

Introduction to Scientific Python

Application to Oceanography

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Universitat de les
Illes Balears

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3. Importing/exporting data)
4. Time series
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Introduction:

What? Why? How?

What is Python?

Programming language:

1. interpreted
2. dynamically typed
3. object-oriented
4. high-level

instructions executed directly

type checking at run-time

classes, objects, methods, ...

strong abstraction



<https://www.python.org>

Why Python?

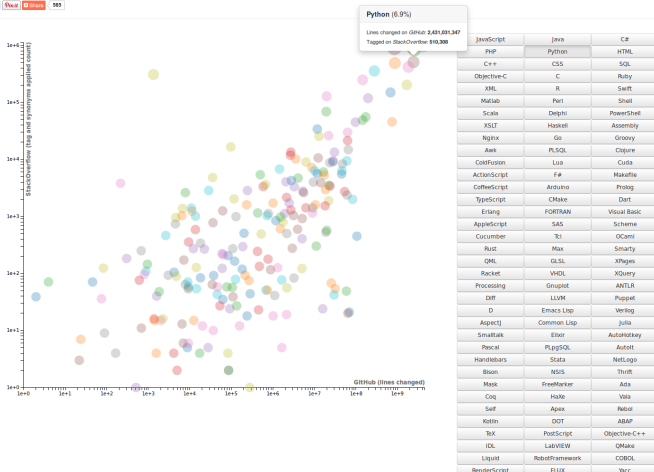
1. Simple, easy to learn syntax
2. Open
3. Large user community

doc, support, packages

Why Python?

Programming Language Popularity Chart

Like (1.4k) Tweet (1.4k) +1 (1.4k) 583



Source: <http://langpop.corger.nl/>

Python vs. Matlab

Python	Matlab
General	
programming language	programming language + numerical computing environment
open	proprietary algorithms
general purpose	linear algebra
Indexing	
a[0]	a(1)
a[-1]	a(end)
a[:,2]	a(1:2:end)
Functions	
a.max()	max(a)
a.shape()	size(a)

Numpy for Matlab users:

<https://docs.scipy.org/doc/numpy-dev/user/numpy-for-matlab-users.html>

Quick example: hello.py



Quick example: hello.py



```
#!/usr/bin/python
# -*- coding: utf-8 -*-
'''
This function prints "Hello world"
'''

def hello():
    print "Hello world"
    return

def main():
    hello()

if __name__ == '__main__':
    main()
```

Quick example: hello.py



1. Try to document you code

Quick example: hello.py



1. Try to document you code
2. Use

```
# -*- coding: utf-8 -*-
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if you're using non-ascii characters

Quick example: hello.py



1. Try to document you code
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3. In Python 3:

```
print("Hello world!")
```

Quick example: hello.py



1. Try to document you code
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```
# -*- coding: utf-8 -*-
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if you're using non-ascii characters

3. In Python 3:

```
print("Hello world!")
```

4. Indentation matters!

A few definitions

Object: Python's abstraction for data

[https:](https://docs.python.org/2/reference/datamodel.html#index-0)

[//docs.python.org/2/reference/datamodel.html#index-0](https://docs.python.org/2/reference/datamodel.html#index-0)

Function: series of statements which returns some value to a caller

<https://docs.python.org/2/glossary.html#term-function>

Module: file containing Python definitions and statements

<https://docs.python.org/2/tutorial/modules.html>

Class: logical grouping of data and methods (functions)

<https://docs.python.org/2/tutorial/classes.html>

Data types

1. Numbers

Example:

```
g = 9.81  
h = 4.135667662e-15
```


Data types

1. Numbers
2. String

Example:

```
name = "Rickman"  
s = "this is a string"
```

Data types

1. Numbers
2. String
3. List

Example:

```
list = [ 'one', 2, 'three', 'four', 5]
```

Data types

1. Numbers
2. String
3. List
4. Tuple

Example:

```
tuple1 = ('one', 2, 'three', 'four', 5)
tuple2 = (1, '1', 'one', [1, 2], (1, 2, 3))
```

Tuples are *immutable*

(fixed value)

Data types

1. Numbers
2. String
3. List
4. Tuple
5. Dictionary

Example:

```
email = { 'Evan': 'emason@imedeia.uib-csic.es', \
          'Irene': 'irene.laiz@uca.es', \
          'Charles': 'ctroupin@socib.es' }
email[ 'Irene' ]
'irene.laiz@uca.es'
```

Data types

1. Numbers
2. String
3. List
4. Tuple
5. Dictionary

More details:

<https://docs.python.org/2/tutorial/datastructures.html#>



Resources

Web:

- ▶ <https://docs.python.org/2.7/tutorial/index.html>
- ▶ <https://developers.google.com/edu/python/introduction?hl=en>
tutorial + exercises
- ▶ <http://www.python-course.eu>
- ▶ <http://www.learnpython.org> online code execution
<https://pythonprogramming.net>
- ▶ <https://www.gitbook.com/book/djangogirls/djangogirls-tutorial>

Resources

Learning platforms:

- ▶ [Programming Foundations with Python Learn Object-Oriented Programming](#) (7 weeks)
- ▶ [Code Academy](#) (13 hours)

Resources

Youtube:

- ▶ [Python Beginner Tutorial \(For Absolute Beginners\)](#) (4 parts)
- ▶ [Google Python Class](#) (7×30 minutes)
- ▶ [Zero to Hero with Python](#) (11 hours)

Resources

Books:

- ▶ *Learn Python the hard way*, Z.A. Shaw, 2013
<http://learnpythonthehardway.org/book/>
- ▶ *Learning Python, 5th Edition*, M. Lutz, 2013
- ▶ *Python Programming: An Introduction to Computer Science*, J.M. Zelle, 2002

Complete list: <https://wiki.python.org/moin/PythonBooks>

Python 2 vs Python 3

Some differences:

- ▶ Print function
- ▶ Integer division
- ▶ Unicode
- ▶ ...

Python 3.x = present and future of the language

More details:

Python 2 or Python 3

Will Scientists Ever Move to Python 3?

Objectives of the course

1. Use Python to solve oceanography-related problems

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What we won't (can't) do:

teach you how to be a good programmer

About the trainers

Evan Mason

Oceanographer

Post-doctoral researcher at **IMEDEA**

10-year experience with Python

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Evan Mason

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Post-doctoral researcher at **IMEDEA**

10-year experience with Python

Charles Troupin

Engineer, oceanographer

Head of **SOCIB** Data Center

2.5-year experience with Python

Structure of the course

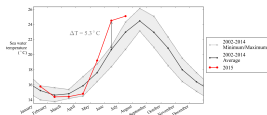
1. Reading/writing

```
Python 3.5.3 (default, Feb 27 2014, 19:37:34)
[GCC 4.7.3] on linux2
Type "help()" or "help()" for more information.
>>> print("hello world")
hello world
>>>
>>> for i in range(10):
>>>     print i
0
1
2
3
4
5
6
7
8
9
>>>
```

Structure of the course

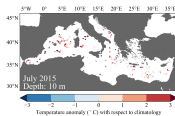
1. Reading/writing
2. Time series

```
Python 3.5.3 (default, Feb 27 2014, 19:37:34)
[OS: 4.7.3] on linux2
type "help()" or "help()" for more information.
>>> from pylab import *
>>> from time import *
>>> from sys import *
>>> from math import *
```



1. Reading/writing
2. Time series
3. 2-D fields

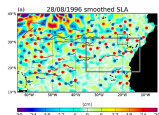
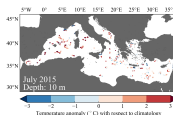
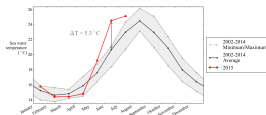
Figure 1 is a line graph showing the monthly variation of sea water temperature (°C) from January to December. The Y-axis represents sea water temperature in °C, ranging from 10 to 30. The X-axis represents the months of the year. The graph includes four data series: 2002-2014 (grey shaded area), Minimum (dotted line), Maximum (solid line), and Average (black line). A red line with dots represents the 2015 data. A vertical dashed line is drawn at June, indicating the start of the study period. The temperature difference between the 2015 data and the average at June is labeled as $\Delta T = 5.3^{\circ}\text{C}$.



Structure of the course

1. Reading/writing
2. Time series
3. 2-D fields
4. Functions, classes, modules

```
Python 3.5.3 (default): Feb 27 2014, 19:37:34)
[ROC 4.7.3] on linux
type "help()"; "credits" or "license()" for more information.
>>> import "Module name"
>>> print "Module name"
Module name
>>>
>>> for i in range(10):
>>>     print i
0
1
2
3
4
5
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9
>>>
```



Installation & use

Installing Python

Hard way: download source and compile:

<https://www.python.org/downloads/>

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Normal way: use installer or package:

- ▶ Windows:

<https://www.python.org/downloads/windows/>

- ▶ Mac OS:

<https://www.python.org/downloads/mac-osx/>

- ▶ Linux: package manager:

python2.x and python2.x-dev packages

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python2.x and python2.x-dev packages

Easy way: Python distributions such as:

Anaconda

free

Enthought Canopy

free and commercial

Python(x,y)

free, Windows only

+ others

Installing modules

Example: SciPy (<http://www.scipy.org/>):
mathematics, science, and engineering

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Intermediate: Linux, Mac: install package

- ▶ Linux: package manager
- ▶ Mac: [MacPorts](#), [Homebrew](#)

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Harder: build from source

```
$ python setup.py install
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Harder: build from source

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$ python setup.py install
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Better: pip (<https://pypi.python.org/pypi/pip>)

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Easy way: Windows, Linux, Mac:
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Harder: build from source

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$ python setup.py install
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Better: pip (<https://pypi.python.org/pypi/pip>)

Avoid: mixing installation methods

Using `pip` to manage modules

`pip` = recommended tool for installing Python packages

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- Installation:
- ▶ Included in recent Python version
 - ▶ Otherwise: download and run `get-pip.py`
<https://pip.pypa.io/en/stable/installing/#install-pip>

```
$ python get-pip.py
```

Using pip to manage modules

pip = recommended tool for installing Python packages

Installation:

- ▶ Included in recent Python version
- ▶ Otherwise: download and run `get-pip.py`
<https://pip.pypa.io/en/stable/installing/#install-pip>

```
$ python get-pip.py
```

Usage:

- ▶ Install latest version + dependencies:

```
$ pip install Package
```

- ▶ Specify exact version:

```
$ pip install Package==x.y.z
```

- ▶ Specify minimum version:

```
$ pip install 'Package>=x.y.z'
```

More about `pip`

- ▶ Uninstall packages:

```
$ pip uninstall
```

More about pip

► **Uninstall packages:**

```
$ pip uninstall
```

► **List installed packages:**

```
$ pip list
```

```
aptoncd (0.1.98 – b2r117 – 1.2)
backports.ssl-match-hostname (3.4.0.2)
basemap (1.0.7)
...
xhtml2pdf (0.0.6)
zope.interface (3.6.1)
```

More about pip

- ▶ Uninstall packages:

```
$ pip uninstall
```

- ▶ List installed packages:

```
$ pip list
```

- ▶ Output installed packages in requirements format:

```
$ pip freeze
```

```
aptoncd==0.1.98-bzr117-1.2  
backports.ssl-match-hostname==3.4.0.2  
basemap==1.0.7  
...  
xhtml2pdf==0.0.6  
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```

More about pip

- ▶ Uninstall packages:

```
$ pip uninstall
```

- ▶ List installed packages:

```
$ pip list
```

- ▶ Output installed packages in requirements format:

```
$ pip freeze
```

- ▶ Show information about installed packages:

```
$ pip show Package
```

```
Metadata-Version: 1.1
```

```
Name: numpy
```

```
Version: 1.9.2
```

```
Summary: NumPy: array processing for numbers, strings, ...
```

```
...
```

```
Requires:
```

Running your code: several solutions

Edit, then run in a shell:

```
$ python mycode.py
```

or

```
$ mycode.py
```

if *shebang*

```
#!/usr/bin/python
```

is present at the 1st line

Running your code: several solutions

Interactive python ([ipython](#))

Auto-completion, exploring objects, ...

```
In [2]: string = 'Hello all '
```

```
In [3]: string.
```

```
string.capitalize    string.encode        string.format        ...
```

```
string.rstrip        string.strip         string.upper
```

```
...
```

```
string.startswith    string.translate
```

+ *magic* functions:

`%run`: Run the named file inside IPython as a program

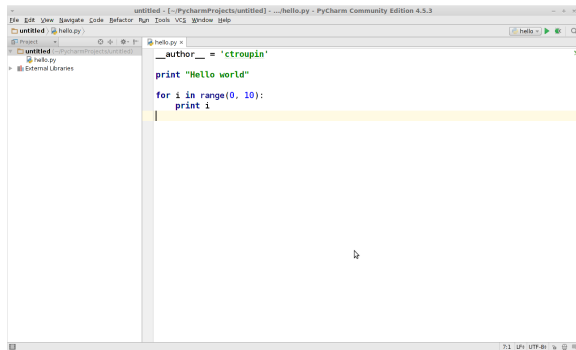
`%timeit`: Time execution of a Python statement or expression

`%who`: Print all interactive variables, with some minimal formatting

More: [Built-in magic commands](#)

Running your code: several solutions

Integrated Development Environment (IDE)
(editor + build automation tools + debugger)



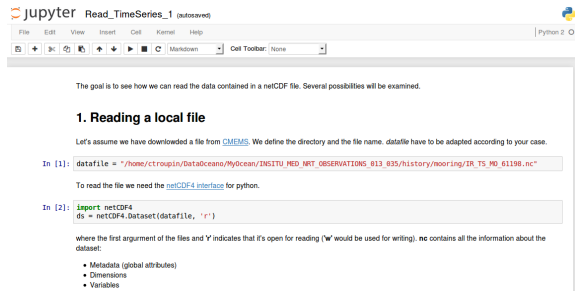
Examples: Atom, Eclipse, PyCharm, Idle, ...

Complete list: <https://wiki.python.org/moin/PythonEditors>

Running your code: several solutions

ipython notebook

(interactive computational environment)



Rich text + command executions + figures + ...

"Data story telling"

(see Programming in Python 2)

What do we work with?



Exercise 1: `changeCase.py`



Write a program that takes 2 arguments: the name and the surname, both written with a mix of upper and lowercase, and return the name with the first letter in uppercase and the surname with all the letters in uppercase.

Examples:

<i>changeCase allan rickman</i>	returns	<i>Allan RICKMAN</i>
<i>changeCase aLLan ricKmaN</i>	returns	<i>Allan RICKMAN</i>

Tips: use the function `sys.argv` to be able to run the code as

```
$ changeCase name surname
```

Programming in Python #1

importing/exporting data

*El més important, que quedi clar el
zen de python*

Objective

Be able to read/write data in various formats used in oceanography

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Text files (ascii)

CSV

NetCDF

HDF

Images (geotiff)

matlab files

...

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Be able to read/write data in various formats used in oceanography

Text files (ascii)

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Be able to find the resources to read another format

What is an ipython notebook?

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Python: high-level programming language
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Python: high-level programming language

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IPython: command shell for interactive computing

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IPython notebook: web-based interactive computational environment
combining code, text, figures, ...

<http://ipython.org/notebook.html>

Why ipython notebooks?

IP[y]: IPython
Interactive Computing



- ▶ User-friendly
- ▶ Free, easy to write, easy to read
- ▶ Code and results visible online via <http://nbviewer.ipython.org>

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- ▶ *Data story-telling*

Structure of a notebook

 **jupyter** Read_TimeSeries_1 (autosaved) 

File Edit View Insert Cell Kernel Help Python 2

Cell Toolbar: None

The goal is to see how we can read the data contained in a netCDF file. Several possibilities will be examined.

1. Reading a local file

Let's assume we have downloaded a file from [CEMETS](#). We define the directory and the file name. `datafile` have to be adapted according to your case.

```
In [1]: datafile = "/home/ctroupin/DataOceano/MyOcean/INSITU_MED_NRT_OBSERVATIONS_013_035/history/mooring/IR_TS_MO_61198.nc"
```

To read the file we need the [netCDF4 interface](#) for python.

```
In [2]: import netCDF4
ds = netCDF4.Dataset(datafile, 'r')
```

where the first argument of the files and 'r' indicates that it's open for reading ('w' would be used for writing). `nc` contains all the information about the dataset:

- Metadata (global attributes)
- Dimensions
- Variables

1.1 Metadata

```
In [3]: ds
Out[3]: <type 'netCDF4. netCDF4.Dataset'>
root group (NETCDF3_CLASSIC data model, file format UNDEFINED):
  data_type: OceansITES time-series data
  format_version: 1.2
  platform_code: 61198
  date_update: 2015-08-02T11:20:44Z
  institution: Puertos del Estado (Spain)
  institution_edmo_code: 2751
  site_code:
  wmo_platform_code: 61198
  source: Mooring observation
  history: 2015-08-02T11:20:44Z: Creation
  data_mode: R
  quality_control_indicator: 6
```


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Run current cell

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```

Run current cell
Add a new cell

Structure of a notebook

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Markdown

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  wmo_platform_code: 61198
  source: Mooring observation
  history: 2015-08-02T11:20:44Z: Creation
  data_mode: R
  quality_control_indicator: 6
```

Run current cell
Add a new cell
Select type of cell

Structure of a notebook

 **jupyter** Read_TimeSeries_1 (autosaved) 

File Edit View Insert Cell Kernel Help Python 2

Cell Toolbar: None

The goal is to see how we can read the data contained in a netCDF file. Several possibilities will be examined.

1. Reading a local file

Let's assume we have downloaded a file from [CEMETS](#). We define the directory and the file name. `datafile` have to be adapted according to your case.

```
In [1]: datafile = "/home/ctroupin/DataOceano/MyOcean/INSITU_MED_NRT_OBSERVATIONS_013_035/history/mooring/IR_TS_MO_61198.nc"
```

To read the file we need the [netCDF4 interface](#) for python.

```
In [2]: import netCDF4
ds = netCDF4.Dataset(datafile, 'r')
```

where the first argument of the files and 'r' indicates that it's open for reading ('w' would be used for writing). `ds` contains all the information about the dataset:

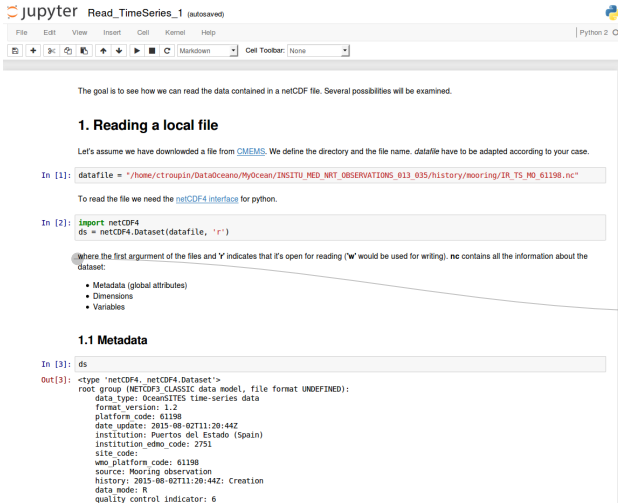
- Metadata (global attributes)
- Dimensions
- Variables

1.1 Metadata

```
In [3]: ds
Out[3]: <type 'netCDF4. netCDF4.Dataset'>
root group (NETCDF3_CLASSIC data model, file format UNDEFINED):
  data_type: OceansITES time-series data
  format_version: 1.2
  platform_code: 61198
  date_update: 2015-08-02T11:20:44Z
  institution: Puertos del Estado (Spain)
  institution_edmo_code: 2751
  site_code:
  wmo_platform_code: 61198
  source: Mooring observation
  history: 2015-08-02T11:20:44Z: Creation
  data_mode: R
  quality_control_indicator: 6
```

Run current cell
Add a new cell
Select type of cell
Code cell

Structure of a notebook



The screenshot shows a Jupyter Notebook window titled "Read_TimeSeries_1 (autosaved)". The interface includes a menu bar (File, Edit, View, Insert, Cell, Kernel, Help), a toolbar with icons for file operations and cell execution, and a status bar indicating "Python 2".

The notebook content consists of the following cells:

- Text cell:** "The goal is to see how we can read the data contained in a netCDF file. Several possibilities will be examined."
- Section header:** "1. Reading a local file"
- Text cell:** "Let's assume we have downloaded a file from [CEMETS](#). We define the directory and the file name. `datafile` have to be adapted according to your case."
- Code cell (In [1]):**

```
datafile = "/home/ctroupin/Data0ocean/MyOcean/INSITU_MED_NRT_OBSERVATIONS_013_035/history/mooring/IR_TS_MO_61198.nc"
```
- Text cell:** "To read the file we need the [netCDF4 interface](#) for python."
- Code cell (In [2]):**

```
import netCDF4
ds = netCDF4.Dataset(datafile, 'r')
```
- Text cell:** "Where the first argument of the files and 'r' indicates that it's open for reading ('w' would be used for writing). `nc` contains all the information about the dataset:"
 - Metadata (global attributes)
 - Dimensions
 - Variables
- Section header:** "1.1 Metadata"
- Code cell (In [3]):**

```
ds
```
- Text cell (Out[3]):**

```
<type 'netCDF4. netCDF4.Dataset'>
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  data_type: OceansITES time-series data
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    wmo platform code: 61198
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  history: 2015-08-02T11:20:44Z: Creation
  data_mode: R
  quality_control_indicator: 6
```

Run current cell
Add a new cell
Select type of cell
Code cell
Text cell

Comma-Separated Values file

Example: file buoy-canaldeibiza_SALT_SBE37.csv

Example of CSV file

Platform	Instrument	Parameter	Units	Date	Value	QC value
Buoy_CanalDeIbiza	SCB-SBE37006	sea_water_salinity	psu	2015-12-01 12:00:00	36.916	1.0
Buoy_CanalDeIbiza	SCB-SBE37006	sea_water_salinity	psu	2015-12-01 01:00:00	36.936	1.0
Buoy_CanalDeIbiza	SCB-SBE37006	sea_water_salinity	psu	2015-12-01 02:00:00	36.929	1.0
Buoy_CanalDeIbiza	SCB-SBE37006	sea_water_salinity	psu	2015-12-01 03:00:00	36.927	1.0
Buoy_CanalDeIbiza	SCB-SBE37006	sea_water_salinity	psu	2015-12-01 04:00:00	36.925	1.0
Buoy_CanalDeIbiza	SCB-SBE37006	sea_water_salinity	psu	2015-12-01 05:00:00	36.948	1.0
Buoy_CanalDeIbiza	SCB-SBE37006	sea_water_salinity	psu	2015-12-01 06:00:00	36.95	1.0
Buoy_CanalDeIbiza	SCB-SBE37006	sea_water_salinity	psu	2015-12-01 07:00:00	36.954	1.0
Buoy_CanalDeIbiza	SCB-SBE37006	sea_water_salinity	psu	2015-12-01 08:00:00	36.933	1.0

Comma-Separated Values file

- ▶ Type "python read csv file" in search engine

Comma-Separated Values file

- ▶ Type "python read csv file" in search engine
- ▶ Result: <https://docs.python.org/2/library/csv.html>

Comma-Separated Values file

- ▶ Type "python read csv file" in search engine
- ▶ Result: <https://docs.python.org/2/library/csv.html>
- ▶ From the doc:

```
import csv
csvfile = open('buoy-canaldeibiza\_SALT_SBE37.csv', 'rb')
reader = csv.reader(csvfile)
for row in reader:
    print row
csvfile.close()
```

Comma-Separated Values file

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- ▶ Result: <https://docs.python.org/2/library/csv.html>
- ▶ From the doc:

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reader = csv.reader(csvfile)
for row in reader:
    print row
csvfile.close()
```

: read_csv_file.ipynb

Seabird CTD file

Example: file dsb01.cnv

Example of CNV file

```
* Sea-Bird SBE 9 Data File :
* FileName = C:\OCEANO\CTD\DATOS\IMEDEA-SHEBEX\SB01.hex
* Software Version Seasave V 7.22
* Temperature SN = 5427
* Conductivity SN = 3872
...
38.86539  2.78989  ... 3.4535e-02  7.459
38.86542  2.78986  ... 223 0.0000e+00
```

Seabird CTD file

- ▶ Type "python read cnv file" in search engine

Seabird CTD file

- ▶ Type "python read cnv file" in search engine
- ▶ Result: <https://pypi.python.org/pypi/cnv>

"Sorry for the inconvenience, but I moved all the functionalities into the package seabird"

Seabird CTD file

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- ▶ Use pip to search for the package

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seabird      — Non official parser for Sea-Bird's sensors.
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pip install —user seabird==0.6.3
```

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```
from seabird.cnv import fCNV
profile = fCNV('')
profile.attributes      # It will return the header, as a dictionary.
profile.keys()          # It will list the available variables.
profile['TEMP']         # Get the data
```


Seabird CTD file

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: read_cnv_file.ipynb

How to get code from github

<https://github.com/ctroupin/PythonCourseCadiz2016>

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	notebooks	Merge branch 'master' of github.com:ctroupin/PythonCourseCadiz2016	2 days ago
	README.md	Update README.md	2 months ago

 **README.md**

PythonCourseCadiz2016

This folder contains the material for the course "Introduction to Scientific Python" at the University of Cadiz (Spain).

How to get code from github

<https://github.com/ctroupin/PythonCourseCadiz2016>

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ctroupin latex directory		Latest commit 7d2de9f a minute ago
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notebooks	Merge branch 'master' of github.com:ctroupin/PythonCourseCadiz2016	2 days ago
README.md	Update README.md	2 months ago

README.md

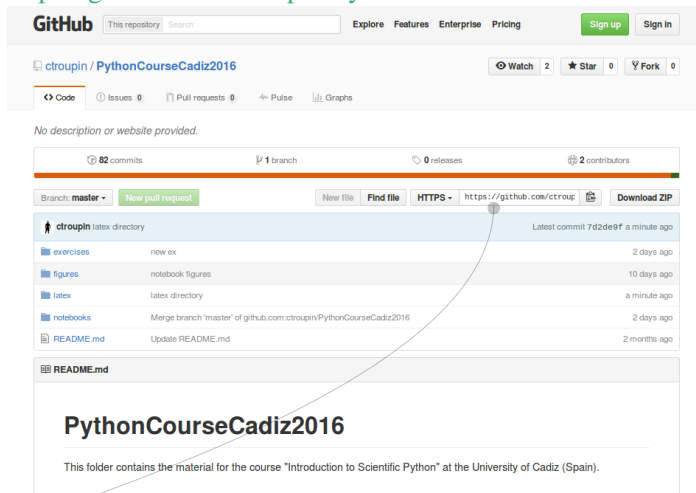
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82 commits 1 branch 0 releases 2 contributors

Branch: master New pull request New file Find file HTTPS https://github.com/ctroupin Download ZIP

ctroupin latex directory	Latest commit 7d2de9f a minute ago
exercises	new ex 2 days ago
figures	notebook figures 10 days ago
latex	latex directory a minute ago
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README.md	Update README.md 2 months ago

README.md

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Copy the URL and type `git clone url` in a terminal

Update the code

1. Clone the repository

```
git clone https://github.com/... .git
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(if there were modifications in the repository)

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3. Update your version

```
git pull
```

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```
git clone https://github.com/... .git
```

2.

(if there were modifications in the repository)

3. Update your version

```
git pull
```

More about github:

- ▶ <https://github.com/>
- ▶ <http://rogerdudler.github.io/git-guide/>

Definition: software libraries and self-describing,
machine-independent data formats (source:
<http://www.unidata.ucar.edu/software/netcdf/>).

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Tools: many tools and libraries to inspect, visualise and explore data sets.

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Tools: many tools and libraries to inspect, visualise and explore data sets.

Structure:

- ▶ header: dimensions, attributes, variables
- ▶ data: arrays

Quick inspection: ncdump



<https://www.unidata.ucar.edu/software/netcdf/docs/netcdf/ncdump.html>



text representation of a netCDF dataset (header information, variables, ...)

ncdump applied on a file

```
ncdump -h 20140628_d-OC_CNR-L3-CHL-MedOC3_A.1KM-MED-DT-v02.nc

netcdf \20140628_d-OC_CNR-L3-CHL-MedOC3_A.1KM-MED-DT-v02 {
dimensions:
    time = 1 ;
    lat = 1580 ;
    lon = 3308 ;
variables:
    int time(time) ;
        time:long_name = "reference time" ;
        time:standard_name = "time" ;
        time:axis = "T" ;
        time:calendar = "Gregorian" ;
        time:units = "seconds since 1981-01-01 00:00:00" ;
...
        "SUBSAMP=1\n",
        "OUTMODE=0\n",
        "" ;
}
```



<http://www.ferret.noaa.gov/Ferret/>



visualization and analysis environment

Ferret to get basic info on file

```
ctroupin@SCBD046 ~/Desktop $ ferret_c
```

```
NOAA/PMEL TMAP
```

```
FERRET v6.62
```

```
Linux (gfortran) 2.6.9 - 89.0.20.ELsmp - 07/06/13
```

```
25-Nov-15 12:23
```

```
yes? SET DATA 20140628_d-OC.CNR-L3-CHL-MedOC3_A.1KM-MED-DT-v02.nc
```

```
yes? SHOW DATA
```

```
currently SET data sets:
```

```
1> 20140628_d-OC.CNR-L3-CHL-MedOC3_A.1KM-MED-DT-v02.nc (default)
```

name	title	I	J	K	L
CHL	Mediterranean Sea Daily Chlorop	1:3308	1:1580	...	1:1
QI	Quality Index of Mediterranean	1:3308	1:1580	...	1:1

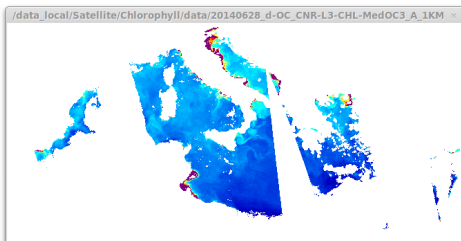
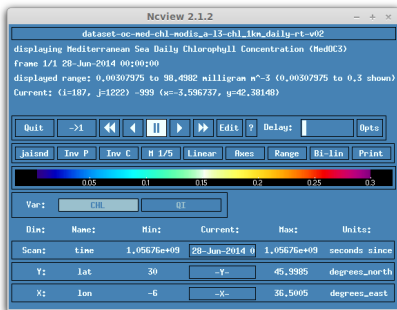
```
yes?
```



http://meteora.ucsd.edu/~pierce/ncview_home_page.html



quick visualisation of 3-4D fields

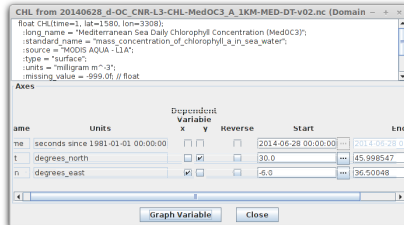
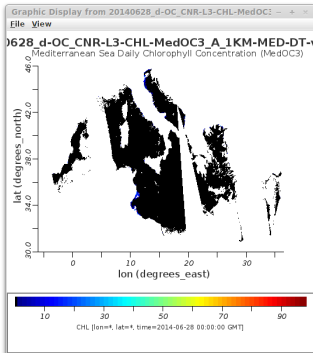




<http://www.epic.noaa.gov/java/ncBrowse/>



interactive graphical display



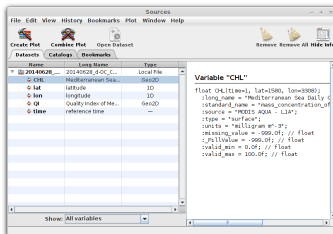
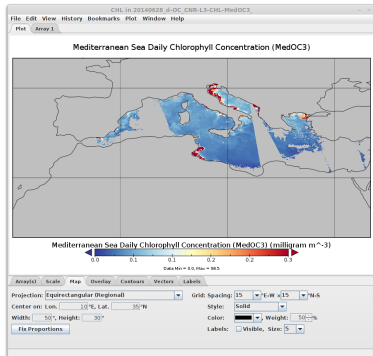
Panoply



<http://www.giss.nasa.gov/tools/panoply/>



plot, slice, combine, overlay, ...



cdo – Climate Data Operators



🏠 <https://code.zmaw.de/projects/cdo>

🔧 manipulate (merging, averaging) netCDF files (+other formats)

Examples: ▶ Basic info (min, max, avg, size, ...):

```
cdo info input.nc
```

▶ Compute standard deviation:

```
cdo fldstd input.nc output.nc
```

NCO – netCDF Operators



 <http://nco.sourceforge.net/>

 command line operations on netCDF files

Examples: ▶ Average variable over domain:

```
ncwa -O -a lon,lat input.nc output.nc
```


▶ Extract subregion:

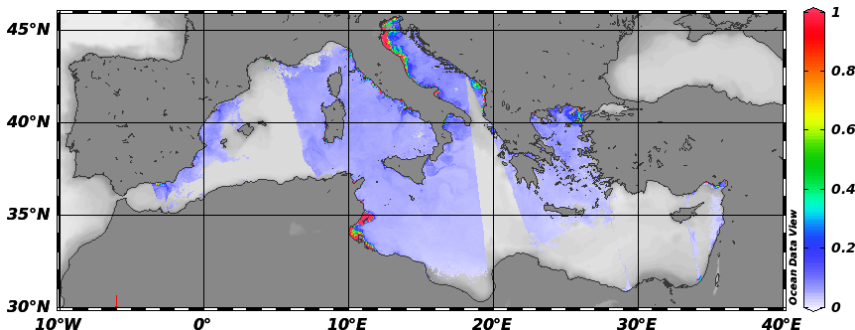
```
ncks -d lon,13.,18.0 -d lat,33.0,36.0  
input.nc output.nc
```

ODV – Ocean Data View



 <http://odv.awi.de/en/home/>

 interactive exploration, analysis and visualization of oceanographic data





High-level functions to read/write data from/to a netCDF file:

- ▶ <http://octave.sourceforge.net/netcdf/overview.html>
- ▶ <http://es.mathworks.com/help/matlab/network-common-data-form.html>

Example with Octave

```
nc = netcdf('input.nc','r');      % open netcdf file in read-only
CHL = nc{'CHL'}(:);               % retrieve variable
CHL_units = nc{'CHL'}.units;      % retrieve the attribute units
CHL_valid_range = nc{'CHL'}.valid_range; % retrieve the attribute valid_range
global_history = nc.history;      % retrieve the global attribute history
```



Python interface to the netCDF C library:

<http://unidata.github.io/netcdf4-python/>

Example: file

dep0001_station-santantoni_scb-wlog001_L1-2016-01.nc

Example with ipython

```
import netCDF4
nc = netCDF4.Dataset('dep0001_station-santantoni_scb-wlog001_L1-2016-01.nc')
print nc
<type 'netCDF4._netCDF4.Dataset'>
root group (NETCDF3_CLASSIC data model, file format UNDEFINED):
  title: Data from instrument SCB-WLOG001 on platform Station SantAntoni
  institution: SOCIB (Sistema de Observacion y prediccion Costero de las Islas Baleares)
  netcdf_version: 3.0
  Conventions: CF-1.6
  abstract: Deployment of instrument SCB-WLOG001 at Sant Antoni station in endurance line
...
nc.close()
```

List of notebooks

Located in Data_ReadWrite

[read_csv_file.ipynb](#): Comma separated values

[read_cnv_file.ipynb](#): SeaBird CTD file

[read_netcdf_local.ipynb](#): local [netCDF](#) file

[read_netcdf_opendap.ipynb](#): [netCDF](#) on [thredds data server](#)

[read_netcdf_cf.ipynb](#): [netCDF](#) using [CF conventions](#)

[read_shapefile.ipynb](#): geospatial vector data

[read_geotiff.ipynb](#): geotiff image

[read_image.ipynb](#): jpg image

[read_HDF_file.ipynb](#): Hierarchical Data Format

[read_mat_file.ipynb](#): .mat file

Exercise 1: data reading

Objective: read *unknown* file format

⚙️: 1-read_CMEMS_indexfile.ipynb

Programming in Python #2

time series, scatter plots, ...

Useful packages

NumPy: package for scientific computing

<http://www.numpy.org/>

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matplotlib: 2D plotting library which produces publication quality figures <http://matplotlib.org/>

List of notebooks

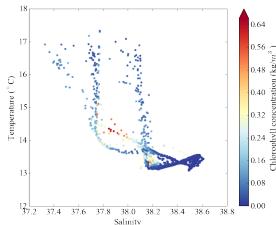
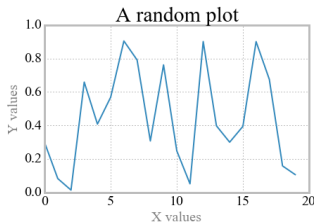
Located in Plotting

`plot_line.ipynb`: simple line plots and configuration

`plot_subfigure.ipynb`: organizing plots in sub-figures

`plot_TS_diagram.ipynb`: scatter plot using temperature and salinity from CTD

`oceanography.mplstyle`: file to define figure style



Exercise 2: mooring time series

Objective: plot time series of temperature and salinity

⚙️: 2-plot_ibiza_temperature_salinity.ipynb

Programming in Python #3

2D plots and plots on map

Useful packages

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<http://www.numpy.org/>

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<http://matplotlib.org/basemap/>

Bokeh: interactive visualization library
(<http://bokeh.pydata.org/en/latest/>)

List of notebooks

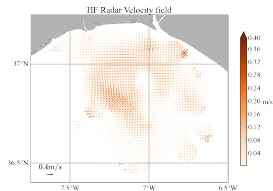
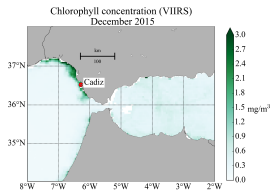
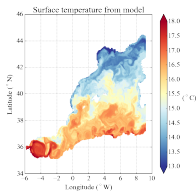
Located in Plotting

[plot2D_contours_pcolor.ipynb](#): plot 2D fields with contour or pseudo-color techniques

[plot2D_map_field.ipynb](#): plot 2D field on a map

[plot2D_map_vector.ipynb](#): plot vector field on a map

[plot2D_map_scatter.ipynb](#): scatter plot on a map



Exercise 3: 2D plot

Objective: create a plot with the salinity from a numerical model and the velocities taken from a HF radar system.

⚙️: 3-plot_radar_salinity.ipynb