

Lectures Overview



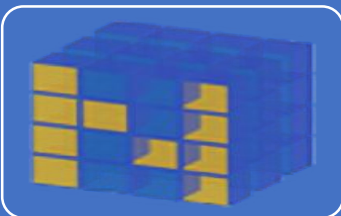
Python Basics

- Background
- Installation & setup
- Python Language



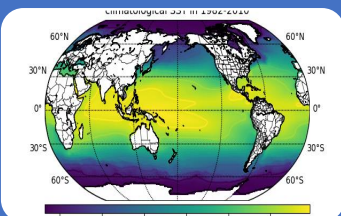
Python Advanced

- I/O & Exceptions Handling
- Modules & Packages
- Object-Oriented Programming in Python



Python for Scientific Computation

- Array computation with Numpy
- Scipy
- Draw common 2D figures with Matplotlib



Python for Oceanography

- Read/Write netCDF files
- Draw data on maps with basemap

Introduction to Python3

Wenming Wu

06/20/2018

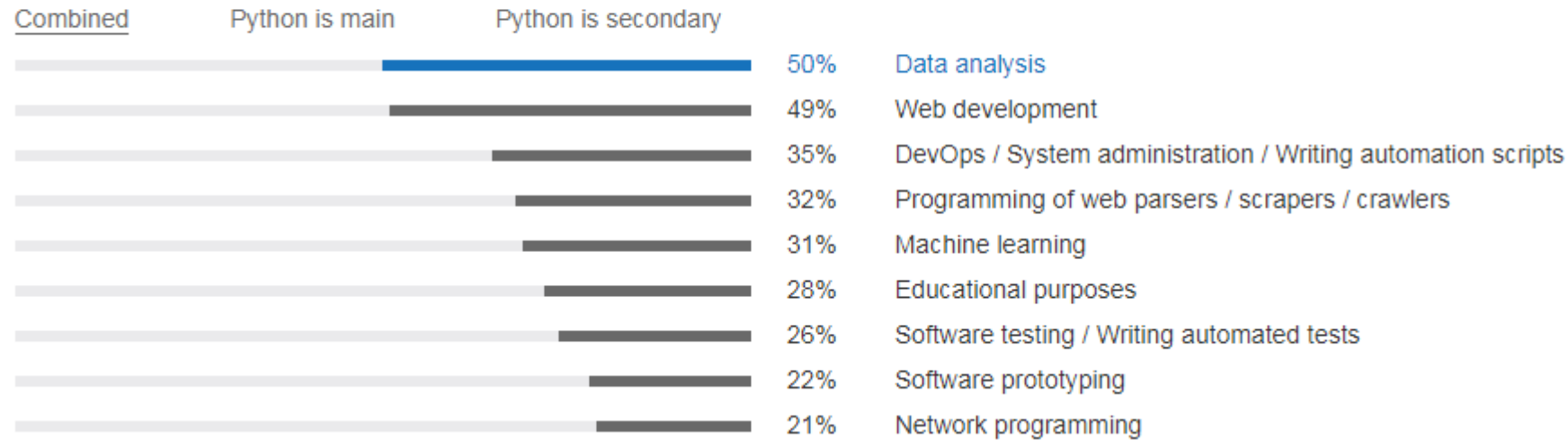
Basics

- Why Python ?
- Installation & setup
- Identifiers & keywords
- Data type
 - Basic types
 - Integral
 - Floating-point
 - String
 - Collection data types
 - Sequence
 - Mapping
- Control flow
- Function

Why Python ?

- Open source general-purpose language

What do you use Python for? (multiple answers)



Source: [Python Developers Survey 2017 Results](#)

Why Python ?

- “People want to use Python because of its **intuitiveness, beauty, philosophy, and readability.**”*

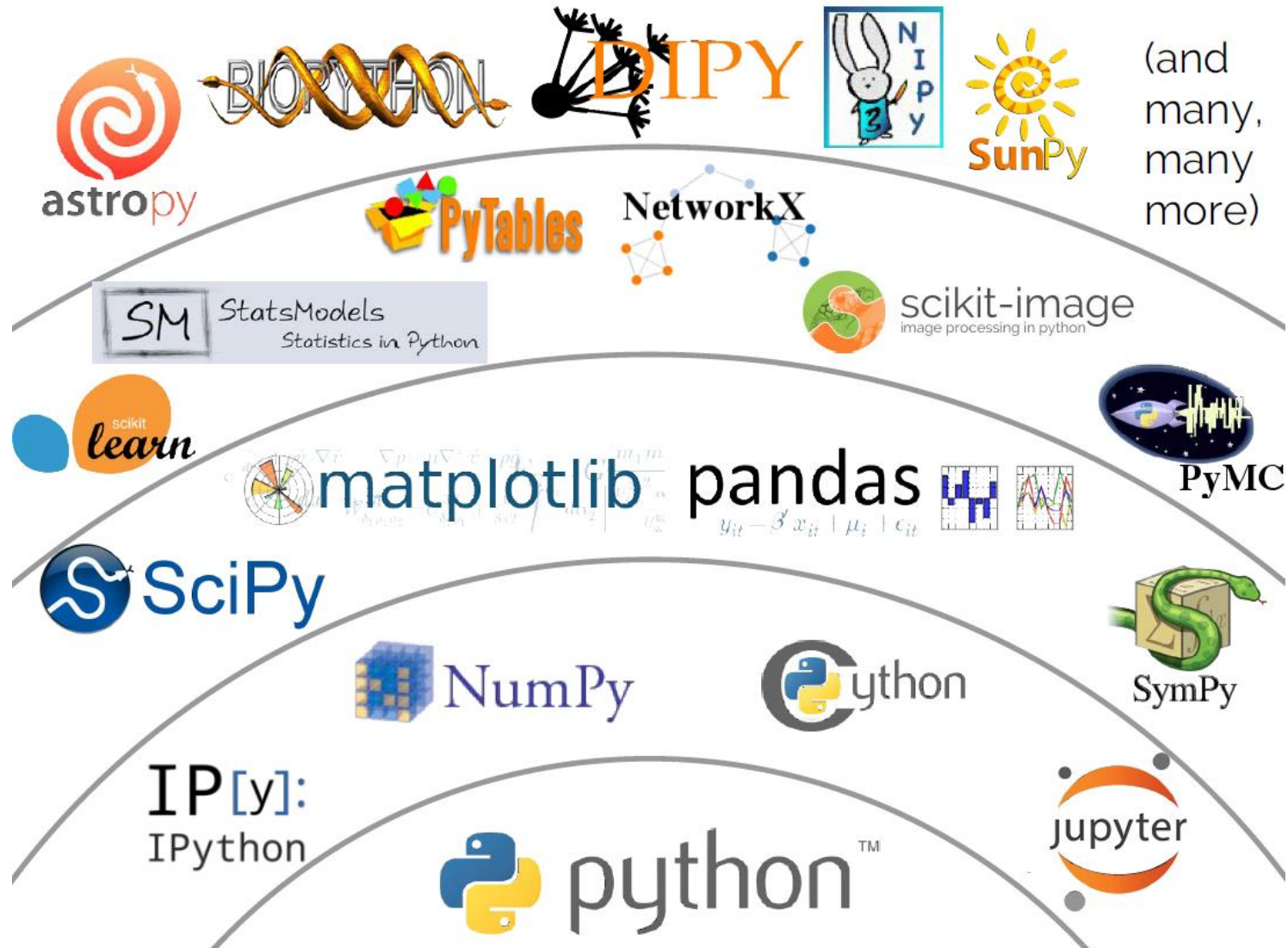
```
x = 34 - 23      # A comment.  
y = "Hello"     # Another one.  
z = 3.45  
if z == 3.45 or y == "Hello":  
    x = x + 1  
    y = y + "World"  # String concat.  
print (x)  
print (y)  
  
12  
HelloWorld
```

- “So people build Python packages that incorporate lessons learned in other tools & communities.”*

* quotes from: [Jake VandPlas 2017 PyData Talk](#)

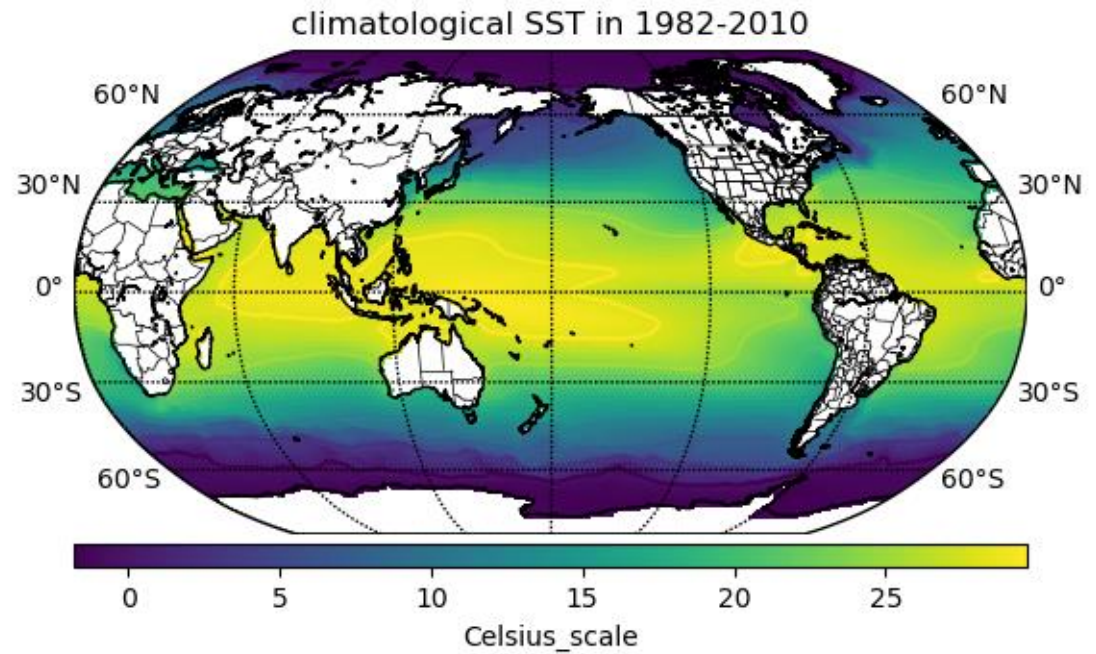
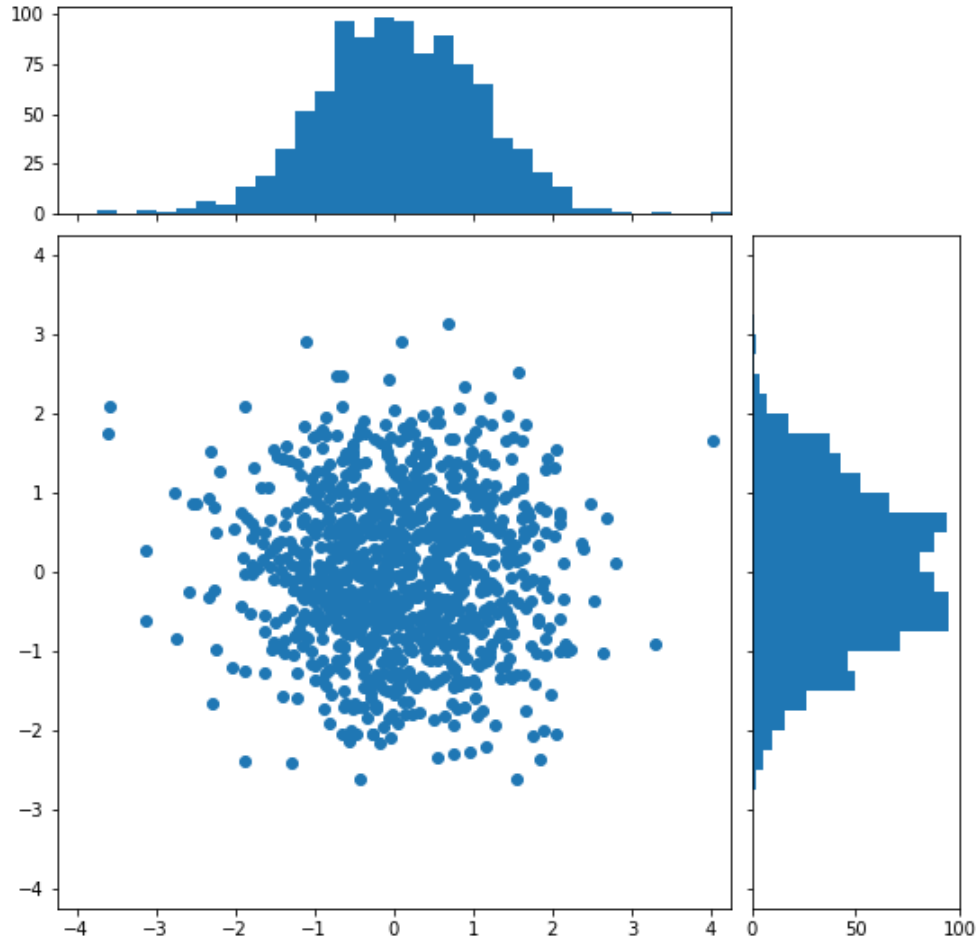
Why Python for Scientific Computation ?

- Easily work with Fortran/C/C++ etc.
- Rich built-in and 3rd party packages for both common and specific domains



Why Python for Scientific Computation ?

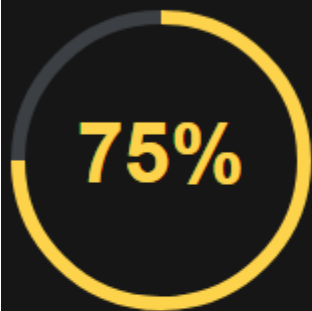
- High-quality figure plotting



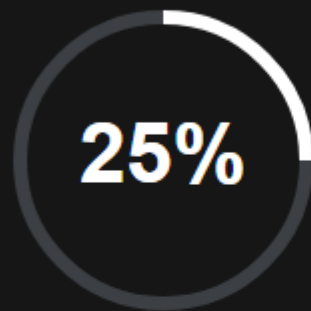
Why Python 3 instead of Python 2 ?

- “Python 2.x is legacy, Python 3.x is the present and future of the language”

Python 3 vs Python 2



Python 3



Python 2

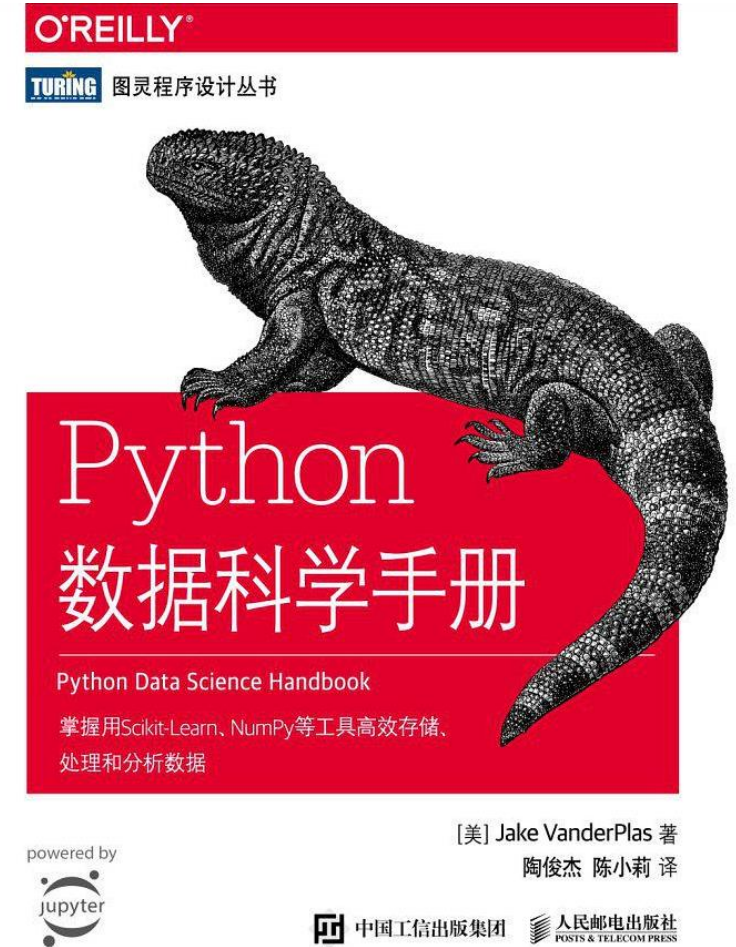
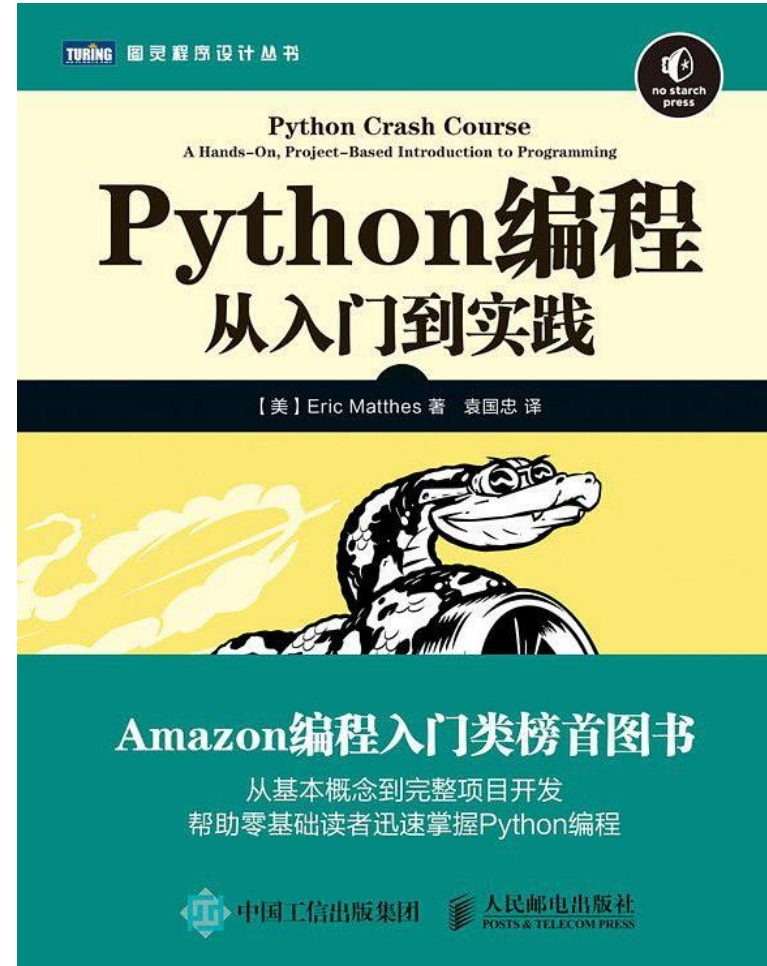
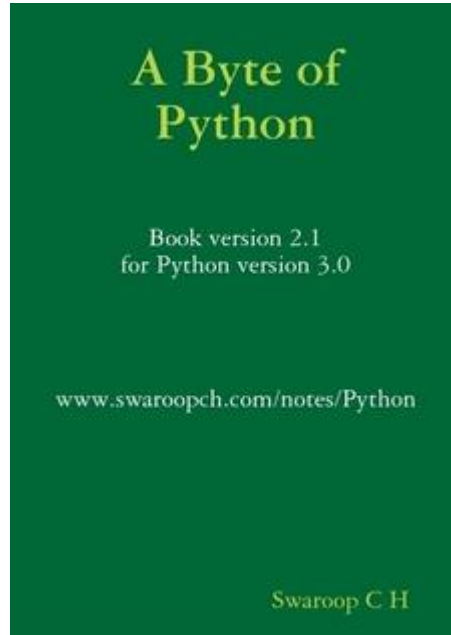


We asked, “Which version of Python do you use the most?”. Python 3 is a strong leader with 75% and Python 2 is used as the main interpreter by only 25%.

Interesting fact

The primary use of Python 3 is growing rapidly. According to the latest research in 2016, 60% were using Python 2 compared with 40% for Python 3. Use of Python 2 is declining as it's not actively developed, doesn't get new features, and its maintenance is going to be stopped in 2020.

Textbooks



Installation



- Conda is an open source package management system focused on Python for scientific computing, which runs on Windows, macOS and Linux.
- Two approaches
 - Miniconda: a minimal installation of the conda command-line tool
 - Anaconda: miniconda plus lots of common used Python packages
- Suggest to download from local repository mirrors instead
 - <https://mirrors.ustc.edu.cn/anaconda/archive>

Anaconda3-5.2.0-Linux-ppc64le.sh	288.3 MiB	2018-05-31 02:37
Anaconda3-5.2.0-Linux-x86.sh	507.3 MiB	2018-05-31 02:37
Anaconda3-5.2.0-Linux-x86_64.sh	621.6 MiB	2018-05-31 02:38
Anaconda3-5.2.0-MacOSX-x86_64.pkg	613.1 MiB	2018-05-31 02:38
Anaconda3-5.2.0-MacOSX-x86_64.sh	523.3 MiB	2018-05-31 02:39
Anaconda3-5.2.0-Windows-x86.exe	506.3 MiB	2018-05-31 02:41
Anaconda3-5.2.0-Windows-x86_64.exe	631.3 MiB	2018-05-31 02:41

Setup

- Verify the installation

```
Anaconda Prompt - conda install numpy pandas matplotlib

(base) C:\Users\wewu>python --version
Python 3.6.5 :: Anaconda custom (64-bit)
```

- Setup updating from local repository channels

```
(base) C:\Users\wewu>conda config --add channels https://mirrors.tuna.tsinghua.edu.cn/anaconda/pkgs/main

(base) C:\Users\wewu>conda config --add channels https://mirrors.tuna.tsinghua.edu.cn/anaconda/pkgs/free

(base) C:\Users\wewu>conda config --show channels
channels:
- https://mirrors.tuna.tsinghua.edu.cn/anaconda/pkgs/free
- https://mirrors.tuna.tsinghua.edu.cn/anaconda/pkgs/main
- Defaults
```

- Install 3rd party packages according to your need

```
(base) C:\Users\wewu>conda install numpy pandas matplotlib netcdf4
Solving environment: done

## Package Plan ##

  environment location: C:\Users\wewu\Anaconda3

added / updated specs:
- matplotlib
- netcdf4
- numpy
- pandas

The following packages will be downloaded:
```

package	build	size	url
libssh2-1.8.0	vc14_0	189 KB	https://mirrors.tuna.tsinghua.edu.cn/anaconda/pkgs/free
matplotlib-2.0.2	np113py36_0	8.5 MB	https://mirrors.tuna.tsinghua.edu.cn/anaconda/pkgs/main

CONDA
CONDA CHEAT SHEET
Command line package and environment manager

Learn to use conda in 30 minutes at bit.ly/tryconda
TIP: Anaconda Navigator is a graphical interface to use conda. Double-click the Navigator icon on your desktop or in a Terminal or at the Anaconda prompt, type `anaconda-navigator`

Conda basics	
Verify conda is installed, check version number	<code>conda info</code>
Update conda to the current version	<code>conda update conda</code>
Install a package included in Anaconda	<code>conda install PACKAGENAME</code>
Run a package after install, example Spyder*	<code>spyder</code>
Update any installed program	<code>conda update PACKAGENAME</code>
Command line help	<code>CONDA/NAME --help</code> <code>conda install --help</code>

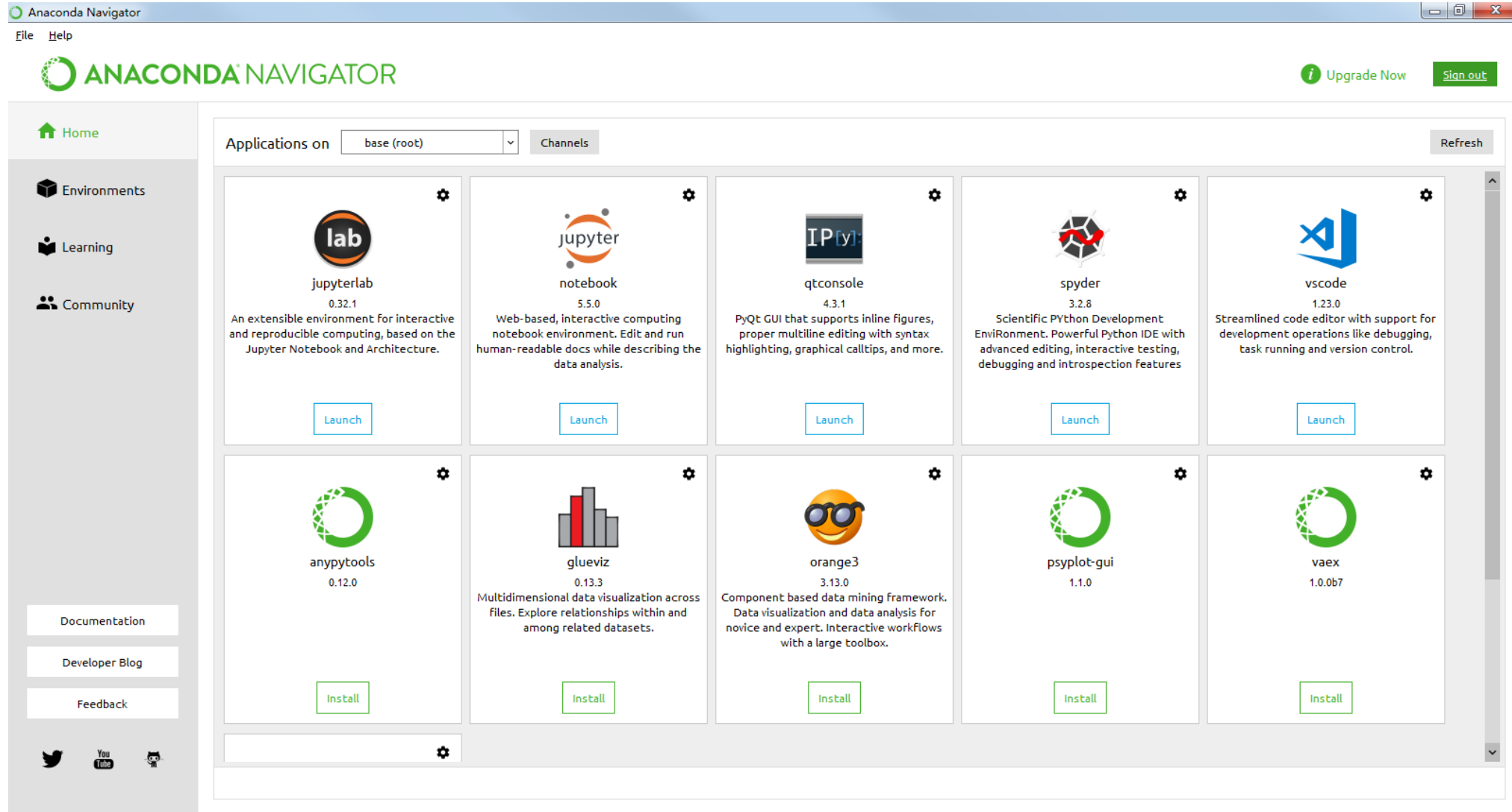
*Must be installed and have a deployable command, usually `PACKAGENAME`

Using environments	
Create a new environment named py35, install Python 3.5	<code>conda create --name py35 python=3.5</code>
Activate the new environment to use it	WINDOWS: <code>activate py35</code> LINUX, macOS: <code>source activate py35</code>
Got a list of all my environments, active environment is shown with *	<code>conda env list</code>
Make exact copy of an environment	<code>conda create --clone py35 --name py35-2</code>
List all packages and versions installed in active environment	<code>conda list</code>
List the history of each change to the current environment	<code>conda list --revisions</code>
Restore environment to a previous revision	<code>conda install --revision 2</code>
Save environment to a text file	<code>conda list --explicit > bio-env.txt</code>
Delete an environment and everything in it	<code>conda env remove --name bio-env</code>
Deactivate the current environment	WINDOWS: <code>deactivate</code> macOS, LINUX: <code>source deactivate</code>
Create environment from a text file	<code>conda env create --file bio-env.txt</code>
Stack commands: create a new environment, name it bio-env and install the biopython package	<code>conda create --name bio-env biopython</code>

Finding conda packages	
Use conda to search for a package	<code>conda search PACKAGENAME</code>
See list of all packages in Anaconda	https://docs.anaconda.com/anaconda/packages/pkg-docs

ANACONDA. CONTINUED ON BACK →

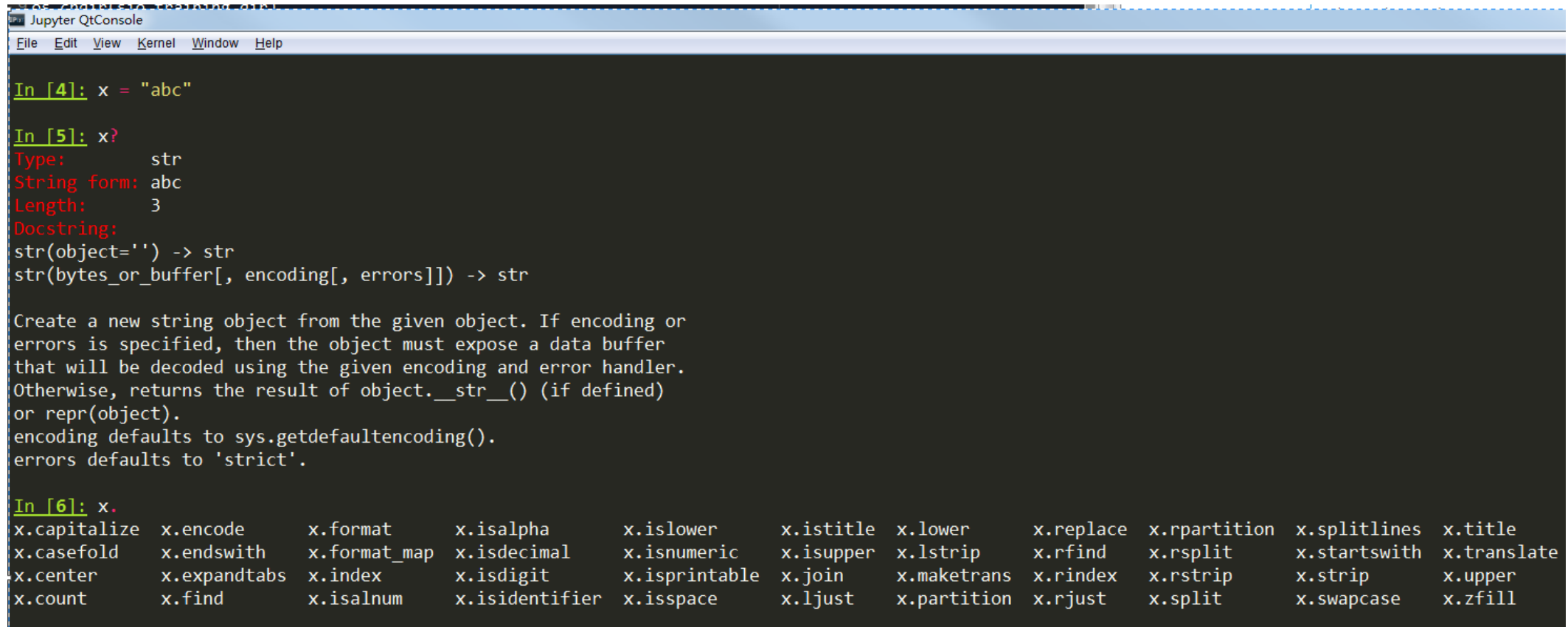
Anaconda Navigator



Get Help & Documents in IPython

“When a technologically-minded person is asked to help a friend, family member, or colleague with a computer problem, most of the time it's less a matter of knowing the answer as much as knowing how to quickly find an unknown answer. ”

- Accessing Documentation/Source Code with `?/??`
- Auto-Completion with **Tab key**



```
Jupyter QtConsole
File Edit View Kernel Window Help

In [4]: x = "abc"

In [5]: x?
Type:          str
String form:   abc
Length:        3
Docstring:
str(object='') -> str
str(bytes_or_buffer[, encoding[, errors]]) -> str

Create a new string object from the given object. If encoding or
errors is specified, then the object must expose a data buffer
that will be decoded using the given encoding and error handler.
Otherwise, returns the result of object.__str__() (if defined)
or repr(object).
encoding defaults to sys.getdefaultencoding().
errors defaults to 'strict'.

In [6]: x.
x.capitalize  x.encode      x.format      x.isalpha     x.islower     x.istitle     x.lower       x.replace     x.rpartition  x.splitlines  x.title
x.casefold    x.endswith    x.format_map  x.isdecimal  x.isnumeric  x.isupper    x.lstrip     x.rfind       x.rsplitt     x.startswith  x.translate
x.center      x.expandtabs  x.index       x.isdigit     x.isprintable x.join        x.maketrans  x.rindex     x.rstrip     x.strip       x.upper
x.count       x.find        x.isalnum     x.isidentifier x.isspace     x.ljust      x.partition  x.rjust      x.split       x.swapcase    x.zfill
```

A Code Sample

```
x = 34 - 23      # A comment.  
y = "Hello"     # Another one.  
z = 3.45  
if z == 3.45 or y == "Hello":  
    x = x + 1  
    y = y + "World"  # String concat.  
print (x)  
print (y)  
  
12  
HelloWorld
```

To understand the codes:

- **Assignment** uses `=` and comparison uses `==`
- Start comments with `#`: the rest of line is ignored
- For numbers, `+` `-` `*` `/` `%` are as expected
 - Special use of `+` for string concatenation
 - Special use of `%` for string formatting (as with `printf` in C)
- Logical operators are **keywords** (`and`, `or`, `not`), not **identifiers**
- The basic printing command is `print`
- The first **assignment** to a variable create it
 - **Variable types don't need to be declared**
 - Python figures out the variable types on its own
- **Whitespace** is meaningful in Python
 - Use **consistent indentation** instead of braces `{ }` to mark blocks of code
 - Use `\` when must go to next line prematurely

Identifiers & keywords

- Identifiers
 - Rule1: contain non-empty string with **letters**, **numbers**, and **underscores**. Can not start with a number
 - Rule2: case sensitive and can not be reserved keywords
 - Recommend: to follow the [PEP8](#) Python coding style

- Keywords

and	as	assert	break	class	continue	def	del
elif	else	except	False	finally	for	from	global
if	import	in	is	lambda	None	nonlocal	not
or	pass	raise	return	True	try	while	with
yield							

Assignment

- You create a **name** the first time it appears on the left side of an assignment expression:

`x = 3`

- Names in Python do not have an intrinsic type. Objects have types.
 - Python determines the type of the reference automatically based on the data object assigned to it

```
>>>x = 3
>>>x
3
>>>type(x)
<class 'int'>
>>>type(3)
<class 'int'>
```

- A reference is deleted via **garbage collection** after any names bound to it have passed out of scope
- Binding a variable in Python means setting a **name** to hold a **reference** to some **object**.
 - Assignment manipulates **references**, not copies

Multiple Assignment

- You can also assign to multiple **names** at the same time :

```
>>> x, y = 2, 3
```

```
>>> x
```

```
2
```

```
>>> y
```

```
3
```

Python Built-in Data Types

Boolean

True/False

```
if (number % 2) == 0:  
    even = True  
else:  
    even = False
```

Numbers

Integers, Floats, and Complex

```
a = 5  
b = 7.3  
c = 2 + 3j
```

Strings

Immutable **sequences** of
Unicode characters

```
a = "This is a string"
```

Tuples

Immutable **sequences** of
arbitrary Python objects

```
a = ("Edward", 42)
```

Bytes

Immutable **sequences** of 8-bit
bytes in range [0, 255]

Bytes Arrays

Mutable **sequences** of 8-bit
bytes in range [0, 255]

```
b = bytes(b'Abc')  
ba =  
bytearray(b'Abc')
```

Lists

Mutable **sequences** of arbitrary
Python objects

```
a = ["Edward", 42]
```

Sets

Mutable finite **sets** of unique
and immutable Python object

Frozen Sets

Immutable finite **sets** of unique
and immutable Python object

```
s = {"Edward", 42}  
fs = frozenset(s)
```

Dictionaries

Mutable finite **sets** of Python
objects indexed by arbitrary
index sets

```
d = {"name":  
    "Edward", "age": 42}
```

Data Type: integer

- int: unlimited value (min/max value depends on machine memory capacity)
 - 123 #decimal 0b110011 #binary
 - 0o675351 #octal 0xDEFOA #hexadecimal
 - Operator:
 - Numerical operator: +, -, *, /, //, %, **
 - Bit operator: &, |, ^, <<, >>, ~
 - x operator= y \longleftrightarrow x = x operator y
 - Functions: int(i), hex(i), bin(i)
- bool
 - True, False
 - Logical operator: and, or, not (*short-circuit calculation*)
 - Function: bool(x) return False when x is false or omitted, return True otherwise.
- **Methods** for int & bool types

```
In [114]: int.  
int.bit_length  int.conjugate  int.denominator  int.from_bytes  int.imag  int.mro  int.numerator  int.real  int.to_bytes
```

Data Type: float-point

- float: *float(x)*
 - 0.0 -2.5 8.98e-4
 - Double precision value
 - $\text{abs}(a-b) \leq \text{sys.float_info.epsilon}$
 - **math** module: `math.acos(x)`, `math.ceil(x)`, `math.e`, `math.log(x, b)`, ...
- complex: *complex(real, imag)*
 - a pair (*real*, *imag*) of float: `z = -89.5+2.125j` `z.real`, `z.imag`: (-89.5, 2.125)
 - **cmath** module: `cmath.pi`
- `decimal.Decimal` from standard library: `decimal.Decimal(x)`
 - `decima.Decimal("54321.012345678987654321")`
 - Precision controllable decimal value
- **Methods** for float & complex types

```
In [119]: float.  
float.as_integer_ratio  float.conjugate  float.fromhex  float.hex  float.imag  float.is_integer  float.mro  float.real
```

```
In [119]: complex.  
complex.conjugate  complex.imag  complex.mro  complex.real
```

Data Type: strings

- Definition: **immutable** sequences of Unicode characters
- Valid string
 - Can use `"""` or `"` to specify: `x="abc"` `x='abc'`
 - `x = "matt'sin"` \leftrightarrow `x = 'matt"sin'` (same thing)
 - Use triple double-quotes(`"""`) for multi-line strings or strings that contain both `'` and `"` inside of them:
`"""ab'cd"ef"""`
- Operators and functions
 - `<, <=, ==, !=, >, >=`
 - Slicing :
 - `str[index]`
 - `str[start:end]`
 - `str[start:end:step]`
 - `str.format()`:
 - `"The {who} was {0} last week.".format(12, who="boy")`
 - **Methods:**

```
In [8]: str = "abc'def"
```

```
In [9]: str.
```

<code>str.capitalize</code>	<code>str.endswith</code>	<code>str.index</code>	<code>str.isidentifier</code>	<code>str.istitle</code>	<code>str.lstrip</code>	<code>str.rindex</code>	<code>str.split</code>	<code>str.title</code>
<code>str.casefold</code>	<code>str.expandtabs</code>	<code>str.isalnum</code>	<code>str.islower</code>	<code>str.isupper</code>	<code>str.maketrans</code>	<code>str.rjust</code>	<code>str.splitlines</code>	<code>str.translate</code>
<code>str.center</code>	<code>str.find</code>	<code>str.isalpha</code>	<code>str.isnumeric</code>	<code>str.join</code>	<code>str.partition</code>	<code>str.rpartition</code>	<code>str.startswith</code>	<code>str.upper</code>
<code>str.count</code>	<code>str.format</code>	<code>str.isdecimal</code>	<code>str.isprintable</code>	<code>str.ljust</code>	<code>str.replace</code>	<code>str.rsplit</code>	<code>str.strip</code>	<code>str.zfill</code>
<code>str.encode</code>	<code>str.format_map</code>	<code>str.isdigit</code>	<code>str.isspace</code>	<code>str.lower</code>	<code>str.rfind</code>	<code>str.rstrip</code>	<code>str.swapcase</code>	

Data Type: tuple

- **Definition:** **immutable** sequences of arbitrary Python objects
- **Creation**

```
>>> tuple_sample = (1, 2, 3)
>>> edward = ['Edward Gumby', 42]
>>> tuple_sample = tuple(edward)
>>> tuple_sample
('Edward Gumby', 42, 'Male')
```

- **Methods**

```
In [160]: tuple.|
tuple.count tuple.index tuple.mro
```

- **Indexing & Slicing**

```
>>> x = 1, 2, 3
>>> x[1]
2
>>> x[0:2]
(1, 2)
```

Data Type: list

- **Definition:** **mutable** sequences of arbitrary Python objects

- **Creation**

```
>>> edward = ['Edward Gumby', 42]
```

```
>>> strings = list("abc")
```

```
>>> strings
```

```
['a', 'b', 'c']
```

```
>>> number = list(range(10))
```

```
>>> number
```

```
[0, 1, 2, 3, 4, 5, 6, 7, 8, 9]
```

- **Methods**

```
In [119]: list.  
list.append list.clear list.copy list.count list.extend list.index list.insert list.mro list.pop list.remove list.reverse list.sort
```

```
>>> edward.append('Male')
```

```
>>> Edward
```

```
['Edward Gumby', 42, 'Male']
```

```
>>> edward.index(42)
```

```
1
```

Data Type: list – indexing & Slicing

- **Indexing:** starts from 0 and supports negative number.

```
>>> greeting = 'Hello'
>>> greeting[0]
'H'
>>> greeting[-1]
'o'
```

- **Slicing**

```
>>> numbers = [0, 1, 2, 3, 4, 5, 6, 7, 8, 9]
>>> numbers[3 : 6: 1] # [start : end : interval] , [start, start + interval , ... end)
[3, 4, 5]
```


Data Type: list – slicing

- **Slicing**

```
>>> numbers[7:]  
[7, 8, 9]  
>>> numbers[:3]  
[0, 1, 2]  
>>> numbers[:]  
[0, 1, 2, 3, 4, 5, 6, 7, 8, 9]  
>>> numbers[-3:-1]  
[7, 8]  
>>> numbers[-1:-3]  
[]  
>>> numbers[-1:-3:-1]  
[9, 8]  
>>> numbers[: :2]  
[0, 2, 4, 6, 8]
```

Data Type: list – assignment operator

- **Assignment**

```
>>> numbers = [1, 5, 6]
```

```
>>> numbers[0] = 0
```

```
>>> numbers
```

```
[0, 5, 6]
```

```
>>> numbers[1:] = [1, 2, 3]
```

```
>>> numbers
```

```
[0, 1, 2, 3]
```

```
>>> numbers[1:1] = [4, 5, 6]
```

```
>>> numbers
```

```
[0, 4, 5, 6, 1, 2, 3]
```

```
>>> numbers[1:4] = []
```

```
>>> numbers
```

```
[0, 1, 2, 3]
```

Data Type: list – special operators

- +

```
>>> [1, 2, 3] + [4, 5, 6]
[1, 2, 3, 4, 5, 6]
>>> 'Hello ' + 'world'
'Hello world'    # two string
>>> [1, 2, 3] + 'Hello'
Error           # list and string
```

- *

```
>>> 'Hi' * 3
'HiHiHi'
>>> [32] * 5
[32, 32, 32, 32, 32]
>>> [None] * 5
[None, None, None, None, None]
```

- Example

```
>>> endings = ['st', 'nd', 'rd'] + 17 * ['th'] + ['st', 'nd', 'rd'] + 7 * ['th'] + ['st']
```

Data Type: list – keywords

- **del**

```
>>> names = ['Tom', 'Jack', 'Rose']  
>>> del names[1]  
>>> names  
['Tom', 'Rose']
```

- **in**

```
>>> strings = ['abc', 'def']  
>>> 'abc' in strings  
True  
>>> 'a' in strings  
False  
  
>>> permissions = 'rwx'  
>>> 'w' in permissions  
True  
>>> 'a' in permissions  
False  
>>> 'rw' in permissions  
True  
>>> 'rx' in permissions  
False
```

Data Type: list – copy and sort a list

- **Wrong way**

```
>>> y = x
>>> y.sort()
>>> x
[1, 2, 3]
>>> y
[1, 2, 3]
```

- **Right ways:**

```
>>> y = x[:]
>>> y.sort()
>>> x
[2, 3, 1]
>>> y
[1, 2, 3]
```

or

```
>>> y = sorted(x)
>>> x
[2, 3, 1]
>>> y
[1, 2, 3]
```

Data Type: dictionary

- **Definition:** **mutable** finite sets of Python objects indexed by arbitrary index sets

- **Creation**

```
>>>phonebook = {'Alice':'2341', 'Beth':'9102'}
```

```
>>> items = [('Alice', '2341'), ('Beth', '9102')]
```

```
>>> phonebook = dict(items)
```

```
>>> phonebook
```

```
{'Alice':'2341', 'Beth':'9102'}
```

- **Methods:**

```
In [201]: dict.  
dict.clear  dict.fromkeys  dict.items  dict.mro  dict.popitem  dict.update  
dict.copy   dict.get      dict.keys  dict.pop  dict.setdefault  dict.values
```

Data Type: dictionary

- **Basic operations:**

- `len(d)`: returns the number of key-value pairs.
- `d[key]`: returns the value corresponds to key
- `d[key] = value`: assign value to key in d.
- `del d[key]`: delete item key in d.
- `key in d`: check whether key is in d.

- **Advantages**

- More types of key other than index, compared to sequences data types (string, tuple, list)
- Much more flexible even using index as key

```
>>> x = []  
>>> x[20] = 'Hello'  
Error  
>>> y = {}  
>>> y[20] = 'Hello'
```

Shallow and deep copy operations

- **Copy one dictionary and make some changes**

```
>>> x = {'user_name': 'admin', 'lst': ['a', 'b', 'c']}
>>> y = x.copy()
>>> y['user_name'] = 'guest'
>>> y['lst'][0] = 'd'
>>> y
{'user_name': 'guest', 'lst': ['d', 'b', 'c']}
>>> x
{'user_name': 'admin', 'lst': ['d', 'b', 'c']}
```

SURPRISE! x is also changed...

- **Right way**

```
>>> import copy
>>> y = copy.deepcopy(x)
>>> y['user_name'] = 'guest'
>>> y['lst'][0] = 'd'
>>> y
{'user_name': 'guest', 'lst': ['d', 'b', 'c']}
>>> x
{'user_name': 'admin', 'lst': ['a', 'b', 'c']}
```


Control flow: conditional statement

- The followings will be considered as false in python:

False None 0 "" () [] {}

```
>>> True==1
```

```
True
```

```
>>> False==0
```

```
True
```

```
>>> True + False + 42
```

```
43
```

```
>>> bool(42)
```

```
True
```

```
>>> bool("")
```

```
False
```

- keywords: if, else, elif

```
num = input('Enter a number: ')
```

```
if num > 0:
```

```
    print 'The number is positive'
```

```
elif num < 0:
```

```
    print 'The number is negative'
```

```
else:
```

```
    print 'The number is zero'
```

Control flow: conditional statement

- Logical operations
`==, <, >, <=, >=, !=, is, is not, in, not in.`

`if 3 < num < 7:`

```
>>> x = y = [1, 2, 3]
```

```
>>> z = [1, 2, 3]
```

```
>>> x == y
```

```
True
```

```
>>> x == z
```

```
True
```

```
>>> x is y
```

```
True
```

```
>>> x is z
```

```
False
```

- **`assert(condition)`**
`if not condition:`
 crash program

`>>>assert(age >= 0)`

Control flow: loop statement

- **while**

```
x = 1
while x <= 100:
    print(x)
    x+=1
```

- **for ... in ...**

- **List iteration**

```
numbers = [0, 1, 2, 3, 4, 5, 6, 7, 8, 9]
for number in numbers:
    print(number)
```

- **Dictionary iteration**

```
d = {'x':1, 'y':2, 'z':3}
for key in d:
    print key, 'corresponds to', d[key]
```

```
for key, value in d.items():
    print key, 'corresponds to', d[key]
```

Control flow: loop statement

- **for ... in ...**

- **Parallel iteration**

```
names = ['anne', 'beth', 'damon']  
ages = [12, 30, 45]  
  
>>> zip(names, ages)  
[('anne', 12), ('beth', 30), ('damon', 45)]  
for name, age in zip(names, ages):  
    print(name, age)
```

- **Index iteration**

```
names = ['anne', 'beth', 'damon']  
index = 0  
  
for name in names:  
    print(index, name)  
    index += 1  
  
for index, number in enumerate(numbers):  
    print (index, number)
```

Control flow: loop statement

- **break, continue**

```
x = 3
while x < 10:
    if x > 7:
        x += 2
        continue
    x = x + 1
    print("still in the loop.")
    if x == 8:
        break
print("outside of the loop.")
```

Control flow: special loop statement

- **List traversal**

```
>>> numbers = [0, 1, 2, 3, 4, 5, 6, 7, 8, 9]
>>> [x*x for x in numbers]
[0, 1, 4, 9, 16, 25, 36, 49, 64, 81]
```

```
>>> [x*x for x in numbers if x%3==0]
[0, 9, 36, 81]
```

```
>>> [(x, y) for x in numbers[0:2] for y in numbers[0:2]]
[(0, 0), (0, 1), (1, 0), (1, 1)]
```

```
>>> girls = ['alice', 'bernice']
>>> boys = ['bob', 'arnold']
>>> [b + '+' + g for b in boys for g in girls if b[0] == g[0]]
['bob+bernice', 'arnold+alice']
```

Function: definition

- **def** creates a function and assign it a name
- **return** sends a result back to the caller
- Arguments and return types are not declared

```
def square(x):  
    return x*x
```

```
def printHi():  
    print('Hi')  
    return  
    print("Not printed")
```

```
>>> x = printHi()  
Hi  
>>> x  
>>>  
>>> print(x)  
>>> None
```

Function: arguments passing

- **Arguments are passed by assignment**
- Passed arguments are assigned to local names
- Assignment to argument names don't affect the caller
- Changing a mutable argument may affect the caller

```
def changer(name, age, organizations):  
    name = name.title()  
    age += 1  
    organizations.append('SIO')  
    print(name, age, organizations)  
    return
```

```
>>> name = 'wenming wu'  
>>> age = 30  
>>> orgs = ['ASML', 'DJEL']  
>>> changer(name, age, orgs)  
Wenming Wu 31 ['ASML', 'DJEL', 'SIO']  
  
>>> name  
'wenming wu'  
>>> age  
30  
>>> orgs  
['ASML', 'DJEL', 'SIO']
```


Function: passing arguments by keyword

Two ways to assign argument values to function parameters: by position or by keyword

```
def hello_1(greeting, name):  
    print(greeting, name)
```

```
def hello_2(name, greeting):  
    print(greeting, name)
```

- **By position**

```
>>> hello_1('Hello', 'Tom')  
Hello Tom  
>>> hello_2('Tom', 'Hi')  
Hi Tom
```

- **by keyword**

```
>>> hello_1(greeting='Hello', name='Tom')  
Hello Tom  
>>> hello_2(greeting='Hi', name='Tom')  
Hi Tom
```

Function: optional arguments with default values

- Define default values for arguments that need not be passed

```
def hello_3(greeting='Hello', name = 'Tom'):  
    print(greeting, name)
```

```
>>> hello_3()
```

```
Hello Tom
```

```
>>> hello_3('Hi')
```

```
Hi Tom
```

```
>>> hello_3(name='Jack')
```

```
Hello Jack
```

Function: passing multiple arguments with * and ** symbols

- ***params** represents a tuple receiving any excess positional arguments

```
def print_params(first, *therest):  
    print(first, therest)
```

```
>>> print_params(1)  
1 ()  
>>> print_params(1, 2, 'name')  
1 (2, 'name')
```

- ****params** represents a dictionary receiving any excess keyword arguments

```
def print_params_2(first, **therest):  
    print(first, therest)
```

```
>>> print_params_2(1, name='Jack', age=21)  
1 {'name': 'Jack', 'age': 21}
```

Function: recursion

- Recursion allows functions to call themselves
- Recursive functions solve problems by reducing them to smaller sub-problems of the same form

```
def factorial(x):  
    ret = 1  
    if x == 0:  
        return ret  
  
    a = 1  
    while a <= x:  
        ret *= a  
        a += 1  
  
    return ret
```

```
>>>factorial(0)  
1  
>>>factorial(10)  
3628800
```

```
def factorial(x):  
    if x == 0:  
        return 1  
  
    return x * factorial(x - 1)
```

```
>>>factorial(0)  
1  
>>>factorial(10)  
3628800
```

Function: others

- **All functions in Python have a return value**
 - Functions without a return statement will return the special value None
- **There is no function overloading in Python**
 - Two different functions can't have the same name, even if they have different arguments
- **Functions can be used as any other data type. They can be:**
 - arguments to function
 - return values of functions
 - assigned to variables
 - parts of tuples, list, etc.

Python basics: reference & exercise

- References:
 - <https://www.python.org/>
 - [Swaroop C H, "A Byte of Python"](#)
 - [Eric Matthes, "Python Crash Course: A Hands-On, Project-Based Introduction to Programming"](#)
 - <https://www.python.org/dev/peps/pep-0008/>
 - <https://www.cnblogs.com/vamei/archive/2012/09/13/2682778.html>
 - <https://www.liaoxuefeng.com/wiki/0014316089557264a6b348958f449949df42a6d3a2e542c000>
 - <https://www.fullstackpython.com/table-of-contents.html>
 - <http://www.pythontutor.com/>
- Exercises 1
 - Write a python function to sort any list of integers. (You could not use any built-in sort functions.)

```
>>>sort([9, 5, 18, -2, 0])  
[-2, 0, 5, 9, 18]
```