

# Python for Data Analysis and Scientific Computing

X433.3 (2 semester units in COMPSCI)

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#### **Course Content Outline**

	Intro	duct	ion	to.	Dyth	an "
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- Python pros and cons
- Installing the environment with core packages
- Python modules, packages and scientific blocks
- Working with the shell, IPyton and the editor

#### Language specifics 1/2

- Basic arithmetic operations, assignment operators, data types, containers
- Control flow (if/elif/else)
- Conditional expressions
- Iterative programming (for/continue/while/break)
- Functions: definition, return values, local vs. global variables

#### Language specifics 2/2

- Classes / Functions (cont.): objects, methods, passing by value and reference
- Scripts, modules, packages
- I/O interaction with files
- Standard library
- Exceptions
- NumPy 1/3
- Why NumPy?
- Data type objects
- NumPy arrays
   Indexing and slicing of arrays

Indexing and slicing of arrays HW

- Matplotlib
- What is Matplotlib?
- Basic plotting
- Tools: title, labels, legend, axis, points, subplots, etc.
- Advanced plotting: scatter, pie, bar, 3D plots, etc. HW3



- Functions: <u>objects</u>, methods, passing by value and reference
  - an object is something allocated in memory
  - variables are objects
  - functions are objects
  - functions and variables are not different in Python in the way they are addressed as they point to an object
  - functions can be assigned to variables
  - they can be passed as an argument to different functions
  - a function can also be an item in a collection
  - everything in Python is an object. Example: int is an object
  - objects have identity (names) so that we can tell if they are the same or different objects



- Functions: objects, methods, passing by value and reference
  - the name of an object is not part of the object
  - the name of an object exist in the namespace
  - every object has a specific location in memory
  - in Python objects have an ID that reveals their memory location
  - objects have a particular type (int, list, tuple, etc.)
  - every object has only one type
  - every object has a value with different attributes
  - Example: X = 34 -> here, 34 is of type 'int'. Objects are: '34', 'int' itself, the 'type' applied to 'X' in order to find that it is of 'int' 'type'



- <u>Classes</u>: objects, <u>methods</u>, passing by value and reference
  - methods are functions that are members of a class
  - they are functions attached to objects
  - a class can be called with different methods (functions) that it consist of

Example:

```
## Class example:
2  # Simple class:
3  class simple_class:
4    """This class shows basic functionality"""
5    a = 12
6    def f():
7    return 'hello world'
```

after executing the code above we try:

We create an ---> instance of a class



- <u>Classes</u>: objects, <u>methods</u>, passing by value and reference
  - methods are functions that are members of a class
  - they are functions attached to objects
  - a class can be called with different methods (functions) that it consist of

Example:

```
## Class example:

## Simple class:

class simple_class:

"""This class shows basic functionality"""

a = 12

def f():
    return 'hello world'
```

after executing the code above we try:



- Classes <u>Inheritance</u>: objects, methods, passing by value and reference
  - Inheritance is when a class behavior can be copied by an instance of a class object
  - Classes can inherit attributes and behavior methods from other classes called the superclasses
  - A class that inherits from a superclass is called a subclass, (also heir or child class)
  - There is a hierarchy among classes

```
12 # Base class - super class:
13 class class test:
14
        def method one():
            print('This is method 1')
15
        def method two():
16
17
            print('I am method 2')
18
19 # Inheritance - subclass / derived class:
20 class class_test_two(class_test):
21
        def method one():
            print('This is new method 1') # method overriding from super class
22
23
        def method three():
            print('This is method 3')
24
```



- Classes <u>Inheritance</u>: objects, methods, passing by value and reference
  - Inheritance is when a class behavior can be copied by an instance of a class object
  - Classes can inherit attributes and behavior methods from other classes called the superclasses
  - Unlike Java and C#, python allows multiple inheritance inherit from multiple classes at the same time like this: >>> class Subclass(SuperClass1, SuperClass2, ...)

```
# Base class - super class:
   class class test:
        def method_one():
14
            print('This is method 1')
15
        def method two():
16
            print('I am method 2')
17
18
   # Inheritance - subclass / derived class:
    class class_test_two(class_test):
21
        def method one():
            print('This is new method 1') # method overriding
22
23
        def method_three():
            print('This is method 3')
24
```

```
In [1]: class_test.method_one()
This is method 1

In [2]: class_test.method_two()
I am method 2

In [3]: class_test_two.method_one()
This is new method 1

In [4]: class_test_two.method_two()
I am method 2

In [5]: class_test_two.method_three()
This is method 3

In [6]: class_test_two._base__
Out[6]: __main__.class_test
```



- Classes Polymorphism: objects, methods, passing by value and reference
  - Polymorphism is based on the Greek words: Poly (many) and morphism (forms)
  - So it is a structure that can take or use many forms of objects

```
## Polymorphism example:
    class Animal:
        def __init__(self, name): # Constructor of the class
28
29
             self.name = name
30
        def talk(self):
                                     # Abstract method, defined by convention only
            raise NotImplementedError("Subclass must implement abstract method")
31
32
33
   class Cat(Animal):
34
        def talk(self):
35
             return 'Meow!'
36
37 class Dog(Animal):
38
        def talk(self):
39
            return 'Woof! Woof!'
40
41 animals = [Cat('Tiger'),
42
               Cat('Kitty'),
43
               Dog('Maxie')]
44
45 def animal_sounds():
46
        for animal in animals:
47
            print(animal.name + ': ' + animal.talk())
```



- Functions: objects, methods, passing by value and reference
  - Pass by value call means the called functions' parameter will be a copy of the callers
    passed argument
    - user is dealing with the actual value of a variable directly
  - Pass a reference to a function means the called functions' parameter will be == as the callers' passed argument (not the value, but the identity the variable obj. itself)
    - user is dealing with the memory location of a variable rather than its actual value
  - the question is if a variable can be modified after being passed to a function or not
  - in Python the difference between the two ways of sharing variables is somewhat elusive



Functions: objects, methods, passing by value and reference

#### Rules:

- when a variable is passed to a function, the reference to the object, to which the variable refers is actually passed, and not the variable
- when an <u>immutable</u> value is passed to a function, the function <u>can not</u> change the variable
- when a <u>mutable</u> value is passed to a function, the function <u>can</u> change the variable
- variables declared in functions exist in a local table known as local namespace and have local scope



Functions: objects, methods, passing by value and reference

Example:

```
## Example of functions: passing by value and reference

def fun_two(a, b, c):
    a = 12
    print(a)
    b = [34]
    print(b)
    c.append(41)
    print(c)
```

after executing the code above we enter these lines:



Functions: objects, methods, <u>passing by value and reference</u>

Pass-by-reference

- Suppose we have the list:
  - X = [12,34,41,52]

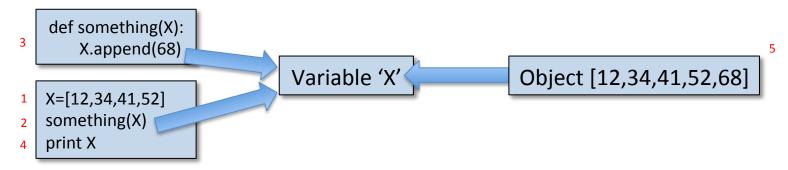
X is the variable that points to the object that is the list [12,34,41,52], but X itself is NOT the list

- Variables can be looked at as containers that hold objects
- in the pass-by-reference case the variable is passed directly into the function along with its contents, that is the object

Functions: objects, methods, passing by value and reference

#### Pass-by-reference

- the argument created inside the function is exactly the same container as the one passed by the caller
- it refers to the same object in memory



- it follows that any action performed to the variable or the object inside the function 3 will be visible by the caller 2
- so the changes will be visible outside the function

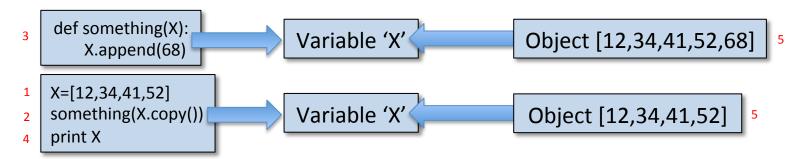
<u>Conclusion:</u> when using pass-by-reference, both the function and the caller use the same exact variable and object / memory location



Functions: objects, methods, passing by value and reference

#### Pass-by-value

- in this case the function receives a copy of the object's argument passed by the caller
- it is stored in a new memory location
- in essence the function now provides it's own container for the value
- there is no relationship between the variables nor the objects referred to by the function and the caller
- the objects have the same value, but they are different
- it follows that nothing that happens to one will affect the other
- so the changes inside the function will not be visible outside



Conclusion: the different copies of the variable and the object do not affect one another



- Functions: objects, methods, <u>passing by object in Python</u>
  - in Python there is not exactly a reference to a value or reference in the same way as in C++
  - Python uses a reference to an object, which binds the name of a variable to an object in memory
  - Python creates a new name for the same object when calling functions, so changing the object shows in the caller, however assigning to the function-<u>local</u> variable is not reflected in the caller just like in Java or Lisp
  - To make this slightly easier, always think of the mutable and immutable objects:
    - Changing mutable objects can change the object directly, hence changing an object inside a function or a method will also change the original object outside
    - Changing immutable objects inside a function or a method will create a <u>new instance</u> and the original instance outside that function or a method is <u>not changed</u>



- Scripts, modules, packages
  - scripts are longer code collections stored in a file
  - scripts are used so that there is no need to type everything in the interpreter
  - it is a convenient way to store larger pieces of code to be executed any time
  - scripts contain sequence of instructions
  - indentation used in scripts is very convenient because increases readability
  - scripts can be written in any text editor of choice ( we have one in Pyzo)
  - scripts are also referred to as modules
  - scripts have the extension .py



Scripts, modules, packages

Example: ... save the code below in a file called 'lecture3.py':

... check what's loaded in namespace and run the script from the same directory :

... after the script was executed we see new objects exist in namespace



Scripts, modules, packages

Example: ... now call the already defined function and observe the result:

```
In [15]: script_test(a,b)
Python is fun
```

- this script can also by executed as a standalone file in the Unix/Linux terminal or using the cmd Win console
- make sure you are in the same directory where 'lecture3.py' resides

Example: ... we slightly modify the script by adding "print('It works')" before we run it:

```
17 a = ('Python')
18 b = (' is fun')
19 def script_test():
20 print(a+b)
21 print('It works')
```

... now run the code using your terminal or cmd window:

```
Macintosh:code alex$ python lecture3.py
It works
Macintosh:code alex$
```



- Scripts, <u>modules</u>, packages
  - modules are scripts that provide a better way of organizing your code in a hierarchical way
  - the tools for scientific computing provided by numpy and scipy are modules, but they themselves are packages
  - modules, packages and sub-packages must be imported before they are used
  - then you can use the extended functionality a module provides



- Scripts, modules, packages
  - in some cases it is better to import only parts of modules / packages we need
  - this is good because we won't take extra memory for functionality we won't use from a module
  - the drawback in this approach is that you won't be able to use other methods of the module
  - in this way the user can type shorter commands like: 'path' rather than 'sys.path'

```
In [18]: from sys import path
In [19]: whos
Variable
             Type
                        Data/Info
             str
                        Python
                        is fun
name
             str
                         loader
             list
path
script test function
                        <function script test at 0x10ed922f0>
In [20]: path
Out[20]:
'/Applications/Python 3.4/pyzo2015a/lib/python34.zip',
 '/Applications/Python 3.4/pyzo2015a/lib/python3.4',
 '/Applications/Python 3.4/pyzo2015a/lib/python3.4/plat-darwin',
 '/Applications/Python 3.4/pyzo2015a/lib/python3.4/lib-dynload',
 '/Applications/Python 3.4/pyzo2015a/lib/python3.4/site-packages',
 '/Applications/Python 3.4/pyzo2015a/lib/python3.4/site-packages/setuptools-12.2-py3.4.egg',
 '/Applications/Python 3.4/pyzo2015a/lib/python3.4/site-packages/IPython/extensions']
In [21]: version
                                       Traceback (most recent call last)
<ipvthon-input-21-6e6c2420ff71> in <module>()
----> 1 version
NameError: name 'version' is not defined
```



- Scripts, modules, packages
  - sometimes it is better to refer to a module with a different alias after being imported

In [23]: import numpy as np

```
In [23]: whos
Variable Type Data/Info

a ndarray 2x2: 4 elems, type `int64`, 32 bytes
b ndarray 49: 49 elems, type `float64`, 392 bytes
c ndarray 49: 49 elems, type `float64`, 392 bytes
name str __loader__
np module <module 'numpy' from '/Ap<...>kages/numpy/_init__.py'>
```

#### Example:

```
import numpy as np
a = np.array([[12, 34], [41, 54]])
b = np.arange(0.5,4*np.pi,0.25)
c = np.sin(b)
print(c)
```

... the code above will produce:

```
In [24]: run lecture3
[ 0.47942554     0.68163876     0.84147098     0.94898462     0.99749499     0.98398595
     0.90929743     0.7780732     0.59847214     0.38166099     0.14112001 -0.10819513
-0.35078323 -0.57156132 -0.7568025 -0.89498936 -0.97753012 -0.99929279
-0.95892427 -0.85893449 -0.70554033 -0.50827908 -0.2794155 -0.03317922
     0.21511999     0.45004407     0.6569866     0.82308088     0.93799998     0.99459878
     0.98935825     0.92260421     0.79848711     0.62472395     0.41211849     0.17388949
-0.07515112 -0.31951919 -0.54402111 -0.73469843 -0.87969576 -0.96999787
-0.99999021 -0.967808     -0.87545217 -0.72866498 -0.53657292 -0.31111935
-0.0663219 ]
```



- Scripts, modules, packages
  - we can also use a different way to import a module using the '\*' sign:

```
In [26]: from sys import *
```

- this notation is called star import and it means import all ... names for access from the module
- import \* will import everything, except the names that start with \_ as they are private
- every name that does not have \_ is considered public and access to it will be granted
- an exception to this rule is when the module has the \_\_all\_\_ option in the beginning
- all specifies what names exactly will be made available when an import \* call is made regardless
  if they are meant to be public or private



• Scripts, modules, packages

Example: ... consider we have the following code:

```
public_var = 12
    private_var = 34

def public_fun():
    print('This function is public')

def _private_fun():
    print('... now this function is set to be private')

class PublicClass():
    print('This is a public class')

class _PrivateClass():
    print('... now this Class is private')
```

... then the only exposed names in this '\*' call will be:

```
In [27]: from lecture3 import *
In [28]: whos
Variable
          Type
                   Data/Info
PublicClass type
                   <class 'lecture3.PublicClass'>
          str
                   loader
name
public_fun function
                   <function public fun at 0x10ed0cd90>
public var
          int
                   12
```



Scripts, <u>modules</u>, packages

Example: ... lets try the same code with the only addition the '\_\_all\_\_' option:

```
30 public var = 12
               private var = 34
                all = ['public var',' private fun']
               def public_fun():
            36
                    sum pub priv = public_var + _private_var
                    print('This function is public. The sum is', sum pub priv)
            38
                def private fun():
                    print('... now this function is set to be private')
                                                           class PublicClass():
                    print('This is a public class')
                                                           In [29]: from lecture3 import *
            43 class PrivateClass():
                    print('... now this Class is private')
                                                           In [30]: whos
                                                           Variable Type Data/Info
... then the only exposed names in this '*' call will be:
                                                                             __loader_
                                                           public_var int
                                                           In [31]: _private_fun()
                                                            ... now this function is set to be private
                                                           In [32]: public var
                                                           Out[32]: 12
                                                           In [33]: private_var
                                                                                               Traceback (most recent call last)
                                                           <ipython-input-33-2e9c0dc51fa1> in <module>()
                                                           ---> 1 private var
                                                           NameError: name 'private var' is not defined
```



Scripts, <u>modules</u>, packages

<u>Caution</u>: star import is <u>NOT</u> recommended and should be avoided for the following reasons:

- it is not explicit, which means that we don't know anything about what is being imported, which is why it is much more clear to import variables, functions or classes one by one as needed
- the namespace can be cluttered
- this may create name overrides between different modules that are loaded
- it is impossible to understand the functionality of everything that is loaded just by looking at the names of different variables, functions or classes that were imported



• Scripts, modules, packages

<u>Caution</u>: star import is <u>NOT</u> recommended and should be avoided for the following reasons:

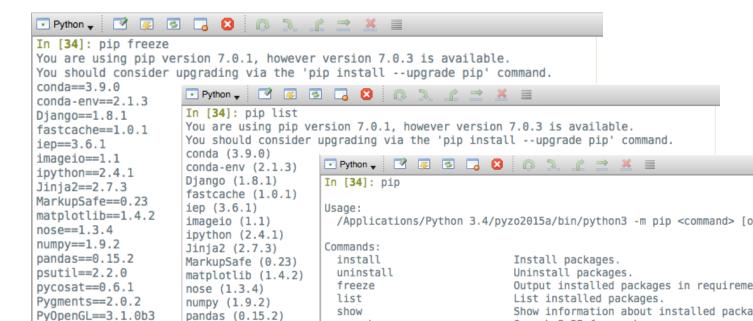
- it decreases readability of the code and it is hard to understand it
- the tab completion is not functioning as it is supposed to to provide simplicity
- it is impossible to check for different undefined symbols
- there may be problems with visibility of different variables or functions declared in '\_\_all\_\_'
- finally, this way of loading has its benefit because it is quick, but it is a lazy way of doing it and the user must know what exactly needs before using it



- Scripts, modules, <u>packages</u>
  - a module is a single file whereas a package is a folder containing number of modules
  - in the package folder there must be a file named '\_\_init\_\_.py' that describes what is included in this package
  - the '\_\_init\_\_.py' file distinguishes a Python package from a regular file folder
  - packages can be nested, so that subfolders may have an '\_\_init\_\_.py' file and can contain more modules
  - when importing a module or a package Python creates the same type of module object
  - when importing a package you are importing bunch of modules (files), which is why it is always better to only import particular modules from a package in order not to clutter the namespace
  - when a package is imported, only variables, functions and classes specified in the '\_\_init\_\_.py' file are loaded. That rule does not go for any sub-packages or modules
  - when using star import for packages, '\_\_all\_\_' specifies the modules that will be loaded into the current namespace (not what is specified in the '\_\_all\_\_' file inside each module)
  - when the '\_\_all\_\_' declaration is omitted in the '\_\_init\_\_.py' file of a package, the statement 'from <package> import \*' will not import anything at all



- Scripts, modules, packages
  - some packages come with Python core installation:
    - email, http, html (modules), io, ison, test, xml (modules), etc.
  - others have to be installed separately:
    - pandas, numpy, scipy, matplotlib, sympy, requests, django, pillow, SQLAlchemy, pygame, pyglet etc.
  - to check for available packages and their versions on your machine use the pip command





- Scripts, modules, <u>packages</u>
  - Some of the top extended Python packages are:
  - NumPy provides an advance math functionality
  - SciPy provides a rich library for scientific computations and works well with NumPy
  - Matplotlib advanced plotting capability that is well integrated with NumPy and SciPy
  - Pandas provides a high-level data manipulation toolset built on top of NumPy
  - SymPy providing algebraic evaluation, differentiation, complex numbers, etc.
  - Requests the top choice for any http web design
  - Pillow great tool for image processing
  - IPython makes Python easy to use with its shell, history, library and own text editor
  - Pygame for 2D game development
  - Pyglet for 3D game development
  - Django a rich web framework for pro development
  - Kyvi Open source *Python* framework for rapid development of mobile applications



- I/O interaction with files
  - when working with data it is generally more convenient to read it from a file containing it
  - in order to store some result the user have to be able to write to a file
  - in order to begin reading from or writing to a file, the user has to specify it

#### Example:

```
file = open('files/lecture3/test.txt', 'r') # opens file for reading
sentences = file.readlines()
print(sentences)
print(len(sentences))
file.close()

file = open('files/lecture3/test.txt', 'w') # opens file for writing
file.write('We will overwrite the previous text \n and go to a new line as well')
file.close()

file = open('files/lecture3/test.txt', 'r') # opens file for reading
sentences = file.readlines()
print(sentences)
print(len(sentences))
file.close()
```

... the code above will result in:

```
['Hello all, I am a text file :)']

1
['We will overwrite the previous text \n', ' and go to a new line as well']
2
```



- I/O interaction with files
  - below are the possible file mode options for file I/O interaction:
    - r open file to read-only
      - » Note: you can not write to it, but only to read from it
    - w open the file to write-only
      - » Note: this option creates a new file or overwrites an existing one
    - a open file to append to it
      - » Note: it does not delete any previous entries
    - r+ open file to read and write
      - » Note: it works just like the 'w' option, but you can read the file
    - b open file in binary mode
      - » Note: used for binary files



#### Standard library

- Some of the top standard library modules in Python are:
- Os provides a selected list of operating system level functionality
- Sys provides access to some variables used by the interpreter
- Io deals with I/O functionality for the three main types of I/O: text, binary and raw
- Math it gives access to mathematical functions excluding complex numbers (->cmath)
- Wave part of Python core installation, provides interface to the WAV format
- Audioop consist of useful tools for operating on digital sound sampled data
- Html provides an utility to work with the html language
- Time provides functions related to time
- Calendar provides various calendar capability
- Daytime extended way of manipulating date and time



#### Exceptions

- exceptions in Python are raised when the interpreter finds a problem with executing a code
- they can be used to notify the user that certain state is reached or a condition is met
- exceptions can pass messages from one part of the code to another
- there are different types of errors and some of them are shown below

```
In [35]: a = [12,34,41,54]

In [36]: a[4]

IndexError

/Users/alex/1.HD/Alex/1.new/Work/3.Berkeley Extension/3. final course material/2.
.py in <module>()
----> 1 a[4]

IndexError: list index out of range

In [37]: a[2]/0

ZeroDivisionError

/Users/alex/1.HD/Alex/1.new/Work/3.Berkeley Extension/3. final course material/2.
.py in <module>()
----> 1 a[2]/0

ZeroDivisionError: division by zero
```



#### Exceptions

- exceptions in Python are raised when the interpreter finds a problem with executing a code
- they can be used to notify the user that certain state is reached or a condition is met
- exceptions can pass messages from one part of the code to another
- there are different types of errors and some of them are shown below

```
In [38]: a.delete

AttributeError Traceback (most recent call last)

/Users/alex/1.HD/Alex/1.new/Work/3.Berkeley Extension/3. final course material/2.

.py in <module>()
----> 1 a.delete

AttributeError: 'list' object has no attribute 'delete'

In [39]: a[3] + 'Python'
----

TypeError Traceback (most recent call last)

/Users/alex/1.HD/Alex/1.new/Work/3.Berkeley Extension/3. final course material/2.

.py in <module>()
----> 1 a[3] + 'Python'

TypeError: unsupported operand type(s) for +: 'int' and 'str'
```



#### Exceptions

in order to handle exceptions, they have to be caught first

#### Example:

... running the code:

```
while True:
    try:
    a = int(input('Please enter a number: '))
    print('You entered the number ', a)
    print('I will now exit. Good bye!')
    break
    except ValueError:
    print('You entered an invalid number. Please try again.')
```

... will produce the following result:

```
Please enter a number: q
You entered an invalid number. Please try again.
Please enter a number: t
You entered an invalid number. Please try again.
Please enter a number: 5
You entered the number 5
I will now exit. Good bye!
```



#### **Course Content Outline**

•	Installing the environment with core packages Python modules, packages and scientific blocks Working with the shell, IPyton and the editor	HW1
•	Basic language specifics 1/2 Basic arithmetic operations, assignment operators, data types, contain Control flow (if/elif/else) Conditional expressions Iterative programming (for/continue/while/break) Functions: definition, return values, local vs. global variables	
•	Basic language specifics 2/2 Classes / Functions (cont.): objects, methods, passing by value and refe Scripts, modules, packages I/O interaction with files Standard library Exceptions	rence
•	NumPy 1/3 Why NumPy? Data type objects NumPy arrays Indexing and slicing of arrays	HW2
•	Matplotlib What is Matplotlib? Basic plotting	

Tools: title, labels, legend, axis, points, subplots, etc. Advanced plotting: scatter, pie, bar, 3D plots, etc.

Introduction to Python®



- Numpy is the main scientific open-source package for numerical computation in Python
- Numpy provides:
  - functionality comparable to Matlab,
  - it allows for fast algorithm development and proof-of-concept scientific solutions
  - It provides logic manipulation functionality
  - large set of mathematical functions
  - linear algebra functionality
  - Fast Fourier transform
  - large multidimensional array objects
  - variety of routines for fast operations on arrays
  - different objects, like matrices and masked arrays
  - random simulation
  - sorting
  - statistical operations
  - ... and much more



- NumPy's core functionality is the ndarray, which stands for n-dimensional array
- NumPy arrays' data structure and standard sequences in Python have some important differences:
  - NumPy array elements must be of the same data type and take the same memory space
  - this gives NumPy the capability to make advanced mathematical calculations possible on large data sets
  - this kind of calculations are executed with higher efficiency and use more concise code as compared to the built-in sequences in Python
  - lists in Python can increase on the fly, while arrays in NumPy are fixed size once created
  - when the size of an ndarray is changed, a new array will be created and the reference (id) to the the original array will be released (lost and deleted)
  - in Python and NumPy, when having arrays of objects, arrays of different sized elements are possible



- Why NumPy?
  - The main differences between regular Python objects and NumPy objects are:
    - **Speed** comparing the results from a simple test on performing addition over a regular Python list and over a NumPy array, reveals that the sum on the latter is faster
    - Memory efficiency:
      - NumPy's arrays are more compact than Python lists (example later in slides)
      - a list of lists in Python, would take at 3-5 times more space than a NumPy array using single-precision float type numbers
    - **Functionality** FFT, convolution, statistics, linear algebra, histograms, etc.
    - Convenience all vector and matrix operations come free with NumPy, while they are efficiently implemented and save unnecessary work



- Why NumPy?
  - The main differences between regular Python objects and NumPy objects are:
    - **Speed** comparing the results from a simple test on performing addition over a regular Python list and over a NumPy array, reveals that the sum on the latter is faster for large calculations

```
from numpy import arange
                                                    import time
     Speed test example:
                                                    N = int(input('Please enter a number: '))
                                                    x = arange(N)
                                                    y = range(N)
                                                    tic = time.clock()
                                                    toc = time.clock()
                                                    t numpy = toc - tic
                                                    tic = time.clock()
                                                    sum(y)

    Python —

                                                    toc = time.clock()
                                                    t list = toc - tic
In [1]: run speed test list ndarray
                                                    print("numpy: %.3e sec" % (t_numpy))
Please enter a number: 20000
                                                    print("list: %.3e sec" % (t list))
numpy: 7.300e-05 sec
                                                    print("diff: %.3e sec" % (t list-t numpy))
list: 8.330e-04 sec
                                                print("ratio: list is %.1i times slower than numpy ndarray" % (t list/t numpy))
diff: 7.600e-04 sec
ratio: list is 11 times slower than numpy ndarray
```



- Data type objects
  - there are five basic numerical types in NumPy:
    - bool booleans
    - int integers
    - uint unsigned integers
    - float floating point
    - complex 2 double precision numbers
  - all numerical types in NumPy are instances of the dtype object and you can find them like this:

```
In [1]: import numpy as np
In [2]: np.<data type>
or
In [3]: dir(np)
```



- Data type objects
  - NymPy supports much larger variety of types than what the standard Python implementation does:

Number type	Data type	Description
Booleans	bool, bool8, bool_	Boolean (True or False) stored as a byte – 8 bits
	byte	compatible: C char – 8 bits
	short	compatible: C short – 16 bits
	int, int0, int_	Default integer type (same as C long; normally either int32 or int64) – 64 bits
	longlong	compatible: C long long – 64 bits
Integers	intc	Identical to Cint – 32 bits
lintegers	intp	Integer used for indexing (same as C size_t) - 64 bits
	int8	Byte (-128 to 127) – 8 bits
	int16	Integer (-32768 to 32767) – 16 bits
	int32	Integer (-2147483648 to 2147483647) – 32 bits
	int64	Integer (-9223372036854775808 to 9223372036854775807) – 64 bits
	uint, uint0	Python int compatible, unsigned – 64 bits
	ubyte	compatible: C unsigned char, unsigned – 8 bits
	ushort	compatible: C unsigned short, unsigned – 16 bits
	ulonglong	compatible: C long long, unsigned – 64 bits
Unsigned	uintp	large enough to fit a pointer – 64 bits
integers	uintc	compatible: C unsigned int – 32 bits
	uint8	Unsigned integer (0 to 255) – 8 bits
	uint16	Unsigned integer (0 to 65535) – 16 bits
	uint32	Unsigned integer (0 to 4294967295) – 32 bits
	uint64	Unsigned integer (0 to 18446744073709551615) – 64 bits



- Data type objects
  - NymPy supports much larger variety of types than what the standard Python implementation does:

Number type	Data type	Description
	half	compatible: C short - 16 bits
	single	compatible: C float – 32 bits
	double	compatible: C double – 64 bits
Floating-	longfloat	compatible: C long float – 128 bits
point	float_	Shorthand for float64 – 64 bits
numbers	float16	Half precision float: sign bit, 5 bits exponent, 10 bits mantissa
	float32	Single precision float: sign bit, 8 bits exponent, 23 bits mantissa
	float64	Double precision float: sign bit, 11 bits exponent, 52 bits mantissa
	float128	128 bits
6	csingle	64 bits
Complex	complex, complex_	Shorthand for complex128 - 128 bits
floating-	complex64	Complex number, represented by two 32-bit floats (real and imaginary components)
point numbers	complex128	Complex number, represented by two 64-bit floats (real and imaginary components)
ilullibels	complex256	two 256 bit floats

- To check how many bits each type occupies, use one of these notations:
  - 1) (np.dtype(np.<type>).itemsize)\*8
  - 2) np.<type>().itemsize\*8



- Data type objects
  - the difference between signed and unsigned integers and long type variables is:
    - the signed and unsigned types are of the same size
    - the signed can represent equal amount of values around the '0' thus representing equal amount of positive and negative numbers
    - the unsigned can not represent any negative numbers, but can represent double the amount of total positive numbers as compared to the signed type
    - for 32-bit int we have:

int: -2147483648 to 2147483647

uint: 0 to 4294967295

for 64-bit long we have:

long: -9223372036854775808 to 9223372036854775807

ulong: 0 to 18446744073709551615



- Data type objects
  - some of the data types that contain numbers, explicitly specify the bit size of the particular type
  - this is an important thing to know when coding on a 32-bit or 64-bit platforms and a low-level languages are used (C or Fortran)
  - some NumPy data types can be used to:
    - convert python numbers to array scalars (used as functions)
    - convert python sequences of numbers to arrays
    - enter as arguments to the dtype keyword to call various NumPy methods



- Data type objects
  - Examples:
    - convert Python numbers to array scalars (used as functions)

```
In [3]: import numpy as np
In [4]: from sys import getsizeof
In [5]: x=float(2.5)
In [6]: type(x)
Out[6]: float
In [7]: getsizeof(x)
Out[7]: 24
In [8]: x = np.float128(2.5)
In [9]: type(x)
Out[9]: numpy.float128
In [10]: getsizeof(x)
Out[10]: 32
```



- Data type objects
  - Examples:
    - convert Python sequences (lists, tuples, etc.) of numbers to arrays

- Data type objects
  - Examples:
    - enter as arguments to the dtype keyword to call various NumPy methods

