# 15.2\_Matplotlib

April 26, 2023

# 1 Introduction to Python for Open Source Geocomputation



• Instructor: Dr. Wei Kang

• Class Location and Time: ENV 336, Mon & Wed 12:30 pm - 1:50 pm

#### Content:

- What is Matplotlib?
- Options with Matplotlib
  - Different plot types
  - Styling
  - multiple plots
- Saving a plotted figure

# 2 What is Matplotlib?

- One of the most popular packages for quickly creating figures in python
- Many packages are built on top of and extending Matplotlib
  - Examples
    - \* pandas: Tabular data analysis and manipulation tool providing a .plot() API for Matplotlib plotting.
    - \* animatplot: Interactive animated plots.
    - \* seaborn: High-level interface for drawing attractive statistical graphics.
    - \* GeoPandas: Pandas extended to support geographical data, algorithms, and visualization
  - See a fuller list here

### 2.1 Installation of Matplotlib

From a terminal:

```
pip install matplotlib or
```

conda install matplotlib

matplotlib is included in conda installation, so our working environment should already have matplotlib installed.

#### 2.2 Support Many Different Types of Plots

- Basic plots: lines, scatter plot, bar plot
- image plots
- statistical plots: histogram, boxplot, pie
- 3D plots

```
[1]: from IPython.display import IFrame
IFrame(src="https://matplotlib.org/stable/plot_types/index.html", width=1000, uheight=550)
```

[1]: <IPython.lib.display.IFrame at 0x7f9ec97f99a0>

#### 2.3 Creating a simple figure in Matplotlib

Two interfaces for plotting with Matplotlib

- implicit interface:
  - procedural approach
  - inspired by and modeled on MATLAB
  - uses an global state-based interface which is is encapsulated in the pyplot module to plot to the "current Axes"
  - use functions
  - See the pyplot tutorials for a more in-depth look at the pyplot interface.
- explicit interface:
  - object-oriented (OO) interface
  - directly utilize instances of axes.Axes to build up the visualization in an instance of figure.Figure
  - use methods associated with instances of classes axes. Axes and figure. Figure

```
[2]: import matplotlib.pyplot as plt #import the pyplot module from matplotlib
```

```
[3]: dir(plt)
```

```
'Axes',
'Button',
'Circle',
'Enum',
'ExitStack',
'Figure',
'FigureBase',
'FigureCanvasBase',
'FigureManagerBase',
'FixedFormatter',
'FixedLocator',
'FormatStrFormatter',
'Formatter',
'FuncFormatter',
'GridSpec',
'IndexLocator',
'Line2D',
'LinearLocator',
'Locator',
'LogFormatter',
'LogFormatterExponent',
'LogFormatterMathtext',
'LogLocator',
'MaxNLocator',
'MouseButton',
'MultipleLocator',
'Normalize',
'NullFormatter',
'NullLocator',
'Number',
'PolarAxes',
'Polygon',
'Rectangle',
'ScalarFormatter',
'Slider',
'Subplot',
'SubplotSpec',
'Text',
'TickHelper',
'Widget',
'_REPL_DISPLAYHOOK',
'_ReplDisplayHook',
'__builtins__',
'__cached__',
'__doc__',
'__file__',
'__loader__',
```

```
'__name__',
'__package__',
'__spec__',
'_api',
'_auto_draw_if_interactive',
'_backend_mod',
'_copy_docstring_and_deprecators',
'_docstring',
'_draw_all_if_interactive',
'_get_backend_mod',
'_get_pyplot_commands',
'_get_required_interactive_framework',
'_interactive_bk',
'_log',
'_pylab_helpers',
'_warn_if_gui_out_of_main_thread',
'acorr',
'angle_spectrum',
'annotate',
'arrow',
'autoscale',
'autumn',
'axes',
'axhline',
'axhspan',
'axis',
'axline',
'axvline',
'axvspan',
'bar',
'bar_label',
'barbs',
'barh',
'bone',
'box',
'boxplot',
'broken_barh',
'cbook',
'cla',
'clabel',
'clf',
'clim',
'close',
'cm',
'cohere',
'color_sequences',
'colorbar',
```

```
'colormaps',
'connect',
'contour',
'contourf',
'cool',
'copper',
'csd',
'cycler',
'delaxes',
'disconnect',
'draw',
'draw_all',
'draw_if_interactive',
'errorbar',
'eventplot',
'figaspect',
'figimage',
'figlegend',
'fignum_exists',
'figtext',
'figure',
'fill',
'fill_between',
'fill_betweenx',
'findobj',
'flag',
'functools',
'gca',
'gcf',
'gci',
'get',
'get_backend',
'get_cmap',
'get_current_fig_manager',
'get_figlabels',
'get_fignums',
'get_plot_commands',
'get_scale_names',
'getp',
'ginput',
'gray',
'grid',
'hexbin',
'hist',
'hist2d',
'hlines',
'hot',
```

```
'hsv',
'importlib',
'imread',
'imsave',
'imshow',
'inferno',
'inspect',
'install_repl_displayhook',
'interactive',
'ioff',
'ion',
'isinteractive',
'jet',
'legend',
'locator_params',
'logging',
'loglog',
'magma',
'magnitude_spectrum',
'margins',
'matplotlib',
'matshow',
'minorticks_off',
'minorticks_on',
'mlab',
'new_figure_manager',
'nipy_spectral',
'np',
'pause',
'pcolor',
'pcolormesh',
'phase_spectrum',
'pie',
'pink',
'plasma',
'plot',
'plot_date',
'polar',
'prism',
'psd',
'quiver',
'quiverkey',
'rc',
'rcParams',
'rcParamsDefault',
'rcParamsOrig',
'rc_context',
```

```
'rcdefaults',
'rcsetup',
're',
'register_cmap',
'rgrids',
'savefig',
'sca',
'scatter',
'sci',
'semilogx',
'semilogy',
'set_cmap',
'set_loglevel',
'setp',
'show',
'specgram',
'spring',
'spy',
'stackplot',
'stairs',
'stem',
'step',
'streamplot',
'style',
'subplot',
'subplot2grid',
'subplot_mosaic',
'subplot_tool',
'subplots',
'subplots_adjust',
'summer',
'suptitle',
'switch_backend',
'sys',
'table',
'text',
'thetagrids',
'threading',
'tick_params',
'ticklabel_format',
'tight_layout',
'time',
'title',
'tricontour',
'tricontourf',
'tripcolor',
'triplot',
```

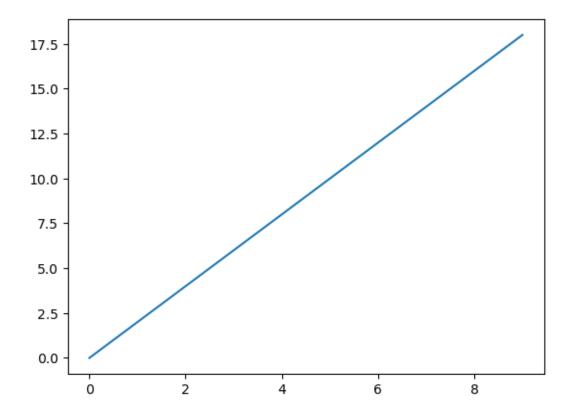
```
'twinx',
      'twiny',
      'uninstall_repl_displayhook',
      'violinplot',
      'viridis',
      'vlines',
      'waitforbuttonpress',
      'winter',
      'xcorr',
      'xkcd',
      'xlabel',
      'xlim',
      'xscale',
      'xticks',
      'ylabel',
      'ylim',
      'yscale',
      'yticks']
[4]: import numpy as np
[5]: x = np.arange(10)
     y = x * 2
[6]: x
[6]: array([0, 1, 2, 3, 4, 5, 6, 7, 8, 9])
[7]: y
[7]: array([0, 2, 4, 6, 8, 10, 12, 14, 16, 18])
```

#### Explicit interface This interface works by

- instantiating an instance of a Figure class (fig below)
- using a method subplots method (or similar) on that object to create one or more Axes objects (ax below)
- then calling drawing methods on the Axes (plot in this example)

```
[8]: fig, ax = plt.subplots() # Create a figure containing a single axes.
ax.plot(x, y) # Plot some data on the axes.
```

[8]: [<matplotlib.lines.Line2D at 0x7f9eb81b8280>]

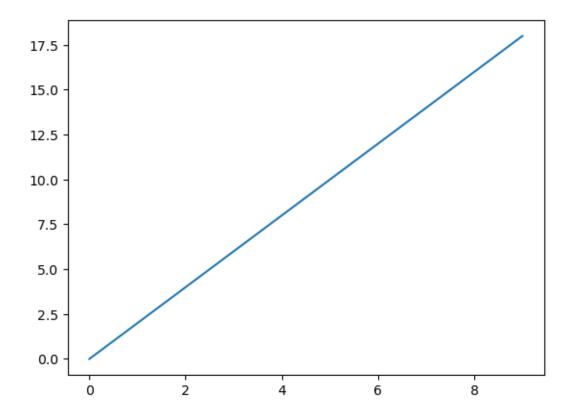


## implicit interface

- shadows most of the Axes plotting methods to give the equivalent of the above
- the creation of the Figure and Axes is done for the user

```
[9]: plt.plot(x,y)
```

[9]: [<matplotlib.lines.Line2D at 0x7f9e881b3d00>]



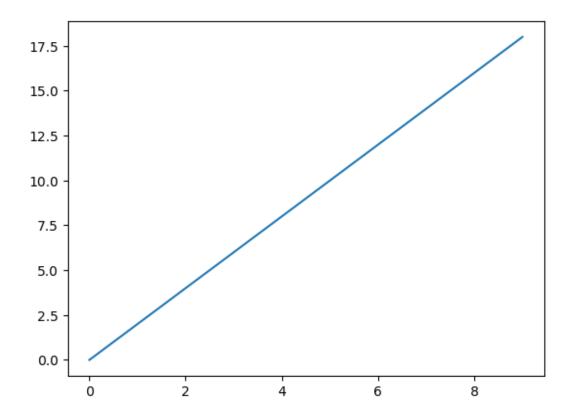
### 2.4 Anatamy of a Matplotlib Figure

#### 2.4.1 Figure and Axes

- Axes:
  - represent an individual plot
  - differnt from "axis", which refers to the x/y axis of a plot
- Figure: the final image that may contain 1 or more Axes
- Syntax for creating Figure and Axes
  - fig = plt.figure() # an empty figure with no Axes
  - fig, ax = plt.subplots() # a figure with a single Axes
  - fig, axs = plt.subplots(2, 2) # a figure with a 2x2 grid of Axes

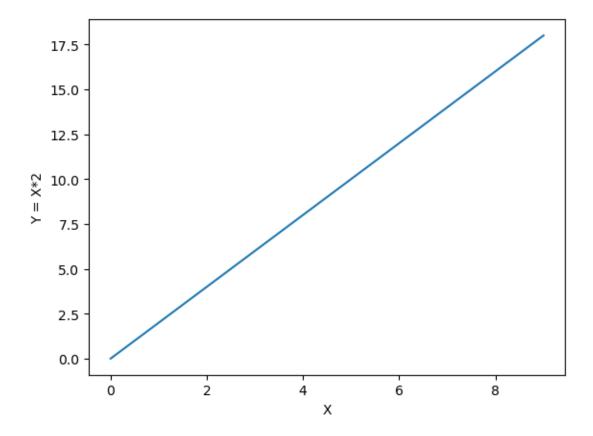
```
[10]: fig, ax = plt.subplots() # Create a figure containing a single axes.
ax.plot(x, y) # Plot some data on the axes.
```

[10]: [<matplotlib.lines.Line2D at 0x7f9e98c500a0>]



```
[11]: fig, ax = plt.subplots() # Create a figure containing a single axes.
ax.plot(x, y) # Plot some data on the axes.
ax.set_xlabel("X")
ax.set_ylabel("Y = X*2")
```

[11]: Text(0, 0.5, 'Y = X\*2')



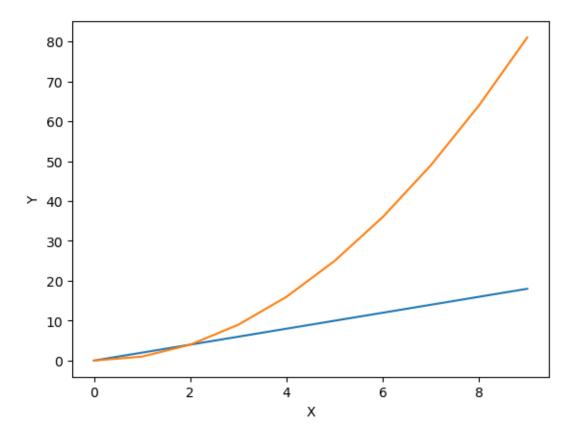
What it we want to add another line to the current plot?

```
[12]: fig, ax = plt.subplots() # Create a figure containing a single axes.
ax.plot(x, y) # Plot some data on the axes.

y2 = x ** 2
ax.plot(x, y2) # Plot some data on the axes.

ax.set_xlabel("X")
ax.set_ylabel("Y")
```

[12]: Text(0, 0.5, 'Y')



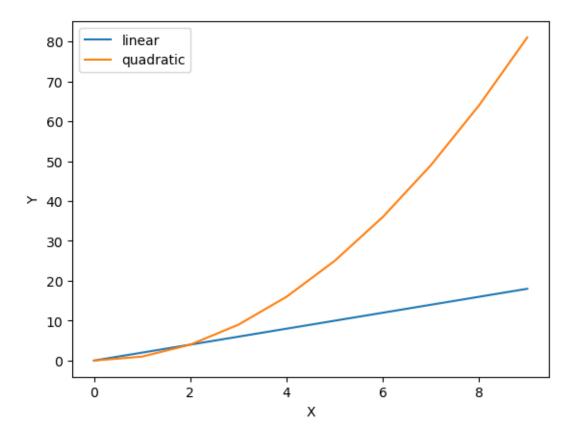
add legend to different different lines

```
fig, ax = plt.subplots() # Create a figure containing a single axes.
x = np.arange(10)
y = x * 2
ax.plot(x, y, label='linear')

y2 = x ** 2
ax.plot(x, y2, label='quadratic') # Plot some data on the axes.

ax.set_xlabel("X")
ax.set_ylabel("Y")
ax.legend()
```

[13]: <matplotlib.legend.Legend at 0x7f9e88221400>



add a third line

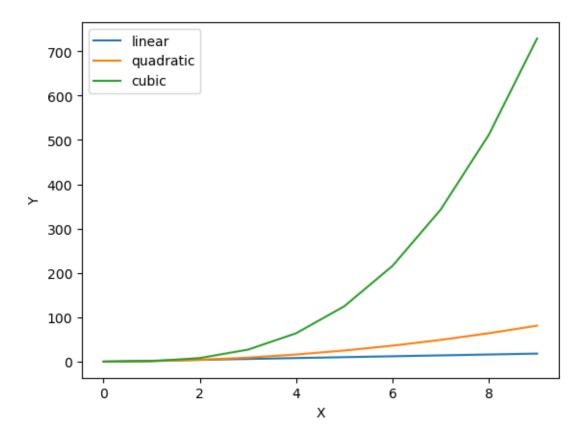
```
fig, ax = plt.subplots() # Create a figure containing a single axes.
x = np.arange(10)
y = x * 2
ax.plot(x, y, label='linear')

y2 = x ** 2
ax.plot(x, y2, label='quadratic') # Plot some data on the axes.

y3 = x ** 3
ax.plot(x, y3, label='cubic')

ax.set_xlabel("X")
ax.set_ylabel("Y")
ax.legend()
```

[14]: <matplotlib.legend.Legend at 0x7f9e98e21790>



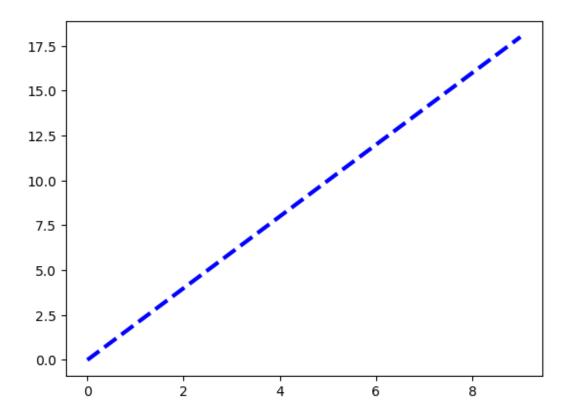
# 2.4.2 Styling Artists

Axes's plotting methods have styling options for:

- color
- linewidth
- linestyle

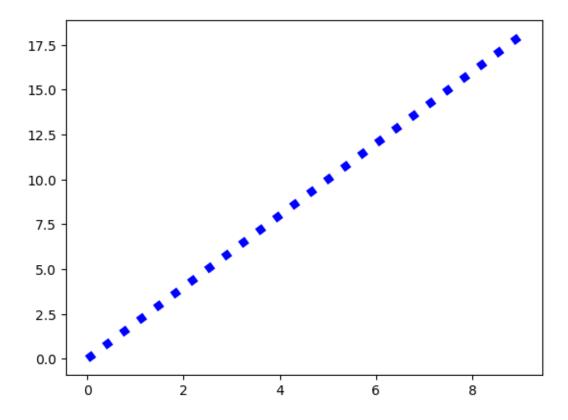
```
[15]: fig, ax = plt.subplots()
ax.plot(x, y, color='blue', linewidth=3, linestyle='--')
```

[15]: [<matplotlib.lines.Line2D at 0x7f9ec9dc6580>]



```
[16]: fig, ax = plt.subplots()
ax.plot(x, y, color='blue', linewidth=6, linestyle=':')
```

[16]: [<matplotlib.lines.Line2D at 0x7f9e991742e0>]



### 2.4.3 Group exercise

Edit the following python program to change the style (color, linewidth, linestyle) of the three plotted lines

```
fig, ax = plt.subplots()
x = np.arange(10)
y = x * 2
ax.plot(x, y, label='linear')

y2 = x ** 2
ax.plot(x, y2, label='quadratic')

y3 = x ** 3
ax.plot(x, y3, label='cubic')

ax.set_xlabel("X")
ax.set_ylabel("Y")
ax.legend()
```

when you are done, raise your hand!

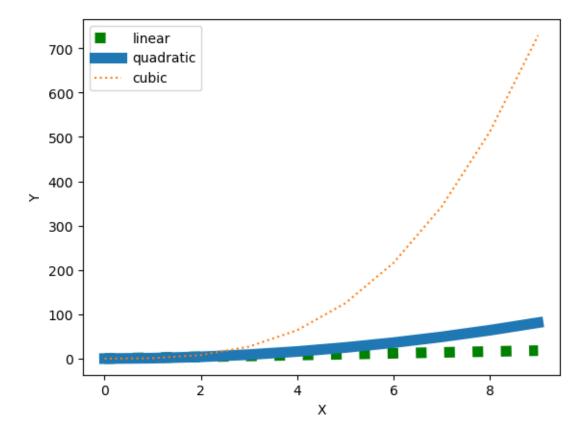
```
fig, ax = plt.subplots()
x = np.arange(10)
y = x * 2
ax.plot(x, y, label='linear', color="green", linewidth = 8, linestyle = "dotted")

y2 = x ** 2
ax.plot(x, y2, label='quadratic', linewidth = 8)

y3 = x ** 3
ax.plot(x, y3, label='cubic', linestyle = "dotted")

ax.set_xlabel("X")
ax.set_ylabel("Y")
ax.legend()
```

### [17]: <matplotlib.legend.Legend at 0x7f9ec9f10be0>



```
[18]: fig, ax = plt.subplots()
x = np.arange(10)
y = x * 2
```

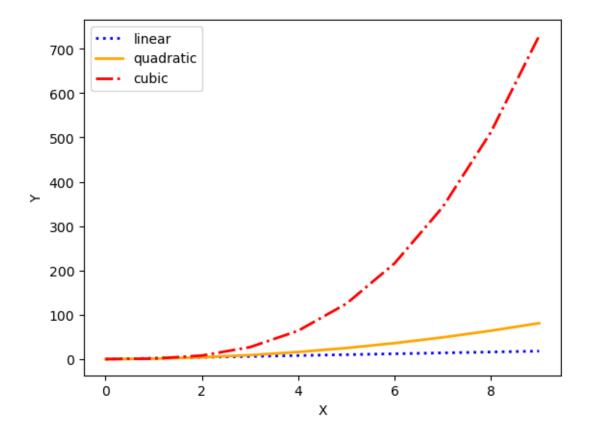
```
ax.plot(x, y, label='linear', color='blue', linewidth=2, linestyle=':')

y2 = x ** 2
ax.plot(x, y2, label='quadratic',color='orange', linewidth=2, linestyle='-')

y3 = x ** 3
ax.plot(x, y3, label='cubic',color='red', linewidth=2, linestyle='dashdot')

ax.set_xlabel("X")
ax.set_ylabel("Y")
ax.legend()
```

[18]: <matplotlib.legend.Legend at 0x7f9ec9f5c7c0>



### 2.5 multiple plots (Axes) in one figure

When to use multiple plots instead of one

- the two plots are on different scales
  - linear: range [0,9]
  - cubic: range [0, 800]

How?

• Create a figure containing two axes.

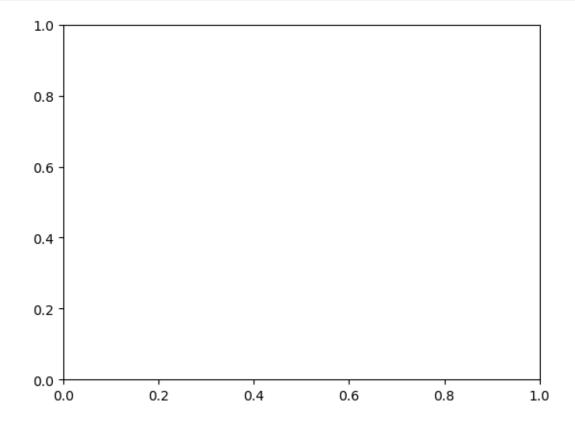
fig, axes = plt.subplots(1,2)

• Create a figure containing four axes.

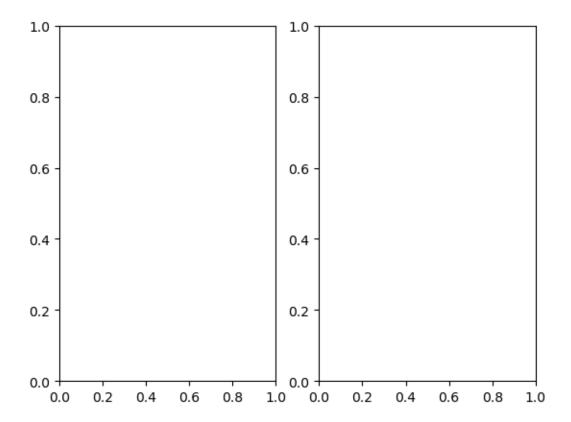
fig, axes = plt.subplots(2,2) (2 rows and 2 columns)

fig, axes = plt.subplots(1,4) (1 row and 4 columns)

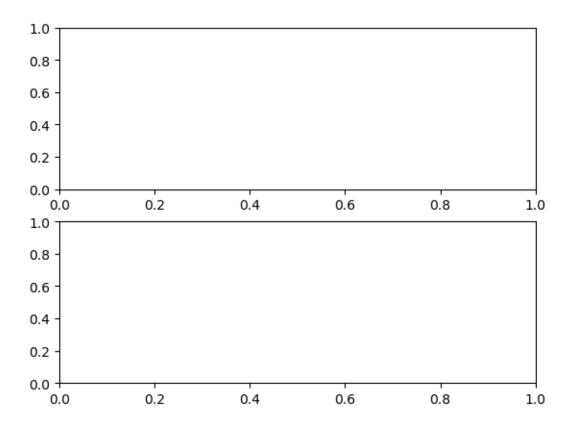
[19]: fig, axes = plt.subplots()



[20]: fig, axes = plt.subplots(1,2) # Create a figure containing two axes.

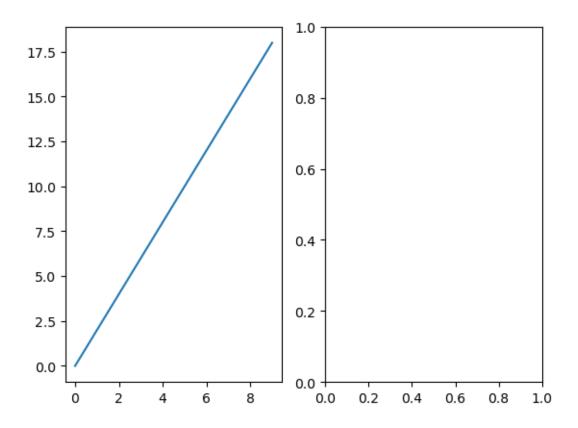


[21]: fig, axes = plt.subplots(2,1)



```
[22]: fig, axes = plt.subplots(1,2) # Create a figure containing two axes.
ax1 = axes[0]
ax1.plot(x,y)
```

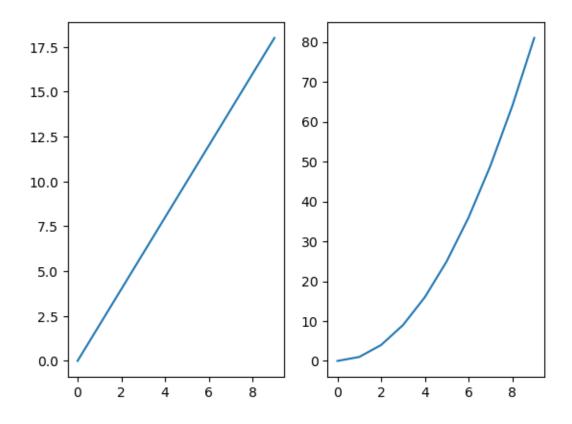
[22]: [<matplotlib.lines.Line2D at 0x7f9ec9ffb4c0>]



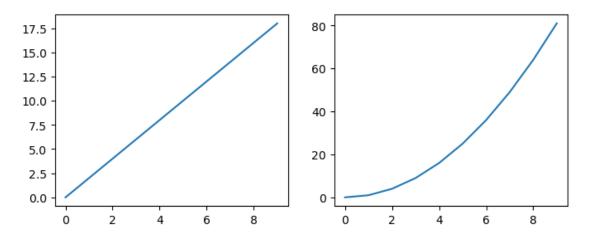
```
[23]: fig, axes = plt.subplots(1,2) # Create a figure containing two axes.
ax1 = axes[0]
ax1.plot(x,y)

ax2 = axes[1]
ax2.plot(x,x**2)
```

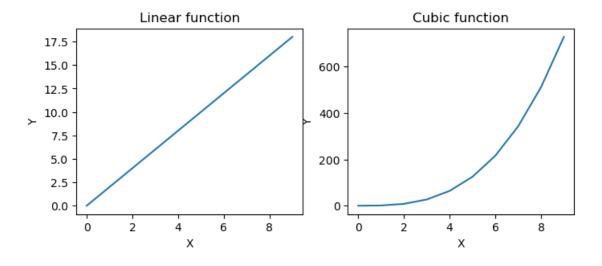
[23]: [<matplotlib.lines.Line2D at 0x7f9e993b9040>]



[24]: [<matplotlib.lines.Line2D at 0x7f9ea9794f70>]

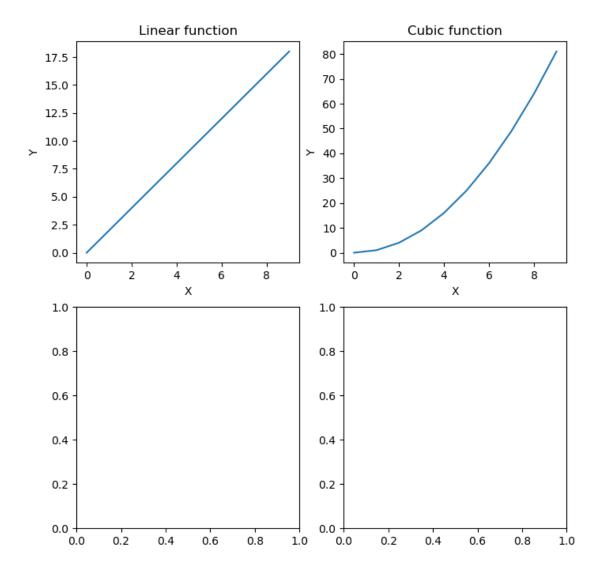


#### [25]: Text(0.5, 1.0, 'Cubic function')



```
ax2.set_ylabel("Y")
ax2.set_title("Cubic function")
```

### [26]: Text(0.5, 1.0, 'Cubic function')

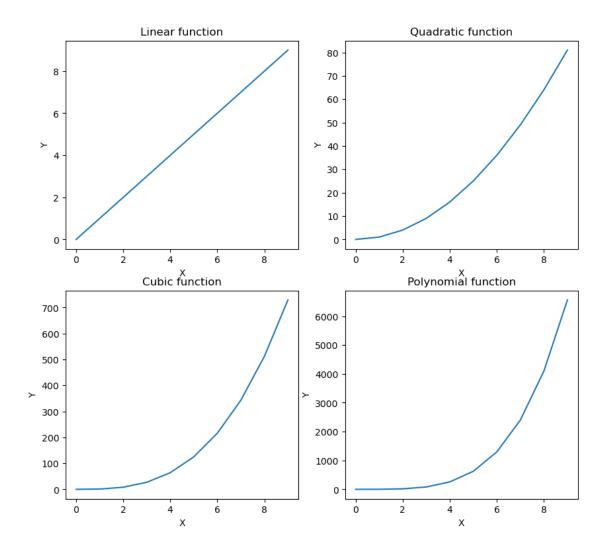


```
ax2 = axes[0,1]
ax2.plot(x,x**2)
ax2.set_xlabel("X")
ax2.set_ylabel("Y")
ax2.set_title("Quadratic function")

ax3 = axes[1,0]
ax3.plot(x,x**3)
ax3.set_xlabel("X")
ax3.set_ylabel("Y")
ax3.set_title("Cubic function")

ax4 = axes[1,1]
ax4.plot(x,x**4)
ax4.set_xlabel("X")
ax4.set_ylabel("Y")
ax4.set_ylabel("Y")
ax4.set_ylabel("Y")
```

[27]: Text(0.5, 1.0, 'Polynomial function')



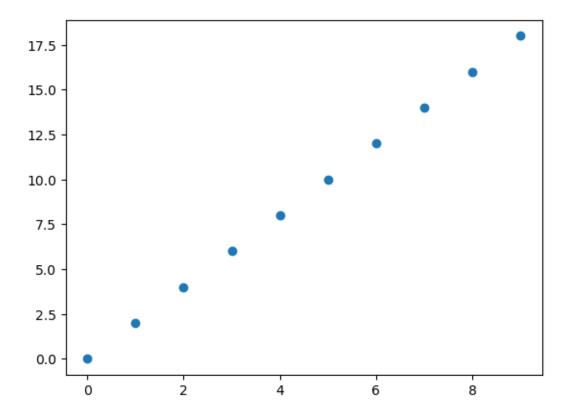
## 2.6 Scatter plot

axes.scatter()

- marker size s=None
- marker colors c=None
- marker style marker=None

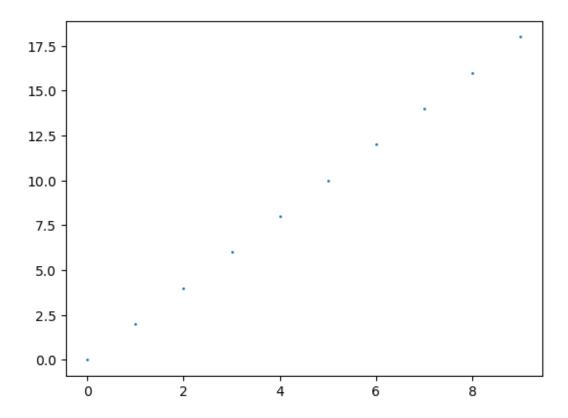
```
[28]: fig, ax = plt.subplots()
ax.scatter(x,y)
```

[28]: <matplotlib.collections.PathCollection at 0x7f9ea98d5fa0>



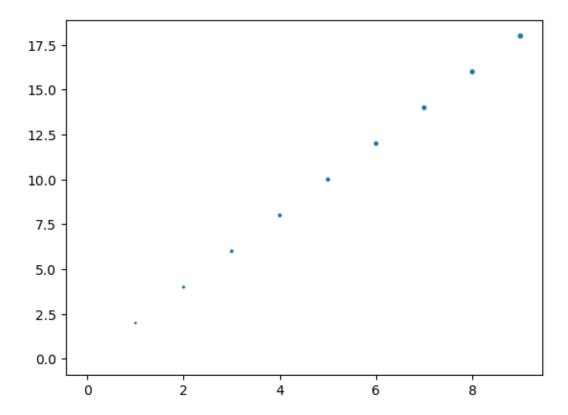
```
[29]: fig, ax = plt.subplots()
ax.scatter(x,y, s=1)
```

[29]: <matplotlib.collections.PathCollection at 0x7f9eca4395b0>



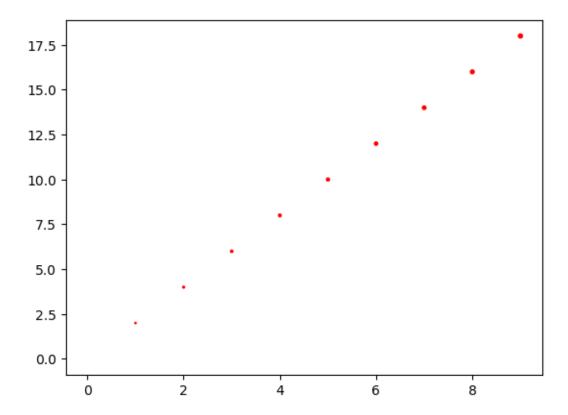
```
[30]: fig, ax = plt.subplots()
ax.scatter(x,y, s=np.arange(10))
```

[30]: <matplotlib.collections.PathCollection at 0x7f9eb84faa60>



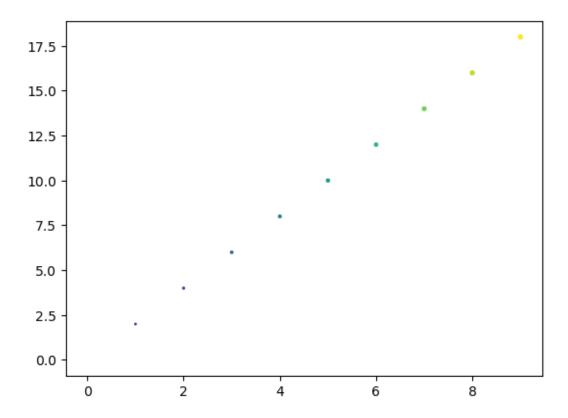
```
[31]: fig, ax = plt.subplots()
ax.scatter(x,y, s=np.arange(10),c="red")
```

[31]: <matplotlib.collections.PathCollection at 0x7f9e7830fb20>



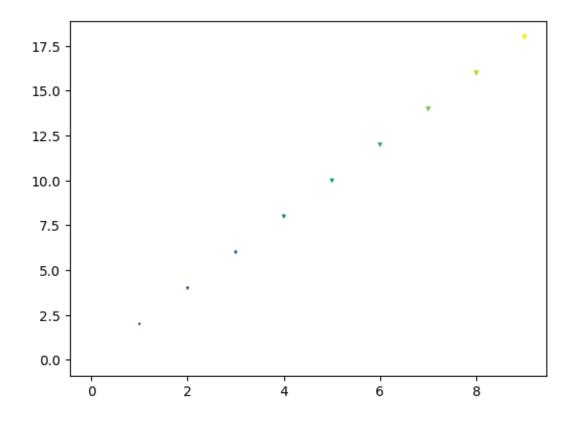
```
[32]: fig, ax = plt.subplots()
ax.scatter(x,y, s=np.arange(10),c=np.arange(10))
```

[32]: <matplotlib.collections.PathCollection at 0x7f9e98eb5790>



```
[33]: fig, ax = plt.subplots() ax.scatter(x,y, s=np.arange(10),c=np.arange(10), marker="v")
```

[33]: <matplotlib.collections.PathCollection at 0x7f9ea9ab0fd0>

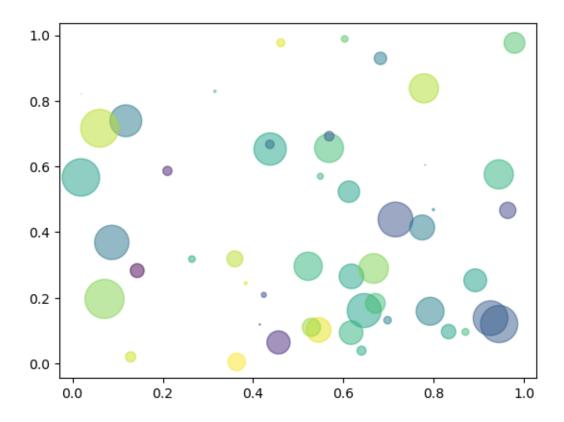


```
import numpy as np
import matplotlib.pyplot as plt

# Fixing random state for reproducibility
np.random.seed(0)

N = 50
x = np.random.rand(N)
y = np.random.rand(N)
colors = np.random.rand(N)
area = (30 * np.random.rand(N))**2 # 0 to 15 point radii
fig, ax = plt.subplots()
ax.scatter(x, y, s=area, c=colors, alpha=0.5)
```

[34]: <matplotlib.collections.PathCollection at 0x7f9e884fd280>



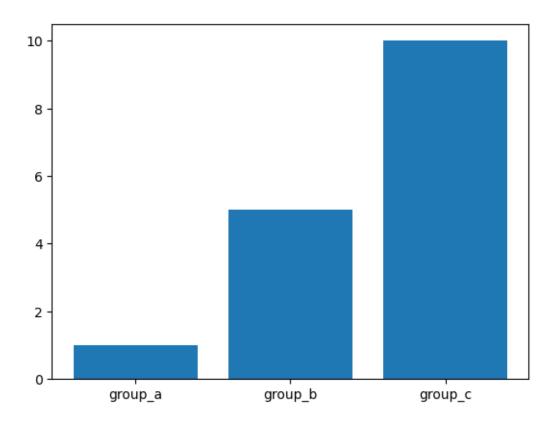
### 2.7 bar plot for categorical variables

axes.bar(): a vertical bar plot.

axes.barh(): a horizontal bar plot.

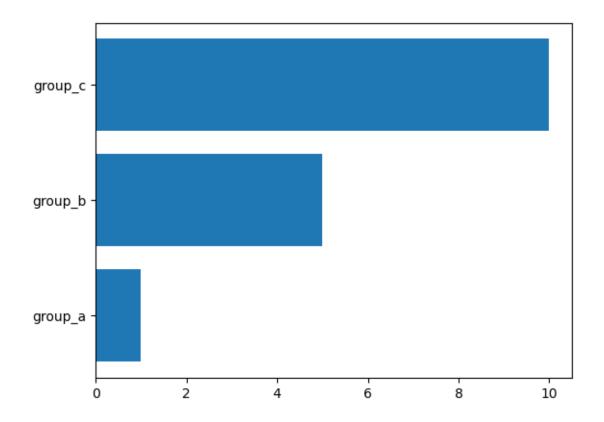
```
[35]: names = ['group_a', 'group_b', 'group_c']
values = [1, 5, 10]
fig, ax = plt.subplots()
ax.bar(names, values)
```

[35]: <BarContainer object of 3 artists>



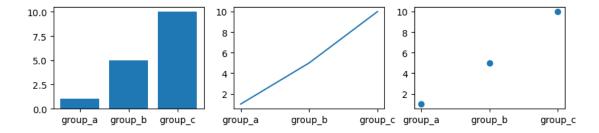
```
[36]: names = ['group_a', 'group_b', 'group_c']
values = [1, 5, 10]
fig, ax = plt.subplots()
ax.barh(names, values)
```

[36]: <BarContainer object of 3 artists>



```
[37]: names = ['group_a', 'group_b', 'group_c']
values = [1, 5, 10]
fig, axes = plt.subplots(1,3, figsize=(10,2))
axes[0].bar(names, values)
axes[1].plot(names, values)
axes[2].scatter(names, values)
```

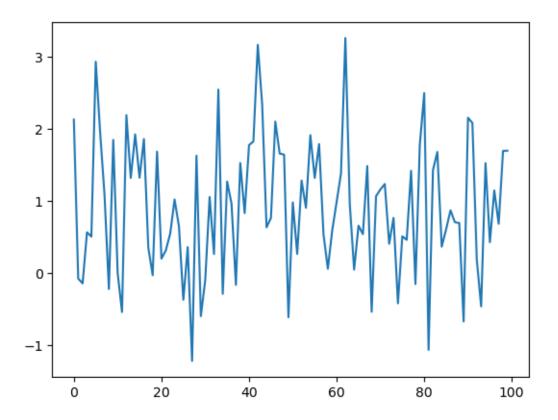
[37]: <matplotlib.collections.PathCollection at 0x7f9e8857ffd0>



## 2.8 Distributions and Densities

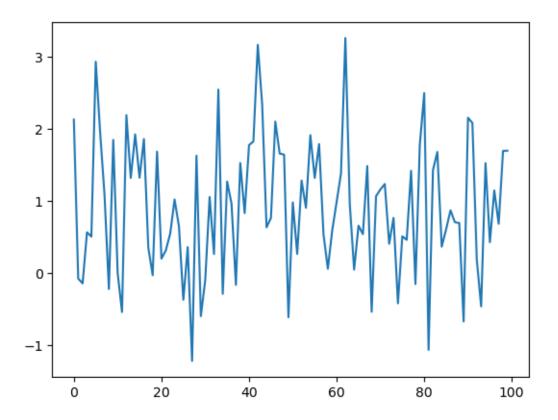
```
[38]: import numpy as np
      x = np.random.normal(1,1,100)
[39]: x
[39]: array([ 2.12663592e+00, -7.99315084e-02, -1.47468652e-01,
                                                                 5.62179955e-01,
              5.01967549e-01,
                               2.92953205e+00,
                                               1.94942081e+00,
                                                                 1.08755124e+00,
             -2.25435519e-01, 1.84436298e+00, -2.15347390e-04, -5.44771097e-01,
              2.18802979e+00, 1.31694261e+00,
                                                                 1.31872765e+00,
                                               1.92085882e+00,
              1.85683061e+00, 3.48974407e-01, -3.42428418e-02,
                                                                 1.68159452e+00,
              1.96590336e-01, 3.10450222e-01, 5.44467496e-01,
                                                                 1.01747916e+00,
              6.46006089e-01, -3.74951293e-01,
                                                3.56381597e-01, -1.22340315e+00,
              1.62523145e+00, -6.02057656e-01, -1.04383339e-01,
                                                                 1.05216508e+00,
              2.60437004e-01,
                               2.54301460e+00, -2.92856910e-01,
                                                                 1.26705087e+00,
              9.60717182e-01, -1.68093498e-01, 1.52327666e+00,
                                                                 8.28453669e-01,
              1.77179055e+00,
                              1.82350415e+00,
                                                3.16323595e+00,
                                                                 2.33652795e+00,
              6.30818162e-01,
                               7.60620822e-01,
                                                2.09965960e+00,
                                                                 1.65526373e+00,
              1.64013153e+00, -6.16956044e-01,
                                                9.75673876e-01,
                                                                 2.61969091e-01,
              1.27992460e+00,
                               9.01849610e-01,
                                                1.91017891e+00,
                                                                 1.31721822e+00,
              1.78632796e+00, 5.33580903e-01,
                                                5.55537441e-02,
                                                                 5.89950307e-01,
              9.82979586e-01, 1.37915174e+00,
                                                3.25930895e+00,
                                                                 9.57742848e-01,
              4.40549995e-02, 6.54018224e-01,
                                                5.36404025e-01,
                                                                 1.48148147e+00,
             -5.40797014e-01, 1.06326199e+00,
                                                1.15650654e+00,
                                                                 1.23218104e+00,
              4.02683931e-01, 7.62078270e-01, -4.24060909e-01,
                                                                 5.06680117e-01,
              4.57138524e-01,
                              1.41605005e+00, -1.56182432e-01,
                                                                 1.78119810e+00,
              2.49448454e+00, -1.06998503e+00,
                                                1.42625873e+00,
                                                                 1.67690804e+00,
              3.62562974e-01, 6.02728186e-01,
                                                8.67119422e-01,
                                                                 7.02209121e-01,
              6.90987031e-01, -6.76003806e-01,
                                                2.15233156e+00,
                                                                 2.07961859e+00,
              1.86635741e-01, -4.66424328e-01, 1.52106488e+00,
                                                                 4.24212030e-01,
              1.14195316e+00, 6.80671583e-01,
                                                                1.69474914e+00])
                                               1.69153875e+00,
[40]: fig, ax = plt.subplots()
      ax.plot(x)
```

[40]: [<matplotlib.lines.Line2D at 0x7f9e99354ca0>]



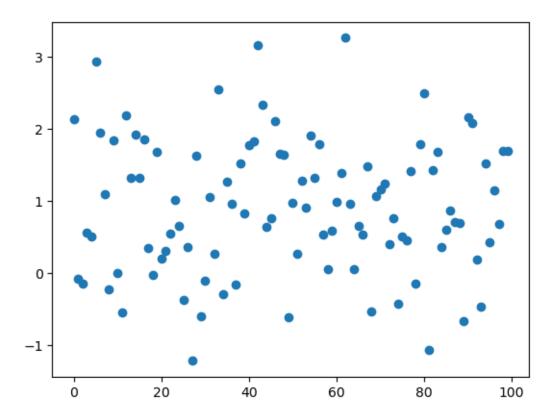
```
[41]: fig, ax = plt.subplots()
ax.plot(np.arange(100),x)
```

[41]: [<matplotlib.lines.Line2D at 0x7f9eb831d9d0>]



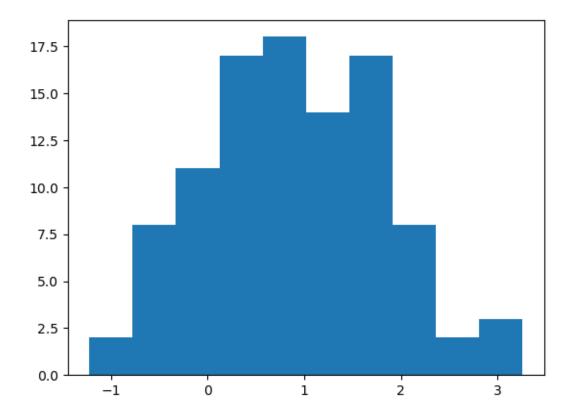
```
[42]: fig, ax = plt.subplots() ax.scatter(np.arange(100),x)
```

[42]: <matplotlib.collections.PathCollection at 0x7f9eca38d9a0>



<BarContainer object of 10 artists>)

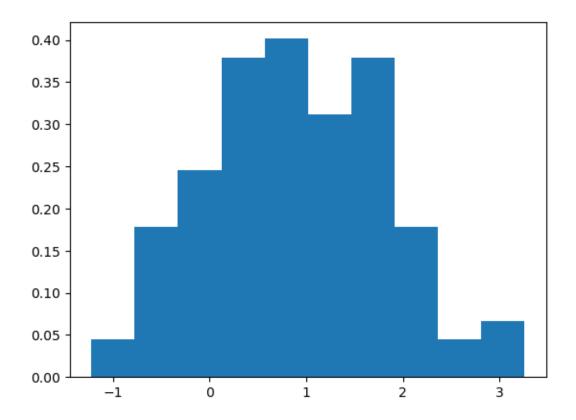
3.25930895]),



array([-1.22340315, -0.77513194, -0.32686073, 0.12141048, 0.56968169,

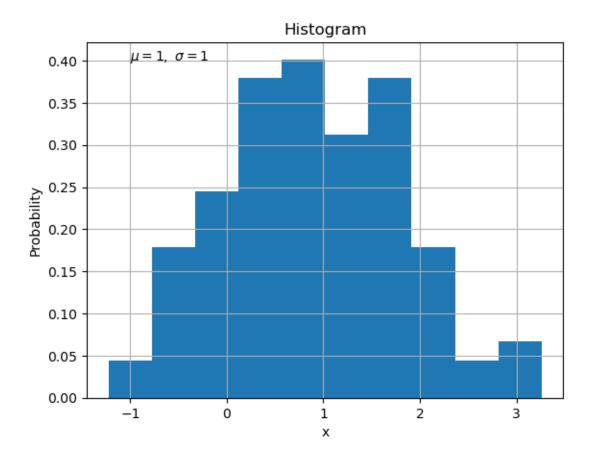
1.0179529 , 1.46622411, 1.91449532, 2.36276653, 2.81103774,

3.25930895]), <BarContainer object of 10 artists>)



```
[45]: ax.hist?

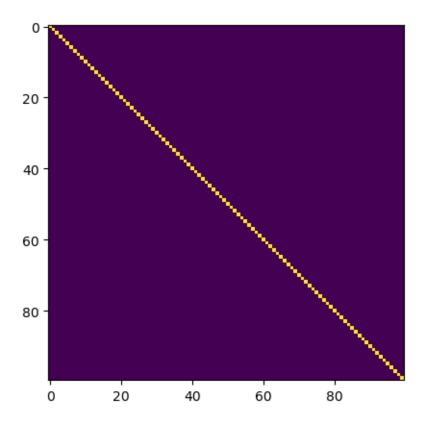
[46]: fig, ax = plt.subplots()
    ax.hist(x, density=True)
    ax.set_xlabel('x')
    ax.set_ylabel('Probability')
    ax.set_title('Histogram')
    ax.text(-1, .4, r'$\mu=1,\ \sigma=1$')
    ax.grid(True)
```



## 2.9 Image plotting

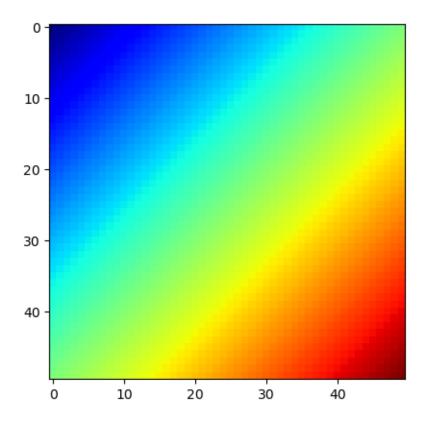
ax.imshow

[48]: <matplotlib.image.AxesImage at 0x7f9eaa1acac0>



```
[49]: dim = 50
    x_coords, y_coords = np.meshgrid(range(dim), range(dim), indexing='ij')
    beta_low = np.zeros((dim,dim))
    for i in range(x_coords.shape[0]):
        for j in range(x_coords.shape[1]):
            x = x_coords[i,j]
            y = y_coords[i,j]
            beta_low[i,j] = 1 + 1/24*(i+j)
[50]: fig, ax = plt.subplots()
    ax.imshow(beta_low,cmap="jet")
```

[50]: <matplotlib.image.AxesImage at 0x7f9e8867e220>

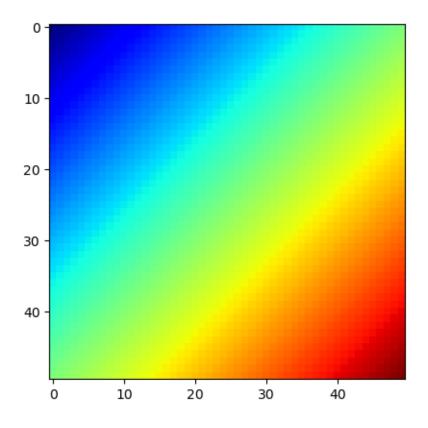


## 2.10 Saving a figure

plt.savefig()

Save the current figure.

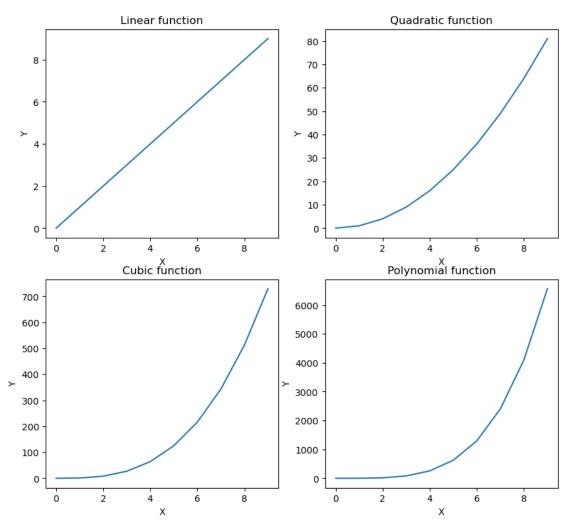
```
[51]: fig, ax = plt.subplots()
ax.imshow(beta_low,cmap='jet')
plt.savefig("image.png")
```



```
[52]: x = np.arange(10)
      fig, axes = plt.subplots(2,2,figsize=(10,9)) # Create a figure containing four_
      ⇔axes.
      ax1 = axes[0,0]
      ax1.plot(x,x)
      ax1.set_xlabel("X")
      ax1.set_ylabel("Y")
      ax1.set_title("Linear function")
      ax2 = axes[0,1]
      ax2.plot(x,x**2)
      ax2.set_xlabel("X")
      ax2.set_ylabel("Y")
      ax2.set_title("Quadratic function")
      ax3 = axes[1,0]
      ax3.plot(x,x**3)
      ax3.set_xlabel("X")
      ax3.set_ylabel("Y")
      ax3.set_title("Cubic function")
```

```
ax4 = axes[1,1]
ax4.plot(x,x**4)
ax4.set_xlabel("X")
ax4.set_ylabel("Y")
ax4.set_title("Polynomial function")

plt.savefig("functions_4.png",dpi=500)
```



There is a lot more to matplotlib. One can visit the gallery and pull examples in to get a sense of what is possible, and how to adapt examples for your own purposes.