

# Python: Object-Oriented Programming

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<https://www.orsys.fr/>

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## About the Seminar

# Introduction

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**Activity** Senior Machine Learning Engineer. Python, ML &  
MLOps Freelance

**Specialization** Natural Language Processing & Machine Learning  
applied to source code

# Requirements

- Basic knowledge of programming
- Have a **Google** account in order to access the labs environments in [Google Colaboratory](#)

# Objectives

- Master the syntax of the Python language
- Acquire the essential notions of object-oriented programming
- Know and implement different Python modules
- Implementing tools for testing and evaluating the quality of a Python program

# Resources

I will give you links to the resources used before and/or after each day.

They are also accessible through [My Orsys](#).

# Schedule

4 days, 9AM to 12:30PM and 1:30PM to 5PM.



# Introduce yourself!

- Your name
- Your job
- Your client company if applicable
- The skills and knowledge you have related to this training session
- Your objectives and expectations for this training session

# Python Language

# History

**1989** Creation of the language by Guido Van Rossum

**2001** Launch of the Python Software Foundation

**2001** Transition to GPL

**2009** Python 3



Logo Python, Python Software Foundation ("PSF"), PSF trademark.

# Characteristics

Python is:

**Interpreted** and compiled on-the-fly, with C modules

**Object-oriented** (but not limited to)

**Portable** Compatible with all current platforms

**Flexible** Swiss Army knife, from system administration to web development

**Popular** Top 5 most used languages for years

# Strengths/Weaknesses

## Strengths

- Stable
- Cross-platform
- Easy to learn
- Large community (most used since 2019)
- Need something? There's a module for it.

## Weaknesses

- Not compiled
  - Slower than low-level languages
  - Optimizing an operation  $\Rightarrow$  not easy to learn

Different interpreters:

- CPython/Pypy  $\Rightarrow$  C/C++
- Jython  $\Rightarrow$  JVM
- IronPython  $\Rightarrow$  .Net

# Domains

Application domains:

- Web (Django, Flask, ...)
- Sciences (Data mining, Machine learning, Physics, ...)
- OS (Linux, Raspberry Pi, System administration scripting, ...)
- Education (Introduction to programming)
- 3D CAD (FreeCAD, pythonCAD, ...)
- Multimedia (Kodi, ...)

# Development Environments

The three main Python IDEs are:

**Visual Studio Code** Free IDE offered by Microsoft

**PyCharm** IDE with both free and professional versions, offered by JetBrains

**Spyder** Open-source and free IDE focused on data science

They all integrate modern development tools.

However, you can of course use your favorite text editor (emacs, vim, atom, sublime text, etc.).



# Python Versions 2 and 3

**Version 2** No longer supported since January 1, 2020. Still present in legacy systems.

**Version 3** Current version of Python  
. All new developments should use it.

# Resources

- [Official Python Documentation](#)
- [Python Learning Reddit \(forum\)](#)
- [Course support, download the PDF](#)
- [Python Tutor](#)

# Installation

Refer to the excellent [blog post](#) on Real Python about the topic.

Do you have any questions ?

# Python Fundamentals

# Python Fundamentals

## Basic Types and Variables

# Introduction to variables

A variable is a *label* assigned to a Python object.

We can use this label instead of the object it refers to at any time in our programs.

# Variable creation

To create a variable, we use the following syntax:

```
answer: int = 42
```



# Variable usage

To use a variable, we just refer to it by its name:

```
>>> answer: int = 42
>>> print(answer)
42
```

# Variable naming

There are two rules to respect when it comes to variables names:

- The names should start by a lowercase letter, uppercase letter or an underscore
- The names should continue by those same characters and you can also mix in digits

## Unicode

From Python 3 on, it's possible to use any unicode letter in variable names. *It's strongly discouraged. Do yourself a favor and stick to ASCII!*

# Basic types

To represent simple values, we mainly use:

- int** Integers
- float** Reals
- str** Strings
- bool** Booleans

# The `type` function

Useful to know the type of an object:

```
>>> question = "What's the answer to the universe?"
>>> answer = 42
>>> type(question)
<class 'str'>
>>> type(answer)
<class 'int'>
```

# Type conversion

We can use the classes that represent basic values to convert to them:

```
>>> float(42)  
42.0
```

Do you have any questions ?

# Python Fundamentals

## Basic Types and Variables

Labs

# Labs

[Instructions](#)



# Python Fundamentals

## Display

# Display function

`print` is the main function to display text in Python:

```
>>> print("Hello World!")  
Hello World!
```

# print arguments

**sep** Displayed between each argument. Default: a space

**end** Displayed after the last argument. Default: a newline

**file** Output file. Default: `sys.stdout`

**flush** Should we flush the buffer? Default: `False`

```
>>> print("Hello", "World", sep=", ", end="!\n")  
Hello, World!
```

# Formatted strings

It's possible to build complex strings with the `format` method:

```
>>> "My name is {lastname}, {firstname} {lastname}.".format(  
...     firstname="James",  
...     lastname="Bond")  
'My name is Bond, James Bond.'
```

The website [PyFormat](#) gives more examples on available options.

# f-strings

`format` has a handy shortcut:

```
>>> firstname = "James"
>>> lastname = "Bond"
>>> f"My name is {lastname}, {firstname} {lastname}."
'My name is Bond, James Bond.'
```

Do you have any questions ?

# Python Fundamentals

## Display

### Labs

# Labs

[Instructions](#)



# Python Fundamentals

## Collections

# Introduction

The 4 main data structures in Python are:

**list** Mutable lists, can be heterogeneous

**dict** Key-value associations

**tuple** Immutable tuples

**set** Sets (no repetition, unordered)

# list characteristics

- Probably the most used collection in Python
- Can contain elements of different types (*not recommended at all*)
- Good performance
- Despite its name, it's closer to an array than to a linked list (e.g.  $\mathcal{O}(1)$  access)
- Not suited for scientific computations (see **numpy** instead)

# list usage

```
>>> l = []                # Create an empty list
>>> l = [1, 2, 3]         # Create a list with elements
>>> l[0]                  # Positive indices
1
>>> l[1]
2
>>> l[-1]                 # Negative indices
3
>>> l[-2]
2
>>> l.append(4)           # Add an element
>>> l.extend([5, 6])      # Add several elements
>>> l.sort(reverse=True)  # Sort, here reversed
>>> len(l)                # Size
6
>>> del l[4]              # Deletion by index
>>> l.remove(1)           # Deletion by value
>>> l
[6, 5, 4, 3]
```

# Slices

A list slice is a subset of a list:

```
>>> l: list[str] = ["a", "b", "c", "d", "e", "f"]
>>> l[0:3]
["a", "b", "c"]
>>> l[:3]
["a", "b", "c"]
>>> l[3:]
["d", "e", "f"]
>>> l[0:3:2]
["a", "c"]
```

# dict characteristics

`dict` allows to define key-value associations:

- Equivalent to JS objects, Java maps
- Access the value associated to a key in  $\mathcal{O}(1)$
- Test if a key is in the dict in  $\mathcal{O}(1)$

# dict usage

```
>>> d = {} # Empty dict creation
>>> d = {"a": 1, "b": 2} # Creation with elements
>>> d = dict([("a", 1), ("b", 2)]) # Creation from an iterable
>>> d = dict(a=1, b=2) # Creation with keyword style
>>> d["a"] # Accessing a value
1
>>> d["c"] = 3 # Modifying or adding an entry
>>> "a" in d # Testing presence
True
>>> "d" in d
False
>>> 1 in d
False
>>> len(d) # Size
3
>>> del d["a"] # Deletion
>>> d
{"b": 2, "c": 3}
```

# tuple characteristics

Very similar to a list, but:

- Immutable
- Suited for elements of different types
- Hashable if its elements are hashable
- Standard way to return several values from a function



# tuple usage

```
>>> t = ()          # Empty tuple creation
>>> t = (1, 2, 3)   # Creation with elements
>>> t[0]             # Positive indices
1
>>> t[1]
2
>>> t[-1]            # Negative indices
3
>>> t[-2]
2
>>> 1 in t           # Presence test
True
>>> 4 in t
False
>>> t + (4, 5, 6)    # Concatenation
(1, 2, 3, 4, 5, 6)
>>> len(t)           # Size
3
```

# Multiple definitions with a tuple

```
>>> a, b = 0, 1
>>> a
0
>>> b
1
```

# Multiple values return with a tuple

```
>>> def sum_and_product(a, b):  
...     return a + b, a * b  
...  
>>> x, y = sum_and_product(3, 4)  
>>> print(f"Sum: {x}, product: {y}")  
Sum: 7, product: 12
```

# set characteristics

sets are unordered and without repetition and provide:

- Math set operations (union, intersection, ...)
- Fast presence test ( $\mathcal{O}(1)$  vs  $\mathcal{O}(n)$  for a `list`)

```
>>> import timeit
>>> timeit.timeit(
...     setup="l = list(range(1_000_000))",
...     stmt="1_000_000 in l",
...     number=1_000)
6.942514133999794
>>> timeit.timeit(
...     setup="s = set(range(1_000_000))",
...     stmt="1_000_000 in s",
...     number=1_000)
2.4280000616272446e-05
```

# set usage

```
>>> s = set() # Empty set creation
>>> s = {"a"} # Creation with elements
>>> s = set(["a"]) # Creation from an iterable
>>> s.add("b") # Add an element
>>> s.update(["c", "d"]) # Add several elements
>>> s
{'c', 'b', 'd', 'a'}
>>> "a" in s # Test presence
True
>>> "e" in s
False
>>> s | {"e", "f"} # Union
{'c', 'b', 'e', 'a', 'f', 'd'}
>>> s & {"a", "e"} # Intersection
{'a'}
>>> s - {"a", "e"} # Difference
{'d', 'c', 'b'}
>>> s < {"a", "b", "c", "d", "e"} # Subset test
True
```

# Immutable sets

`frozenset` is an immutable set alternative.

Similar to what `tuple` is compared to `list`.

Do you have any questions ?

# Python Fundamentals

## Collections

### Labs



# Labs

[Instructions](#)

# Python Fundamentals

## Control Structures

# Introduction

Python has 3 main control structures: `if`, `while` and `for`.

We'll talk about `try/except` later to handle errors.

From Python 3.10 on, there's also a `match` structure but it has few good use cases, we will not study it here.

# if

```
>>> age = 23
>>> if age < 18:
...     print("Minor in France")
... elif age < 21:
...     print("Minor in the US")
... else:
...     print("Adult")
...
Adult
```

## for · With indices

The **range** function can be used to generate indices for iteration:

```
range(10)           # 0, 1, 2, 3, 4, 5, 6, 7, 8, 9
range(1, 10)        # 1, 2, 3, 4, 5, 6, 7, 8, 9
range(1, 10, 2)      # 1, 3, 5, 7, 9
list(range(1, 10, 2)) # [1, 3, 5, 7, 9]
```

Usage in a loop:

```
>>> for i in range(2):
...     print(i)
...
0
1
```

# for · With a list

```
>>> l = ["a", "b"]

>>> for item in l:
...     print(item)
...
a
b

>>> for i in range(len(l)):
...     print(i, l[i])
...
0 a
1 b

>>> for i, item in enumerate(l):
...     print(i, item)
...
0 a
1 b
```

# for · With a dict

```
>>> d = {"a": 1, "b": 2}

>>> for key in d:
...     print(key)
...
a
b

>>> for key, value in d.items():
...     print(key, value)
...
a 1
b 2
```

## for · With several iterables

```
>>> l1 = ["a", "b", "c"]
>>> l2 = [True, False]

>>> for item1, item2 in zip(l1, l2):
...     print(item1, item2)
...
a True
b False

>>> import itertools
>>> for item1, item2 in itertools.zip_longest(l1, l2):
...     print(item1, item2)
...
a True
b False
c None
```

Works with more than 2 iterables.



# while

```
>>> ok = False
>>> while not ok:
...     answer = input("Type y or n: ")
...     ok = answer in {"y", "n"}
...
Type y or n: yes
Type y or n: y
>>> answer
'y'
```

# break & continue

**break** Used to skip to after the most inner loop

**continue** Used to skip to the next iteration of the most inner loop

```
>>> i = 0
>>> while True:
...     i += 1
...     if i < 10:
...         continue
...     if i > 11:
...         break
...     print(i)
...
10
11
```

# else branch for loops

The `else` branch is executed if no `break` was used in the loop body:

```
>>> for i in range(1, 4):  
...     print(i)  
... else:  
...     print("Soleil")  
...  
1  
2  
3  
Soleil
```

```
>>> for i in range(1, 4):  
...     if i == 3:  
...         break  
...     print(i)  
... else:  
...     print("Soleil")  
...  
1  
2
```

Do you have any questions ?

# Python Fundamentals

## Control Structures

### Labs

# Labs

## [Instructions](#)

# Python Fundamentals

## Reading and Writing Files

# Main tools

- **open** function to retrieve an object to manipulate a file
- Usage of a **with** statement to ensure that file closing is handled properly



# with statement

Introduces a context:

- Entering and leaving the context will execute some code, here the opening and closing of the file
- Errors can be handled

## Most important open parameters

**mode** By default, "r" for reading. See [here](#) for all the options.

**encoding** By default, locale dependent. Nowadays, `encoding="utf8"` is almost always what you want.

# Reading

```
>>> with open("example.txt", encoding="utf8") as fh:
...     print(fh.read())
...
My first line
My second line

>>> with open("example.txt", encoding="utf8") as fh:
...     for line in fh:
...         print(line)
...
My first line

My second line

>>> with open("example.txt", encoding="utf8") as fh:
...     lines = fh.readlines()
...     print(len(lines))
...
2
```

# Writing

```
with open("example.txt", mode="w", encoding="utf8") as fh:  
    fh.write("My text\n")  
  
with open("example.txt", mode="w", encoding="utf8") as fh:  
    fh.writelines(["My first line\n", "My second line\n"])
```

# Manipulating two files at once

```
with open("example.txt", encoding="utf8") as fh_read, open(
    "example-upper.txt", mode="w", encoding="utf8"
) as fh_write:
    fh_write.write(fh_read.read().upper())
```

# Newlines

By default, Python 3 understands newlines from all platforms.  
When writing, it will use mostly `\n` as a default option.

Do you have any questions ?

# Python Fundamentals

## Reading and Writing Files

Labs



# Labs

[Instructions](#)

# Python Fundamentals

## Functions

# Introduction

Functions are one of the two main ways (with classes) to organize code.

# Example

```
>>> def add(a: int, b: int) -> int:  
...     return a + b  
...  
>>> add(1, 2)  
3
```

# Default values

```
>>> def add(a: int, b: int = 1) -> int:  
...     return a + b  
...  
>>> add(1, 2)  
3  
>>> add(1)  
2
```

# Mutable default values

## Warning

Never give a mutable default value to a function.

```
>>> def append_to(item: int, lst: list[int] = []) -> list[int]:  
...     lst.append(item)  
...     return lst  
...  
>>> append_to(1)  
[1]  
>>> append_to(1)  
[1, 1]
```

# Keyword style

```
>>> def sub(a: int, b: int) -> int:  
...     return a - b  
...  
>>> sub(3, 2)  
1  
>>> sub(a=3, b=2)  
1  
>>> sub(b=3, a=2)  
-1
```

# Variables scope

In Python, the variables scope is the function (not the block).

```
>>> s: int = 3
>>> def square(n: int) -> int:
...     s = n ** 2
...     return s
...
>>> s
3
>>> square(3)
9
>>> s
3
```



Do you have any questions ?

# Python Fundamentals

## Functions

### Labs

# Labs

[Instructions](#)

# Python Fundamentals

## Object Oriented Programming

# Introduction

Object Oriented Programming is a style of programming with the following goals:

- encapsulation
- modularity
- reusability

# Key idea

Define **objects** that group together:

- data
- methods related to the data

# Objects definition

To define objects, we write a class — a “recipe” to create an object (we also call objects instances):

```
from math import sqrt

class Point:
    def __init__(self, x, y):
        self.x = x
        self.y = y

    def distance(self, other):
        return sqrt((other.x - self.x) ** 2 + (other.y - self.y) ** 2)
```

- `Point` is the name of the class
- `__init__` is a special method to initialize the object
- `self.x` & `self.y` are instance attributes
- `distance` is an arbitrary method we've defined

## Objects usage

Once the class is defined, we can use it as any other class in Python (e.g. `list`):

```
>>> from math import sqrt
>>> class Point:
...     def __init__(self, x, y):
...         self.x = x
...         self.y = y
...     def distance(self, other):
...         return sqrt((other.x - self.x) ** 2
...                     + (other.y - self.y) ** 2)
...
>>> point1 = Point(2, 2)
>>> point2 = Point(-2, -2)
>>> point1.distance(point2)
5.656854249492381
```



# Difference between instance attributes and class attributes

```
>>> class Point:
...     coeff = 5 # Class attribute, accessible to all instances
...     def __init__(self, x, y):
...         self.x = x # Instance attribute
...         self.y = y # Instance attribute
...
>>> point1 = Point(1, 2)
>>> point2 = Point(3, 4)
>>> point1.x, point1.y, point1.coeff
(1, 2, 5)
>>> point2.x, point2.y, point2.coeff
(3, 4, 5)
```

If an instance attribute has the same name as a class attribute, it will shadow it.

## A few important remarks

- The first argument is named `self` by convention
- No notion of visibility in Python (private attributes or methods)
- Instead, we **say** that an attribute or a method is private by using a convention: adding a `_` in front of the name (`self._x`)

# Polymorphism

Adaptation of the behaviour of functions or operators depending on the objects they are applied to.

E.g., the + operator in Python can mean:

- String concatenation
- List concatenation
- Integer addition
- ...

⇒ A different method is called in each case!

## Warning

We also use the term polymorphism for simple functions or class methods, not only for operators.

## Example of polymorphism by operator overloading

```
>>> class Point:
...     def __init__(self, x, y):
...         self.x = x
...         self.y = y
...     def __add__(self, other):
...         return Point(self.x + other.x, self.y + other.y)
...
>>> point1 = Point(2, 3)
>>> point2 = Point(3, 4)
>>> point3 = point1 + point2
>>> point3.x, point3.y
(5, 7)
```

# Inheritance

To define a class, we can start from an existing class instead of from scratch. It's called inheriting from a class:

```
>>> class Rectangle:
...     def __init__(self, width, height):
...         self.width = width
...         self.height = height
...     def area(self):
...         return self.width * self.height
...
>>> class Square(Rectangle):
...     def __init__(self, side):
...         super().__init__(side, side)
...
>>> Square(2).area()
```

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# Multiple inheritance

It's possible to inherit from several classes, not only one.

- The order in which the parent classes are queried to find a function with **super()** is called MRO (*Method Resolution Order*)
- It's possible to access the MRO of a class by its `__mro__` attribute

## Warning

Using multiple inheritance is common but can lead to very complex code.

Do you have any questions ?

# Python Fundamentals

## Object Oriented Programming

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# Labs

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# Python Fundamentals

## Error Handling

# Introduction

Python handles errors with a special construct: `try/except`, and many different exception classes.

# Native exception hierarchy

The [Python doc](#) contains a full list.

# Intercept an error

```
>>> def div(a, b):  
...     try:  
...         return a / b  
...     except ArithmeticError:  
...         return float("nan")  
...  
>>> div(4, 3)  
1.3333333333333333  
>>> div(4, 0)  
nan
```

# Raise an error

```
>>> wind_speed = -9999
>>> if wind_speed < 0:
...     raise ValueError("Speed cannot be negative")
...
Traceback (most recent call last):
  File "<stdin>", line 2, in <module>
ValueError: Speed cannot be negative
```

# Define a custom error

It's possible to inherit from `Exception` or a more specific exception class.

```
class MathError(Exception):  
    pass
```

# Wrapping errors

```
>>> class MathError(Exception):
...     pass
...
>>> try:
...     1 / 0
... except ArithmeticError as e:
...     raise MathError("Division impossible") from e
...
```

```
Traceback (most recent call last):
  File "<stdin>", line 2, in <module>
ZeroDivisionError: division by zero
```

The above exception was the direct cause of the following exception:

```
Traceback (most recent call last):
  File "<stdin>", line 4, in <module>
__main__.MathError: Division impossible
```



# Re-raising errors

```
>>> try:
...     1 / 0
... except ArithmeticError:
...     print("Division impossible")
...     raise
...
Division impossible
Traceback (most recent call last):
  File "<stdin>", line 2, in <module>
ZeroDivisionError: division by zero
```

# finally

The `finally` keyword is used to ensure that some code is executed regardless of whether an exception has occurred or not.

More details in the [doc](#).

```
>>> try:
...     1 / 0
... finally:
...     print("Hello World")
...
Hello World
Traceback (most recent call last):
  File "<stdin>", line 2, in <module>
ZeroDivisionError: division by zero
```

# else

Just like for loops, the **else** branch is executed if the **try** branch is completed without an error.

Do you have any questions ?

# Python Fundamentals

## Native Functions

# Introduction

Some functions do not require an import, they are always available.  
The complete list is available in the [Python documentation](#).

# Basic types

```
>>> int(42.0)
```

```
42
```

```
>>> str()
```

```
''
```

# Iteration

```
>>> list(enumerate(["a", "b", "c"]))
[(0, 'a'), (1, 'b'), (2, 'c')]

>>> list(zip(["a", "b", "c"], [10, 20, 30]))
[('a', 10), ('b', 20), ('c', 30)]

>>> list(map(float, [1, 2, 3]))
[1.0, 2.0, 3.0]

>>> list(range(10))
[0, 1, 2, 3, 4, 5, 6, 7, 8, 9]

>>> list(reversed([1, 2, 3]))
[3, 2, 1]

>>> sorted([3, 1, 2])
[1, 2, 3]
```



# Aggregation

```
>>> all([0, 42])
False

>>> any([0, 42])
True

>>> sum([1, 2, 3])
6

>>> max([1, 2, 3])
3

>>> min([1, 2, 3])
1
```

# Objects manipulation

```
>>> class A:
...     pass
...
>>> a = A()

>>> setattr(a, "x", 3)
>>> a.x
3

>>> getattr(a, "x")
3

>>> delattr(a, "x")
>>> a.x
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
AttributeError: 'A' object has no attribute 'x'
```

# Type testing

```
>>> callable(int)
True
>>> callable(42)
False

>>> type(True)
bool

>>> isinstance(True, int)
True
>>> type(True) == int
False

>>> issubclass(bool, int)
True
```

# Basic operations

```
>>> abs(-42)
42

>>> divmod(10, 3)
(3, 1)

>>> pow(2, 3)
8

>>> pow(3, 2, 4)
1
```

Do you have any questions ?

# Python Software Engineering

# Python Software Engineering

## Software Environment Management

# Introduction

Control your software environment to :

- Make your development environment reproducible
- Control dependencies for production
- Deploy your environment easily on different clouds



## Environment Isolation — `venv`

`venv` allows Python environments isolation. A virtual environment:

- Does not interact with the system environment
- Can coexist with other virtual environments
- Is faster than a container-based solution
- Is a copy of a base Python distribution

# Using venv

```
$ python3 -m venv .venv  
$ source .venv/bin/activate  
(.venv) $ pip install requests
```

# Dependency Control

Goal : precisely describe which libraries (and their versions) are used.

Several good tools :

**pip + requirements.txt** Simple list of dependencies

**conda/mamba** Environment management, including native dependencies

**poetry** Application or library definition inspired by Cargo

**uv** Similar to **poetry**, more comprehensive

# Using uv

Some useful [commands](#) for dependency management:

**uv init** Creates a Python package skeleton managed by uv

**uv add** Adds a package as a project dependency

**uv remove** Removes a package from project dependencies

**uv sync --frozen** Installs dependencies exactly as specified in the `uv.lock` file (automatically managed by uv)

**uv export** Exports the `uv.lock` file to the `requirements.txt` format

# Facilitating Deployment

A few platforms accept Python packages for deployment.

Most often, an intermediate step is required before deployment: transforming into a container. It brings:

- Control over native libraries in addition to Python libraries
- Greater robustness if the software runs on multiple OS
- A heavier setup than **venv**
- A more suitable format for production (easy deployment via Kubernetes)

⇒ Dockerization of Python packages using a **Dockerfile**

# Dockerfile Example

```
FROM python:3.14-slim-trixie
WORKDIR /app
RUN apt update \
    && apt install -y --no-install-recommends \
        build-essential python3-dev gfortran libgl1-mesa-glx \
        libopenblas-dev liblapack-dev
COPY --from=ghcr.io/astral-sh/uv:latest /uv /uvx /bin/
COPY ./uv.lock ./pyproject.toml ./
RUN uv sync --frozen --no-install-project --no-dev
COPY . .
RUN uv sync --frozen
CMD ["uv", "run", "landscaped"]
```

# Multi-Stage Dockerfile with uv Example

```
FROM python:3.14-slim-trixie AS base
WORKDIR /app

FROM base AS uv
COPY --from=ghcr.io/astral-sh/uv:0.9.8 /uv /uvx /bin/
COPY uv.lock pyproject.toml /app/
RUN uv export --frozen --no-dev --no-emit-project -o requirements.txt

FROM base
COPY --from=uv /app/requirements.txt /app/requirements.txt
RUN pip install --no-cache-dir -r requirements.txt
COPY ./pyproject.toml ./README.md ./src ./
RUN pip install .
CMD ["uvicorn", "landscape_classifier.api:app", "--host", "0.0.0.0",
    "--port", "80"]
```

# Multi-Stage Dockerfile with poetry Example

```
FROM python:3.14-slim-trixie AS base
WORKDIR /app

FROM base AS poetry
RUN pip install --no-cache-dir 'poetry == 1.8.2'
COPY poetry.lock pyproject.toml /app/
RUN poetry export -o requirements.txt

FROM base
COPY --from=poetry /app/requirements.txt /app/requirements.txt
RUN pip install --no-cache-dir -r requirements.txt
COPY ./pyproject.toml ./README.md ./src ./
RUN pip install .
CMD ["uvicorn", "landscape_classifier.api:app", "--host", "0.0.0.0",
    "--port", "80"]
```



Do you have any questions ?

# Python Software Engineering

## Software Environment Management

### Demonstration

# Demonstration

The different systems seen during the demonstration are :

- [pip install -r requirements.txt](#) and [pip freeze](#) to freeze versions
- [venv](#)
- [uv](#), the tool I recommend for managing Python environments

# Python Software Engineering

## Python Code Typing

# Introduction

Adding type annotations is probably the greatest improvement one can make to a Python codebase:

- Allows for aggressive software modifications
- Resolves a large number of bugs before integration into the codebase
- Documents the code
- Enables automatic generation (CLI with Typer, for example)

The transition to a typed codebase can be gradual.

# Typing Notations

An expression is typed by preceding the type annotation with `:`.

For function return types, we use `->`.

```
def add(a: int, b: int) -> int:  
    return a + b
```

# Behavior in Python

```
>>> def add(a: int, b: int) -> int:
...     return a + b
...
>>> add("Hello ", "World!")
'Hello World!'
```

Python does not check types at runtime. To verify them, we use **mypy** beforehand :

```
$ mypy type-hints.py
type-hints.py:5: error: Argument 1 to "add" has incompatible type "str";
expected "int" [arg-type]
type-hints.py:5: error: Argument 2 to "add" has incompatible type "str";
expected "int" [arg-type]
Found 2 errors in 1 file (checked 1 source file)
```

# Best Practices

- Automatic usage in production pipelines (continuous integration)
- Configuration within the development environment
- Gradual typing of an existing codebase if necessary



# Configuration

In the `pyproject.toml` file :

```
[tool.mypy]
disallow_untyped_defs = true
ignore_missing_imports = true
strict_optional = true
```

# Resources

- Documentation for [mypy](#)
- Documentation for the [typing](#) module

Do you have any questions ?

# Python Software Engineering

## Python Code Typing

### Generics

# Introduction

Generics allow functions or classes that manipulate arbitrary types to be typed.

```
from collections.abc import Sequence

def first[T](seq: Sequence[T]) -> T:
    return seq[0]
```

## Difference with `typing.Any`

A type variable allows linking the type of multiple values, whereas `typing.Any` is a wildcard:

```
from collections.abc import Sequence
from typing import Any

def first_any(seq: Sequence[Any]) -> Any:
    return seq[0]

def first_typevar[T](seq: Sequence[T]) -> T:
    return seq[0]

data = [0, 1]
first_any(data).upper()
first_typevar(data).upper() # "int" has no attribute "upper"
```

# Generics in a Class

```
class Stack[T]:
    def __init__(self) -> None:
        self.items: list[T] = []

    def push(self, item: T) -> None:
        self.items.append(item)

    def pop(self) -> T:
        return self.items.pop()

    def empty(self) -> bool:
        return not self.items

s: Stack[str] = Stack()
s.push("abc")
s.push(1) # Argument 1 to "push" of "Stack" has incompatible type "int";
          # expected "str"
```

Do you have any questions ?



# Python Software Engineering

## Python Code Typing

### Protocols

# Introduction

Protocols define interface-like structures without relying on object hierarchy.

Instead, they use structural typing.

# Structural Subtyping

Structural subtyping is based on the attributes and methods of an object rather than class hierarchy, as in traditional object-oriented programming.

Also known as *Duck Typing*:

*If it has two legs and quacks, it's a duck.*

# Defining a Protocol

```
from pathlib import Path
from typing import Protocol

class SupportsSave(Protocol):
    def save(self, path: Path) -> None: ...
```

# Using a Protocol

```
from collections.abc import Iterable
from pathlib import Path

class Resource:
    ...

    def save(self, path: Path) -> None:
        self._resource.save(path)

    ...

def save_all(items: Iterable[SupportsSave],
             paths: Iterable[Path]) -> None:
    for item, path in zip(items, paths):
        item.save(path)

resources = [Resource(), Resource()]
paths = [Path.home() / "1.bin", Path.home() / "2.bin"]
save_all(resources, paths)
```

# Protocols Available in the Standard Library

- In the module [collections.abc](#)
- In the module [typing](#)

# Alternatives

`abc.ABCs` and informal interfaces can complement or replace protocols depending on the use case, but protocols remain the most precise way to specify interfaces.

Do you have any questions ?



# Python Software Engineering

## Python Code Typing

Some More Typing Elements

# typing.NewType

**NewType** creates a distinct type from an existing type.

```
from typing import NewType

# New type definition based on str
UserName = NewType("UserName", str)

# Variable creation with the new type
user_name = UserName("Jean Martin")

def get_first_name(user_name: UserName) -> str:
    return user_name.split(" ")[0]

# Ok
print(get_first_name(user_name))
# mypy error
print(get_first_name("Marie Jeanne"))
```

The new type retains all the functionalities of the class it derives from and has no impact at runtime.

# typing.NewType

**Warning:** `NewType` does not actually define a new class and therefore cannot be the parent of another class:

```
>>> from typing import NewType
>>>
>>> # New type definition
>>> UserName = NewType('UserName', str)
>>>
>>> class User(UserName):
>>>     pass
TypeError: Cannot subclass an instance of NewType.
```

# typing.TYPE\_CHECKING

`TYPE_CHECKING` is a variable that is always `False` at runtime but is `True` when using `mypy` or another static type checking tool.

```
>>> from typing import TYPE_CHECKING
>>> if TYPE_CHECKING:
>>>     # Required for mypy but not during runtime
>>>     from collections.abc import Iterable
>>>
>>> def print_all(iterable: 'Iterable') -> None:
>>>     pass
>>>
>>> print(Iterable)
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
NameError: name 'Iterable' is not defined
```

# typing.Literal

**Literal** allows defining a type that accepts a finite list of values.

```
from typing import Literal

type Action = Literal["rock", "paper", "scissors"]
type Winner = Literal["p1", "p2", "draw"]

def rock_paper_scissors(action_p1: Action, action_p2: Action) -> Winner:
    pass
```

# typing.overload

**overload** is a decorator that allows defining multiple signatures for the same function.

```
from collections.abc import Sequence
from typing import overload

class MyList[T](Sequence[T]):
    @overload
    def __getitem__(self, index: int) -> T:
        ...
    @overload
    def __getitem__(self, index: slice) -> Sequence[T]:
        ...
    def __getitem__(self, index: int | slice) -> T | Sequence[T]:
        if isinstance(index, int):
            # Return a T here
        elif isinstance(index, slice):
            # Return a sequence of Ts here
        else:
            raise TypeError(...)
```

Do you have any questions ?

# Python Software Engineering

Python Code Typing

Python Versions Differences



# Typing Collections from the Standard Library

Python < 3.9:

```
from typing import Dict  
  
d: Dict[str, int] = {"a": 1}
```

Python  $\geq$  3.9:

```
d: dict[str, int] = {"a": 1}
```

# Typing Protocols

Python < 3.9:

```
from typing import Iterable

def print_iterable_upper(iterable: Iterable[str]):
    for item in iterable:
        print(item.upper())
```

Python ≥ 3.9:

```
from collections.abc import Iterable

def print_iterable_upper(iterable: Iterable[str]):
    for item in iterable:
        print(item.upper())
```

# Typing Unions

Python < 3.10:

```
from typing import Optional, Union

d: Union[dict[str, int], None] = None
d: Optional[dict[str, int]] = None
...
d = {"a": 1}
```

Python  $\geq$  3.10:

```
d: dict[str, int] | None = None
...
d = {"a": 1}
```

# Typing Generic Types

Python < 3.12:

```
from collections.abc import Sequence
from typing import TypeVar

T = TypeVar("T")

def first(seq: Sequence[T]) -> T:
    return seq[0]
```

Python  $\geq$  3.12:

```
from collections.abc import Sequence

def first[T](seq: Sequence[T]) -> T:
    return seq[0]
```

Do you have any questions ?

# Python Software Engineering

## Python Linting

# Introduction

Goals:

- Compliance with standards within a team
- Minimizing time lost in code reviews
- Producing more maintainable software

# Possibilities

The major points that are usually checked:

- Code style
- Patterns that are often bugs
- Missing or incomplete documentation
- Compliance with best practices
- ...



# Tools

Common tools:

- [flake8](#)
- [pylint](#)
- [black](#)
- [isort](#)
- [pydocstyle](#)

A modern alternative to all these tools : [ruff](#).

# General Checks

The essential tool is **ruff**. Depending on the [rules](#) enabled, it will check:

- Common bugs
- Usage of deprecated features
- Suboptimal code patterns
- Code complexity
- Naming conventions
- Documentation
- ...

# Configuration of `ruff`

`ruff` is configured in the `pyproject.toml` file at the root of your project.

```
[tool.ruff]
target-version = "py312"

[tool.ruff.lint]
preview = true
select = ["E4", "E7", "E9", "F", "B"]
```

# Style Verification

To handle code style, I strongly recommend using **ruff** with formatting on save:

- Automatic formatting (transformation of source code into a syntax tree and then back into source code  $\Rightarrow$  original formatting is ignored)
- Ability to check application across the codebase
- Consistent style
- No more style issues in code reviews!

There are [instructions](#) for each editor in the **ruff** documentation.

# Usage Recommendations

Recommended: group checks into a single command (e.g., using a Makefile).

- Run these checks before each PR (git hook possible)
- Integrate them into CI
- A PR should not be reviewed until these issues are resolved

# Configuration

- Define as a team which points to check
- Regularly analyze the cost/benefit of each verified element
- Add or remove checks based on these analyses

# Reproducibility

Verification tools should be managed like dependencies:

- Each colleague should get the same results given the same codebase
- The tools should be easy to install, including in CI

However, be careful not to install these dependencies in production.

Do you have any questions ?



# Python Software Engineering

## Python Linting

### Labs

# Labs

## [Instructions](#)

# Python Software Engineering

## Python Packages Creation

# Introduction

Goals :

- Be able to publish a Python project as a package on PyPI
- Define the required project dependencies and metadata

# Python Package

To transform a folder containing Python sources into a package :

- Add an `__init__.py` file in each source folder
- Add metadata (depends on the build tool)

# Tools

- `setup.py`, & `setuptools`
- `Pipenv`
- `poetry`
- `hatchling`
- `uv`

I recommend `uv`. A simple, modern, and complete tool.

# Structure of a package managed by uv

```
demo-package
├── pyproject.toml
├── README.md
├── src
│   └── demo_package
│       ├── __init__.py
│       └── py.typed
```

## Warning

The source folder name is `src`, followed by the project name with `-` replaced by `_`

# pyproject.toml File

Standard since PEP 518 :

- Defines the package build tool to use
- Contains metadata
- Specifies dependencies, including development and extras
- Adopted across the entire tooling ecosystem



# Example of a `pyproject.toml` File

```
[project]
authors = [{name = "m09", email = "142691+m09@users.noreply.github.com"}]
dependencies = ["jupyter >= 1, < 2"]
description = "Experiment with landscape classifying."
license = "Apache-2.0"
name = "landscape-classifier"
readme = "README.md"
requires-python = ">= 3.12"
version = "0.1.0"

[dependency-groups]
dev = ["mypy >= 1"]

[project.scripts]
landscape-classifier = "landscape_classifier.cli:main"

[build-system]
build-backend = "hatchling.build"
requires = ["hatchling"]
```

# Using uv

Some useful [commands](#) for package management:

**uv build** Builds the package distribution

**uv publish** Publishes the package on PyPI

# PyPI Repository

Repository for Python projects :

- Usable with **pip**, **poetry**, **Pipenv**, **uv**, ...
- It is not possible to replace the files of a version with new files
- Can be used in CI pipelines

Do you have any questions ?

# Python Software Engineering

## Python Packages Creation

Labs

# Labs

[Instructions](#)

# Python Software Engineering

## Deployment

# Introduction

Goals:

- Make the software available to the rest of the company / the public
- Automate the process
- Deploy frequently to avoid the tunnel effect



# Deployment Levels

Deployment is usually done at several levels:

**Local** Machine of the developer

**Development** Machine or cluster for initial deployment tests

**Integration** Continuous integration environment

**Staging** Exact replica of the production environment

**Production** System used by end users

# Continuous Delivery and Continuous Deployment

In English, both are referred to as CD (*Continuous Delivery* and *Continuous Deployment*).

## Continuous Delivery

- Short software production cycles
- Regular production of deliverables
- Manual deployment

## Continuous Deployment

Like continuous delivery, but with regular and automated deployment.

# Best Practices

- Use a controlled environment
- Deploy automatically on a Git tag of a certain format
- Use tools like GitHub Actions, Travis, Jenkins, CircleCI, ...

# Example Configuration

```
name: CD

on:
  push:
    tags:
      - "v*"

jobs:
  deploy-pypi:
    name: Deploy to PyPI
    runs-on: ubuntu-latest
    steps:
      - name: Checkout code
        uses: actions/checkout@v4
      - name: Install uv
        uses: astral-sh/setup-uv@v4
      - name: Publish to PyPI
        run: |
          uv build
          uv publish
```

Do you have any questions ?

# Python Software Engineering

## Command Line Interfaces

# Introduction

Goals:

- Create easily manageable tools
- Enable scripting from your Python programs

# Mechanisms

- `sys.argv` is an array that contains the arguments passed to your program
- `argparse`, `click`, or `Typer` parse this array for you



# argparse

To define a CLI with **argparse**, you need to:

- Create a parser
- Call this parser from the program's entrypoint
- Process the parsed arguments

# Creating a Parser

Create an `argparse.ArgumentParser` and then add arguments using the `add_argument` method:

```
import argparse

parser = argparse.ArgumentParser(description="Create datasets.")
parser.add_argument("output_dir", help="Path to the directory.")
parser.add_argument("--langs", nargs="+", help="Langs to consider.")
parser.add_argument("--max-size", type=int, help="Maximum size in ko.")
```

## Adding an Argument

You can specify many options to `add_argument`. Among them:

- A short option ("`-d`") and a long one ("`--directory`")
- A help string (`help="Argument help."`)
- A type (`type=int`)
- An action, for example, to create boolean flags
- A default value

The [official documentation](#) is very comprehensive.

# Usage

Call the `parse_args` method and then process the retrieved arguments.

```
import argparse

from .dataset import create_csv_dataset_from_dump

parser = argparse.ArgumentParser(description="Create datasets.")
parser.add_argument("output_dir", help="Path to the directory.")
parser.add_argument("--langs", nargs="+", help="Langs to consider.")
parser.add_argument("--max-size", type=int, help="Maximum size in ko.")

args = parser.parse_args()

create_csv_dataset_from_dump(args.output_dir,
                             langs=args.langs,
                             max_size=args.max_size)
```

# Multiple Commands

Ability to define multiple commands: create subparsers and then handle them like the main parser:

```
import argparse

parser = argparse.ArgumentParser(description="Create datasets.")
subparsers = parser.add_subparsers(help="Commands", dest="command")

download_parser = subparsers.add_parser("download")
download_parser.add_argument("output_dir")

dataset_parser = subparsers.add_parser("dataset")
dataset_parser.add_argument("dumps_folder_path")
```

# Usage

```
args = parser.parse_args()
if args.command == "download":
    downloader = Downloader(args.output_dir)
    downloader.download_all_wiktionaries()
elif args.command == "dataset":
    create_csv_dataset_from_dump(args.dumps_folder_path)
```

## Some Perks Provided by `argparse`

- Automatically generated help
- Informative error messages when arguments are incorrect

Do you have any questions ?



# Python Software Engineering

## Command Line Interfaces

Labs

# Labs

## [Instructions](#)

## Important Modules of the Standard Library

# Important Modules of the Standard Library

## File Manipulation

# Introduction

In Python, file manipulation is mainly done using 4 modules:

**shutil** High-level copy and move operations

**os** Low-level operations

**pathlib** Modern replacement for part of **os**

**tempfile** Creation of temporary files and directories

# Navigation · `pathlib` module

```
>>> import pathlib

>>> formations_dir = pathlib.Path.home() / "work" / "formations"
>>> formations_dir
PosixPath('/home/mog/work/formations')
>>> str(formations_dir)
'/home/mog/work/formations'

>>> config_file = formations_dir / "config.yml"
>>> config_file.with_suffix(".txt")
PosixPath('/home/mog/work/formations/config.txt')
>>> config_file.name
'config.yml'

>>> for item in formations_dir.iterdir():
...     print(item)
...
/home/mog/work/formations/formation.sty
/home/mog/work/formations/.git
```

## Using wildcards

It is possible to use wildcards thanks to the `pathlib.Path.glob` and `pathlib.Path.rglob` functions:

```
>>> import pathlib

>>> home = pathlib.Path.home()
>>> for jpg in home.rglob("*.jpg"):
...     print(jpg)
...
/home/mog/pictures/cat.jpg
/home/mog/pictures/dog.jpg
/home/mog/work/formations/img/python-logo.jpg
```

## Rest of the `pathlib` API

See the excellent [official documentation](#) to discover the full API.



## Copying, moving & deleting files and directories

**shutil.copy** Copy without metadata

**shutil.copy2** Copy with metadata

**shutil.copytree** Copy a directory

**shutil.move** Move a file or directory

**pathlib.Path.unlink** Delete a file

**shutil.rmtree** Delete a directory

## Example use of `shutil`

```
import pathlib
import shutil

home = pathlib.Path.home()
formations_dir = home / "formations"
backup_dir = home / "backup-formations"
old_backup_dir = home / "backup-formations-old"

if backup_dir.exists():
    shutil.move(backup_dir, old_backup_dir)

shutil.copytree(formations_dir, backup_dir)

if old_backup_dir.exists():
    shutil.rmtree(old_backup_dir)
```

# Temporary files and directories

**tempfile.TemporaryFile** Create a temporary file

**tempfile.NamedTemporaryFile** Create a temporary file whose name is accessible (not only the object)

**tempfile.TemporaryDirectory** Create a temporary directory

All these methods are used within a **with** block to ensure that files/directories are removed.

```
import tempfile

with tempfile.TemporaryFile(mode="w+", encoding="utf8") as fh:
    fh.write(template.render())
```

## Creating archives

`shutil.make_archive` creates compressed archives when the corresponding modules are available.

## Managing permissions, groups, and owners

The `os` module contains all these functions when they are exposed by the operating system.

Do you have any questions ?

# Important Modules of the Standard Library

## Environment Variables

# Introduction

Environment variables are key for:

- Retrieving system configuration
- Easily deploying Python applications
- Providing an alternative interface to a CLI



## Retrieving or modifying an environment variable

Two options:

**os.environ** Dictionary with textual values

**os.environb** Dictionary with binary values

Environment variables are retrieved at the moment the **os** module is imported.

Do you have any questions ?

# Important Modules of the Standard Library

## Standard Streams

# Introduction

The input, output, and error standard streams are privileged communication channels for system tools.

# Access in Python

Through the `sys` module:

- `sys.stdin`
- `sys.stdout`
- `sys.stderr`

These streams are exposed as files.

## Easy handling of `stdin` to create system tools

The `fileinput` module allows you to create tools that work on either:

- Lines from standard input
- Lines contained in the files whose names are given as arguments

⇒ Easy definition of standard UNIX-style tools.

# Redirection of standard output and error

The `contextlib` module provides two useful functions:

- `redirect_stdout`
- `redirect_stderr`

Do you have any questions ?



# Important Modules of the Standard Library

## External Commands

# Introduction

The **subprocess** module allows you to:

- execute system commands
- set up pipelines as you would in a terminal
- capture the output of commands instead of simply displaying it
- check the return code

And much more: [official documentation](#)

# Code example

```
>>> import subprocess
>>> subprocess.run(["grep",
...                 "linux-libc-dev",
...                 "/var/log/apt/history.log"])
...
Upgrade: linux-libc-dev:amd64 (5.15.0-105.115, 5.15.0-106.116)
CompletedProcess(args=['grep',
                       'linux-libc-dev',
                       '/var/log/apt/history.log'],
                  returncode=0)
```

Do you have any questions ?

# Important Modules of the Standard Library

## Labs

# Labs

[Instructions](#)

# Important Modules of the Standard Library

## Regular Expressions

# Introduction

Capture and manipulation of strings using patterns.

**Example: add a space after each punctuation**

“The cat eats,quietly,its food.John is moved.”



“The cat eats, quietly, its food. John is moved. ”



## Possibilities

Once we have defined a pattern, we can:

- delete it
- modify it
- reuse it
- ...

# Special characters

- ^ line start (or negation of a character class)
- \$ line end
- . wildcard (matches any character)
- [ opening of a character class
- ] closing of a character class
- ( opening of a capture group
- ) closing of a capture group
- ? 0 or 1 appearance of a pattern
- \* 0 to  $\infty$  appearances of a pattern
- + 1 to  $\infty$  appearances of a pattern
- { opening of a repetition specifier
- } closing of a repetition specifier
- \ escape character or special sequence
- | logical or between patterns

# re.match

```
import re

patterns = ["a.*s", "^b", "s$", "a+b", "a{4,5}b", "y*b"]
test_string = "baaabyys"
for pattern in patterns:
    if re.match(pattern, test_string):
        print(f"{pattern:10} matched")
    else:
        print(f"{pattern:10} did not match")
```

a.*s	did not match
^b	matched
s\$	did not match
a+b	did not match
a{4,5}b	did not match
y*b	matched

# re.search

```
import re

patterns = ["a.*s", "^b", "s$", "a+b", "a{4,5}b", "y*b"]
test_string = "baaabyys"
for pattern in patterns:
    if re.search(pattern, test_string):
        print(f"{pattern:10} matched")
    else:
        print(f"{pattern:10} did not match")
```

```
a.*s      matched
^b        matched
s$        matched
a+b       matched
a{4,5}b   did not match
y*b       matched
```

# re.search

```
import re

pattern = "a.y"
test_string = "baaabyys"
result = re.search(pattern, test_string)
print(f"Capture of characters {result.start()} to {result.end()}")
print(f"Captured group: {result.group()!r}")
```

```
Capture of characters 3 to 6
Captured group: 'aby'
```

# re.findall

```
import re

pattern = "b.."
test_string = "baaabyys"
result = re.findall(pattern, test_string)
print(result)
```

```
['baa', 'byy']
```

# re.finditer

```
import re

pattern = "b.."
test_string = "baaabyys"
result = re.finditer(pattern, test_string)
for r in result:
    print(f"{r.group()!r} from {r.start()} to {r.end()}")
```

```
'baa' from 0 to 3
'byy' from 4 to 7
```

## Special sequences with \

**\d** digits  $\iff$  `[0-9]`

**\D** non-digits  $\iff$  `[^0-9]`

**\s** whitespace  $\iff$  `[\t\n\r\f\v]`

**\S** non-whitespace  $\iff$  `[^\t\n\r\f\v]`

**\w** alpha-numercial  $\iff$  `[a-zA-Z0-9_]`

**\W** non-alpha-numercial  $\iff$  `[^a-zA-Z0-9_]`

Also used as an escape character (e.g. `\.` to match a full stop).



# Raw strings

\ is already an escape character for regular Python strings.

Raw strings disable this.

```
string = "before\nafter"  
raw_string = r"before\nafter"  
print(f"String: {string}")  
print(f"Raw string: {raw_string}")
```

```
String: before  
after  
Raw string : before\nafter
```

## Raw strings & patterns

```
import re

pattern_raw = "\\\\"
pattern_normal = r"\\"
test_normal = "before\nafter"
test_raw = r"before\nafter"
for pattern in [pattern_normal, pattern_raw]:
    for test in [test_normal, test_raw]:
        if re.search(pattern, test):
            print("matched")
        else:
            print("did not match")
```

```
did not match
matched
did not match
matched
```

# Compiling patterns — Flag `re.IGNORECASE` (`re.I`)

Case-insensitive matching.

```
import re

test = "0ab12Ab3491019AB"
pattern = re.compile(r"\d+[ab]")
print(pattern.findall(test))
pattern = re.compile(r"\d+[ab]\D*", re.IGNORECASE)
print(pattern.findall(test))
```

```
['0a']
['0ab', '12Ab', '3491019AB']
```

## Compiling patterns — Flag `re.ASCII` (`re.A`)

Force ASCII character sequences.

```
import re

test = "Élève très studieux"
pattern = re.compile(r"\w+")
print(pattern.findall(test))
pattern = re.compile(r"\w+", re.ASCII)
print(pattern.findall(test))
```

```
['Élève', 'très', 'studieux']
['l', 've', 'tr', 's', 'studieux']
```

# Compiling patterns — Flag `re.VERBOSE` (`re.X`)

Allow a more readable syntax.

```
import re

charref = re.compile(
    r"""
        &[#]                # Start of a numerical entity reference
        (
            0[0-7]+         # Octal form
            | [0-9]+         # Decimal form
            | x[0-9a-fA-F]+   # Hexadecimal form
        )
        ;                  # Final semicolon
    """,
    re.VERBOSE,
)

charref = re.compile("&#(0[0-7]+|[0-9]+|x[0-9a-fA-F]+);")
```

## Compiling patterns — Other flags

**re.DOTALL** . also captures newlines

**re.LOCALE** Uses the locale to define character sequences

**re.MULTILINE** ^ & \$ match line start & line end instead of string start & string end

# Capture group

```
import re

pattern = re.compile(r"([a-zA-Z]+)(\d+)g*")
r = pattern.finditer("A361224g B4012_w44g")
for res in r:
    print(res.group(0), res.group(1), res.group(2))
```

```
A361224g A 361224
B4012 B 4012
w44g w 44
```

# Repetition

```
import re

pattern = re.compile(r"(b.d)+")
r = pattern.finditer("abdbzbdbdbhdefgh")
for res in r:
    print(res.group(0), res.group(1), res.span())
```

```
bdbzbdbdbhd bhd (1, 13)
```



# Substitution

```
import re

p = re.compile("(blue|red|green)")
print(p.sub("colour", "blue socks and red shoes"))
print(p.sub("colour", "blue socks and red shoes", count=1))
```

```
colour socks and colour shoes
colour socks and red shoes
```

## Substitution with group

It's possible to use captured groups in substitutions (and it's extremely powerful):

```
import re

test = '{"first_name":"James","last_name":"Bond"}'
p = re.compile(r'^\{"(\S+)": "(\S+)", "(\S+)": "(\S+)"\}$')
print(p.sub(r"Person(\1='\2', \3='\4')", test))
```

```
Person(first_name='James', last_name='Bond')
```

# Splitting

```
import re

test = "I love, regular. expressions"
p = re.compile(r"\W+")
print(p.split(test))

['I', 'love', 'regular', 'expressions']
```

Do you have any questions ?

# Important Modules of the Standard Library

## Regular Expressions

Labs

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# Important Modules of the Standard Library

## Databases

# Introduction

Relational databases fulfill several needs:

- Structuring data
- Decoupling physical and logical data representations
- Providing transactional capabilities



# Key Concepts

- Data is represented as a set of tables
- Each table is a two-dimensional array
- Each data point is represented by a tuple of attributes
- Links between tables establish relationships between entities

**Table 1 – People**

Id	Age	Weight	Height
1	52	75	178
2	34	76	165
3	18	60	170

**Table 2 – Activities**

Id	Type	Duration	PersonId
1	Bike	23	1
2	Swim	46	1
3	Swim	18	3

## Other Important Concepts

- Each record has a primary key that uniquely identifies it without duplication
- Ability to work transactionally: all modifications are performed atomically, or none are performed

## Possible Relationships Between Entities

Relationships are mainly distinguished by their cardinality:

- 1 to 1
- 1 to many
- many to 1
- many to many

Some libraries offer nuances, such as whether to cascade delete or not.

# SQL Language

SQL (Structured Query Language) allows manipulation of data in a relational database.

It is not strictly necessary to work with databases in Python, as we'll see shortly.

# Implementation

To interact with databases, the most used library is SQLAlchemy.

Versatile, simple for straightforward cases, configurable for complex cases.

# Connecting to a Database

Using a URI. The URI includes:

- Database type
- Driver
- User
- Password
- Server address
- Database name

The `echo` option enables debug output.

```
from sqlalchemy import create_engine

engine = create_engine(
    "postgresql+psycopg2://user:password@host/database",
    echo=True)
```

# Reading Data

```
from sqlalchemy import select, text

# SQL Style
with engine.begin() as conn:
    result = conn.execute(text("SELECT x, y FROM some_table"))
    for row in result:
        print(f"x: {row.x} y: {row.y}")

# SQLAchemy Core methods style
with engine.begin() as conn:
    result = conn.execute(select(some_table.c.x, some_table.c.y))
```

# Writing Data

```
from sqlalchemy import insert, text

# SQL Style
with engine.begin() as conn:
    conn.execute(
        text("INSERT INTO some_table (x, y) VALUES (:x, :y)"),
        [{"x": 6, "y": 8}, {"x": 9, "y": 10}],
    )

# SQLAlchemy Core methods style
with engine.begin() as conn:
    conn.execute(insert(some_table),
                  [{"x": 6, "y": 8}, {"x": 9, "y": 10}])
```



# ORM

In addition to being an SQL engine, SQLAlchemy offers an ORM:

- Model described by Python classes
- Objects synchronized between the database and Python code

# Creating Tables

```
from sqlalchemy.orm import declarative_base

Base = declarative_base()

class User(Base):
    __tablename__ = "users"

    id = Column(Integer, primary_key=True)
    name = Column(String(30))
    fullname = Column(String)

Base.metadata.create_all(engine)
```

# Inserting with ORM

```
from sqlalchemy.orm import Session

with Session(engine) as session:
    hugo = User(name="hugo", fullname="Hugo Mougard")
    john = User(name="john", fullname="John Doe")

    session.add_all([hugo, john])

    session.commit()
```

# Selecting with ORM

```
from sqlalchemy import select  
  
user = session.scalars(select(User).where(User.name == "hugo")).first()
```

## Compatibility

SQLAlchemy is compatible with all major DBMS.

Only a subset of features is exposed for some DBMS.

# Handling Migrations

To manage database evolution, SQLAlchemy has a dedicated project:

[Alembic](#)

## Further Resources

[SQLAlchemy Tutorial Course](#)

Do you have any questions ?



# Important Modules of the Standard Library

Databases

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# Python Testing

# Python Testing

## General Principles

# Introduction

Goals:

- Ensure software quality
- Measure regressions with each update
- Refactor with confidence
- Document code with usage examples for each part of the codebase
- Document assumptions made about the code

# Test-Driven Development (TDD)

Interesting development approach based on a cycle:

1. Add a unit test that aims to ensure functional requirements are met
2. Verify that the test fails
3. Create the minimal code that solves the test
4. Verify that all tests pass

# Different Types of Tests

## Functional Tests:

**Unit** Verify a small unit of code (function or class)

**Integration** Test the combination of medium-sized code units

**Regression** Ensure that the level of quality does not decrease

**Smoke** Verify critical (and basic) functionality

## Non-functional Tests:

**Stress** Measure the system's resistance under high load

**Recovery** Measure the system's ability to recover

**Security** Check for vulnerabilities

...

# Unit Tests

The core of testing: they verify that the basic building blocks work.

- Usually multiple tests per **public API function**
- Each test ensures that preconditions, postconditions, and invariants are met



# Integration Tests

- Verify that multiple subsystems of the system work correctly together
- Very important for making changes to the system with confidence

# End-to-End Tests

- Tests the entire system chain
- Replicates real-world use cases as closely as possible

# Regression Tests

- Combination of unit and integration tests
- Also include tests for known bugs (1 bug fixed = 1 test)
- Verify that software quality is maintained after a modification

## Some Testing Techniques

**Mocking** Replace modules or functions with mocks

**Generation** Provide many random inputs to a test to detect bugs

**Mutation** Mutate the program, and the test suite should fail after the mutation

**Contracts** Often based on generation, they specify invariants and pre/post conditions

# Testing Techniques — Mocking

- Replace a class, a method, or a module attribute with a fake object
- Allows testing of systems that are not accessible during tests
- Implemented by `unittest.mock` or `pytest.monkeypatching`

```
def test_get_json(monkeypatch):  
  
    def mock_get(*args, **kwargs):  
        return MockResponse()  
  
    monkeypatch.setattr(requests, "get", mock_get)  
  
    result = app.get_json("https://fakeurl")  
    assert result["mock_key"] == "mock_response"
```

## Testing Techniques — Generation

- Often coupled with property-based testing
- Focuses on discovering pre/post conditions and invariants
- Test case generation is automatic
- Reduces error cases to simple cases

## Testing Techniques — Mutation

- Assumption that a good test suite fails on different code
- Performs subtle mutations
- Counts failed and unfinished tests

# Testing Techniques — Contracts

- Extension of property-based testing
- Explicitly specifies expectations on functions and classes

```
@deal.pre(lambda *args: all(arg > 0 for arg in args))  
def sum_positive(*args):  
    return sum(args)
```



# Best Practices

- Follow the four-step structure: setup, execution, validation, cleanup
- Create independent tests
- Test only the public API, never implementation details
- Keep tests fast
- Use mutation testing or fuzzing
- Practice inversion of control

# Inversion of Control — Coupling

```
class Simulator:
    def __init__(self):
        self.api_client = APIClient()
        self.api_key = os.environ("API_KEY")

    def simulate(self):
        ...
```

## Inversion of Control — Cohesion

Best practice: each part is testable and easily replaceable.

The instantiation logic varies depending on the context of use.

Allows dependency injection.

```
class Simulator:
    def __init__(self, api_client, api_key):
        self.api_client = api_client
        self.api_key = api_key

    def simulate(self):
        ...
```

# Setting Up in Python

**unittest** Testing framework from the standard library

**pytest** Most popular testing framework

**hypothesis** Fuzzing, generation strategies

**mutmut** Mutation testing

**deal** Contracts

The first three libraries have many extensions.

Do you have any questions ?

# Python Testing

## `unittest`

# Introduction

Goals:

- Have a testing framework similar to JUnit in Java in the standard library
- Manage the 4-phase lifecycle of a test

# Principles

- Define test scenarios by creating classes that inherit from `unittest.TestCase`
- Each scenario consists of multiple tests
- Each test is defined with specific `assert...` methods
- Preparation and cleanup at the function level using `setUp` and `tearDown` methods
- Preparation and cleanup at the class level using `setUpClass` and `tearDownClass` methods



# Test Methods

A large number of test methods are available.

# Execution Order

1. `setUpClass`
2. `setUp`
3. The test function
4. `tearDown`
5. `tearDownClass`

Steps 2–4 are repeated for each test before step 5 is executed.

# Example Usage

```
import unittest

def add(a, b):
    return a + b

class AddTests(unittest.TestCase):
    @classmethod
    def setUpClass(cls):
        cls.integers = [(1, 2), (20, 22)]

    def test_commutativity(self):
        for a, b in self.integers:
            self.assertEqual(add(a, b), add(b, a))

    def test_associativity(self):
        for a, b in self.integers:
            self.assertEqual(add(add(a, b), b), add(a, add(b, b)))
```

# Running the Test Suite

To run the test suite, the most common method is:

```
$ python -m unittest discover
```

It is also possible to specify a file, a class, or a function to execute.

# Mocking Module

`unittest` has a very interesting mocking module: `unittest.mock`.

Two important points:

- The **patch** decorator / context manager, which allows temporary replacement of an object
- The **Mock** class, which allows replacement of untestable objects

It is possible to test which methods have been called and how on a **Mock** object.

Do you have any questions ?

# Python Testing

## pytest

# Introduction

Goals:

- Simplify the writing of tests compared to `unittest`
- Provide a modular mechanism for setup and cleanup



# Usage

pytest uses simple `assert`s to create tests.

```
def add(a, b):  
    return a + b  
  
def test_add():  
    assert add(2, 2) == 4
```

# Fixture

A fixture defines a test environment:

- Connection to a test database
- Creating a directory with files to be tested
- ...

# Using a Fixture

```
import pytest

@pytest.fixture
def integers():
    return [(2, 2), (21, 21)]

def add(a, b):
    return a + b

def test_add(integers):
    for a, b in integers:
        assert add(a, b) == add(b, a)
```

# Modularity of Fixtures

A fixture can use multiple other fixtures.

A function can use multiple fixtures.

# Fixture Memoization

`pytest` defines several levels of fixture calculation:

- Each function (by default)
- Each class
- Each module
- Each package
- For the entire test session

## Fixtures Used by Multiple Modules

Fixtures defined in the `conftest.py` file can be used by all modules in the directory.

# Compatibility

`pytest` can run test suites defined with `unittest` or `nose`.

# Extensions

[Many plugins available.](#)



Do you have any questions ?

# Labs

[Instructions](#)

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