

Computational practicum

Q2 Lecture 1

Advanced python programming

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Process
Intelligence
RESEARCH

Delft Institute of
Applied Mathematics

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Welcome to Q2

- We hope you enjoyed the first half of the class so far!
- We also hope you had a successful Q1 exam!

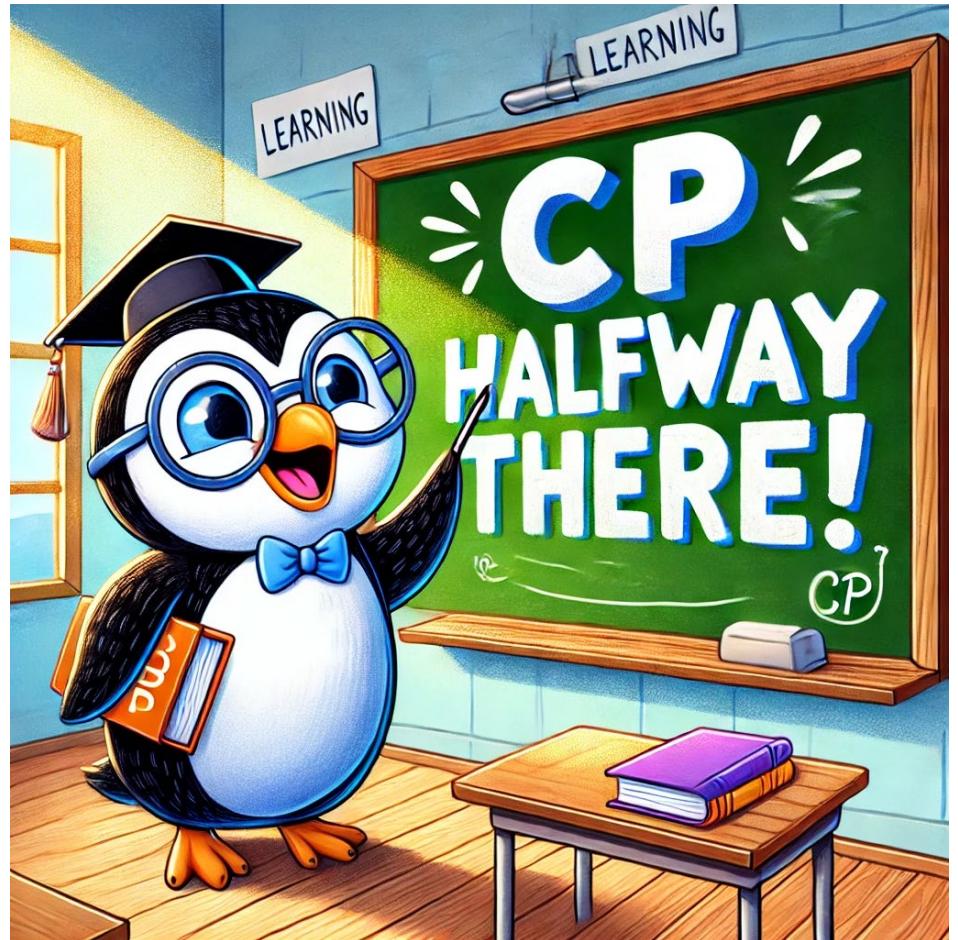


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Lecture overview Q2

- Lecture 1: Advanced programming
- Lecture 2: Partial differential equations, finite difference method
- Lecture 3: Partial differential equations in multiple space dimensions and time
- Lecture 4: Optimization 1
- Lecture 5: Optimization 2
- Lecture 6: Regression, interpolation, least squares
- Lecture 7: Use of LLMs in Chemical Engineering

Agenda

- **Recap Q1**
- **Feedback Q1**
- **Advanced programming**
 - Some fundamental programming principles
 - Managing imports, packages, virtual environments
 - Managing multiple modules
 - Basic object-oriented programming
 - Unit testing

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Recap Q1



- In Q1, you learned:
 - The basics of Python programming, linear algebra, and calculus
 - Solving linear systems of equations
 - Solving nonlinear systems of equations
 - Numerical integration and differentiation
 - Solving initial value problems
 - Solving boundary value problems with the finite difference method
 - Solving boundary value problems with the shooting method

Learning goals of this lecture

After successfully completing this lecture, you are able to...

- explain basic programming principles.
- explain package management and why it is important.
- design a bigger coding project with multiple modules and packages of your own.
- apply object-oriented programming in your code.
- formulate simple test functions to ensure the functionality of your code.

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Advanced programming: motivation and challenge

- Coding is easy, but coding well is hard.
- Large programs become very complex fast.
A model of a methanol plant can have
> 2000 lines!!
- Big challenge with respect to:
 - Readability (others and yourself)
 - Maintainability
 - Reusability

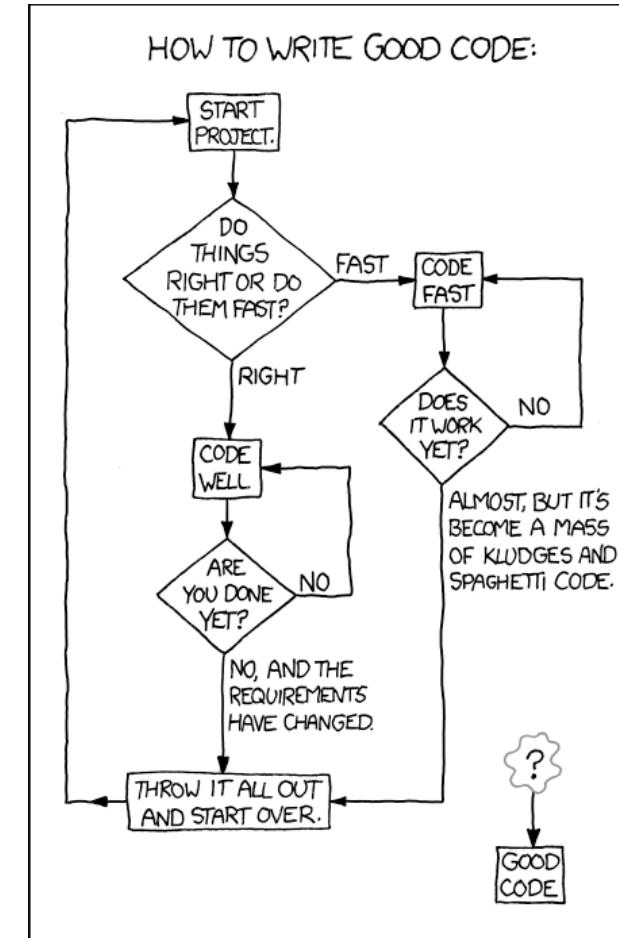


Image: <https://xkcd.com/844/>

Overview: Basic programming principles

- Single-responsibility principle (SRP)
- Don't repeat yourself (DRY)
- Separation of concerns (SoC)
- You aren't gonna need it (YAGNI)
- *There are (way) more, but we will focus on those! (e.g., <https://github.com/webpro/programming-principles>)*

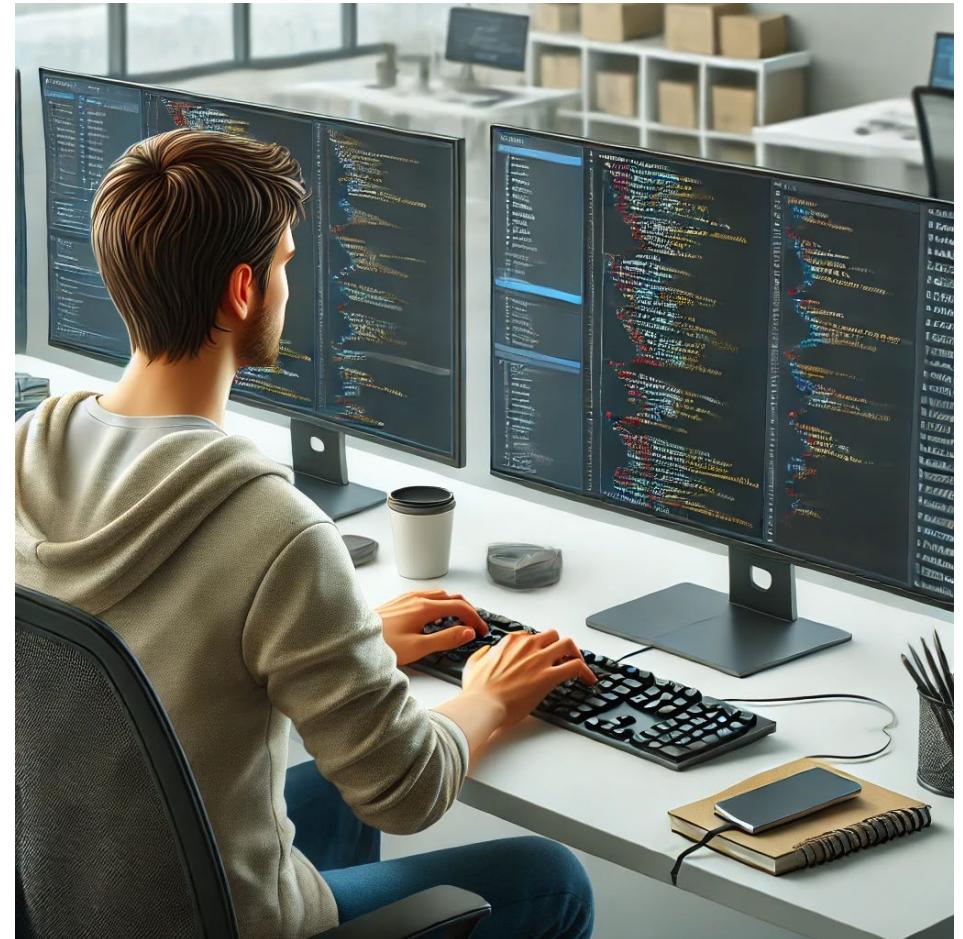


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Single-responsibility principle (SRP) (1/2)

- A function (or a class, module) should be responsible for a single part of the functionality
- Otherwise, changes to one functionality can break the other

```
import this
import numpy as np

def mean_and_variance(data: np.array):
    """This function has too many
    responsibilities."""
    mean = sum(data) / len(data)

    variance_sum = 0.
    for x in data:
        variance_sum += (x - mean) ** 2
    variance = variance_sum / len(data)

    return mean, variance
```



Single-responsibility principle (SRP) (2/2)

- A function (or a class, module) should be responsible for a single part of the functionality
- Otherwise, changes to one functionality can break the other

```
import this
import numpy as np

def mean(data: np.ndarray) -> float:
    """This only calculates the mean."""
    mean = sum(data) / len(data)
    return mean

def variance(data: np.ndarray) -> float:
    """This only calculates the variance."""
    variance_sum = 0.
    data_mean = mean(data)
    for x in data:
        variance_sum += (x - data_mean) ** 2
    variance = variance_sum / len(data)
    return variance
```



Don't repeat yourself (DRY)

- Code should not be duplicated.
- If you need code more than once, write a function.
- If you catch yourself copying code, that's a warning sign!

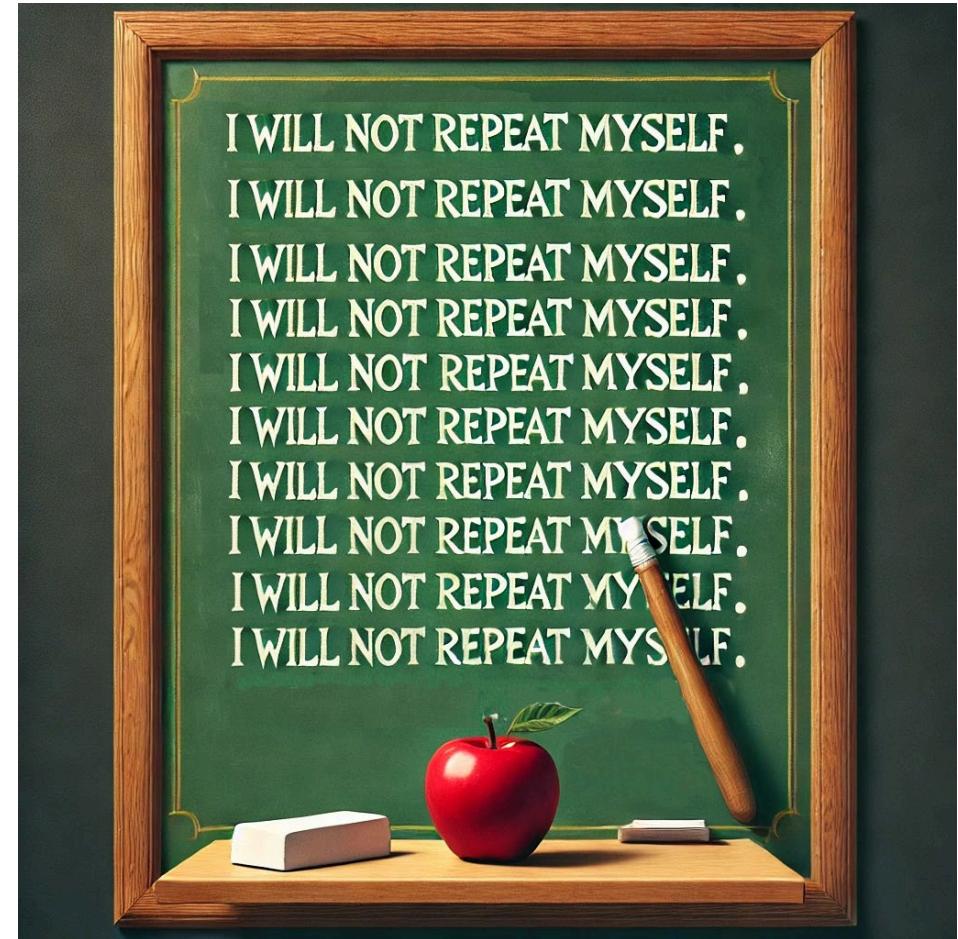
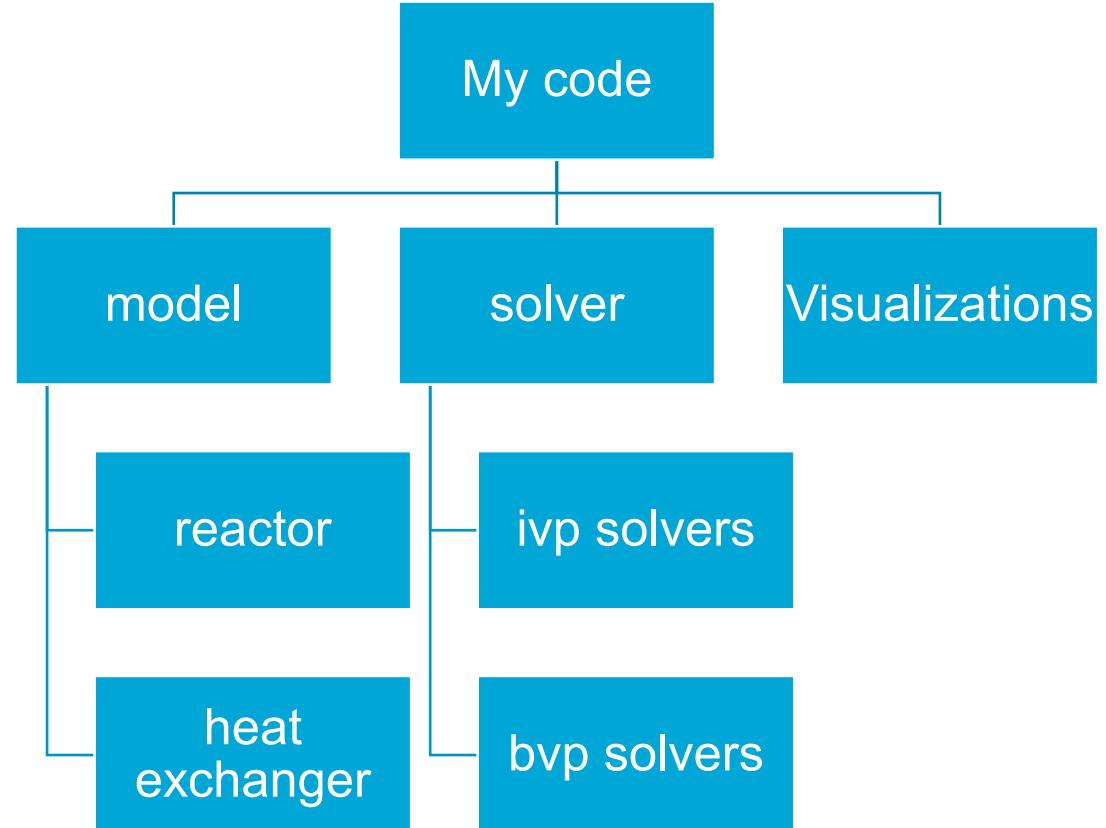


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Separation of Concerns (SoC)

- Each part of your program should focus on a single aspect or concern of the system.
- Different parts of the program should only be coupled loosely.
- SoC is similar to single responsibility, but focusses on a higher, architectural level.



You aren't gonna need it (YAGNI)

- Don't write code for hypothetical requirements
- Focus on current requirements
- Add features to code when they are needed

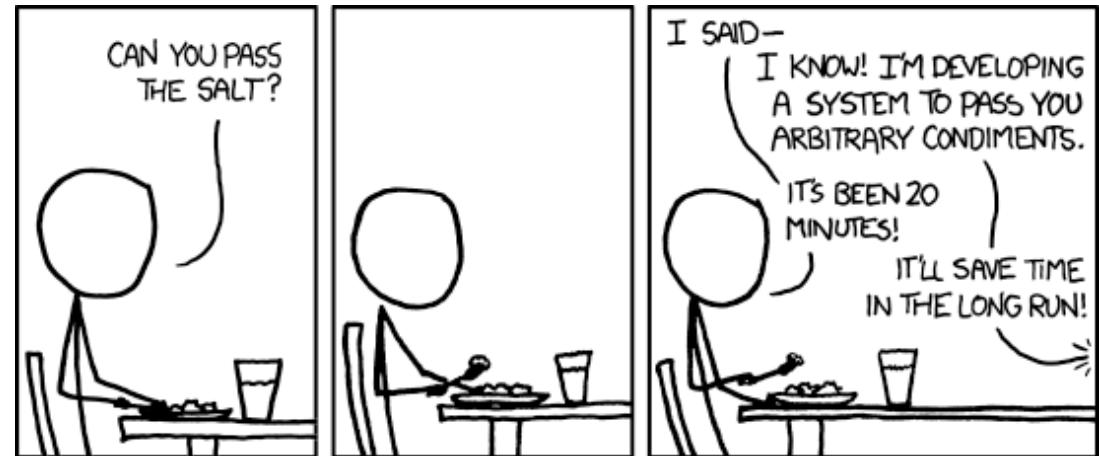


Image: <https://xkcd.com/974/>

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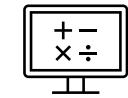
Managing imports, packages, virtual environments

- Last quarter, we have already been importing several packages:
- Where are we actually importing *from*?
- There are three main sources:
 - 1) Python standard library.
 - 2) External packages managed via the Python package installer.
 - 3) Our own packages or modules.

```
import numpy as np
import scipy
from math import sqrt, pi
```

Python standard library

- Some packages come with the installation of python itself. They are part of the **Python standard library**.
- These packages usually contain very basic functionality, e.g.:
 - **os**: package for miscellaneous operating system interfaces, e.g., accessing, creating, deleting folders.
 - **math**: basic mathematical functions like square root or factorial.
- Packages can simply be imported via **import** without other action.
- Why do I have to import these modules even though they are part of the Python installation?
→ The less commands Python has to keep track of, the faster it is!



The Package Installer for Python (pip)

- Use **package installer for Python (pip)** to install further packages from the Python Package Index ([PyPI](#)).
- That way, you can **customize what your Python can do** without downloading the vast number of packages.
- Basic pip commands you will need:
 - “**pip install <package>**”: Install a package
 - “**pip install <package>==<version>**”: Install a specific version of a package
 - “**pip list**”: List installed packages

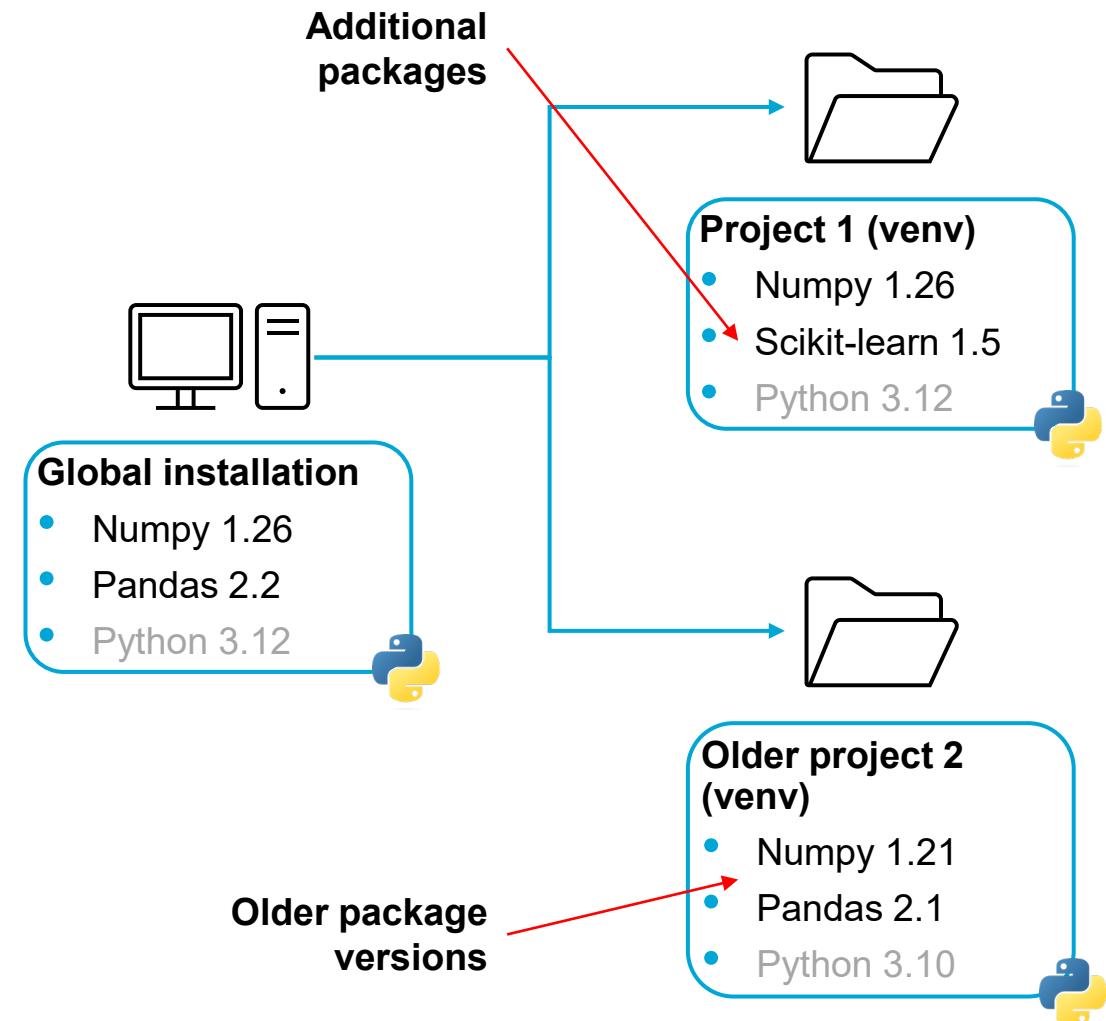


```
>> pip install pytorch  
>> pip install numpy==1.19.5  
>> pip list
```

But I have different projects with different, conflicting package requirements. How do I manage that?

Virtual environments

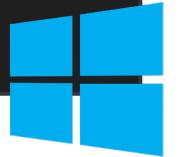
- Virtual environments are isolated Python environments that allow separate management of package dependencies.
- Having separate environments for each project avoids package conflicts and ensures consistency.
- There are several frameworks for virtual environments. The **venv module** comes with the Python standard library.



Setting up a virtual environment

- Managing the virtual environment happens in the console.
- Typical steps in setting up and using your virtual environment:
 1. Creating the environment and giving it a name (typically “.venv” or “venv”)
 2. Activate the environment
 3. Use pip in the environment
 4. Deactivate the environment

```
>> python -m venv .venv
>> .venv/Scripts/activate
(.venv)>> pip install numpy
(.venv)>> pip install -r requirements.txt
(.venv)>> deactivate
>>
```



```
>> python -m venv .venv
>> source .venv/bin/activate
(.venv)>> pip install numpy
(.venv)>> pip install -r requirements.txt
(.venv)>> deactivate
>>
```

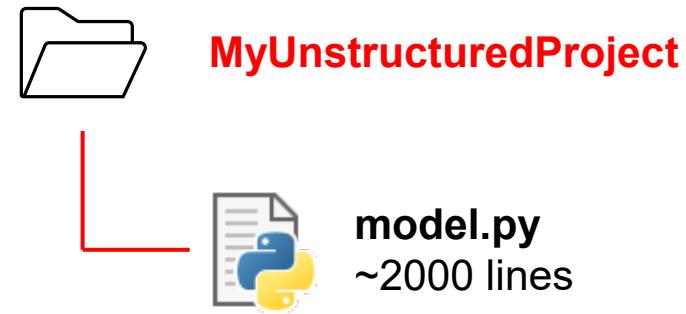


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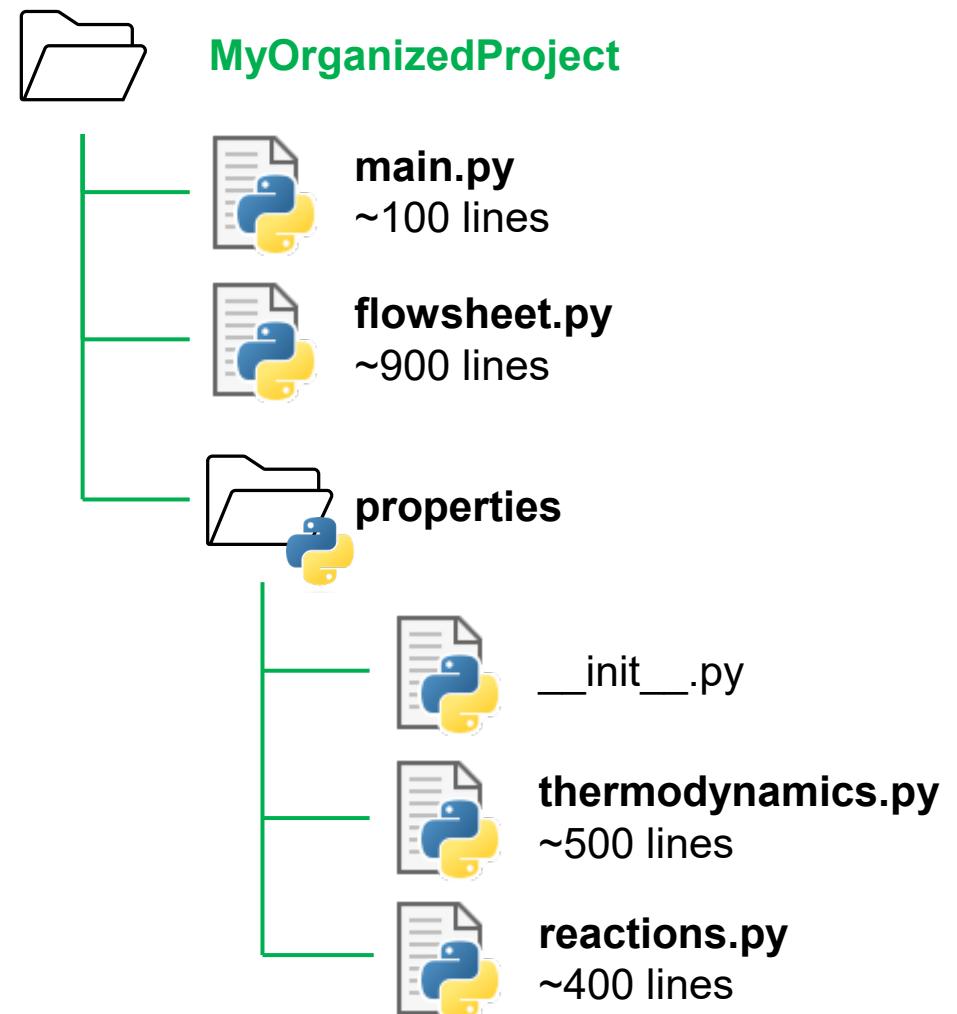
Managing projects with many modules and packages

- Project become big very fast
- Challenges arise for code management:
 - Readability (others and **yourself**)
 - Maintainability
 - Reusability
 - Namespace management
 - ...



Managing projects with many modules and packages

- Organize your project into
 - Modules (python files)
 - Packages (python folders, i.e. folders with an `__init__.py` file)
- Deciding what to put in a module/package requires practice and experience
- The importing syntax is like importing from standard library or PyPI packages.



Importing my modules and packages

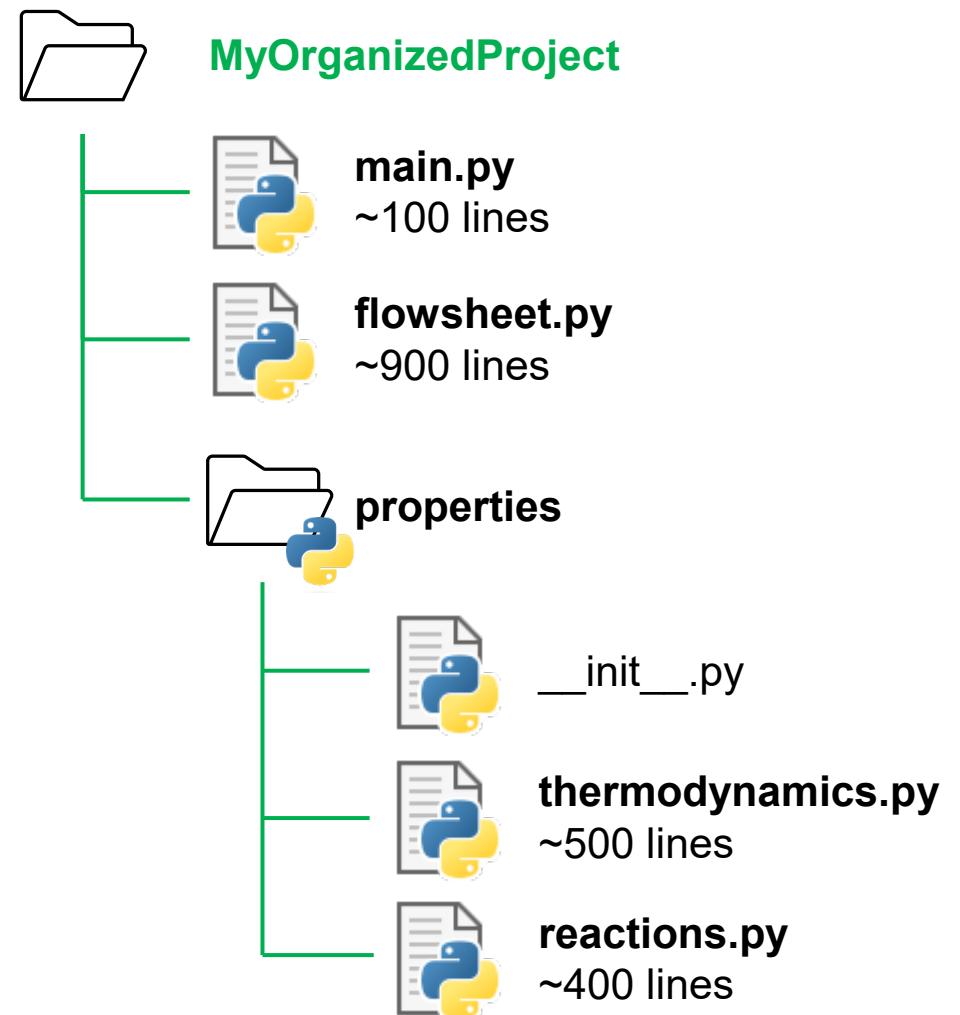
```
# In module "main.py"
import flowsheet
import properties.thermodynamics
from properties.reactions import WGShift,
                                    Syngas2Methanol

# Class MyFlowsheet in flowsheet
print(flowsheet.MyFlowsheet)

# Function ideal_gas_law in thermodynamics
print(properties.thermodynamics.ideal_gas_law)

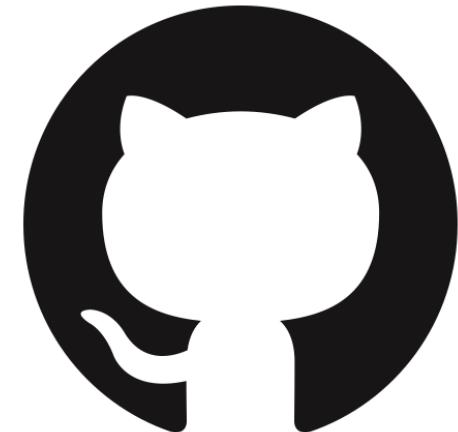
# Classes WGShift and Syngas2Methanol in reactions
print(WGShift)
print(Syngas2Methanol)

>> <class 'flowsheet.MyFlowsheet'>
>> <function ideal_gas_law at 0x000001D7B5A4A520>
>> <class 'properties.reactions.WGShift'>
>> <class 'properties.reactions.Syngas2Methanol'>
```



Live coding: Managing multiple modules

- Open Colab: [Managing modules and packages](#)



- Find more in the Github repository of the course: https://github.com/process-intelligence-research/computational_practicum_lecture_coding/tree/main

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Basics of object-oriented programming: Motivation

- Sometimes, organizing loose functions into modules is not enough.
 - Data and corresponding functionality are separated.
 - Changes in one part of the code impacts the rest of the program.
- **Object oriented programming (OOP):** A programming paradigm based on the concept of “objects”.

An Object in object oriented programming (OOP)

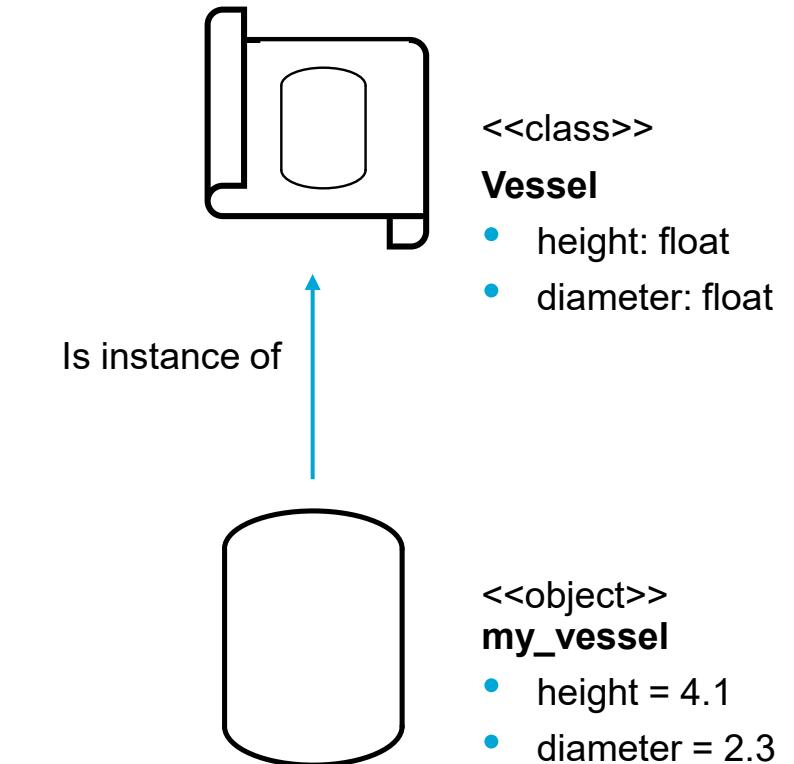
- An **object** is a programming concept, which
 - “**Is something**”: Has a predefined conceptual data and behavioural structure (**class**).
 - “**Has something**”: Contains and encapsulates data related to its meaning (**attributes**).
 - “**Does something**”: Has associated functionality operating on its data (**methods**).
- **Example:** The *silver reaction vessel (on the right)*
 - Is a vessel (*<<class>>*)
 - Has a volume of 10,000 L (*attribute*)
 - Can be filled (*method*)

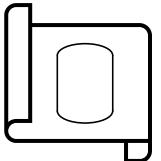


Figure: <https://www.ssengindia.com/chemical-vessel.html>

Core concepts of OOP: classes and objects

- **Class:** A blueprint for creating objects.
Defines:
 - Attributes (data)
 - Methods (functions)
- **Object:** An instance of a class. Contains actual data and can use methods defined in the class.
- **Note:** An object can have other objects as attributes.



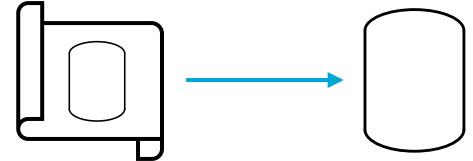


Defining a class

- Define a class using the “**class**” command.
- Define a constructor to your class with the “**__init__**”. It
 - sets the attributes to an initial value.
 - defines further instructions for the instantiation of a new class.
- “**self**” is a reference to the object itself used to retrieve attributes and other methods.
- Add **methods** to give your class functionality. They look like functions.
- Describe your class, its attributes and methods in a class docstring (optional, but recommended).
- Mind the **colons** and **indentations**.

```
class Vessel:  
    """  
        A class to represent a cylindrical vessel and calculate  
        its volume.  
  
    Attributes:  
        height (float): The height of the vessel.  
        diameter (float): The diameter of the vessel.  
  
    Methods:  
        calculate_volume: Calculates vessel volume.  
    """  
  
    def __init__(self, height:float, diameter:float):  
        """The constructor with instructions for creating a  
        class."""  
        self.diameter = diameter  
        self.height = height  
  
    def calculate_volume(self) -> float:  
        """Also add docstrings to methods."""  
        volume = self.height* self.diameter**2 *math.pi/4  
        return volume
```

Instantiate your class



- Instantiate your class by calling the **constructor** of the class.
- To call the constructor, call the class name like a function with arguments.
- Store a reference to the new object like a variable.
- To access attributes or call methods, use the following dot-notation:
“<object>. <method_or_attribute>”
- Note that the “self” argument is not explicitly specified.

```
# Instantiate the class
# For this, call the class name (Vessel). This
# invokes the constructor. Add the required
# arguments (height, diameter).
# Store the new Vessel object in my_vessel
my_vessel = Vessel(1.2, 3.5)
print(my_vessel)
```

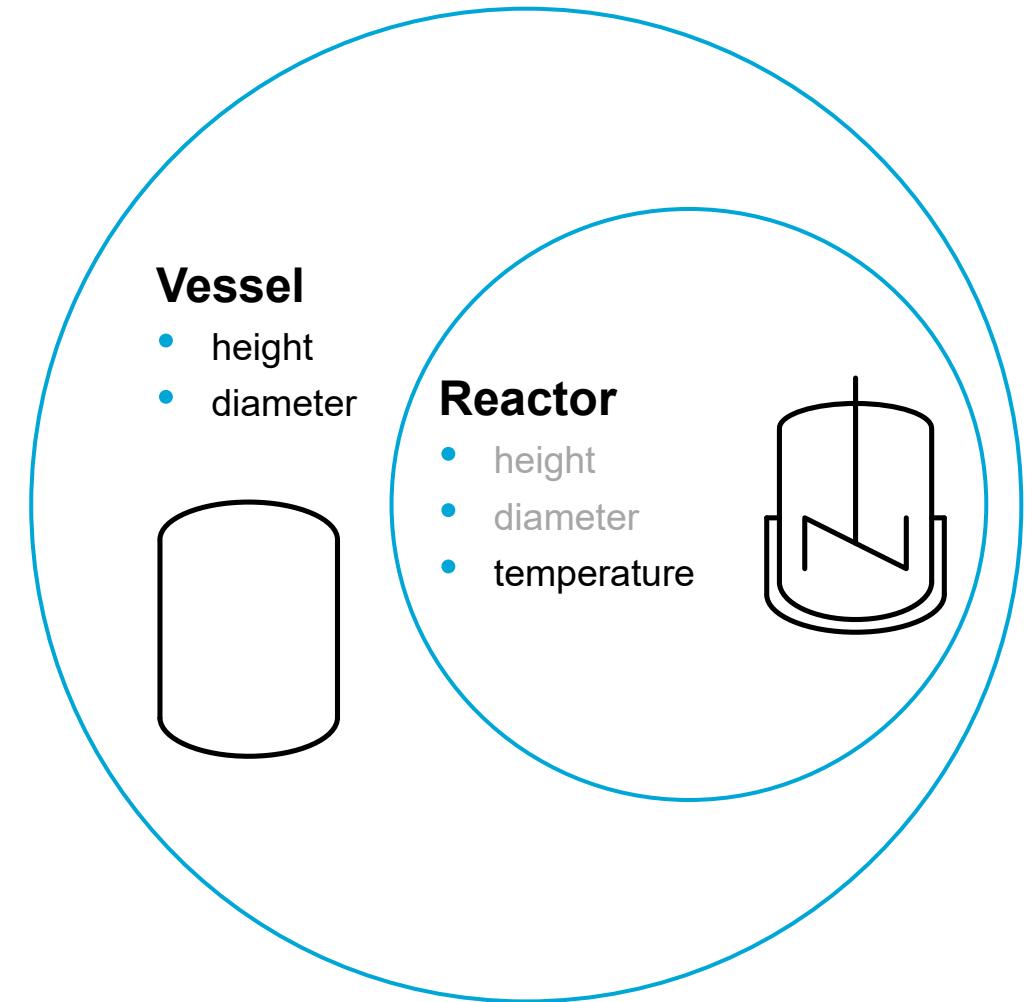
```
# Retrieve the diameter of my_vessel
# For this, use the dot notation
# <object>. <attribute>
print(my_vessel.diameter)
```

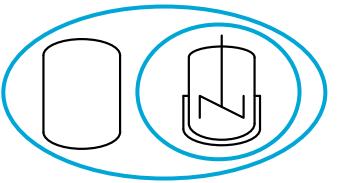
```
# Call the calculate_volume method
# For this, use the dot notation
# <object>. <method>
print(my_vessel.calculate_volume())
```

```
>> <__main__.Vessel object at 0x0000020F75510B50>
>> 3.5
>> 11.54535300194249
```

Class inheritance

- **Inheritance** allows a class (child) to **share** a parent-class attributes and methods while **extending** and **modifying** its functionality.
- Inheritance further improves:
 - Reusability
 - Modularity
 - Extendibility
- E.g.: A **reactor** is a **vessel**, that also has a specified content **temperature**.





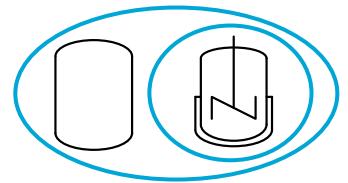
Defining a child class

- A child class is created with the “**class**” keyword as before.
- Name of parent after the class name indicates inheritance.
- In new constructor, first call parent constructor by referencing parent with “**super()**”.
- Then, add further functionality.
- Change the functionality of parent methods (overriding) or define new methods.

```
class Reactor(Vessel):
    """Reactor class that is a vessel and also
    stores temperature."""

    def __init__(self,
                 height:float,
                 diameter:float,
                 temperature:float):
        """Constructor of reactor."""
        super().__init__(height, diameter)
        self.temperature = temperature

    def get_temperature(self):
        """Return reactor temperature"""
        return self.temperature
```



How does my child class behave?

- Instantiate your child class just like a normal class.
- Notice: a reactor still behaves like a vessel.
- But it also has its additional functionality!

```
# Instantiate the class
my_reactor = Reactor(1.2, 3.5, 350)
print(my_reactor)

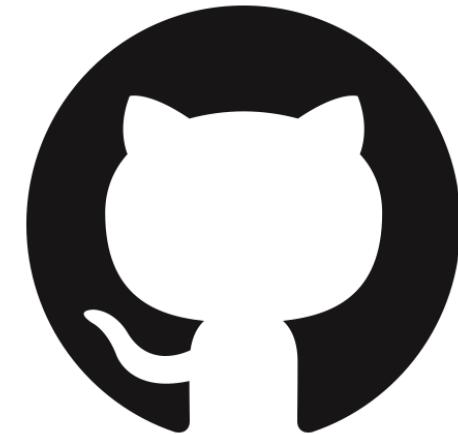
# A reactor is a vessel. The functionality of the
# parent class is preserved.
print(my_reactor.diameter)
print(my_reactor.calculate_volume())

# But also use your new attributes and methods
print(my_reactor.temperature)
print(my_reactor.get_temperature())

>> <__main__.Reactor object at 0x0000020F75510B50>
>> 3.5
>> 11.54535300194249
>> 350
>> 350
```

Live coding: Object-oriented programming

- Open Colab: [Object-oriented programming](#)



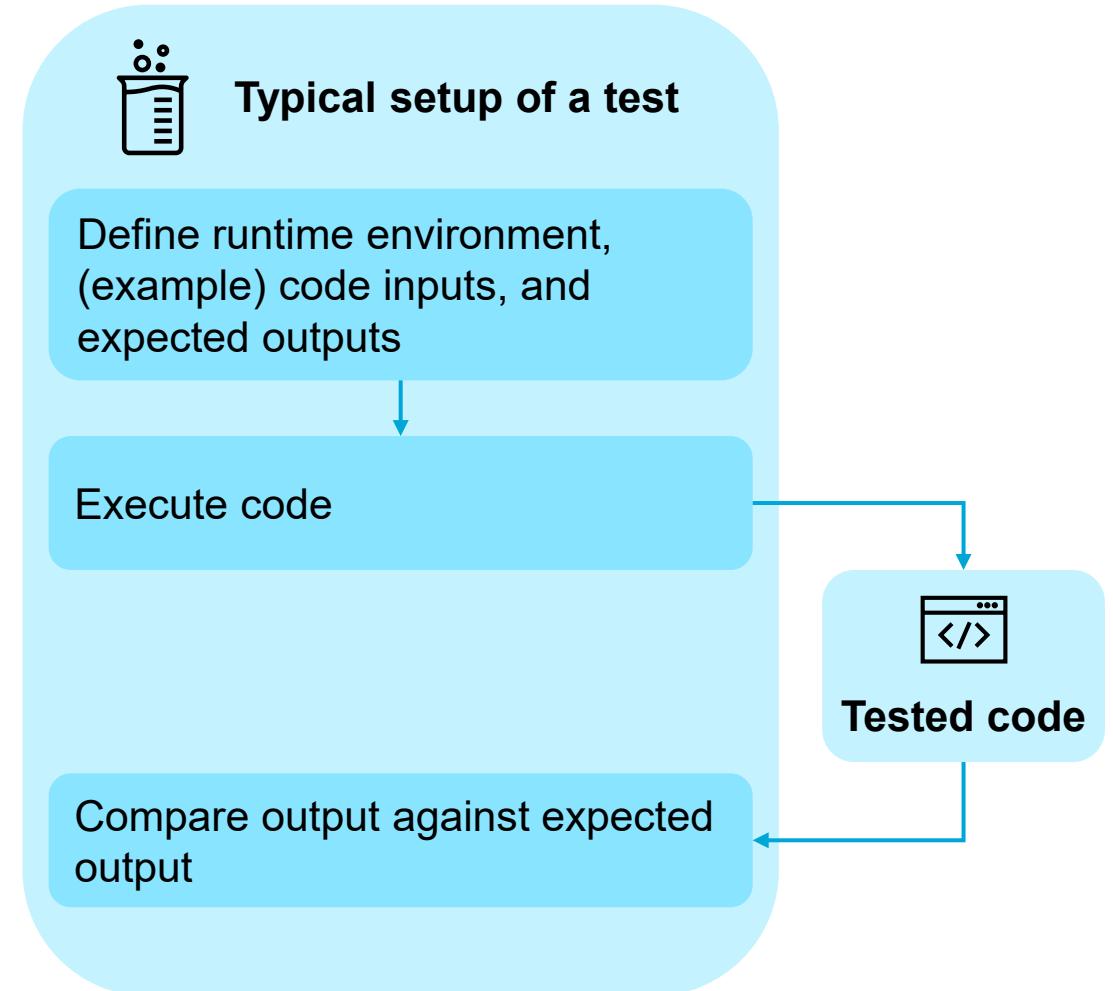
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Testing code with unit tests

- Unit tests run other functions, check if they work as expected.
- Method to check if code works as intended.
- Ensures that code works after changes are made.
- A structured way of collecting code requirements.



Testing a function

- This function calculates the Reynolds number for a flow in a pipe.
- Does it work?
- Let's write a test with some example parameters and outputs!

```
def reynolds_number(diam: float, vel: float,
                     dens: float, visc: float
                     ) -> float:
    """
    Calculates the Reynolds number for flow in a
    pipe.

    Args:
        diam (float): Pipe diameter in m.
        vel (float): Fluid velocity in m/s.
        dens (float): Fluid density in kg/m^3.
        visc (float): (Dynamic) fluid viscosity in
                      Pa.s.

    Returns:
        float: Reynolds number (dimensionless).
    """
    return (diam * vel * dens) / visc
```

Testing a function

- A test function is a normal function with a function header.
- The test calls tested function with example parameters.
- `assert` compares output against expected output.
- `assert` does nothing if condition holds, otherwise, throws an `AssertionError` with this error message.
- A test can have multiple assert-statements to test for several cases.
- However, it is best to separate meaningful test cases into separate functions.

```
def test_reynolds_number():
    """Simple test to see if reynolds number is
    calculated correctly"""
    # Typical values for water flow in a pipe
    res = reynolds_number(0.05, 1.5, 1000, 0.001)
    exp_res = 75000
    assert abs(res - exp_res) < 1e-6, \
        "Basic validation case failed"

    res = reynolds_number(0.05, 3, 1000, 0.001)
    exp_res = 150000
    assert abs(res - exp_res) < 1e-6, \
        "Basic validation case failed"

def test_reynolds_number_zero_velocity():
    """Test Reynolds number for zero velocity."""
    res = reynolds_number(0.05, 0, 1000, 0.001)
    exp_res = 0
    assert res == exp_res, \
        "Zero velocity edge case failed"
```

Where do I put my tests?

- Common convention: test directory with the same structure.
- Module names are the same with “test_”.
- Each function or class method has at least one (typically more) corresponding test function.

```
project
└── project_code
    ├── models.py
    ├── scripts.py
    └── utils.py
└── tests
    ├── test_models.py
    ├── test_scripts.py
    └── test_utils.py
```

Testing with pytest

- pytest is a testing framework for Python
- Automatically finds testing functions, helps to organize and run them
 - In the command line, running pytest runs all tests in the project

```
>> pytest
```
 - Run tests in a specific module by running

```
>> pytest tests/test_reynolds_number.py
```
- Additional functionality to set up complex runtime environments and parametrize tests
- Find the documentation of pytest here:
<https://docs.pytest.org/en/stable/>



pytest

Image and further reading: <https://docs.pytest.org/en/stable/>

Live coding: Unit testing

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- formulate simple test functions to ensure the functionality of your code.

Thank you very much for your attention!