

#### Quick start Steve Nouri

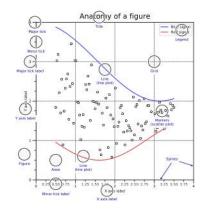
import numpy as np import matplotlib as mpl import matplotlib.pyplot as plt

X = np.linspace(0, 2\*np.pi, 100)Y = np.cos(X)

fig, ax = plt.subplots() ax.plot(X,Y,color='C1')

fig.savefig("figure.pdf") fig.show()

#### Anatomy of a figure



### Subplots layout

subplot[s](cols,rows,...) fig, axs = plt.subplots(3,3)G = gridspec(cols,rows,...) [22] ax = G[0,:]

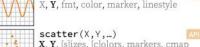


# ax=d.new\_horizontal('10%')

#### Getting help

- matplotlib.org
- O discourse.matplotlib.org
- ₩ gitter.im/matplotlib
- Matplotlib users mailing list

#### Basic plots

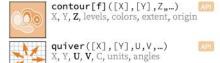


plot([X],Y,[fmt],...)

X, Y, [s]izes, [c]olors, markers, cmap







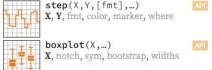




### fill[\_between][x]( ... ) X, Y1, Y2, color, where

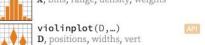
#### Advanced plots

API



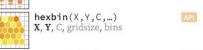
H.T.		
<b>!</b>	errorbar(X,Y,xerr,yerr,) X,Y,xerr,yerr,fmt	

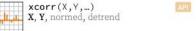








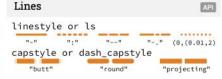


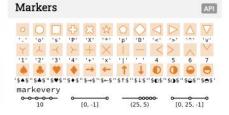


#### Scales ax.set\_[xy]scale(scale,...) MAAAAAAA linear log any values values > 0 symlog logit 0 < values < 1 any values Projections











Colorma	A	

plt.get\_cmap(name)

Qualitative

Cyclic



Steve Nour twilight

coolwarm

tab10

### Event handling

Tick locators

ticker.NullLocator()

ticker.AutoLocator()

Tick formatters

ticker.NullFormatter()

ticker.ScalarFormatter()

Ornaments

ax.legend(...)

Legend -

ax.colorbar(...)

0.2

from matplotlib import ticker

ticker.MaxNLocator(n=4)

from matplotlib import ticker

ticker.MultipleLocator(0.5)

ticker.FixedLocator([0, 1, 5])

ticker.LinearLocator(numticks=3)

ticker.IndexLocator(base=0.5, offset=0.25) 0.25 0.75 1.25 1.75 2.25 2.75 3.25 3.75

ticker.LogLocator(base=10, numticks=15)

ax.[xy]axis.set\_[minor|major]\_formatter(formatter)

ticker.FuncFormatter(lambda x, pos: "[%.2f]" % x)

ticker.FixedFormatter(['', '0', '1', ...])

ticker.FormatStrFormatter('>%d<')

ticker.StrMethodFormatter('{x}')

ticker.PercentFormatter(xmax=5)

handles, labels, loc, title, frameon

Label 1

Label 2

mappable, ax, cax, orientation

0.3 0.4

0.5

Label 3

Label 4

0.6 0.7 0.8

ax.[xy]axis.set\_[minor|major]\_locator(locator)

fig, ax = plt.subplots() def on\_click(event): print(event) fig.canvas.mpl\_connect( 'button\_press\_event', on\_click)

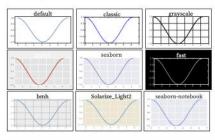
### Animation

import matplotlib.animation as mpla

```
T = np.linspace(0,2*np.pi,100)
S = np.sin(T)
line, = plt.plot(T, S)
def animate(i):
  line.set_ydata(np.sin(T+i/50))
anim = mpla.FuncAnimation(
  plt.gcf(), animate, interval=5)
plt.show()
```

#### Styles

plt.style.use(style)



#### **Ouick** reminder

ax.grid() ax.patch.set\_alpha(0) ax.set [xy]lim(vmin, vmax) ax.set\_[xy]label(label) ax.set\_[xy]ticks(list) ax.set\_[xy]ticklabels(list) ax.set\_[sup]title(title) ax.tick\_params(width=10, ...) ax.set\_axis\_[on|off]()

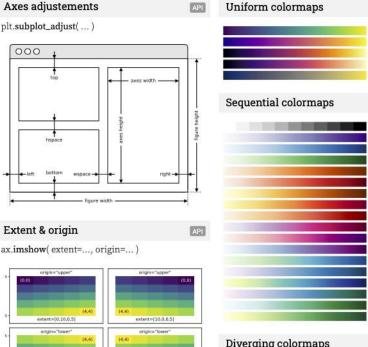
ax.tight\_layout() plt.gcf(), plt.gca() mpl.rc('axes', linewidth=1, ...) fig.patch.set\_alpha(0) text=r'\$\frac{-e^{i\pi}}{2^n}\$'

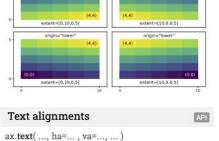
### Keyboard shortcuts

ctrl + s Save ctrl + w Close plot r Reset view f Fullscreen 0/1 f View forward b View back p Pan view O Zoom to rect x X pan/zoom y Y pan/zoom g Minor grid 0/1 G Major grid 0/1 X axis log/linear Y axis log/linear

### Ten Simple Rules

- 1. Know Your Audience
- 2. Identify Your Message
- 3. Adapt the Figure
- 4. Captions Are Not Optional
- 5. Do Not Trust the Defaults
- 6. Use Color Effectively
- 7. Do Not Mislead the Reader
- 8. Avoid "Chartiunk"
- 9. Message Trumps Beauty 10. Get the Right Tool





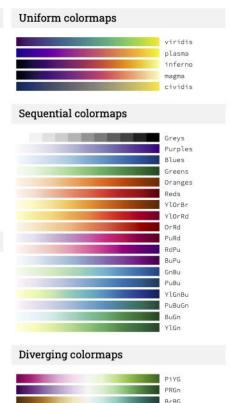


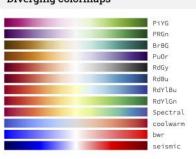


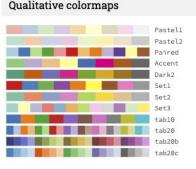
Text parameters	API	
ax.text(, family= , size=, ax.text(, fontproperties =		
The quick brown fox	xx~large	(1.73)
The quick brown fox	x-large	(1.44)
The quick brown fox	large	(1.20)
The quick brown fox	medium	
The quick brown fox The quick brown fox	x-small	(0.83) (0.69)

The quick brown fox	medium (1.00)
The guick brown fox	small (0.83)
The quick brown for	x-small (0.69)
The quick brown tax	xx-small (0.58)
The quick brown fox jumps over the lazy dog	black (900)
The quick brown fox jumps over the lazy dog	bold (700)
The quick brown fox jumps over the lazy dog	semibold (600)
The quick brown fox jumps over the lazy dog	normal (400)
The quick brown fox jumps over the lazy dog	ultralight (180)
The quick brown fox jumps over the l	azy dog monospace
The quick brown fox jumps over the lazy dog	serif

The quick provint fox jumps over the last dog	doicy promition lamps over the last dog a cera eight (		ragine (200)	
The quick brown fox jumps over the	lazy	dog	monospace	
The quick brown fox jumps over the lazy dog			serif	
The quick brown fox jumps over the lazy dog			sans	
The quick brown fox jumps over the lazy dog			cursive	
The quick brown fox jumps over the lazy dog			italic	
The quick brown fox jumps over the lazy dog			normal	
THE QUICK BROWN FOX JUMPS OVER THE LAZY DOG			small-caps	
The quick brown for jumps over the lazy dog			porma1	

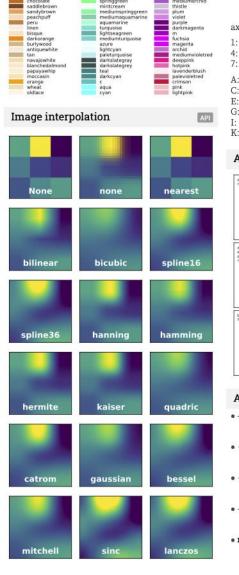


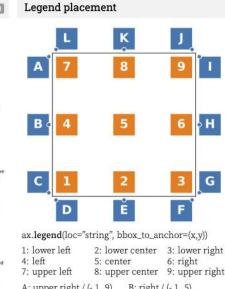


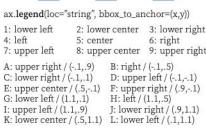


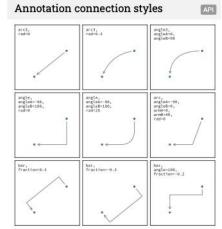


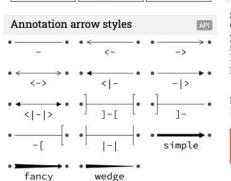






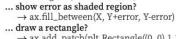






#### How do I ... ... resize a figure? → fig.set\_size\_inches(w,h) ... save a figure? → fig.savefig("figure.pdf") ... save a transparent figure? → fig.savefig("figure.pdf", transparent=True) ... clear a figure?





 $\rightarrow$  ax.add\_patch(plt.Rectangle((0, 0),1,1) ... draw a vertical line?

 $\rightarrow$  ax.axvline(x=0.5) ... draw outside frame?

→ ax.plot(..., clip\_on=False)

... use transparency? → ax.plot(..., alpha=0.25)

... convert an RGB image into a gray image?  $\rightarrow$  gray = 0.2989\*R+0.5870\*G+0.1140\*B

... set figure background color? → fig.patch.set\_facecolor("grey")

... get a reversed colormap? → plt.get\_cmap("viridis\_r")

... get a discrete colormap?  $\rightarrow$  plt.get\_cmap("viridis", 10)

... show a figure for one second?

→ fig.show(block=False), time.sleep(1)

### Performance tips

scatter(X, Y) slow plot(X, Y, marker="o", ls="") fast for i in range(n): plot(X[i]) slow plot(sum([x+[None] for x in X],[])) fast cla(), imshow(...), canvas.draw() slow im.set\_data(...), canvas.draw()

#### Beyond Matplotlib

Seaborn: Statistical Data Visualization Cartopy: Geospatial Data Processing yt: Volumetric data Visualization mpld3: Bringing Matplotlib to the browser Datashader: Large data processing pipeline plotnine: A Grammar of Graphics for Python

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# Matplotlib for beginners

Matplotlib is a library for making 2D plots in Python. It is designed with the philosophy that you should be able to create simple plots with just a few commands:

### 1 Initialize

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

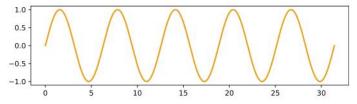
### 2 Prepare

```
X = np.linspace(0, 4*np.pi, 1000)
Y = np.sin(X)
```

### 3 Render

```
fig, ax = plt.subplots()
ax.plot(X, Y)
fig.show()
```

### 4 Observe

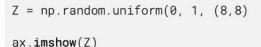


### Choose

Matplotlib offers several kind of plots (see Gallery):

```
X = np.random.uniform(0, 1, 100)
Y = np.random.uniform(0, 1, 100)
ax.scatter(X, Y)
```





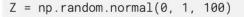


```
Z = np.random.uniform(0, 1, (8,8)
```

ax.contourf(Z)

```
Z = np.random.uniform(0, 1, 4)
```

ax.pie(Z)



ax.hist(Z)

X = np.arange(5)
Y = np.random.uniform(0,1,5)

ax.errorbar(X, Y, Y/4)

Z = np.random.normal(0,1,(100,3))

ax.boxplot(Z)

### Organize

You can plot several data on the the same figure but you can also split a figure in several subplots (named Axes):

```
X = np.linspace(0,10,100)
Y1, Y1 = np.sin(X), np.cos(X)
ax.plot(X, Y1, Y2)
```



```
fig, (ax1, ax2) = plt.subplots((2,1))
ax1.plot(X, Y1, color="C1")
ax2.plot(X, Y2, color="C0")
```



```
fig, (ax1, ax2) = plt.subplots((1,2))
ax1.plot(Y1, X, color="C1")
ax2.plot(Y2, X, color="C0")
```



## **Label** (everything)

```
ax.plot(X, Y)
fig.suptitle(None)
ax.set_title("A Sine wave")
```



```
ax.plot(X, Y)
ax.set_ylabel(None)
ax.set_xlabel("Time")
```



### **Explore**

Figures are shown with a graphical user interface that alllows to zoom and pan the figure, to navigate between the different views and to show the value under the mouse.

# Save (bitmap or vector format)

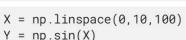
```
fig.savefig("my-first-figure.png", dpi=300)
fig.savefig("my-first-figure.pdf")
```

#### Tweak

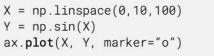
You can modify pretty much anything in a plot, including limits, colors, markers, line width and styles, ticks and ticks labels, titles, etc.

```
X = np.linspace(0,10,100)
Y = np.sin(X)
ax.plot(X, Y, color="black")
```

X = np.linspace(0,10,100)
Y = np.sin(X)
ax.plot(X, Y, linestyle="--")



ax.plot(X, Y, linewidth=5)

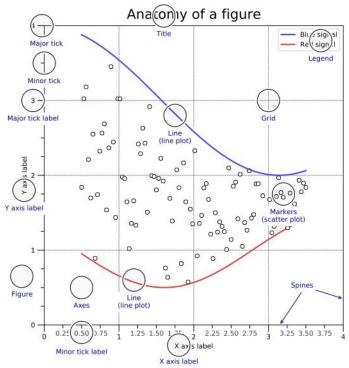




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# Matplotlib for intermediate users

that forms the actual figure. Each element can be modified.



### Figure, axes & spines



```
from mpl.ticker import MultipleLocator as ML
 from mpl.ticker import ScalarFormatter as SF
 ax.xaxis.set_minor_locator(ML(0.2))
 ax.xaxis.set_minor_formatter(SF())
 ax.tick_params(axis='x', which='minor', rotation=90)
0 0 0 0 0 1 1 1 1 1 1 2 2 2 2 2 3 3 2 5 5 6 6 6 4 4 4 4 4 4 5 5
```

### Lines & markers

```
X = np.linspace(0.1, 10*np.pi, 1000)
Y = np.sin(X)
ax.plot(X, Y, "C1o:", markevery=25, mec="1.0")
```

### **Scales & Projections**

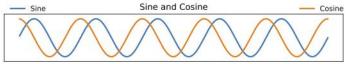
```
fig, ax = plt.subplots()
ax.set_xscale("log")
ax.plot(X, Y, "C1o-", markevery=25, mec="1.0")
```

### **Text & Ornaments**

```
ax.fill_betweenx([-1,1],[0],[2*np.pi])
ax.text(0, -1, r" Period $\Phi$")
```

### Legend

```
ax.plot(X, np.sin(X), "CO", label="Sine")
ax.plot(X, np.cos(X), "C1", label="Cosine")
ax.legend(bbox_to_anchor=(0,1,1,.1),ncol=2,
         mode="expand", loc="lower left")
```



### Annotation

```
ax.annotate("A", (X[250],Y[250]),(X[250],-1),
 ha="center", va="center", arrowprops =
 {"arrowstyle" : "->", "color": "C1"})
```

### Colors

Any color can be used but Matplotlib offers sets of colors:



### Size & DPI

Consider a square figure to be included in a two-columns A4 paper with 2cm margins on each side and a column separation of 1cm. The width of a figure is (21 - 2\*2 - 1)/2 = 8cm. One inch being 2.54cm, figure size should be 3.15×3.15 in.

```
fig = plt.figure(figsize=(3.15,3.15), dpi=50)
plt.savefig("figure.pdf", dpi=600)
```

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# Matplotlib tips & tricks

### Transparency

Scatter plots can be enhanced by using transparency (alpha) in order to show area with higher density and multiple scatter plots can be used to delineate a frontier.

```
X = np.random.normal(-1, 1, 500)
Y = np.random.normal(-1,1,500)
ax.scatter(X, Y, 50, "0.0", lw=2) # optional
ax.scatter(X, Y, 50, "1.0", lw=0) # optional
ax.scatter(X, Y, 40, "C1", lw=0, alpha=0.1)
```



#### Rasterization

If your figure is made of a lot graphical elements such as a huge scatter, you can rasterize them to save memory and keep other elements in vector format.

```
X = np.random.normal(-1, 1, 10_000)
Y = np.random.normal(-1, 1, 10_000)
ax.scatter(X, Y, rasterized=True)
fig.savefig("rasterized-figure.pdf", dpi=600)
```

### Offline rendering

Use the Agg backend to render a figure directly in an array.

```
from matplotlib.backends.backend_agg import FigureCanvas
canvas = FigureCanvas(Figure()))
... # draw som stuff
canvas.draw()
Z = np.array(canvas.renderer.buffer_rqba())
```

### Range of continuous colors

```
X = np.random.randn(1000, 4)
cmap = plt.get_cmap("Blues")
colors = [cmap(i) for in in [.2, .4, .6, .8]]
ax.hist(X, 2, histtype='bar', color=colors)
```



#### Text outline

Use text outline to make text more visible.

```
import matplotlib.patheffects as fx
text = ax.text(0.5, 0.1, "Label")
text.set_path_effects([
  fx.Stroke(linewidth=3, foreground='1.0'),
  fx.Normal()])
```



### Colorbar adjustment

You can adjust colorbar aspect when adding it.

```
im = ax.imshow(Z)
cb = plt.colorbar(im,
        fraction=0.046, pad=0.04)
cb.set_ticks([])
```



### Multiline plot

You can plot several lines at once using None as separator.

```
X, Y = [1, [1]]
for x in np.linspace(0, 10*np.pi, 100):
 X.extend([x, x, None]), Y.extend([0, sin(x), None])
ax.plot(X, Y, "black")
```



### **Dotted lines**

To have rounded dotted lines, use a custom linestyle and modify dash\_capstyle.

```
ax.plot([0,1], [0,0], "C1",
      linestyle = (0, (0.01, 1)), dash_capstyle="round")
ax.plot([0,1], [1,1], "C1",
      linestyle = (0, (0.01, 2)), dash_capstyle="round")
```



### Taking advantage of typography

You can use a condensed face such as Roboto Condensed to save space on tick labels.

```
for tick in ax.get_xticklabels(which='both'):
      tick.set_fontname("Roboto Condensed")
0.2 0.4 0.6 0.8 1 1.2 1.4 1.6 1.8 2 2.2 2.4 2.6 2.8 3 3.2 3.4 3.6 3.8 4 4.2 4.4 4.6 4.8 5
```

### Getting rid of margins

Once your figure is finished, you can call tight\_layout() to remove white margins. If there are remaining margins. you can use the pdfcrop utility (comes with TeX live).

### Hatching

You can achieve nice visual effect with thick hatch patterns.

```
cmap = plt.get_cmap("Oranges")
plt.rcParams['hatch.color'] = cmap(0.2)
plt.rcParams['hatch.linewidth'] = 8
ax.bar(X, Y, color=cmap(0.6), hatch="/"
```



## Combining axes

You can use colormap to pick a range of continuous colors. You can use overlaid axes with different projections.

```
ax1 = fig.add_axes([0,0,1,1],
                   label="cartesian")
ax2 = fig.add_axes([0,0,1,1],
                   label="polar"
                   projection="polar")
```



### Read the documentation

Matplotlib comes with an extensive documenation explaining every details of each command and is generally accompanied by examples with. Together with the huge online gallery, this documenation is a gold-mine.

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