

# **AI-based Audio Analysis of Music and Soundscapes**

## **Fundamentals of Python Programming**

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# Outline

- Python basics
- Data types
- NumPy (Numeric computing)
- Matplotlib (Data visualization)

# Resources

## ■ The Python Tutorial

■ <https://docs.python.org/3/tutorial/>

The screenshot shows the Python 3.10.5 Documentation page for 'The Python Tutorial'. At the top, there are language and version dropdown menus. The main content area is titled 'The Python Tutorial' and contains a brief introduction: 'Python is an easy to learn, powerful programming language. It has efficient high-level data structures and a simple but effective approach to object-oriented programming. Python's elegant syntax and dynamic typing, together with its interpreted nature, make it an ideal language for scripting and rapid application development in many areas on most platforms.' On the left, there is a sidebar with links to 'Previous topic' (Changelog), 'Next topic' (1. Whetting Your Appetite), and 'This Page' (Report a Bug, Show Source). A navigation bar at the bottom includes links for 'Python', 'English', '3.10.5', '3.10.5 Documentation', and 'The Python Tutorial'.

Fig. 1 - https://docs.python.org/3/tutorial/

## ■ Preparation Course for Python

■ <https://www.audiolabs-erlangen.de/resources/MIR/PCP/PCP.html>

Unit	Title	Notions, Techniques & Algorithms	HTML	IPYNB
1	<a href="#">Get Started</a>	Download; Conda; Python environment; Jupyter	<a href="#">[html]</a>	<a href="#">[ipynb]</a>
2	<a href="#">Python Basics</a>	Help; variables; basic operators; list; tuple; boolean values; set; dictionary; type conversion; shallow and deep copy	<a href="#">[html]</a>	<a href="#">[ipynb]</a>
3	<a href="#">NumPy Basics</a>	Array; reshape; array operations; type conversion; constants; matrix	<a href="#">[html]</a>	<a href="#">[ipynb]</a>

Fig. 2 - https://www.audiolabs-erlangen.de/resources/MIR/PCP/PCP.html

# Resources

## ■ W3 Schools – Python Tutorial

■ <https://www.w3schools.com/python>



Fig. 3 - <https://www.w3schools.com/python/>

## ■ Python Tutorial - Python Full Course for Beginners

■ [https://www.youtube.com/watch?v=\\_uQrJ0TkZlc](https://www.youtube.com/watch?v=_uQrJ0TkZlc)

# Python Basics



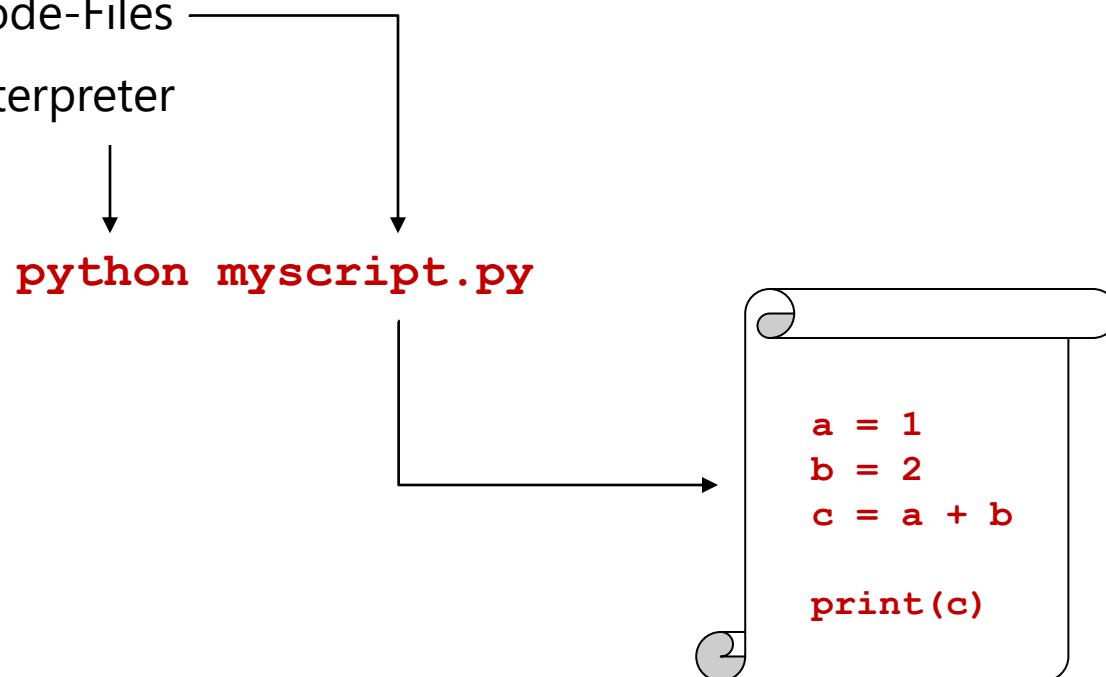
- Free & simple to learn programming language (1989)
- Cross-platform (Windows, MacOS, Linux)
- Great for rapid prototyping
- Interpreted language (not compiled)
  
- Application Scenarios
  - Science
  - Web Development
  - Data Science / Data Visualization
  - Machine Learning / Artificial Intelligence
  - Desktop GUIs

# Python Basics

## Workflow

### Common workflow

- Python Code-Files
- Python interpreter



# Python Basics

## Indentations

- Often “Tab” is used (*4 spaces are recommended*)
- Used to indicate block / level of code
  - Same number of spaces for the same level of code!

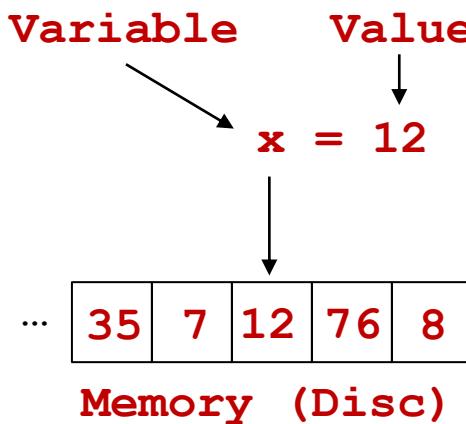
```
x = 12
If x > 24:
    print(x)
    if x > 32:
        print(">32")
```

---

# Python Basics

## Variables

- Variables
  - addresses a part of the **memory**
  - has a **name**
  - has a **value**



# Python Basics

## Variables

- Variables are not declared
- Variables are created after **value assignment**
- **Data type** is inferred from value

```
x = 12
print(x) # 12
```

```
x = "Hello"
print(x) # "Hello"
```

# Python Basics

## Variables

- Variable names can contain
  - Letters (a, b, c, ..., A, B, C, ...Z)
  - Underscore (\_)
  - (*preferably, use small letters and underscore*)

```
first_result = 12.7
```

```
print(first_result) # 12.7
```

# Python Basics

## Variables

- Access type

```
x = 12
print(x)          # 12
print(type(x))   # int
```

# Python Basics

## Comments

- One-line comments (#)

```
# this is a short note
```

- Multi-line comments ("")

```
"""
This is a longer comment
to explain more details.
"""
```

# Python Basics

## if/else & for-loops

- Conditional code execution
- Iterate over list:

```
If a > 4:  
    print("larger than four!")  
else:  
    print("smaller than four!")  
  
for i in range(4):  
    print(i)  
  
# 0, 1, 2, 3  
  
for c in „yahoo“:  
    print(c)  
  
# y, a, h, o, o
```

# Python Basics

## Functions

- Block of code (*one functionality*)
  - Name
  - Arguments

Argument(s)

```
def my_print(s):
    print(s)

my_print(123)      # 123
```

```
def my_addition(a, b):
    c = a + b
    return(c) ← Return parameter

d = my_addition(1, 2)      # 3
e = my_addition(11, 22)    # 33
```

# Python Basics

## Functions

- Keyword arguments
  - Optional
  - Default values

Keyword argument(s)

```
def my_spectrogram(signal, db=True):  
    # compute spectrogram ...  
    if db:  
        # apply dB scaling  
    # return spectrogram
```



# Data Types

## Strings

- Strings (text)

```
s = "Audio Analysis"  
s = 'Audio Analysis'  
s = str("Audio Analysis")
```

- Multiline strings

```
s = """Audio analysis  
Is often based on signal  
processing"""
```

# Data Types

## Strings

- Strings = Arrays (of bytes)

```
s = "Audio"  
print(s[0])      # A  
print(s[2])      # d  
print(s[-1])     # o
```

- String length

```
s = "Audio"  
print(len(s))    # 5
```

- Check for substring

```
s = "Hi Peter"  
print("Hello" in s)    # False  
print("Hi" in s)       # True  
print("Hu" not in s)   # True
```

# Data Types

## Strings

- Slicing strings

```
s = "Audio"  
print(s[0:2])          # Au  
print(s[:2])           # Au  
print(s[2:])            # dio  
print(s[-2:])          # io
```

- Uppercase, Lowercase

```
s = "Audio"  
print(s.upper())        # AUDIO  
print(s.lower())        # audio
```

- Replace substring

```
s = "birdsong.wav"  
s = s.replace(".wav", ".mp3")  
print(s)                 # birdsong.mp3
```

# Data Types

## Strings

- Splitting strings

```
s = "car.wav,12,BMW"
parts = s.split(",")
print(parts)
# ['car.wav', '12', 'BMW']
```

- Joining strings

```
s = ["car", "wav"]
filename = ".".join(s)
print(joint)      # car.wav
```

- Formatting strings

```
s1 = "{}.wav".format("car")
s2 = "car" + ".wav"
print(s1)          # car.wav
print(s2)          # car.wav
```

# Data Types

## Numeric Types

- Integers

```
i1 = 12  
i2 = -23
```

- Float (floating point number)

```
f1 = 12.001  
f2 = -23.5
```

- Type conversion

```
print(i1)                      # 12  
print(type(i1))                # int  
i1 = float(i1)  
print(i1)                      # 12.0  
print(type(i1))                # float
```

# Data Types

## Numeric Types

- Rounding up/down

```
import math
f = 1.49
print(math.ceil(f))      # 2
print(math.floor(f))    # 1
print(round(f))         # 1
```

# Data Types

## Lists

- Store data collections
  - Any data type
- Zero-based indexing
- Length

```
list1 = ["apple", "banana", "cherry"]

list2 = [1, 2, 3]

list3 = [True, False, True]

print(list2[0])      # 1
print(list1[2])      # Cherry

print(len(list1))    # 3
```

# Data Types

## Lists

- List comprehension

```
list1 = [2, 4, 6]
```

```
list2 = [_ + 1 for _ in list1]
```

```
# [3, 5, 7]
```

- Indexing / Slicing like for strings

# Data Types

## Dictionaries (dicts)

- Key/Value pairs

```
d = {  
    "brand": "Ford",  
    "model": "Mustang",  
    "year": 1964  
}
```

```
print(d["year"])      # 1964
```

- Keys

```
Print(d.keys())  
# ['brand', 'model', 'year']
```

# Data Types Operators

## ■ Assignment operators

```
i = 12          # 12
i = i + 2      # 14
i += 2         # 16
i -= 2         # 14
i /= 2         # 7.0
```

## ■ Comparison operators

```
print(1 == 1)    # True
print(1 <= 2)    # True
print(1 >= 3)    # False
print(1 != 3)    # True
```

# Data Types Operators

## ■ Logical operators

```
i = 1
(i < 3) and (i > 1)      # False
(i < 3) or (i > 1)       # True
not (i > 5)               # True
```

# NumPy (Numeric Computing)

- Standard library for working with numerical data in Python
- Core part of various Python libraries
  - Pandas (data analysis)
  - SciPy (scientific computing)
  - Matplotlib (visualization)
  - Scikit-learn (machine learning)
- Needs to be imported first

*Alias (for convenience)*

↓

`import numpy as np`

# NumPy

## Arrays

- Efficient data structure to store multiple values (faster than lists)
- Contains
  - Raw data (values)
  - **dtype** (data type – np.int8 / np.float16 / np.float32)
  - **rank** (number of dimensions)
  - **shape** (size of array along each dimension)

# NumPy Arrays

- Example (one-dimensional array)

```
a = np.array([1, 2, 3])
print(a)                                # [1, 2, 3]
print(a.ndim)                            # 1
print(a.shape)                           # (3,)
print(a.dtype)                            # int32
```

1	2	3
---	---	---

- Example (two-dimensional array / matrix):

```
a = np.array([[1.1, 2.2], [3.3, 4.4]])
print(a)                                # [[1.1, 2.2]
                                         #  [3.3, 4.4]]
print(a.ndim)                            # 2
print(a.shape)                           # (2,2)
print(a.dtype)                            # float64
```

1.1	2.2
3.3	4.4

# NumPy Arrays

- Create arrays with ones / zeros

```
a = np.zeros([2, 3])
print(a)
# array([[0., 0., 0.],
#        [0., 0., 0.]])
```

```
a = np.ones(3)
print(a)
# array([1., 1., 1.])
```

```
a = np.ones(3, dtype=int)
print(a)
# array([1, 1, 1])
```

# NumPy

## Arrays

- Create arrays with increasing numbers (**arange**)

```
a = np.arange(4)  
print(a)                      # array([0., 1., 2., 3.])
```

- Indexing / Slicing ndarray (like with lists & strings before)

```
a = np.arange(4)  
print(a[0])                    # 0.  
print(a[:2])                   # [0., 1.]  
print(a[-1])                   # 3
```

# NumPy Arrays

- Concatenating two arrays (**concatenate**)

```
a = np.arange(4)
```

0	1	2	3
---	---	---	---

```
b = np.arange(3)
```

0	1	2
---	---	---

```
print(np.concatenate((a, b)))
```

```
# array([0., 1., 2., 3., 0., 1., 2.])
```

0	1	2	3	0	1	2
---	---	---	---	---	---	---

# NumPy Arrays

- Horizontal stacking (**hstack**) and vertical stacking (**vstack**)

```
a = np.array((1, 2), dtype=int)
```

1	2
---	---

```
b = np.array((3, 4), dtype=int)
```

3	4
---	---

```
print(np.hstack((a, b))) # array([1, 2, 3, 4])
```

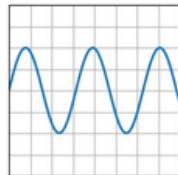
1	2	3	4
---	---	---	---

```
print(np.vstack((a, b))) # array([[1, 2], [3, 4]])
```

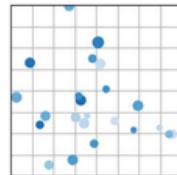
1	2
3	4

# Matplotlib (Data visualization)

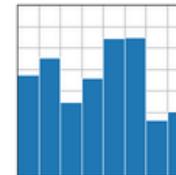
## Plotting types



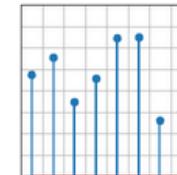
`plot(x, y)`



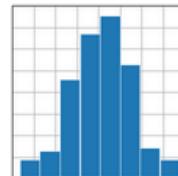
`scatter(x, y)`



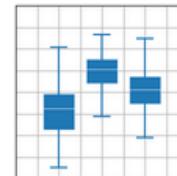
`bar(x, height) / barh(y, width)`



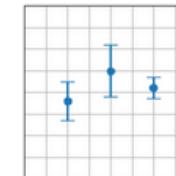
`stem(x, y)`



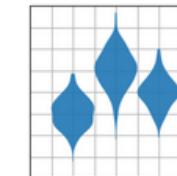
`hist(x)`



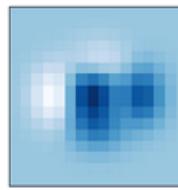
`boxplot(X)`



`errorbar(x, y, yerr, xerr)`



`violinplot(D)`



`imshow(Z)`

Fig. 4 - [https://matplotlib.org/stable/plot\\_types/index](https://matplotlib.org/stable/plot_types/index)

# Matplotlib

## First Steps

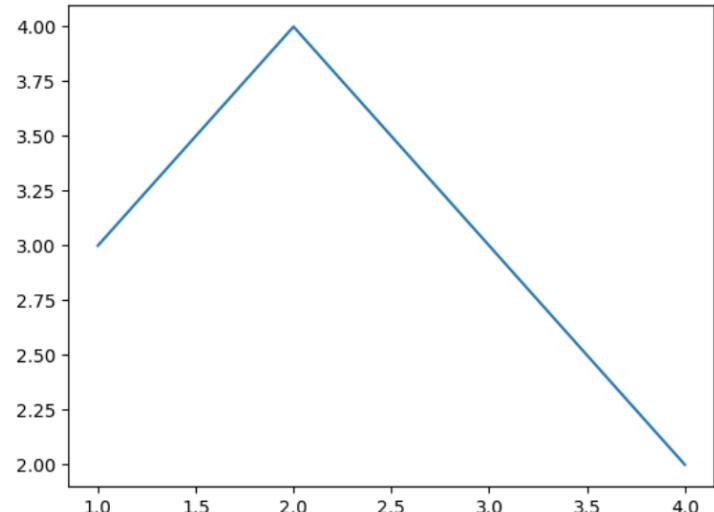
- Import matplotlib package
- Create figure
- Plot data & show figure

```
import numpy as np
x = np.array((1,2,3,4))
y = np.array((3,4,3,2))

import matplotlib.pyplot as plt

fig, ax = plt.subplots()

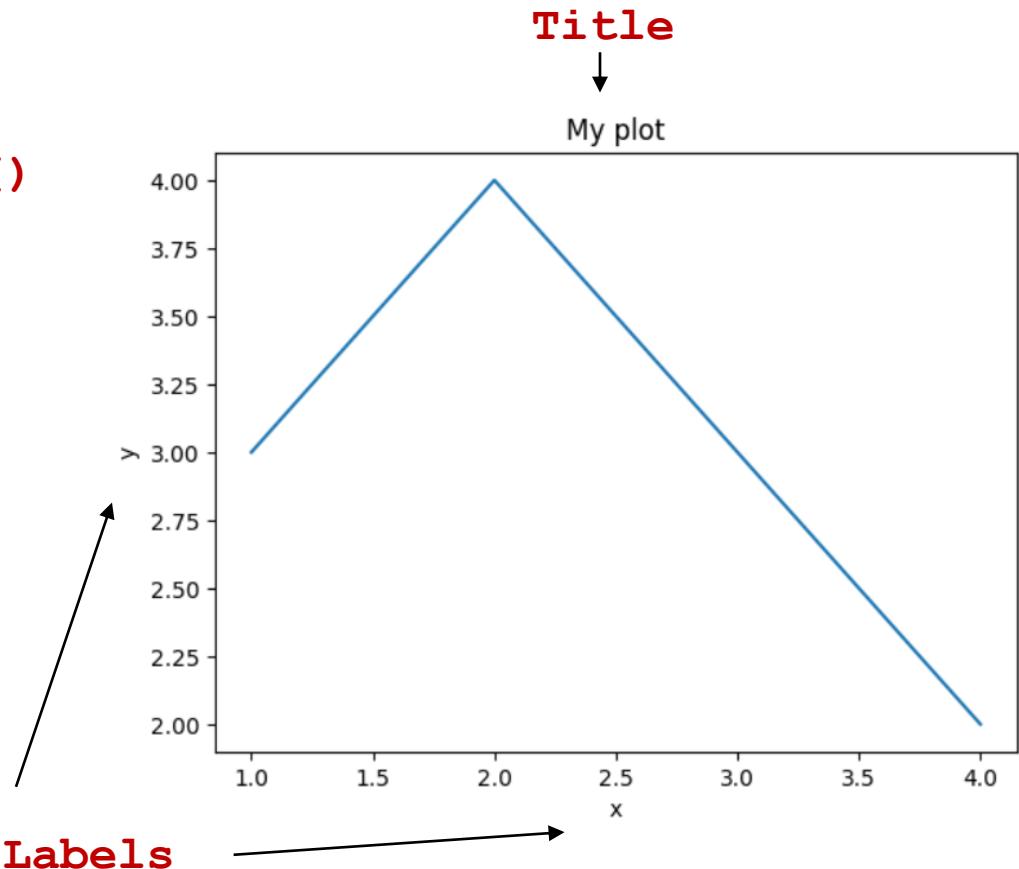
ax.plot(x, y)
plt.show()
```



# Matplotlib

## Axes Labels & Title

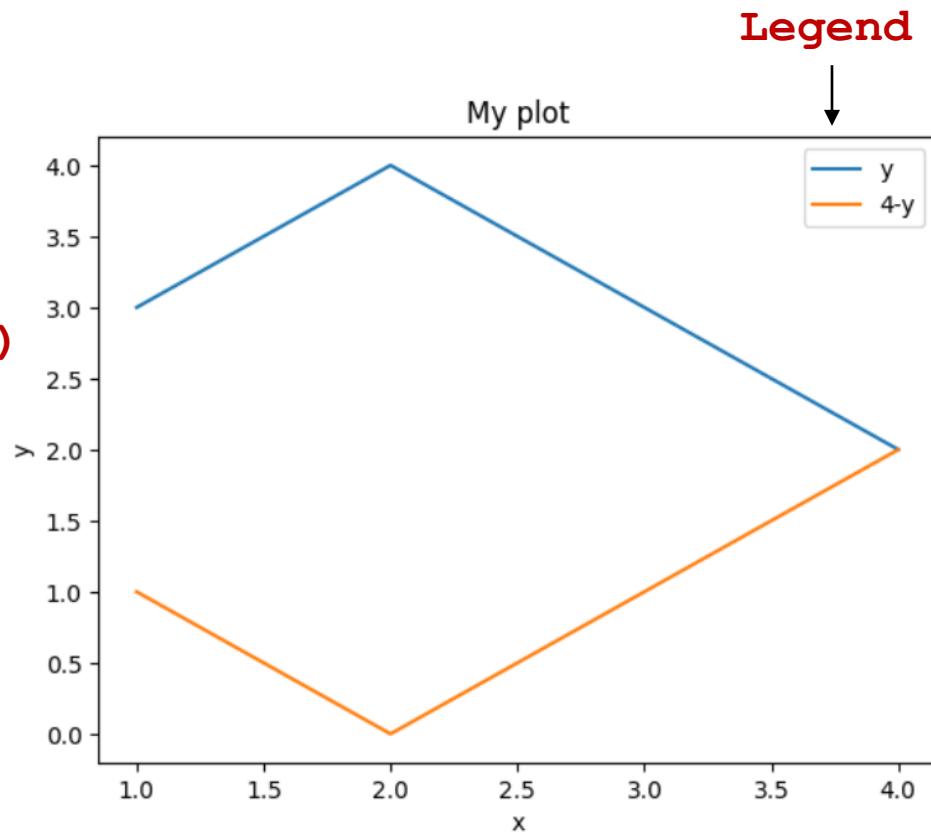
```
# ...  
  
fig, ax = plt.subplots()  
  
ax.plot(x, y)  
ax.set_xlabel('x')  
ax.set_ylabel('y')  
ax.set_title('My plot')  
plt.show()
```



# Matplotlib

## Legend

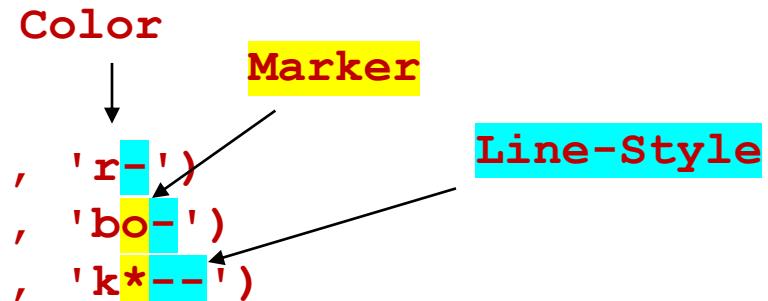
```
# ...  
  
fig, ax = plt.subplots()  
  
ax.plot(x, y, label='y')  
ax.plot(x, 4-y, label='4-y')  
  
# ...  
  
plt.legend()  
plt.show()
```



# Matplotlib

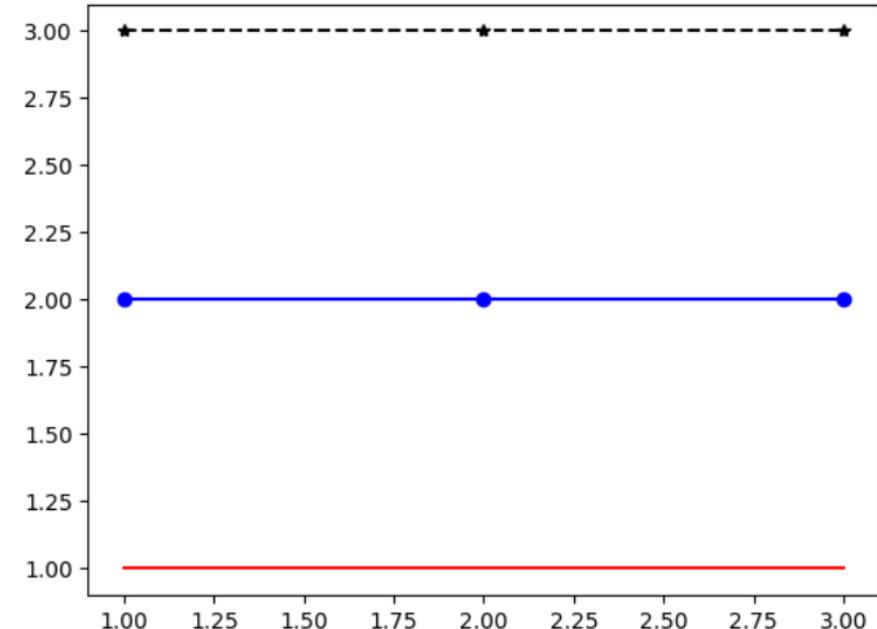
## Line-style / marker-style

```
fig, ax = plt.subplots()  
ax.plot([1, 2, 3], [1, 1, 1], 'r-')  
ax.plot([1, 2, 3], [2, 2, 2], 'bo-')  
ax.plot([1, 2, 3], [3, 3, 3], 'k*-')  
plt.show()
```



- Short or long form

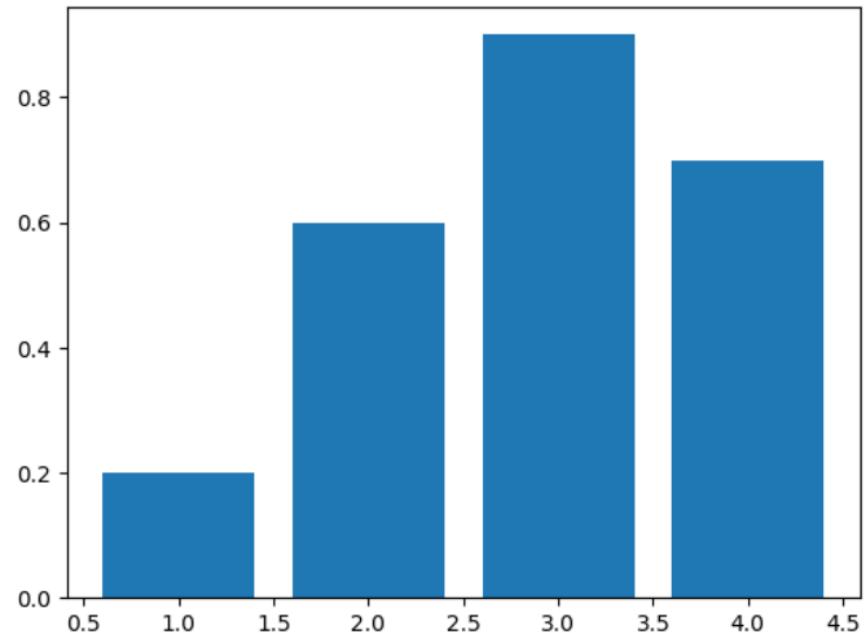
```
...  
..., 'k*--')  
..., color='k', marker='*',  
linestyle='--')
```



# Matplotlib

## Bar plot

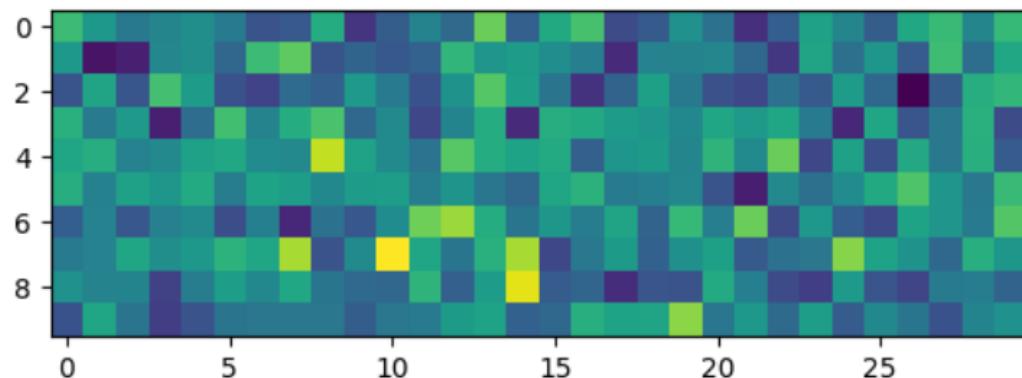
```
fig, ax = plt.subplots()  
ax.bar([1, 2, 3, 4], [0.2, 0.6, 0.9, 0.7])  
plt.show()
```



# Matplotlib

## Matrix plots

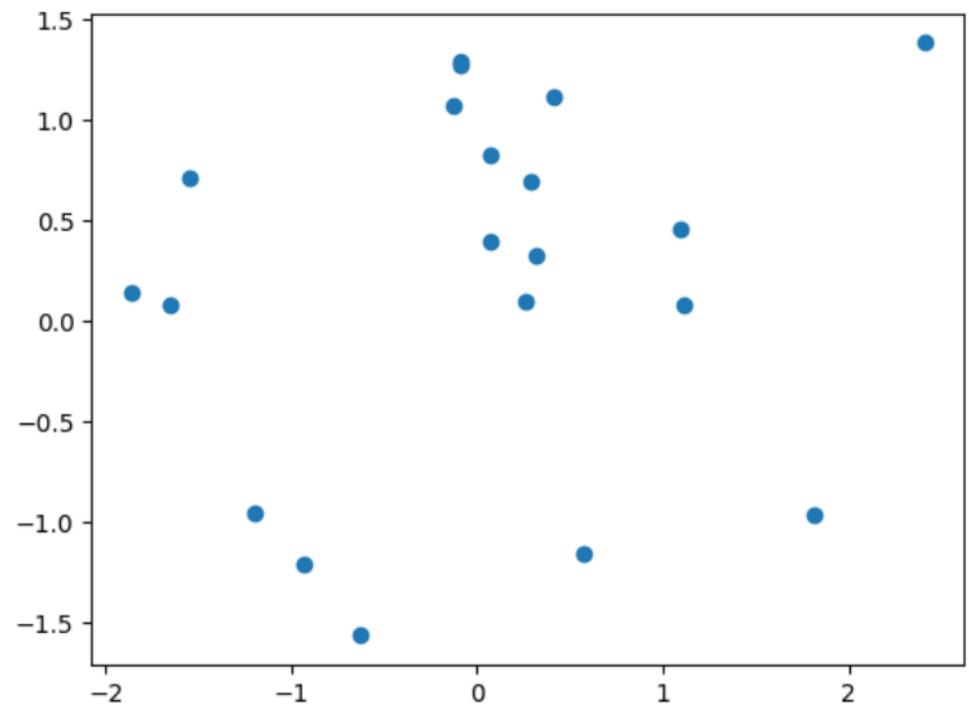
```
mat = np.random.randn(10, 30)
fig, ax = plt.subplots()
ax.imshow(mat)
plt.show()
```



# Matplotlib

## Scatter plots

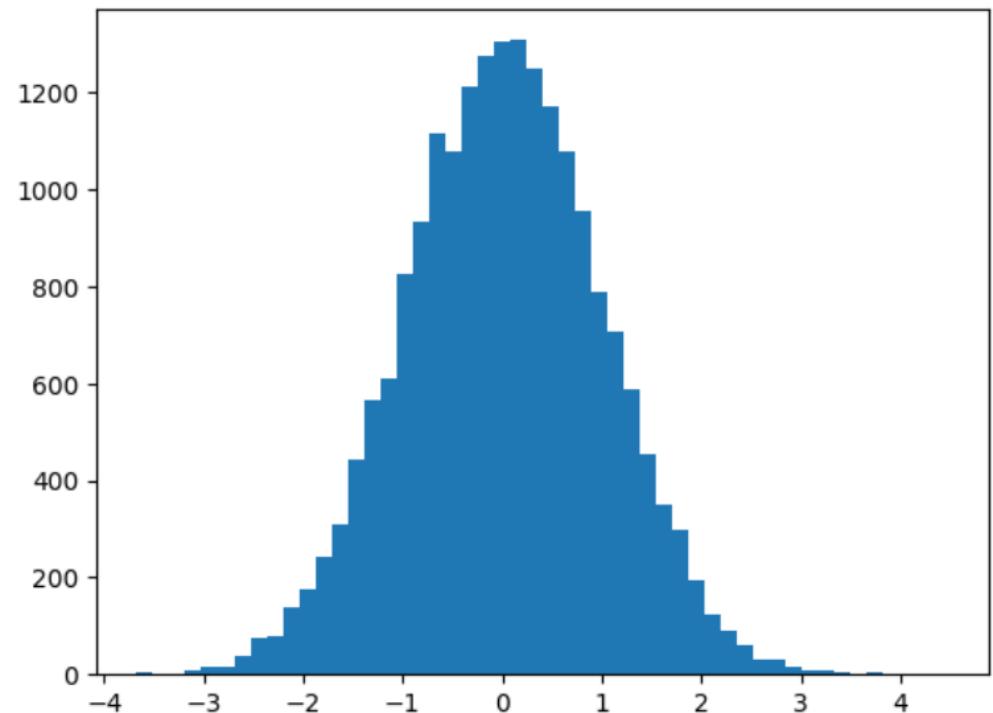
```
x = np.random.randn(20)
y = np.random.randn(20)
fig, ax = plt.subplots()
ax.scatter(x,y)
plt.show()
```



# Matplotlib

## Histograms

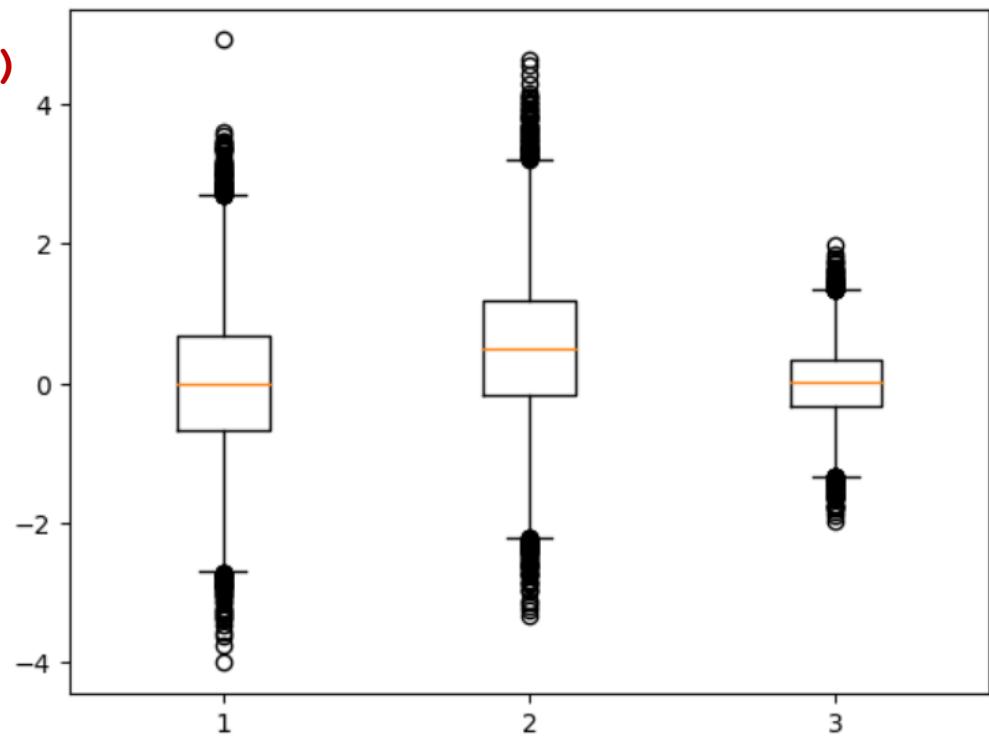
```
x = np.random.randn(20000)
fig, ax = plt.subplots()
ax.hist(x, bins=50)
plt.show()
```



# Matplotlib

## Boxplots

```
x = np.random.randn(20000, 3)
x[:, 1] += 0.5
x[:, 2] /= 2
fig, ax = plt.subplots()
ax.boxplot(x)
plt.show()
```



# Matplotlib

## Subplots

```
fig, ax = plt.subplots(1, 3)
ax[0].imshow(np.random.randn(10, 10))
ax[1].imshow(np.random.randn(10, 10))
ax[2].imshow(np.random.randn(10, 10))
plt.show()
```

