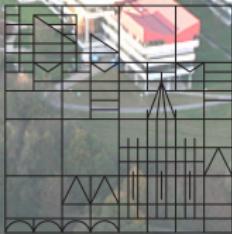


Python Plotting

Matplotlib, etc.

S. Gerlach
Mar. 24, 2022

Universität
Konstanz



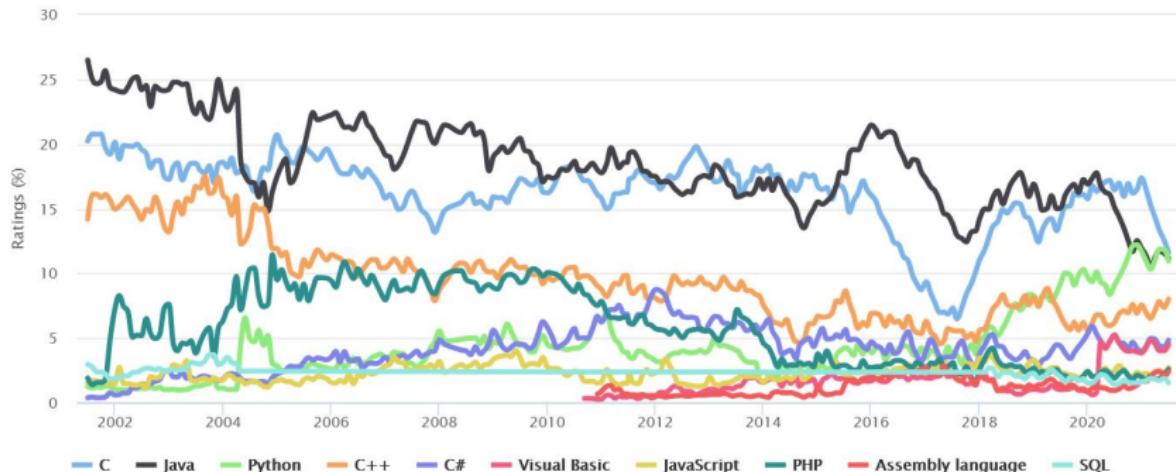
Programming languages - Usage (TIOBE)

Programming Language	2021	2016	2011	2006	2001	1996	1991	1986
C	1	2	2	2	1	1	1	1
Python	2	5	6	8	25	25	-	-
Java	3	1	1	1	2	16	-	-
C++	4	3	3	3	3	2	2	6
C#	5	4	5	7	12	-	-	-
Visual Basic	6	13	-	-	-	-	-	-
JavaScript	7	7	10	9	9	20	-	-
PHP	8	6	4	4	10	-	-	-
Assembly language	9	11	-	-	-	-	-	-
SQL	10	-	-	-	37	-	-	-
Ada	29	28	17	16	18	7	5	2
Lisp	33	27	13	13	17	8	4	3
Pascal	268	75	15	17	15	5	3	7
(Visual) Basic	-	-	7	5	4	3	8	5

Programming languages - Usage (TIOBE)

TIOBE Programming Community Index

Source: www.tiobe.com



Programming language Python

- ▶ Wide spread (well known, many applications)
- ▶ **Free Software**
- ▶ **Interactive Scripting**
- ▶ **Performance** by using optimized libraries or binding to C/C++
- ▶ Easy & flexible (few language features, many libraries)

current: Python 2.7.18 (End-of-Life 2020), Python 3.7.12 - 3.10.2



https://en.wikibooks.org/wiki/Python_Programming
[http://www.scipy-lectures.org/_downloads/
ScipyLectures-simple.pdf](http://www.scipy-lectures.org/_downloads/ScipyLectures-simple.pdf)

Usage - interaktive

1 **Terminal**: python, python3

```
>>> 1+1
```

2 **IPython** - opt. Terminal: ipython3, ipython3 qtconsole

```
In[1]: %hist
```

```
In[2]: hist?
```

```
In[2]: help(abs)
```

3 **Im Browser** - IPython-Notebook: ipython3 notebook

The screenshot shows a web browser window displaying an IPython Notebook. The title bar says "IP[y]: Notebook". The main content area has a section titled "Simple spectral analysis" with the following text:

An illustration of the Discrete Fourier Transform

$$X_k = \sum_{n=0}^{N-1} x_n e^{-\frac{2\pi i}{N} kn} \quad k = 0, \dots, N-1$$

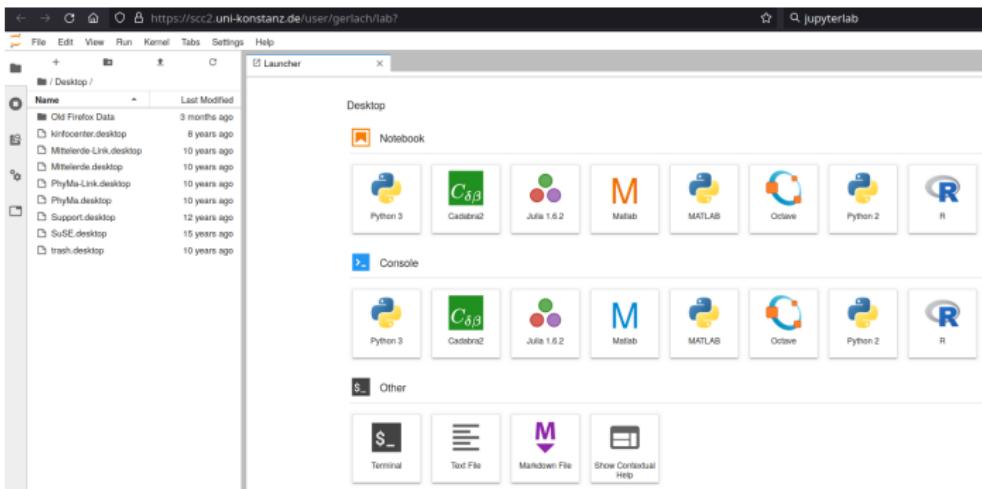
using windowing, to reveal the frequency content of a sound signal.

We begin by loading a datafile using SciPy's audio file support:

```
In [1]: from scipy.io import wavfile
```

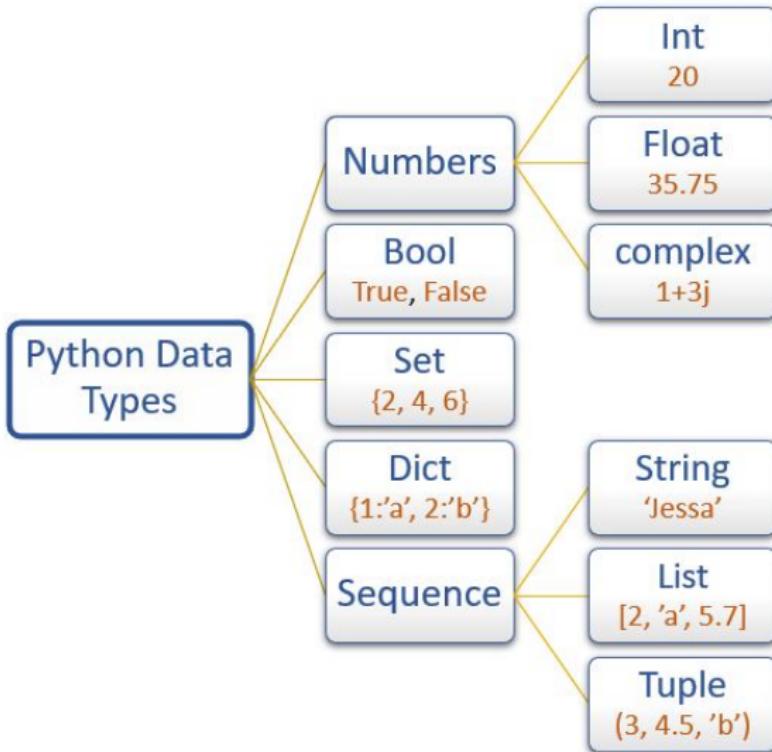
Usage - interaktiv

- 4 **IDE:** Spyder, PyCharm, Eric, ...
- 5 **Online (REPL):** <https://www.python.org/shell/>,
<https://repl.it/languages/python3>
- 6 **Jupyterlab/Jupyterhub:** jupyter lab, Online (SCCKN)



- 7 From C/C++ (CYTHON, pybind11, ...)

Datatypes in Python



Python Basics 1

Python 3 Beginner's Reference Cheat Sheet

Alvaro Sebastian
<http://www.sixthresearcher.com>

Main data types

```
boolean = True / False
integer = 10
float = 10.01
string = "123abc"
list = [ value1, value2, ... ]
dictionary = { key1:value1, key2:value2, ... }
```

Numeric operators

+	addition
-	subtraction
*	multiplication
/	division
**	exponent
%	modulus
//	floor division

Comparison operators

==	equal
!=	different
>	higher
<	lower
>=	higher or equal
<=	lower or equal

Boolean operators

and	logical AND
or	logical OR
not	logical NOT

Special characters

#	comment
\n	new line
\<char>	escape char

String operations

```
string[i]    retrieves character at position i
string[-1]   retrieves last character
string[i:j]  retrieves characters in range i to j
```

List operations

```
list = []      defines an empty list
list[i] = x   stores x with index i
list[i]       retrieves the item with index i
list[-1]      retrieves last item
list[i:j]     retrieves items in the range i to j
del list[i]   removes the item with index i
```

Dictionary operations

```
dict = {}      defines an empty dictionary
dict[k] = x   stores x associated to key k
dict[k]       retrieves the item with key k
del dict[k]  removes the item with key k
```

String methods

```
string.upper()  converts to uppercase
string.lower()  converts to lowercase
string.count(x) counts how many
                times x appears
string.find(x)  position of the x first
                occurrence
string.replace(x,y) replaces x for y
string.strip(x) returns a list of values
                delimited by x
string.join(L)  returns a string with L
                values joined by string
string.format(x) returns a string that
                includes formatted x
```

List methods

```
list.append(x) adds x to the end of the list
list.extend(L) appends L to the end of the list
list.insert(i,x) inserts x at i position
list.remove(x) removes the first list item whose
                value is x
list.pop(i) removes the item at position i and
                returns its value
list.clear() removes all items from the list
list.index(x) returns a list of values delimited
                by x
list.count(x) returns a string with list values
                joined by S
list.sort() sorts list items
list.reverse() reverses list elements
list.copy() returns a copy of the list
```

Dictionary methods

```
dict.keys()    returns a list of keys
dict.values()  returns a list of values
dict.items()   returns a list of pairs (key,value)
dict.get(k)    returns the value associated to
                the key k
dict.pop()     removes the item associated to
                the key and returns its value
dict.update(D) adds key-values (D) to dictionary
dict.clear()   removes all key-values from the
                dictionary
dict.copy()    returns a copy of the dictionary
```

Legend: x,y stand for any kind of data values, s for a string, n for a number, L for a list where i,j are list indexes, D stands for a dictionary and k is a dictionary key.

Python Basics 2

Python 3 Beginner's Reference Cheat Sheet

Alvaro Sebastian
<http://www.sixthresearcher.com>

Built-in functions	
<code>print(x, sep='y')</code>	prints x objects separated by y
<code>input(s)</code>	prints s and waits for an input that will be returned
<code>len(x)</code>	returns the length of x (s, L or D)
<code>min(L)</code>	returns the minimum value in L
<code>max(L)</code>	returns the maximum value in L
<code>sum(L)</code>	returns the sum of the values in L
<code>range(n1,n2,n)</code>	returns a sequence of numbers from n1 to n2 in steps of n
<code>abs(n)</code>	returns the absolute value of n
<code>round(n1,n)</code>	returns the n1 number rounded to n digits
<code>type(x)</code>	returns the type of x (string, float, list, dict ...)
<code>str(x)</code>	converts x to string
<code>list(x)</code>	converts x to a list
<code>int(x)</code>	converts x to a integer number
<code>float(x)</code>	converts x to a float number
<code>help(s)</code>	prints help about x
<code>map(function, L)</code>	Applies function to values in L

Conditional statements	
<code>if <condition>:</code>	<code>
<code> else if <condition>:</code>	<code>
<code> ...</code>	
<code> else:</code>	<code>
<code> if <value> in <list>:</code>	<code>
Data validation	
<code>try:</code>	<code>
<code> except <error>:</code>	<code>
<code> else:</code>	<code>
Working with files and folders	
<code>import os</code>	
<code>os.getcwd()</code>	
<code>os.makedirs(<path>)</code>	
<code>os.chdir(<path>)</code>	
<code>os.listdir(<path>)</code>	

Loops	
<code>while <condition>:</code>	<code>
<code> for <variable> in <list>:</code>	<code>
<code> for <variable> in</code>	
<code> range(start,stop,step):</code>	<code>
<code> for key, value in</code>	
<code> dict.items():</code>	<code>
Loop control statements	
<code>break</code>	finishes loop execution
<code>continue</code>	jumps to next iteration
<code>pass</code>	does nothing
Running external programs	
<code>import os</code>	
<code>os.system(<command>)</code>	

Functions	
<code>def function(<params>):</code>	<code>
Modules	
<code>import module</code>	module.function()
<code>from module import *</code>	function()
Reading and writing files	
<code>f = open(<path>,'r')</code>	
<code>f.read(<size>)</code>	
<code>f.readline(<size>)</code>	
<code>f.close()</code>	
<code>f = open(<path>,'r')</code>	
<code>for line in f:</code>	<code>
<code> f.close()</code>	
<code>f = open(<path>,'w')</code>	
<code>f.write(<str>)</code>	
<code>f.close()</code>	

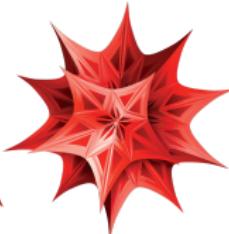
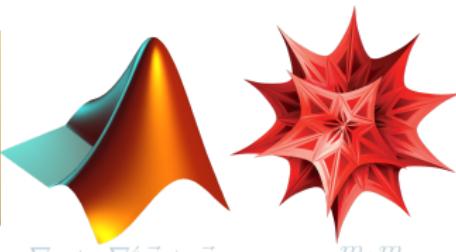
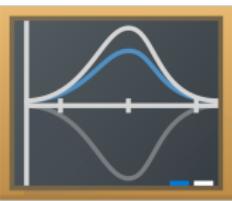
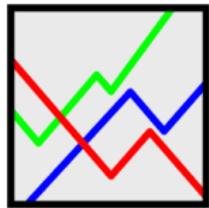
Legend: x,y stand for any kind of data values, s for a string, n for a number, L for a list where i,j are list indexes, D stands for a dictionary and k is a dictionary key.

Summary - What is Python

- ▶ Open-Source, all platforms, portable
- ▶ High-level (further away from machine language, and closer to natural languages)
- ▶ Interactive (Terminal, IPython, Notebook)
- ▶ Interpreted (Scripting)
- ▶ General purpose
- ▶ Multiparadigm (Procedural, Functional, OO, ..)
- ▶ Minimalistic constructs
- ▶ Structured code (indentation)
- ▶ Dynamically typed
- ▶ Built-in advanced types (string, dictionary, list, ..)
- ▶ Powerful standard library and many extensions
- ▶ Widely used, excellent support/documentation

Plotting in Science

- ▶ **Dedicated Apps:** Interactive data analysis and visualization
gnuplot, Grace, LabPlot, Origin, Igor Pro, ...
- ▶ **Frameworks:**
Matlab, Octave, Mathematica, ...
- ▶ **Specialized for 3D/Rendering:**
Povray, Paraview, VMD, ...
- ▶ In **C/C++:** GUI (Qt, ...) + Plotting libraries
- ▶ In **Python:** Matplotlib (Plotly, Seaborn, Pandas, ...)



$\frac{\partial p}{\partial r} \cdot \vec{v} + \vec{v} \cdot \nabla p = -\nabla p + u \nabla^2 \vec{v} + \rho \vec{g}$

$\omega = \vec{v} \times \vec{B}$

$\mathcal{W}_{\delta_1 \rho_1 \sigma_2} = U_{\delta_1 \sigma_1}^{(3)} + \frac{U_{\delta_1 \sigma_1}^{(1)}}{8\pi^2} \int d\alpha_2 \left| \frac{m_1 m}{U_m^{(0)}} \right|^{\frac{m_1 m}{2\alpha_2}}$

Matplotlib - Plotting

- ▶ Python Graphics library, since 2003, BSD license
- ▶ **Backends:** Qt5, Gtk, Tk, wxWidgets, ...

```
1 import matplotlib as mp  
2 mp.use("Qt5Agg")
```

- ▶ **Export** to PDF, EPS, PNG, SVG, ...
- ▶ pyplot module: "MATLAB like" interface
- ▶ pylab (procedural) vs. pyplot (OO) interface

```
1 %import pylab as pl  
2 import matplotlib.pyplot as pl
```

- ▶ Several **toolkits**: seaborn, mplot3d

Matplotlib - Usage

In Script:

```
1 import matplotlib.pyplot as pl
2 from numpy import linspace
3
4 fig, ax = pl.subplots()
5
6 x = linspace(0, 7, 100)
7 #x = arange(0, 7, 0.1)
8 ax.plot(x, x**2)
9 pl.show()
10 #pl.tight_layout()
11 #pl.savefig('plot.png', format='png', dpi=300)
```

In Notebook:

```
$ ipython3 notebook
```

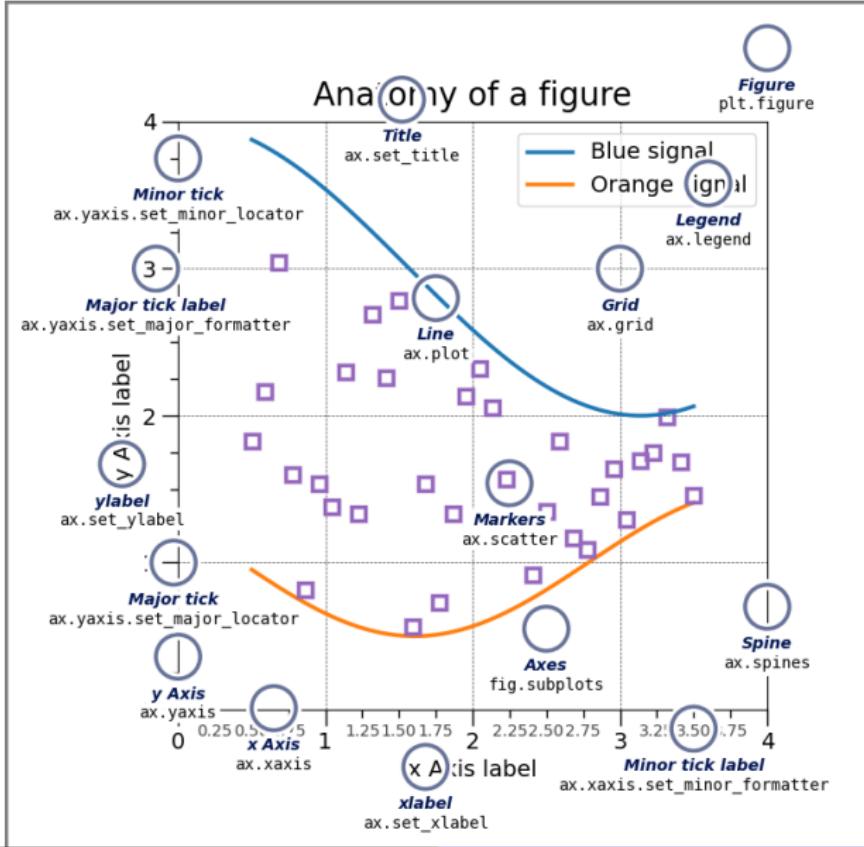
```
In[1]: from numpy import arange
```

```
In[2]: import matplotlib.pyplot as pl
```

```
In[3]: x=arange(0,10)
```

```
In[4]: pl.plot(x**2);
```

Matplotlib - Plot



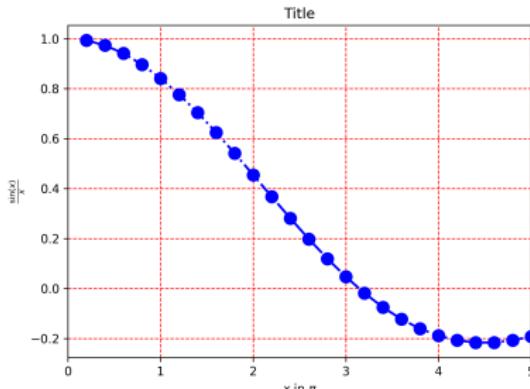
Matplotlib - Styling

Label:

```
1 ax.set_title("Title")
2 ax.set_xlabel("x in $\pi$")
3 ax.set_ylabel("$\frac{\sin(x)}{x}$")
```

Styles:

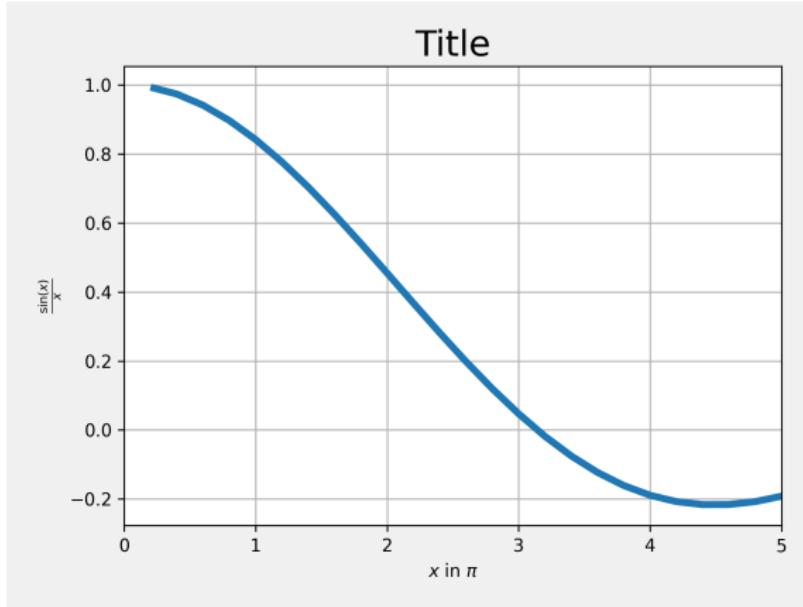
```
1 x = arange(0, 7, 0.5)
2 ax.set_xlim(0, 5)
3 ax.grid(color='r', linestyle='--')
4 ax.plot(x, sin(x)/x, 'bo-.', linewidth = 2, markersize = 10)
```



Matplotlib - Styling

Pre-defined styles:

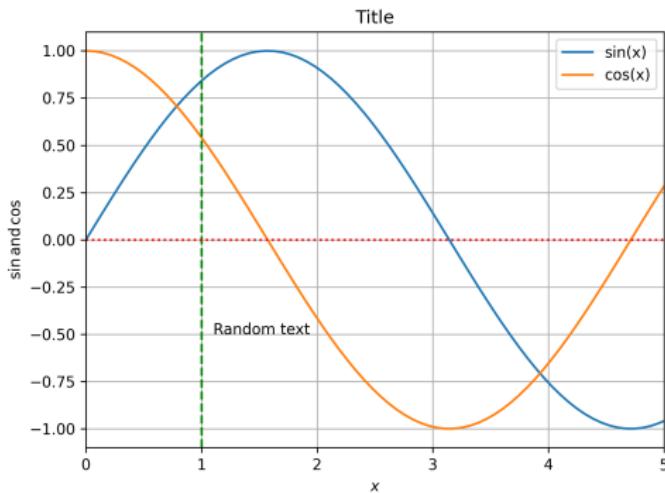
```
1 pl.style.use('fivethirtyeight')
```



see: https://matplotlib.org/stable/gallery/style_sheets/style_sheets_reference.html

Matplotlib - Legend and more

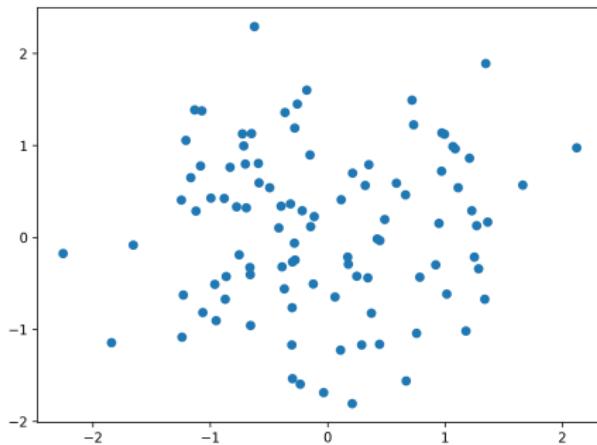
```
1 ax.plot(x, y1, label = "sin(x)")  
2 ax.plot(x, y2, label = "cos(x)")  
3 ax.legend(loc = 'best')  
4  
5 pl.text(1.5, -.5, 'Random_text')  
6 pl.axvline(x=1, color ='g', linestyle='--')  
7 pl.axhline(y=0, color ='r', linestyle=':')
```



Matplotlib - Plot types

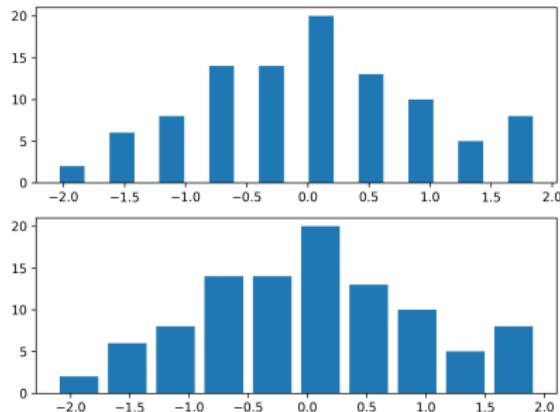
Plot types:

```
1 x = random.normal(mu, sigma, 100)
2 y = random.normal(mu, sigma, 100)
3 ax.scatter(x, y)
4 #pl.bar(...)
5 #ax.hist(x, 10, rwidth=0.9)
6 #pl.pie(...)
```



Matplotlib - Subplots

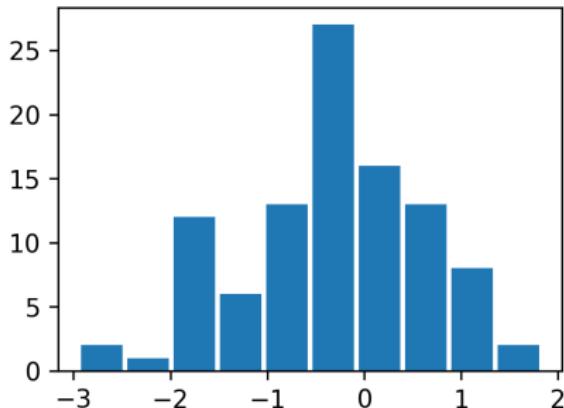
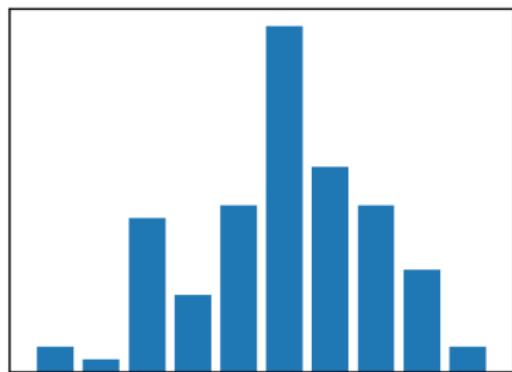
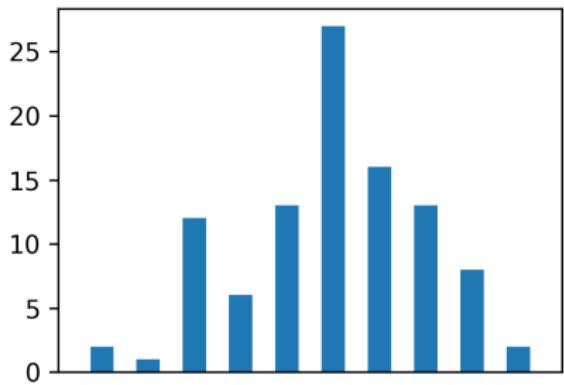
```
1 fig = pl.figure()  
2 ax1 = fig.add_subplot(211)  
3 ax1.hist(x, 10, rwidth=0.5)  
4  
5 ax2 = fig.add_subplot(212)  
6 ax2.hist(x, 10, rwidth=0.8)
```



Matplotlib - Subplots

```
1 fig = pl.figure()
2 ax1 = fig.add_subplot(221)
3 ax1.hist(x, 10, rwidth=0.5)
4 ax1.get_xaxis().set_visible(False)
5
6 ax2 = fig.add_subplot(222)
7 ax2.hist(x, 10, rwidth=0.8)
8 ax2.get_xaxis().set_visible(False)
9 ax2.get_yaxis().set_visible(False)
10 #ax2.grid(True)
11
12 ax3 = fig.add_subplot(223, sharex=ax1)
13 ax3.hist(x, 10, rwidth=0.9)
14
15 ax4 = fig.add_subplot(224, sharex=ax2)
16 ax4.hist(x, 10)
17 ax4.get_yaxis().set_visible(False)
```

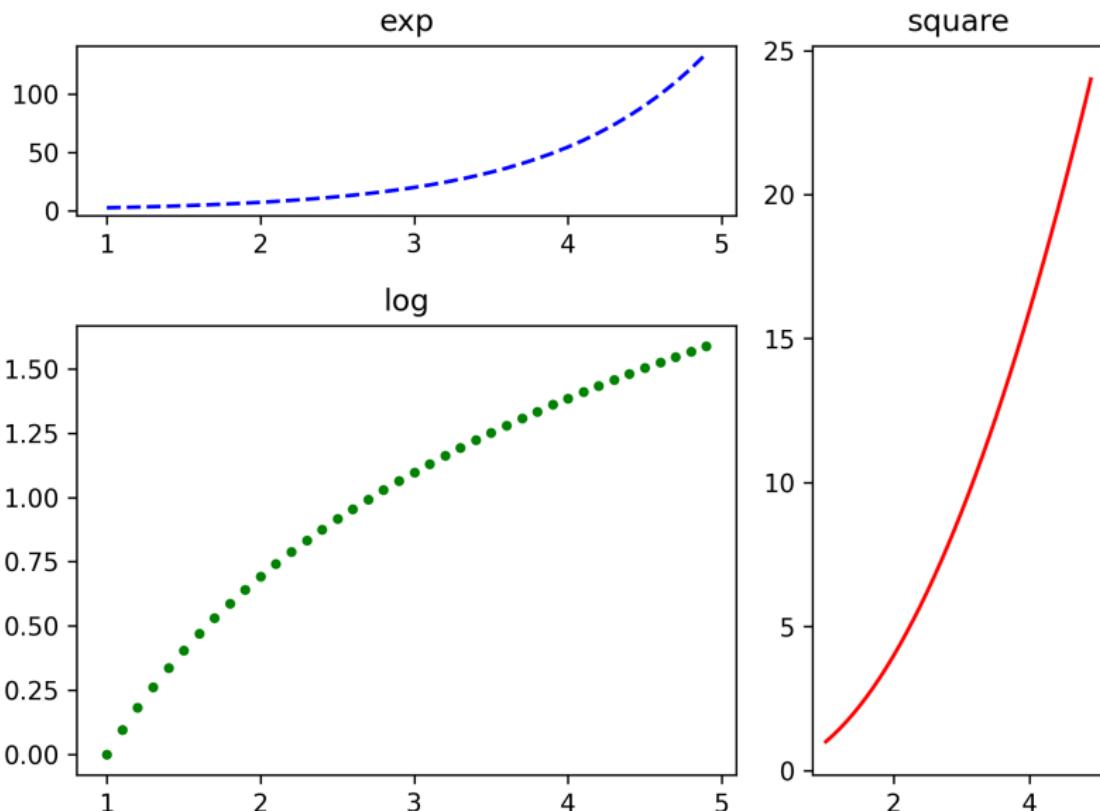
Matplotlib - Subplots



Matplotlib - Subplots Grid

```
1 a1 = pl.subplot2grid((3,3), (0,0), colspan = 2)
2 a2 = pl.subplot2grid((3,3), (0,2), rowspan = 3)
3 a3 = pl.subplot2grid((3,3), (1,0), rowspan = 2, colspan = 2)
4
5 x = arange(1, 5, .1)
6 a1.plot(x, exp(x), 'b--')
7 a1.set_title('exp')
8 a2.plot(x, x*x, 'r')
9 a2.set_title('square')
10 a3.plot(x, log(x), 'g.')
11 a3.set_title('log')
```

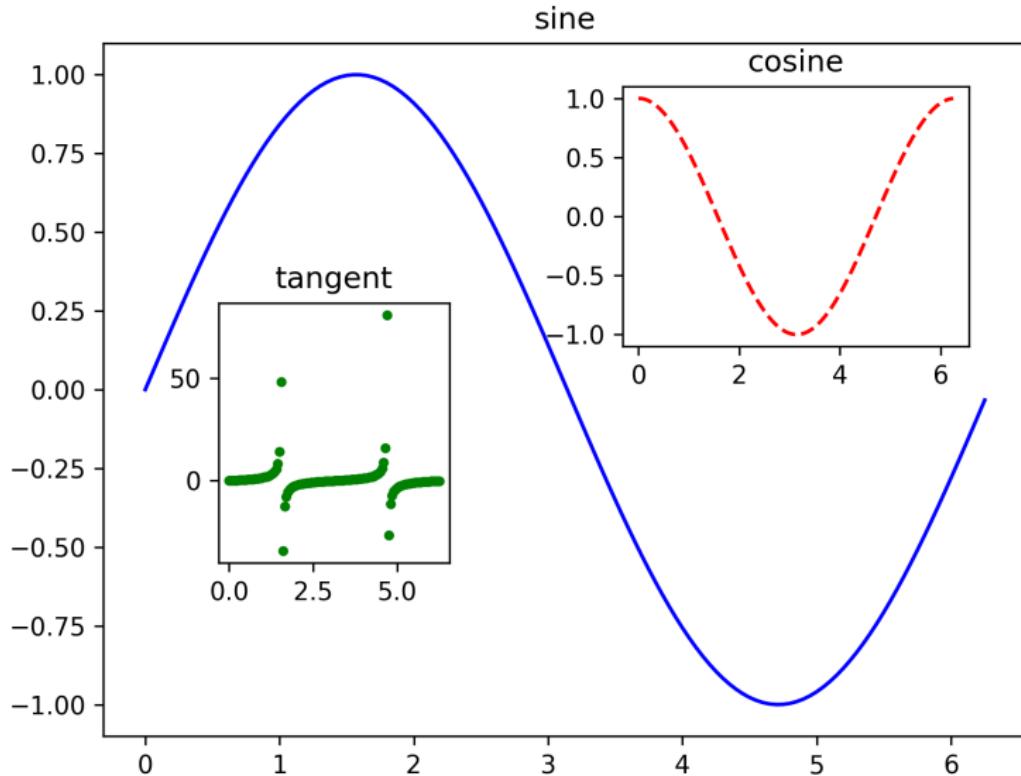
Matplotlib - Subplots Grid



Matplotlib - Inset

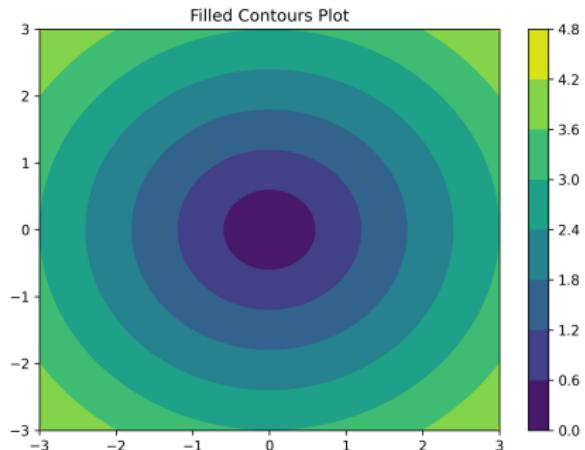
```
1 fig = pl.figure()
2 axes1 = fig.add_axes([0.1, 0.1, 0.8, 0.8]) # main axes
3 axes2 = fig.add_axes([0.55, 0.55, 0.3, 0.3]) # inset axes
4 axes3 = fig.add_axes([0.2, 0.3, 0.2, 0.3]) # inset axes
5
6 x = arange(0, 2*pi, 0.05)
7 axes1.plot(x, sin(x), 'b')
8 axes2.plot(x, cos(x), 'r—')
9 axes3.plot(x, tan(x), 'g.')
10 axes1.set_title('sine')
11 axes2.set_title("cosine")
12 axes3.set_title("tangent")
```

Matplotlib - Inset



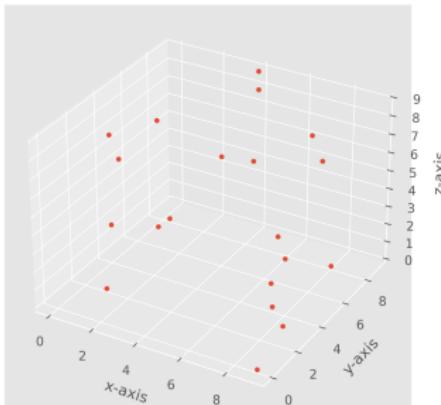
Matplotlib - Contour Plots

```
1 xlist = linspace(-3.0, 3.0, 100)
2 ylist = linspace(-3.0, 3.0, 100)
3 X, Y = meshgrid(xlist, ylist)
4
5 Z = sqrt(X**2 + Y**2)
6
7 fig, ax = pl.subplots(1,1)
8 cp = ax.contourf(X, Y, Z)
9 fig.colorbar(cp)
```



Matplotlib - 3D Plots

```
1 fig = pl.figure()
2 ax = fig.add_subplot(111, projection='3d')
3
4 x = random.randint(0, 10, size = 20)
5 y = random.randint(0, 10, size = 20)
6 z = random.randint(0, 10, size = 20)
7
8 pl.plot(x,y,z, '.')
9
10 ax.set_zlabel('z-axis')
```



Matplotlib - Pictures

```
1 S=pl.imread("ising.png")
2
3 print(S.shape)
4 print(S.dtype)
5 print(S.max())
6 print(S.min())
7
8 pl.axis('off')
9 pl.imshow(S, cmap='gray')
10 #pl.matshow(S, 0)
11
12 pl.show()
```

`imread()`: PNG images are returned as float arrays (0-1). All other formats are returned as int arrays, with a bit depth determined by the file's contents.

better: **Python Imaging Library**

```
1 from PIL import Image
2 # 'P'-pixel, 'L'-greyscale, 'RGB', 'CMYK'
3 S=np.array(Image.open('ising.png').convert('L'))
```

see <https://matplotlib.org/stable/gallery/index>

Matplotlib - Animations

```
1 from matplotlib.animation import FuncAnimation
2
3 fig, ax = pl.subplots()
4 xdata, ydata = [], []
5 ln, = pl.plot([], [], 'ro')
6
7 ax.set_xlim(0, XMAX)
8
9 def update(frame):
10     xdata.append(frame)
11     ydata.append(sin(frame)/frame)
12     ln.set_data(xdata, ydata)
13     return ln,
14
15 ani = FuncAnimation(fig, update,
16                     frames=linspace(0, XMAX, 128),
17                     blit=True)
```

see also double_pendulum.py

Making your plots accessible

- ▶ Always make sure your **text is large** enough to read. Use the `fontsize` parameter in `xlabel`, `ylabel`, `title`, and `legend`, and `tick_params` with `labelsize` to increase the text size of the numbers on your axes.
- ▶ Make your **graph elements easy to see**. Use `s` to increase the size of your scatterplot markers and `linewidth` to increase the sizes of your plot lines.
- ▶ Using only color to distinguish between different plot elements is unreadable to colorblind people (or in black-and-white). Use **different linestyle for lines and marker for symbols**. If unsure, use Coblis or Color Oracle to check how your plots would look like to colorblind.