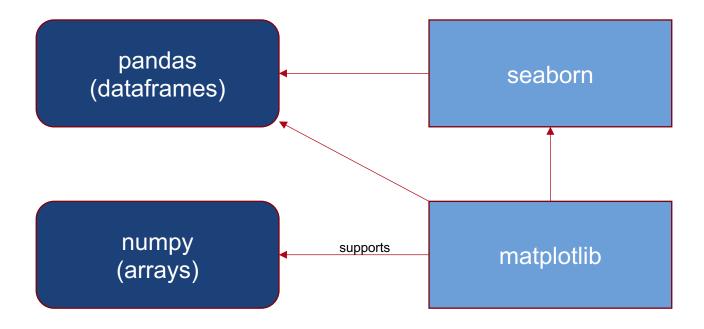
The Bokeh Visualization Library



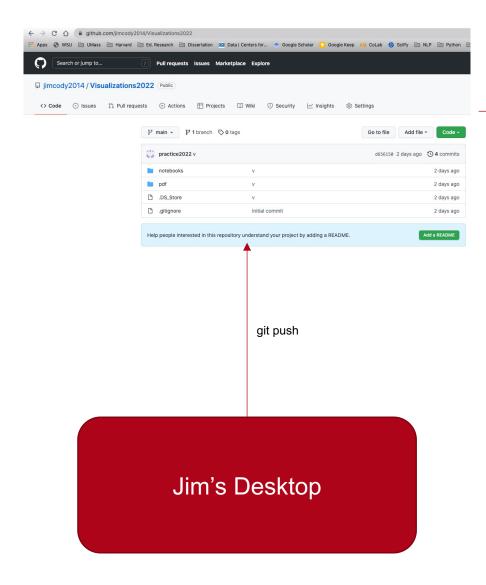
A Grammar of Graphics for Python

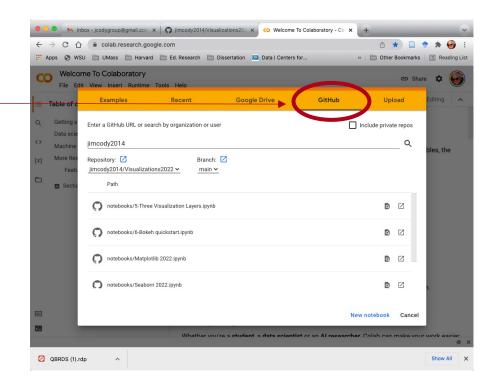
Altair: Declarative Visualization in Python

'Workhorse' data & visualization packages

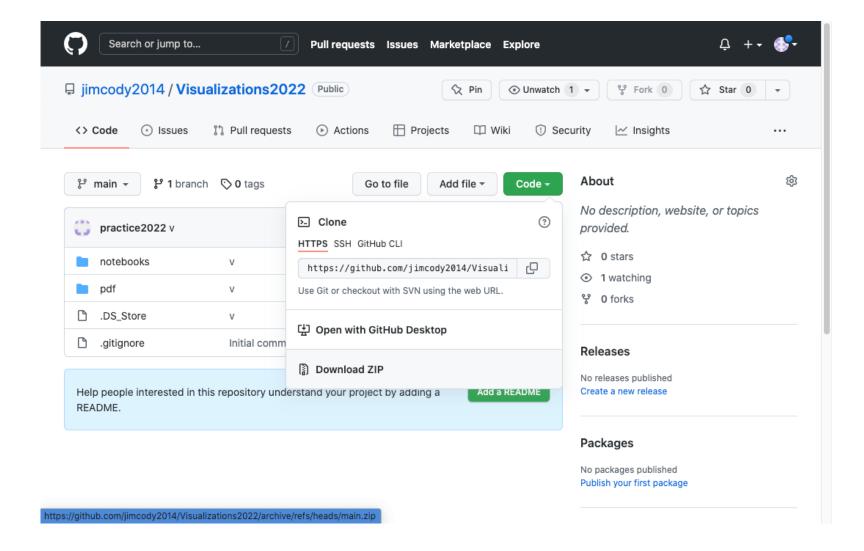


Accessing jupyter notebooks for class





You can also download from github (this is optional!)

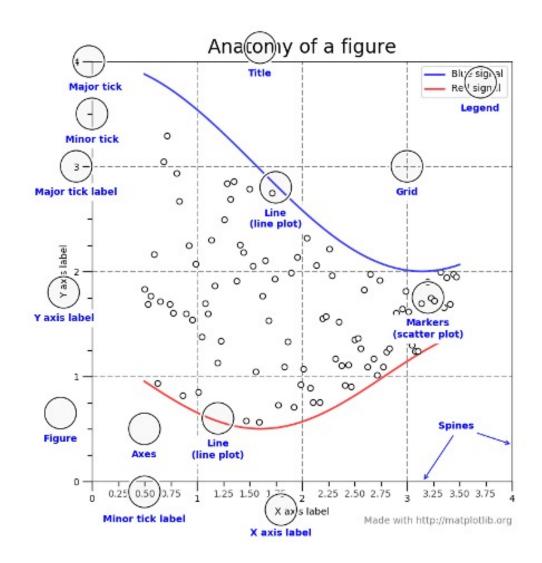


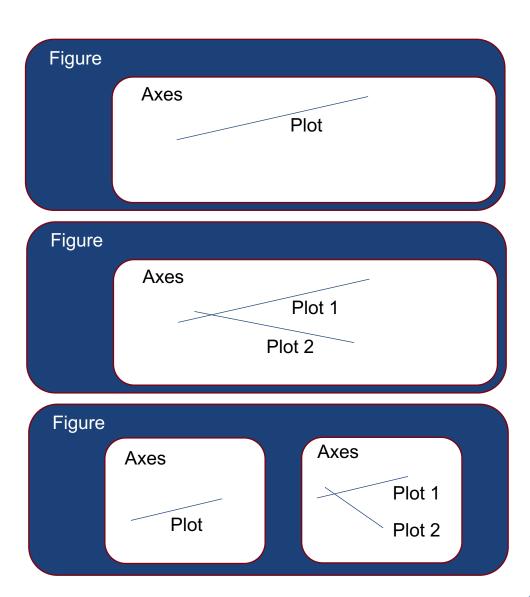
Matplotlib

Matplotlib

- Matplotlib is a popular Python package used to build plots.
- It was started as a project in the early 2000's to replicate MATLAB's plotting capability with Python.
- Matplotlib has three interfaces (ways to write code)
 - pyplot hides the complexity of object-oriented coding.
 - object-oriented provides access to more functions and control over the visualizations
 - pylab (not recommended for use)
- This lesson covers the pyplot and object-oriented interfaces

Two big concepts to keep in mind





Adding axes

fig.add_axes: for absolute positioning

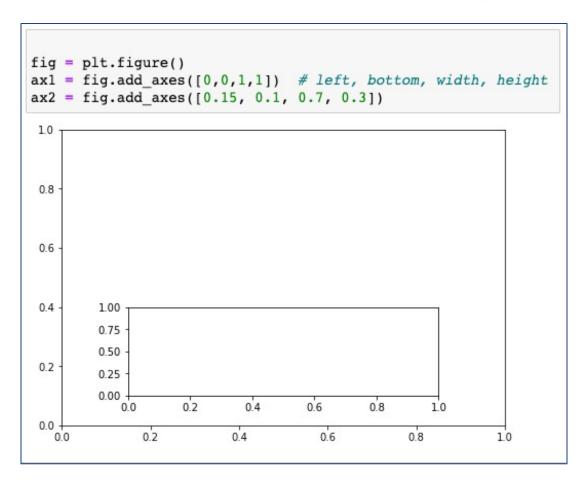
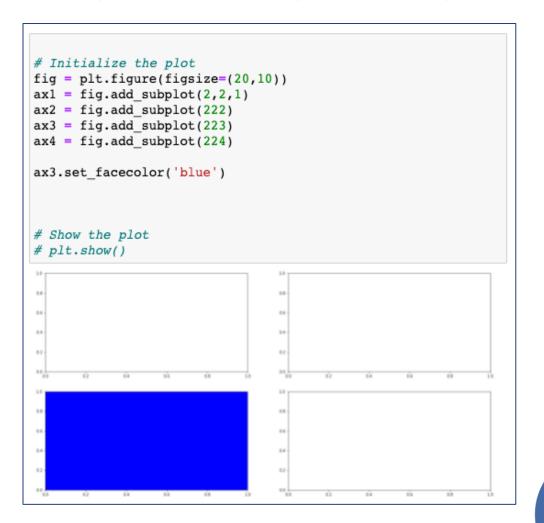


fig.add_subplot: for grid positioning



Subplots using pyplot

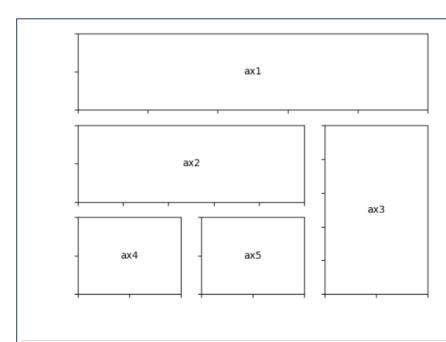
subplot	Add an Axes to the current figure or retrieve an existing Axes
subplot2grid	Create a subplot at a specific location inside a regular grid.
subplot_mosaic	Build a layout of Axes based on ASCII art or nested lists.
subplot_tool	Launch a subplot tool window for a figure.
subplots	Create a figure and a set of subplots.
subplots_adjust	Adjust the subplot layout parameters.

```
plt.subplot(221)
# equivalent but more general
ax1 = plt.subplot(2, 2, 1)
# add a subplot with no frame
ax2 = plt.subplot(222, frameon=False)
# add a polar subplot
plt.subplot(223, projection='polar')
# add a red subplot that shares the x-axis with ax1
plt.subplot(224, sharex=ax1, facecolor='red')
# delete ax2 from the figure
plt.delaxes(ax2)
# add ax2 to the figure again
plt.subplot(ax2)
# make the first axes "current" again
plt.subplot(221)
```

```
# First create some toy data:
x = np.linspace(0, 2*np.pi, 400)
y = np.sin(x**2)
# Create just a figure and only one subplot
fig, ax = plt.subplots()
ax.plot(x, y)
ax.set_title('Simple plot')
# Create two subplots and unpack the output array immediately
f, (ax1, ax2) = plt.subplots(1, 2, sharey=True)
ax1.plot(x, y)
ax1.set_title('Sharing Y axis')
ax2.scatter(x, y)
# Create four polar axes and access them through the returned array
fig, axs = plt.subplots(2, 2, subplot_kw=dict(projection="polar"))
axs[0, 0].plot(x, y)
axs[1, 1].scatter(x, y)
# Share a X axis with each column of subplots
plt.subplots(2, 2, sharex='col')
# Share a Y axis with each row of subplots
plt.subplots(2, 2, sharey='row')
# Share both X and Y axes with all subplots
plt.subplots(2, 2, sharex='all', sharey='all')
# Note that this is the same as
plt.subplots(2, 2, sharex=True, sharey=True)
# Create figure number 10 with a single subplot
# and clears it if it already exists.
fig, ax = plt.subplots(num=10, clear=True)
```

Subplots using pyplot

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```
import matplotlib.pyplot as plt

def annotate_axes(fig):
    for i, ax in enumerate(fig.axes):
        ax.text(0.5, 0.5, "ax%d" % (i+1), va="center", ha="center")
        ax.tick_params(labelbottom=False, labelleft=False)

fig = plt.figure()
ax1 = plt.subplot2grid((3, 3), (0, 0), colspan=3)
ax2 = plt.subplot2grid((3, 3), (1, 0), colspan=2)
ax3 = plt.subplot2grid((3, 3), (1, 2), rowspan=2)
ax4 = plt.subplot2grid((3, 3), (2, 0))
ax5 = plt.subplot2grid((3, 3), (2, 1))
annotate_axes(fig)
plt.show()
```

from the documentation 14

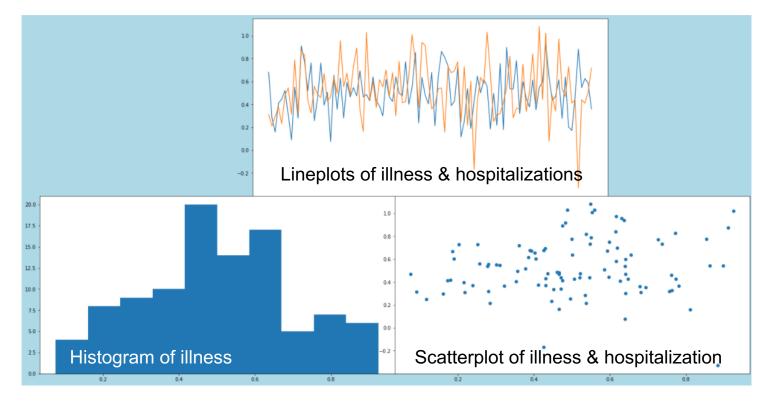
Seaborn

Seaborn

- Seaborn is a library for making statistical graphics in Python.
- It builds on top of matplotlib and integrates closely with pandas data structures.
- Seaborn plotting functions operate on dataframes and arrays containing whole datasets and internally perform the necessary semantic mapping and statistical aggregation to produce informative plots.
- Its dataset-oriented, declarative API lets you focus on what the different elements of your plots mean, rather than on the details of how to draw them.

Day 2 Warm-up. 8:30 – 8:55

- In CoLab, open the notebook named Day 2 Warm-up.
- The imports and data are already in place.
- Recreate the figure shown here.
- Improve the figure
 - Add legends
 - Make sure there is a little space between each plot
 - Add titles to each plot
 - Add a figure level title
- On the scatterplot, use:
 - change the size of the mark based on duration
 - change the color of the mark based on the disease
 - (diseases are just numbers 1-4)
 - Is it better to indicate the disease by shape?
- Add any other labels, titles, etc. that you think might clarify what is being shown.
- · Save the figure as a png. Download it to your machine.



Suggestion: Create each visual separately and then create a figure that holds all three.

Use the notebook from yesterday as reference. You will also need to use the matplotlib documentation.

Grammar of Graphics

