# ILP 2022 – W4S3 Numpy library (part 1) and imports

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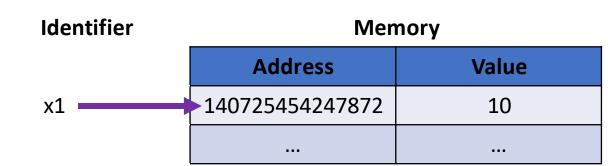


# Outline (Week4, Session3 – W4S3)

- Memory management and lists: aliasing, shallow and deep copies
- The Numpy library (part 1): arrays, math functions, etc.
- About the import procedure
- Project organizing
- Mini-project

## Memory of a computer

• The memory of a computer consists of several "boxes", which can contain values for variables. Each "box" is identified by an **integer**, which corresponds to the **address/ID** of the "box".



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- When a variable is created:
  - A "box" is assigned for the variable and its value is stored in the "box".
  - The variable name simply refers to the address/ID of the "box".



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  - A "box" is assigned for the variable and its value is stored in the "box".
  - The variable name simply refers to the address/ID of the "box".



```
1 x1 = 10
2 print(x1)
3 print(id(x1))
```

 The id() function returns an integer, which corresponds to the address/ID, where the variable is stored in memory.

```
1 x1 = 10
2 print(x1)
3 print(id(x1))
```

10 140725454247872

```
1 x2 = 17
2 print(x2)
3 print(id(x2))
```

- The id() function returns an integer, which corresponds to the address/ID, where the variable is stored in memory.
- Two variables names with identical values will have the same id().

```
1 x1 = 10
2 print(x1)
3 print(id(x1))
```

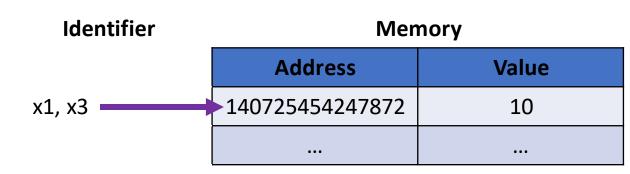
10 140725454247872

```
1 x2 = 17
2 print(x2)
3 print(id(x2))
```

17 140725454248096

```
1 x3 = x1
2 print(x3)
3 print(id(x3))
4 print(id(x1))
```

- The id() function returns an integer, which corresponds to the address/ID, where the variable is stored in memory.
- Two variables names with identical values will have the same id().
- Aliasing: Python saves memory space by having two variables names point to the same memory ID.



```
1 x3 = x1
2 print(x3)
3 print(id(x3))
4 print(id(x1))
```

- The id() function returns an integer, which corresponds to the address/ID, where the variable is stored in memory.
- Two variables names with identical values will have the same id().
- Aliasing: Python saves memory space by having two variables names point to the same memory ID.

### Identifier Memory

	Address	Value
x3	140725454247872	10
x1	140725454247936	12

```
1 x1 = 12
2 print(x1)
3 print(x3)
4 print(id(x1))
5 print(id(x3))
```

## Memory management in lists

• A **list** is a collection of variables.

```
1 list1 = [x1, x2, x3]
2 print(list1)
3 print(id(list1))
```

```
[12, 17, 10]
1769354632448
```

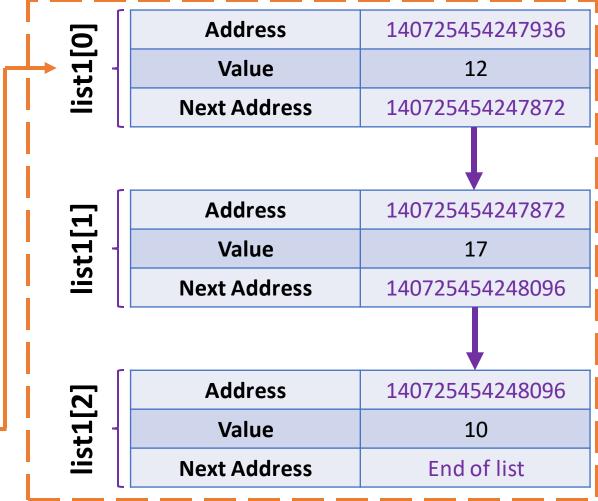
```
print(id(list1))
print("-")
print(id(list1[0]))
print(id(x1))
print("-")
print(id(list1[1]))
print(id(x2))
print("-")
print(id(list1[2]))
print(id(x3))
```

```
1769354632448
140725454247936
140725454247936
140725454248096
140725454248096
140725454247872
140725454247872
```

## Memory management in lists

A list is a collection of variables.
 The variables in a list are chained together.





## Memory management in lists

- A list is a collection of variables.
   The variables in a list are chained together.
- If x1 is changed, Python will adjust so that the list remains unaffected.
- It simply reallocates x1 to another location in memory.

```
1 print(x1)
2 print(id(x1))
3 x1 = "Hello"
4 print(id(x1))
5 print(list1)
```

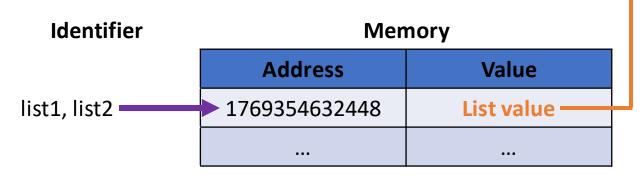
```
12
140726382041088
2120755150000
[12, 17, 10]
```

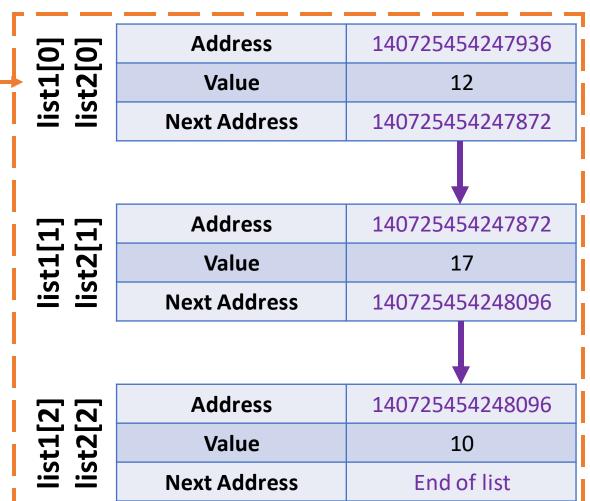
- A list is a collection of variables.
   The variables in a list are chained together.
- Aliasing: We can assign a list to another variable name.

```
1 list2 = list1
2 print(list2)
3 print(id(list1))
4 print(id(list2))
```

```
[12, 17, 10]
1983742564288
1983742564288
```

- A list is a collection of variables.
   The variables in a list are chained together.
- Aliasing: We can assign a list to another variable name.



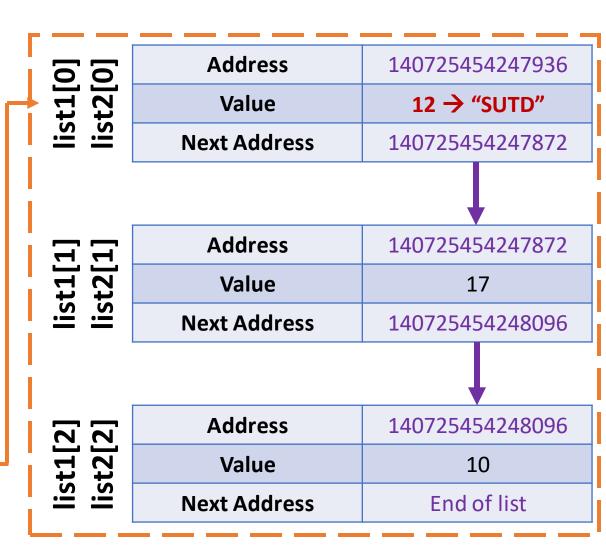


- A list is a collection of variables.
   The variables in a list are chained together.
- Aliasing: We can assign a list to another variable name.
- **Problem:** changing list1[0] changes list1 values, but also changes list2.

```
print(id(list1[0]))
   list1[0] = "SUTD"
   print (list1)
   print(id(list1[0]))
140726382041088
['SUTD', 17, 10]
2120755353584
   print(list2)
   print(id(list2[0]))
['SUTD', 17, 10]
2120755353584
```

- A list is a collection of variables.
   The variables in a list are chained together.
- Aliasing: We can assign a list to another variable name.
- **Problem:** changing list1[0] changes list1 values, but also changes list2.

Identifier	Memory		
	Address	Value	
list1, list2	<b>1</b> 769354632448	List value —	



## Shallow copy of a list

- **Problem:** changing list1[0] changes list1 values, but also changes list2.
- **Shallow copy:** list1[:] makes list2 a shallow copy of list1. By doing so, list2 will be saved to its own location of memory.

```
1 list1 = [12, 17, 10]
2 list2 = list1[:]
3 print(list1)
4 print(list2)
5 print(id(list1))
6 print(id(list2))
```

```
[12, 17, 10]
[12, 17, 10]
2120755431296
2120755345920
```

## Shallow copy of a list

- **Problem:** changing list1[0] changes list1 values, but also changes list2.
- Shallow copy: list1[:] makes list2 a shallow copy of list1. By doing so, list2 will be saved to its own location of memory.
- Changing a value in list1, with list1[index] = ..., no longer affects list2.
- **Note:** you can also use the copy() method.

```
1 list1 = [12, 17, 10]
2 list2 = list1[:]
3 print(list1)
4 print(list2)
5 print(id(list1))
6 print(id(list2))
[12, 17, 10]
```

```
[12, 17, 10]
[12, 17, 10]
2120755431296
2120755345920
```

```
1 list1[0] = "SUTD"
2 print(list1)
3 print(list2)
```

```
['SUTD', 17, 10]
[12, 17, 10]
```

## Shallow copy: problem

- **Note:** if an element of a list is a list (case of lists of lists), then the shallow copy will not copy the sublists to different locations of memory.
- **Problem:** changing a sublist element then affects both lists, even though these lists are shallow copies of each other.

```
1 | list1 = [[8, 9, 11], 7, 4]
 2 | list2 = list1[:]
    print(list1)
 4 | print(list2)
 5 print(id(list1))
 6 print(id(list2))
   print(id(list1[0][1]))
   print(id(list2[0][1]))
[[8, 9, 11], 7, 4]
[[8, 9, 11], 7, 4]
2120755333248
2120755332928
140726382040992
140726382040992
   list1[0][1] = "Damn it!"
 2 print(list1)
    print(list2)
[[8, 'Damn it!', 11], 7, 4]
```

[[8, 'Damn it!', 11], 7, 4]

## Deep copy

• Solution: make a deep copy, using the Python built-in copy library.

 A deep copy forces Python to make sure all elements and subelements are assigned to different locations in memory.

```
1 from copy import deepcopy
 1 | list1 = [[8, 9, 11], 7, 4]
 2 list2 = deepcopy(list1)
 3 print(list1)
 4 print (list2)
 5 print(id(list1[0]))
 6 print(id(list2[0]))
[[8, 9, 11], 7, 4]
[[8, 9, 11], 7, 4]
2120754851072
2120754850304
 1 | list1[0][1] = "Deep copy works?"
 2 print(list1)
 3 print(list2)
 4 print(id(list1[0][1]))
   print(id(list2[0][1]))
[[8, 'Deep copy works?', 11], 7, 4]
[[8, 9, 11], 7, 4]
2120755409424
140726382040992
```

## Matt's Great advice #10

Matt's Great Advice #10: Keep the aliasing, shallow and deep copies concepts in mind for now.

If you find that modifying a list object ends up unexpectedly changing another, then you might have an aliasing or shallow copy problem.

When in doubt, make a deep copy.

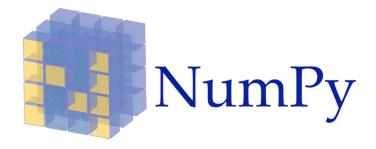
For now, do not worry about understanding all these memory concepts, these will be covered in another advanced course!



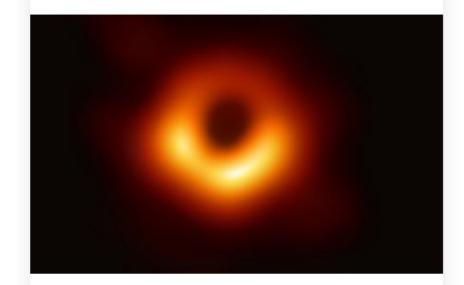
## About the numpy library

 Numpy is one of the most common (if not the most popular) libraries in Python.

- Used for many applications: computing, modelling, data science, astrophysics, etc.
- Linear algebra (one of the main concepts of math with many applications in computing)



#### FIRST IMAGE OF A BLACK HOLE



How NumPy, together with libraries like SciPy and Matplotlib that depend on NumPy, enabled the Event Horizon Telescope to produce the first ever image of a black hole

## A new type of objects: Numpy Arrays

- Numpy arrays are objects from the Numpy library.
  - Typically used to describe matrices and vectors,
  - Or **tables** of data.
- The look very similar to (nested lists of) lists, which we have used earlier for many applications.
- The Numpy library, however, comes with many additional functions and methods.

```
import numpy as np
 1 array1 = np.array([0, 2, 1, 4])
 2 print (array1)
[0 2 1 4]
 1 print (array1)
 2 print(type(array1))
 3 array1 as list = list(array1)
   print(array1 as list)
 5 print(type(array1 as list))
[0 2 1 4]
<class 'numpy.ndarray'>
[0, 2, 1, 4]
<class 'list'>
```

## Length, size, shape

- Just like lists, the Numpy arrays have a length, which can be checked with len().
- The also have a **shape** and a **size attribute**, which give additional information, in the case of arrays with more than 1D.
- Attribute: "sub-variable" of an object; applies to an object using the . operator. (Object-oriented concept, not covered yet)

```
array1 = np.array([0, 2, 1, 4])
   print(len(array1))
   print(array1.shape)
   print(array1.size)
(4,)
   two d array = np.array([[1,2],[3,4]])
   print(two d array)
   print(len(two d array))
   print(two d array.shape)
   print(two d array.size)
[[1 2]
 [3 4]]
(2, 2)
```

## Indexing an array

- Just like lists, the Numpy arrays are indexed and their element can be accessed with [].
- You can equivalently use the [i,j] and [i][j] notations on arrays.
- Replacing an index with a colon symbol:, means "take all".
- For instance, [:, j] means all elements in column j, whereas [i, :] means all elements in row i.

```
1 array1 = np.array([0, 2, 1, 4])
 2 print (array1)
   print(array1[0])
 4 print (array1[1])
[0 2 1 4]
   two d array = np.array([[1,2],[3,4]])
  print (two d array)
   print(two d array[0])
   print(two d array[0][1])
[[1 2]
 [3 4]]
[1 2]
   print(two d array[0,1])
   print(two d array[:,1])
 3 print(two d array[0,:])
```

## Traversing an array with for

 As with lists, we can traverse a Numpy array, in an element-wise manner, using a for loop.

```
1 array1 = np.array([0, 2, 1, 4])
2 print(array1)
3 for element in array1:
4 print(element)
```

```
[0 2 1 4]
0
2
1
```

```
my list = [1, 4, 9, 14, 15]
2 print (my list)
[1, 4, 9, 14, 15]
   # Element-wise
 2 for element in my list:
       print("--")
       print(element)
```

## The + operator on arrays

• The + operator on lists: On lists, the + operator will concatenate both lists into a new one.

```
1 a_list = [0, 1, 2]
2 another_list = [1, 4, 7]
3 list_sum = a_list + another_list
4 print(list_sum)
```

```
[0, 1, 2, 1, 4, 7]
```

## The + operator on arrays

- The + operator on lists: On lists, the + operator will concatenate both lists into a new one.
- The + operator on Numpy arrays – (vector sum): On Numpy arrays, however, the + operator will <u>sum</u> the elements of both Numpy arrays.

```
1 | a list = [0, 1, 2]
    another list = [1, 4, 7]
    list sum = a list + another list
    print(list sum)
[0, 1, 2, 1, 4, 7]
 1 | array1 = np.array([0, 2, 1, 4]) |
   array2 = np.array([1, 2, 3, 5])
   print(array1)
   print(array2)
   sum array = array1 + array2
 6 print(sum array)
[0 2 1 4]
[1 2 3 5]
```

[1 4 4 9]

## The + operator on arrays

- The + operator on lists: On lists, the + operator will concatenate both lists into a new one.
- The + operator on Numpy arrays – (vector sum): On Numpy arrays, however, the + operator will <u>sum</u> the elements of both Numpy arrays.
- **Broadcasting:** If summed with a number instead, the elements in the Numpy array will each be incremented by the given value.

```
1 | a list = [0, 1, 2]
    another list = [1, 4, 7]
    list sum = a list + another list
    print(list sum)
[0, 1, 2, 1, 4, 7]
 1 array1 = np.array([0, 2, 1, 4])
   array2 = np.array([1, 2, 3, 5])
   print (array1)
   print (array2)
   sum array = array1 + array2
 6 print(sum_array)
[0 2 1 4]
[1 2 3 5]
[1 \ 4 \ 4 \ 9]
 1 array1 = np.array([0, 2, 1, 4])
 2 | number = 7
   print (array1)
   sum array = array1 + number
 5 print(sum array)
    9 8 11]
```

## Concatenation on arrays

• Since the + operator cannot be used for **concatenation**, Numpy comes with a **concatenate()** function.

```
1 print(array1)
2 print(array2)
3 conc_array = np.concatenate([array1, array2])
4 print(conc_array)

[0 2 1 4]
[1 2 3 5]
[0 2 1 4 1 2 3 5]
```

## The \* operator on arrays

- The \* operator behaves as the + operator on Numpy arrays.
- It consists of an **element-wise multiplication** of the elements in arrays.
- **Broadcasting:** if a Numpy array is multiplied by a number, the number will multiply each element in the array.

```
1 array1 = np.array([0, 2, 1, 4])
2 array2 = np.array([1, 2, 3, 5])
3 print(array1)
4 print(array2)
5 mult_arrays = array1*array2
6 print(mult_arrays)
```

```
[0 2 1 4]
[1 2 3 5]
[ 0 4 3 20]
```

```
1  n = 4
2  mult_array_int = array1*n
3  print(mult_array_int)
```

```
[ 0 8 4 16]
```

## Additional functions

#### Additional Numpy functions

- Min, max: returns the minimal, resp. maximal, values in array.
- Argmin, argmax: returns the index where the minimal, resp. maximal, values are.
- Mean, median: returns the mean, resp. median, value for a given array.
- **Sum:** sums all the elements in the array together

```
array1 = np.array([0, 2, 1, 4, 7])
   print (array1)
   min val = np.min(array1)
   print(min val)
   argmin val = np.argmin(array1)
  print(argmin val)
   max val = np.max(array1)
   print (max val)
   argmax val = np.argmax(array1)
   print(argmax val)
   mean val = np.mean(array1)
   print(mean val)
   median val = np.median(array1)
   print (median val)
   summed val = np.sum(array1)
  print(summed val)
[0 2 1 4 7]
```

```
2.8
2.0
14
```

## Mathematical functions and constants

#### Numpy also contains

- Many mathematical functions (cosine, sine, logarithm, exponential, etc.)
- And many mathematical constants (pi, etc.)

```
1 print(np.cos(0))
2 print(np.sin(0))
3 print(np.pi)
4 print(np.log(1))
5 print(np.exp(0))
```

```
1.0
0.0
3.141592653589793
0.0
1.0
```

# Aliasing, Shallow and Deep copies in arrays

 As with lists, Numpy arrays are subject to the same issues about aliasing, shallow and deep copies.

• If needed, use deep copies of the arrays.

```
two d array1 = np.array([[1,2],[3,4]])
 2 two d array2 = two d array1
 3 print (two d array1)
 4 print (two d array2)
   print(id(two d array1))
 6 print(id(two d array2))
[[1 2]
 [3 4]]
 [3 4]]
1750029422960
1750029422960
   two d array1[0][0] = 17
 2 print(two d array1)
 3 print (two d array2)
      4]]
```

# And so much more! RTFM!

- Numpy has many more functions and tools to offer!
- Random functions (to be covered in an upcoming session, if time allows?)

Learn more about Numpy (RTFM!) here:

https://numpy.org/doc/stable/

```
# Numpy.random.choice() mimics a dice roll
dice roll = np.random.choice([1, 2, 3, 4, 5, 6])
print(dice roll)
dice roll = np.random.choice([1, 2, 3, 4, 5, 6])
print(dice roll)
dice roll = np.random.choice([1, 2, 3, 4, 5, 6])
print (dice roll)
dice roll = np.random.choice([1, 2, 3, 4, 5, 6])
print(dice roll)
dice roll = np.random.choice([1, 2, 3, 4, 5, 6])
print (dice roll)
dice roll = np.random.choice([1, 2, 3, 4, 5, 6])
print(dice roll)
```

```
6 1 4 3
```

## Activity 1 - Exam adjustments

 Let us assume, that I have grades from my students listed in some np.array variables, as shown below.

```
[[60 80 70]
[50 80 65]
[40 70 55]
[60 70 65]
[60 90 75]]
```

### Activity 1 - Exam adjustments

- Let us assume, that I have grades from my students listed in a np.array.
- The first line contains the column labels (student name, some scores) and the other lines will consist of entries regarding some of the students.
- Let us assume that, as a professor, I have decided to be lenient towards my students.
- I realized that the midterm was a bit too difficult compared to last year.
- To compensate for that, I would like to increase the scores of all students on the midterm by 50%.

### Activity 1 - Exam adjustments

Write a function grade\_adjustment(),

- which receives a grades table, grades\_table,
- increases the scores of all students on the midterm by 50%,
- re-calculates the average score, with the new adjusted midterm score,
- and then returns the updated grades table as its sole output.

### Activity 1 - Exam adjustments

Write a function grade\_adjustment(),

- which receives a grades table, grades\_table,
- increases the scores of all students on the midterm by 50%,
- re-calculates the average score, with the new adjusted midterm score,
- and then returns the updated grades table as its sole output.

• Important note: The maximal score for the midterm exam is capped to 100. This means that a student which scores 80 points on the midterm, will not obtain 120 points after the adjustment, but only 100.

# The import procedure

• The import procedure is used to import functions defined in external .py files.

### my\_code.py file

```
jupyter my_code.py ✓ Last Tuesday at 1:22 PM
 File
       Edit
              View
                     Language
    def my function(x):
        return 2*x + 1
    def my function2(x):
        return 3*x + 4
    def my function3(x):
        return 4*x + 7
```

# The import procedure

- The import procedure is used to import functions defined in external .py files.
- To demonstrate, we have defined a my\_code.py file with three functions.

### my\_code.py file

```
    Jupyter my_code.py
    Last Tuesday at 1:22 PM

 File
        Edit
               View
                      Language
    def my function(x):
        return 2*x + 1
    def my function2(x):
 5
        return 3*x + 4
    def my function3(x):
        return 4*x + 7
```

# The import procedure

- The import procedure is used to import functions defined in external .py files.
- To demonstrate, we have defined a my\_code.py file with three functions.
- We can then import one of these functions in our Notebook, by using the from ... import ... command.

### my\_code.py file

```
    Jupyter my_code.py
    Last Tuesday at 1:22 PM

 File
        Edit
               View
                      Language
    def my function(x):
        return 2*x + 1
    def my function2(x):
        return 3*x + 4
    def my function3(x):
         return 4*x + 7
```

```
1 from my_code import my_function
1 print(my_function(2))
5
```

### Importing as

 If needed, we can import and rename a function by using the as keyword.

The whole command then reads
 from ... import ... as ...

 Note: if you rename the function, its calling name changes to the alias you specified.

### my\_code.py file

```
  Jupyter my_code.py
  Last Tuesday at 1:22 PM

 File
       Edit
              View
                      Language
    def my function(x):
        return 2*x + 1
    def my function2(x):
        return 3*x + 4
    def my function3(x):
        return 4*x + 7
```

```
1 print(my_function2(2))

NameError Traceback (most recent call last)

ipython-input-4-20b74e0a7273> in <module>
----> 1 print(my_function2(2))

NameError: name 'my_function2' is not defined

1 print(custom_name(2))

10
```

# Importing several functions

 If needed, you can import multiple functions in a single import call.

• Simply use **commas (,) symbols** to separate the different functions names.

 Or, you can also import all functions at once, by simply entering \*.

### my\_code.py file

```
Jupyter my_code.py ✓ Last Tuesday at 1:22 PM
 File
       Edit
              View
                     Language
   def my function(x):
        return 2*x + 1
   def my function2(x):
        return 3*x + 4
   def my function3(x):
        return 4*x + 7
```

```
1 from my_code import my_function, my_function2

1 from my_code import *

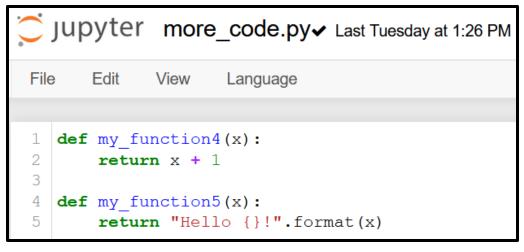
1 print(my_function3(2))

15
```

### Importing an entire module

- You can also import a whole file, as a module.
- To do so, simply start with import instead of from.
- By doing so, you import all the functions, but they have to be called using the module name and the dot operator (.).
- This can make the code more readable, but is also a bit more inconvenient.

### more\_code.py file



### Importing an entire module

- You can also use an alias for the module using the as keyword, as before.
- Typically, we often do it with Numpy!

import numpy as np

### more\_code.py file



```
1 import more_code as mc

1 print(mc.my_function4(2))
3

1 import numpy as np

1 print(np.cos(0))
1.0
```

- **Observation:** Python imported functions from my\_code.py, which was located in the same folder as my Notebook.
- But there was no <u>numpy.py file</u> in this location.
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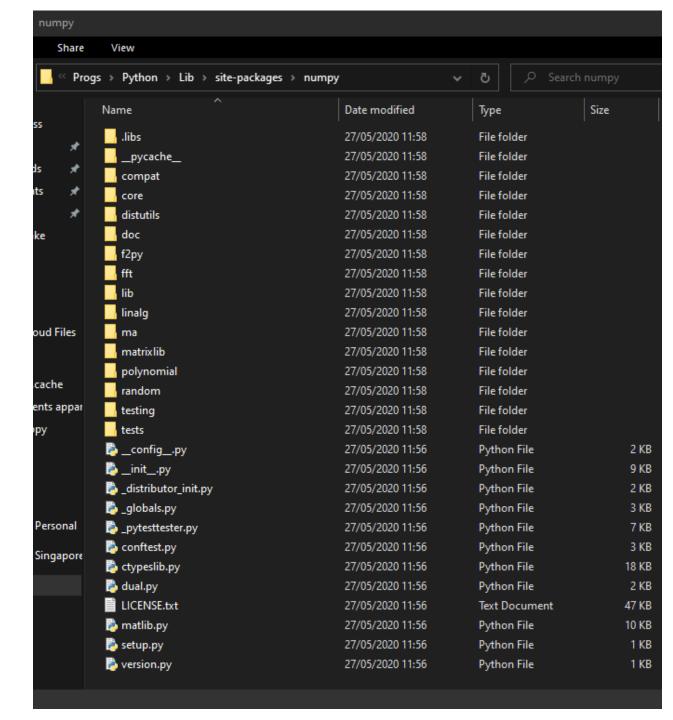
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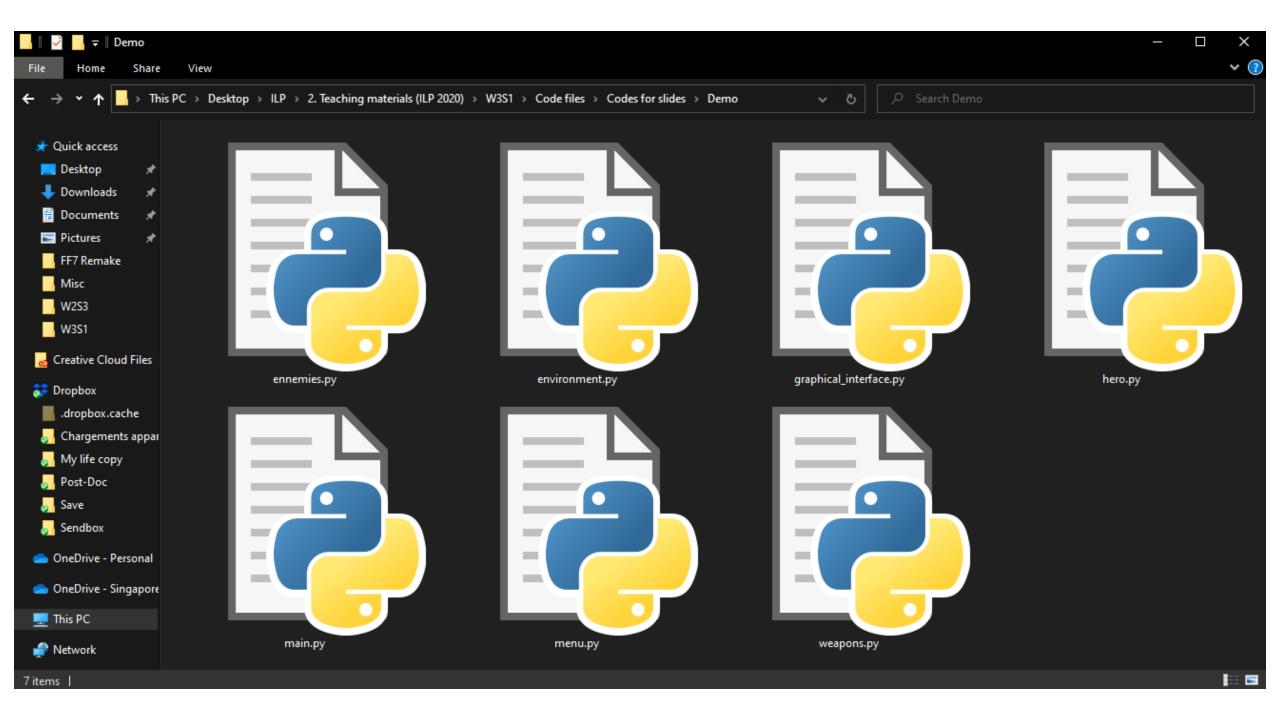


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E.g. in a video game:

- One developer can design the main character,
- Another one will develop enemies,
- Another one will develop items and weapons,
- Another one will design the map/environment in which heroes and enemies evolve,
- Etc.



- Each developer will then work on his/her own .py file, taking care of his/her specific subtask.
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 This is something very common in programming projects.

• Important: you need to build the habit of documenting your functions!

### Matt's Great advice #11

# Matt's Great Advice #11: Good import practices

Some good practices in projects

- 1. As with the variables and functions names, it is a good idea to **make** your file names explicit.
- 2. Have a file for each sub-concept, and a single main file that assembles them all at the end.
- 3. It is often better to **import only what is needed** (**from** ... **import** ...)
  rather than importing everything
  (**from** ... **import** \*, **import** ...).



### Conclusion

- Memory management and lists: aliasing, shallow and deep copies
- The Numpy library (part 1): arrays, math functions, etc.
- About the import procedure
- Project organizing
- Mini-project