

# **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/>



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>

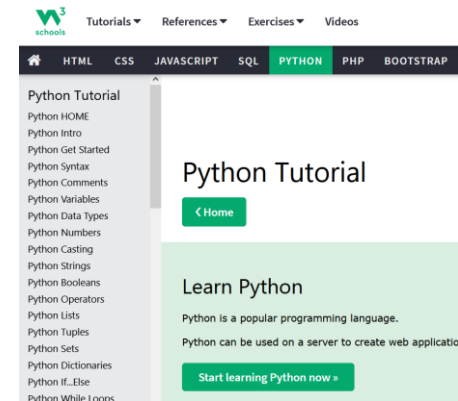


Fig. 3 - <https://www.w3schools.com/python/>

- 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

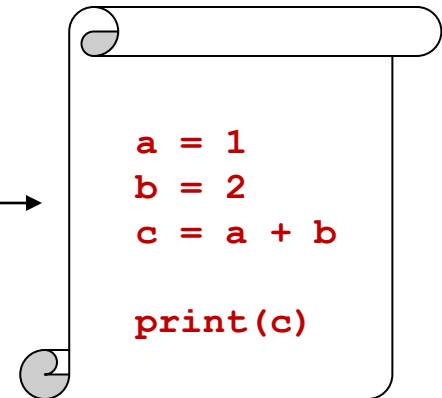
## Workflow

- Common workflow

- Python Code-Files

- Python interpreter

`python myscript.py`



# 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!

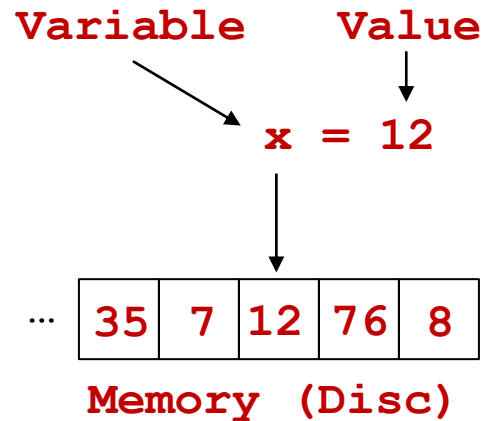
```
x = 12
If x > 24:
    print(x)
    if x > 32:
        print(">32")
```

---

# 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

```
If a > 4:  
    print("larger than four!")  
else:  
    print("smaller than four!")
```

- Iterate over list:

```
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(filename) # 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

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

```
list2 = [1, 2, 3]
```

```
list3 = [True, False, True]
```

- Zero-based indexing

```
print(list2[0])      # 1
```

```
print(list1[2])     # Cherry
```

- Length

```
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

```
import numpy as np
```

*Alias (for convenience)*



# 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 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
---	---	---	---

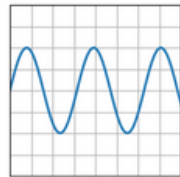
```
print(np.vstack((a, b))) # array([[1, 2],  
                                   [3, 4]])
```

1	2
3	4

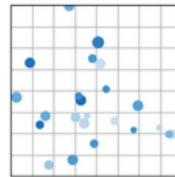
---

# Matplotlib (Data visualization)

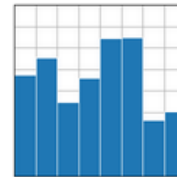
## ■ Plotting types



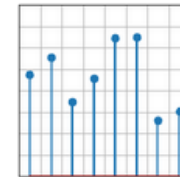
`plot(x, y)`



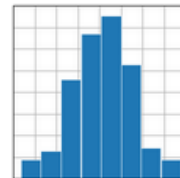
`scatter(x, y)`



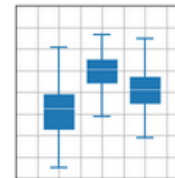
`bar(x, height) / barh(y, width)`



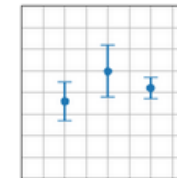
`stem(x, y)`



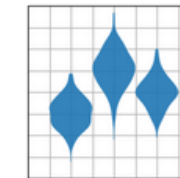
`hist(x)`



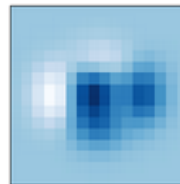
`boxplot(X)`



`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

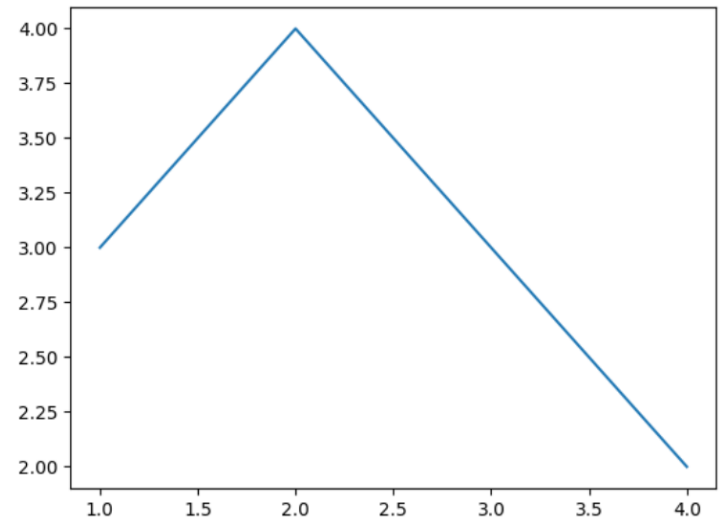
- Import matplotlib package
- Create figure
- Plot data & show figure

```
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()
```

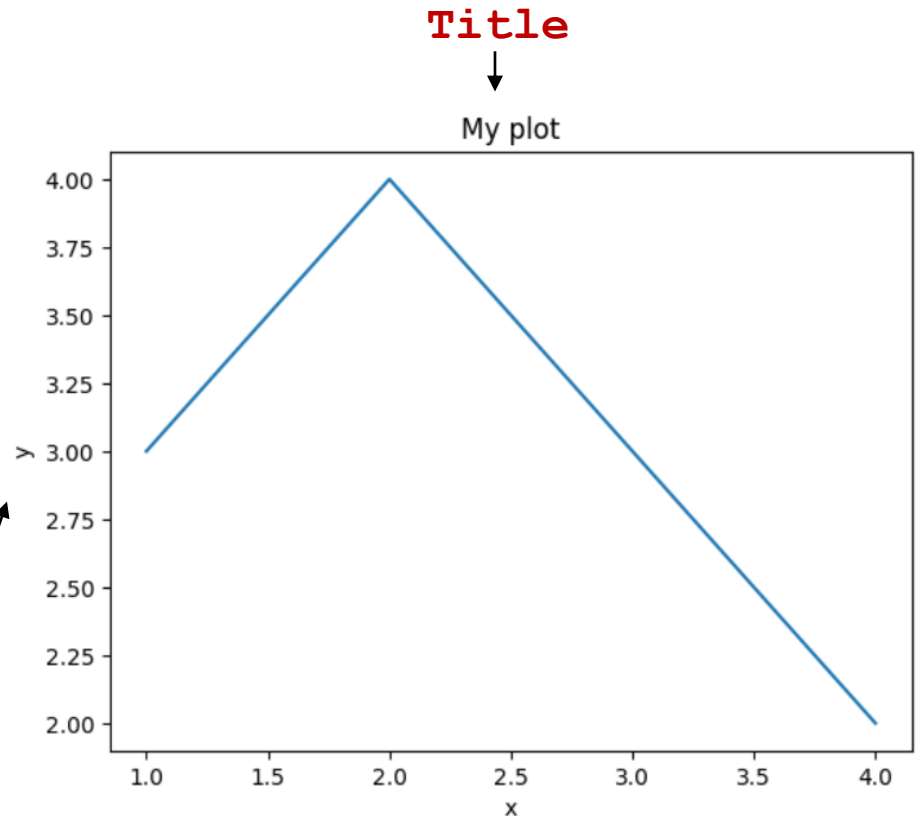
```
ax.plot(x, y)
```

```
ax.set_xlabel('x')
```

```
ax.set_ylabel('y')
```

```
ax.set_title('My plot')
```

```
plt.show()
```

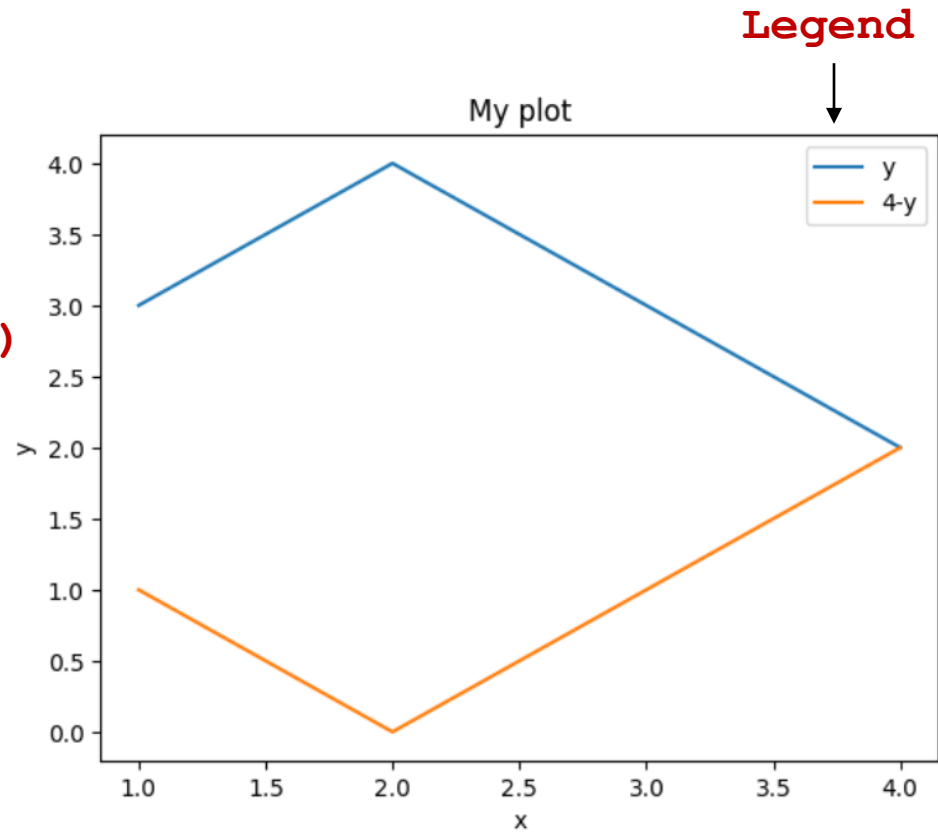


Axes Labels

# 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()
```

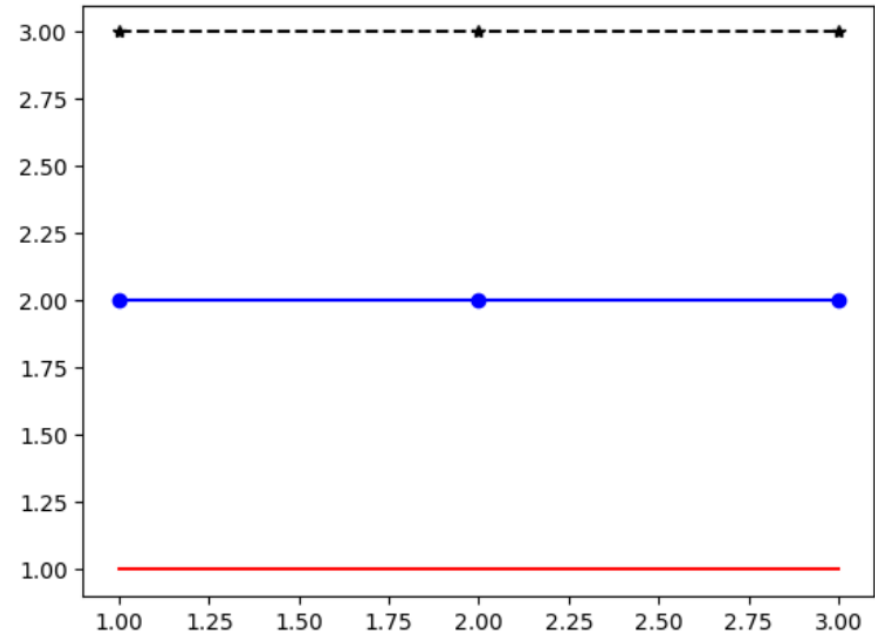
Color

Marker

Line-Style

### ■ Short or long form

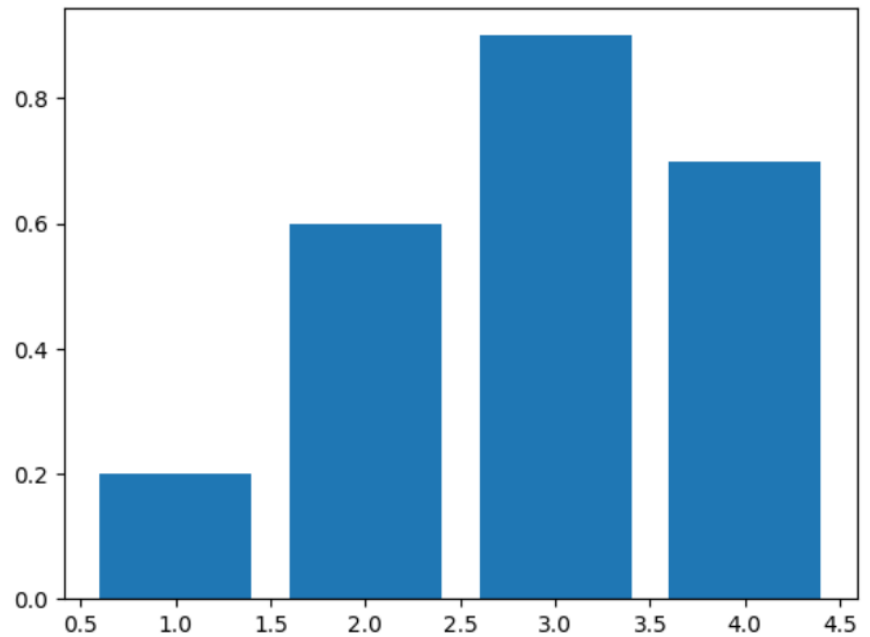
```
...
..., 'k*--')
..., color='k', marker='*',
linestyle='--')
```



# Matplotlib

## Bar plot

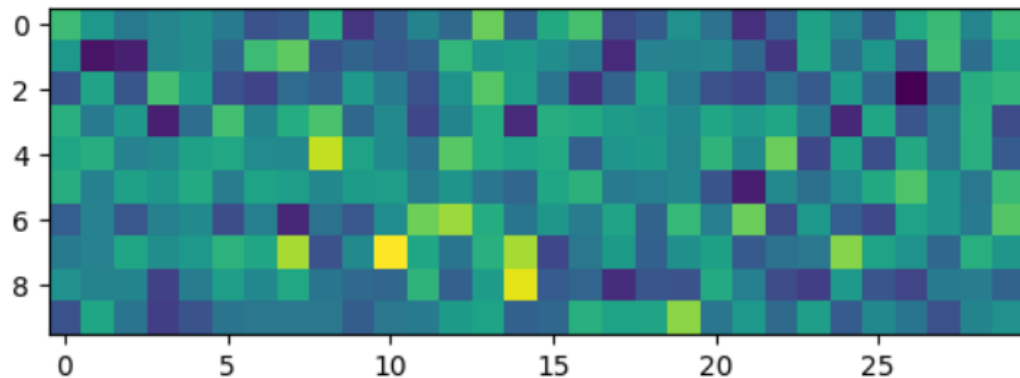
```
fig, ax = plt.subplots()  
ax.bar([1, 2, 3, 4], [0.2, 0.6, 0.9, 0.7])  
plt.show()
```



# Matplotlib

## Matrix plots

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

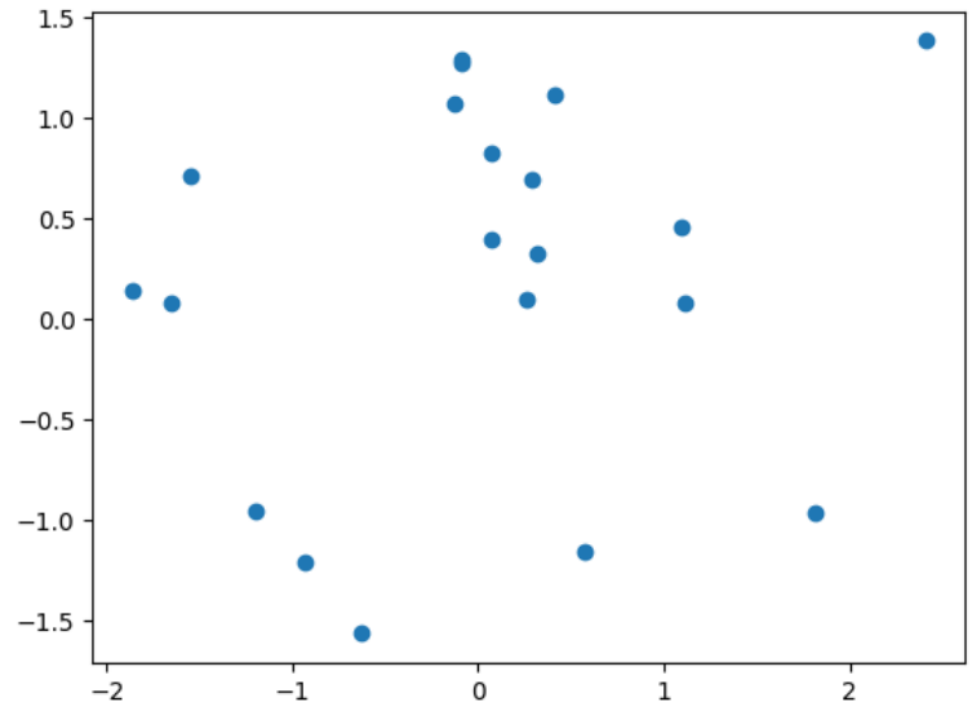




# Matplotlib

## Scatter plots

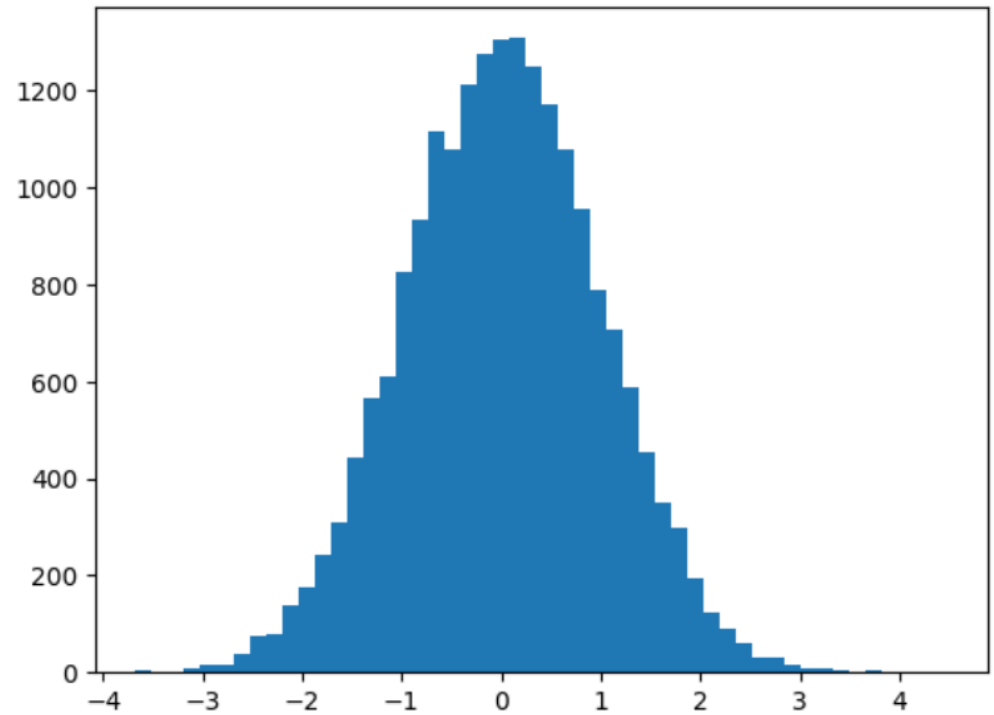
```
x = np.random.randn(20)
y = np.random.randn(20)
fig, ax = plt.subplots()
ax.scatter(x, y)
plt.show()
```



# Matplotlib

## Histograms

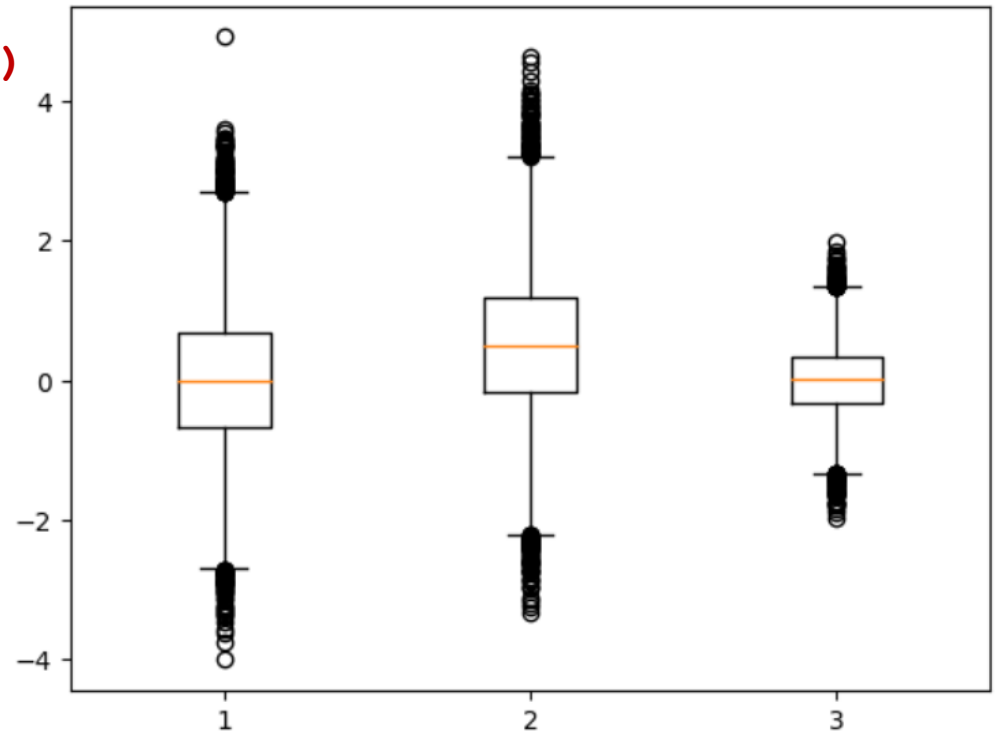
```
x = np.random.randn(20000)
fig, ax = plt.subplots()
ax.hist(x, bins=50)
plt.show()
```



# 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()
```

