
Python for Magnetism Documentation

Release 2020.11

Michael Wack

Nov 03, 2020

CONTENTS

1	Contents:	1
1.1	Introduction to Python	1
1.2	Set up your python environment	1
1.2.1	Recommended setup	1
1.2.2	Other useful ressources	1
1.3	Getting Started	2
1.3.1	Using Python as a Calculator	2
1.3.2	Variables and Types	2
1.4	Program Flow	9
1.4.1	if, else, elif	9
1.4.2	Loops	10
1.4.3	Functions	13
1.4.4	Exceptions	14
1.4.5	Modules and Namespaces	15
1.5	Pylab - Matlab style Python	21
1.5.1	Examples based on “Rappels d’utilisation de MATLAB”	21
1.5.2	Examples based on “familiarisation avec Matlab”	25
1.6	Pylab continued	34
1.6.1	Examples based on “. . . des données sous MATLAB”	34
1.7	Object Oriented Programming (OOP)	41
1.8	MagWire	45
1.9	SymPy	53
1.9.1	Usage	53
1.9.2	Basic Examples	53
1.9.3	Example: Calculate determinant of matrices in a loop	60
1.9.4	Example: Calculate Eigenvalues and Eigenvectors	61
1.10	PyCharm IDE	61
1.11	pandas	62
1.11.1	working with Excel data	62
1.11.2	intermagnet data	63
2	Downloads:	67

CONTENTS:

1.1 Introduction to Python

Python is a versatile, interpreted programming language introduced in 1991. It is available in many varieties and scales very well from little scripts and interactive sessions to full-blown applications with graphical user interfaces. [This article](#) on Wikipedia covers some general aspects of Python.

Due to its scalability, easy syntax and free availability it became very popular in science. Therefore many add-on modules for specific problems are available. Those cover many aspects that are traditionally done with other (commercial) tools like numerical calculations, symbolic math and generation of publication ready plots.

1.2 Set up your python environment

1.2.1 Recommended setup

To get Python running on your systems I recommend to install the following packages on your portable computer (by the way: this works also on the stationary computers in our institute without root access):

1. The Python platform Anaconda (make sure to select the version with Python 3.x, *not* 2.x). Available for MacOS, Linux and Windows.

<https://www.continuum.io/downloads>

2. The PyCharm IDE: choose the free community edition

<https://www.jetbrains.com/pycharm/download/>

3. Get your eduroam WLAN working so that you will have internet access during class. On top you will have free internet access in most universities on the planet . . .

<https://www.lrz.de/services/netz/mobil/eduroam/>

1.2.2 Other useful resources

If you like a matlab style user interface with interactive variable editor, you can try Spyder IDE: <https://pythonhosted.org/spyder/>

Official Python web page: <https://www.python.org/>

Official documentation: <https://docs.python.org/3/>

1.3 Getting Started

There are many different ways to use Python. For now we will use an iPython notebook.

Create a directory of your choice (where you want to locate your python files). Open a command shell in this directory and start the iPython notebook server by typing ``ipython notebook``. This should open your web browser or at least show you the URL that can be opened by the web browser of your choice. Usually <http://localhost:8888>

In your browser window you can now open or create notebook files (.ipynb) in your directory. Once you opened a notebook you can type 'h' to get help on some useful shortcuts. This text is a static version of such a notebook. You can download it (see start page of this documentation) or type it on your own.

1.3.1 Using Python as a Calculator

```
2+2
```

```
4
```

```
50-5*6
```

```
20
```

```
(50-5*6) / 4
```

```
5.0
```

```
8/5
```

```
1.6
```

```
8//5
```

```
1
```

```
8%5
```

```
3
```

1.3.2 Variables and Types

Naming

Do not use reserved names:

and, as, assert, break, class, continue, def, del, elif, else, except, exec, finally, for, from, global, if, import, in, is, lambda, not, or, pass, print, raise, return, try, while, with, yield

Use a-z, A-Z, 0-9, _

Start with a letter

```
myvar = 12
```

```
myvar
```

```
12
```

```
myvar + 10
```

```
22
```

```
myvar = myvar + 10
```

```
myvar
```

```
22
```

```
type(myvar)
```

```
int
```

```
myvar = 22.0
```

```
type(myvar)
```

```
float
```

```
mybool = True
```

```
type(mybool)
```

```
bool
```

```
x = 1.0 + 1.0j
```

```
type(x)
```

```
complex
```

```
x.real
```

```
1.0
```

```
myvar**0.5
```

```
4.69041575982343
```

type casting

```
type(myvar)
```

```
float
```

```
myvar=22.9
```

```
int(myvar)
```

```
22
```

Comparison

```
1 > 0
```

```
True
```

```
type(0 > 1)
```

```
bool
```

```
2 >= 2
```

```
True
```

```
not myvar != 1
```

```
False
```

```
(1==1) | (1==2)
```

```
True
```

Composite types: Strings, List, Tuple, Set and Dictionaries

Strings

```
s = "Hello Everybody"
```

```
type(s)
```

```
str
```

```
s
```



```
'Hello Everybody'
```

```
len(s)
```

```
15
```

```
s.replace('Hello', 'Goodbye')
```

```
'Goodbye Everybody'
```

```
s[0]
```

```
'H'
```

```
s[6:]
```

```
'Everybody'
```

```
s[0:1]
```

```
'H'
```

```
s[:-3]
```

```
'Hello Everyb'
```

```
s[0:10:2]
```

```
'HloEe'
```

```
s[::-2]
```

```
'yoyeEolH'
```

```
s2 = ' and Nobody'
```

```
s + s2
```

```
'Hello Everybody and Nobody'
```

```
s[0:5] + s2[-7:]
```

```
'Hello Nobody'
```

```
print( "The number {} is great".format(myvar))
```

```
The number 22.9 is great
```

Lists

```
l = [1,2,3,4]
```

```
l
```

```
[1, 2, 3, 4]
```

```
type(l)
```

```
list
```

```
l2 = list(range(10))
```

```
l2
```

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

```
l5 = list(range(-10,11,2))
```

```
l5
```

```
[-10, -8, -6, -4, -2, 0, 2, 4, 6, 8, 10]
```

```
l3 = [1.1, 2, 'Hallo', 1+1j]
```

```
l3
```

```
[1.1, 2, 'Hallo', (1+1j)]
```

```
l3[1]
```

```
2
```

```
l4 = [1,2,3,[1,2,3,[5,6,7]]]
```

```
l4
```

```
[1, 2, 3, [1, 2, 3, [5, 6, 7]]]
```

```
l4[3][3]
```

```
[5, 6, 7]
```

```
l4[3][3][2]
```

```
7
```

```
ls = list(s)
```

```
ls
```

```
['H', 'e', 'l', 'l', 'o', ' ', 'E', 'v', 'e', 'r', 'y', 'b', 'o', 'd', 'y']
```

```
ls.sort()
```

```
ls
```

```
[' ', 'E', 'H', 'b', 'd', 'e', 'e', 'l', 'l', 'o', 'o', 'r', 'v', 'y', 'y']
```

```
ls.append( 'X' )
```

```
l6 = []
```

```
l6
```

```
[]
```

```
l6.append( 'H' )
```

```
l6.append('a')
```

```
l6
```

```
['H', 'a']
```

```
l6.insert( 0, 'X' )
```

```
l6
```

```
['X', 'H', 'a']
```

```
l6.insert( 2, 'A' )
```

```
l6
```

```
['X', 'H', 'A', 'a']
```

```
l6[0] = 'x'
```

```
l6
```

```
['x', 'H', 'A', 'a']
```

Tuple

similar to list but it is impossible to modify

```
t1 = (1,2,3,4)
```

```
t1
```

```
(1, 2, 3, 4)
```

```
# t1[0] = 3
```

Dictionaries

```
d1 = {'par1': 5, 'par2': 10}
```

```
d1
```

```
{'par1': 5, 'par2': 10}
```

```
type(d1)
```

```
dict
```

```
d1['par1']
```

```
5
```

```
d1['par1']=1
```

```
d1['par3']=22
```

```
d1
```

```
{'par1': 1, 'par2': 10, 'par3': 22}
```

Set

```
basket = {'apple', 'orange', 'apple', 'pear', 'orange', 'banana'}
```

```
print(basket)
```

```
{'banana', 'apple', 'pear', 'orange'}
```

```
'orange' in basket
```

```
True
```

```
'lemon' in basket
```

```
False
```

```
a = set('abracadabra')
b = set('alacazam')
```

```
a, b
```

```
{'a', 'b', 'c', 'd', 'r'}, {'a', 'c', 'l', 'm', 'z'}
```

```
a-b
```

```
{'b', 'd', 'r'}
```

```
a & b
```

```
{'a', 'c'}
```

```
a | b
```

```
{'a', 'b', 'c', 'd', 'l', 'm', 'r', 'z'}
```

1.4 Program Flow

1.4.1 if, else, elif

```
cond1, cond2 = True, False
```

```
if cond1:
    print("cond1 is True")

elif cond2:
    print("will never happen if cond1 is True")

else:
    print("cond1 and cond2 are False")
```

```
cond1 is True
```

Please note that program blocks are defined by their indentation level.

```
if cond1:
    if not cond2:
        print("cond1 is True and cond2 is False")

print("I'm always here!")
```

```
cond1 is True and cond2 is False
I'm always here!
```

```
if cond1 and not cond2:
    print("cond1 is True and cond2 is False")
```

```
cond1 is True and cond2 is False
```

1.4.2 Loops

for

for loops execute an program block for each element in a list:

```
for c in range(5):
    print(c+1)
```

```
1
2
3
4
5
```

```
for letter in 'Hallo':
    print('The letter is: {}'.format(letter))
```

```
The letter is: H
The letter is: a
The letter is: l
The letter is: l
The letter is: o
```

```
for magnetic_mineral in ('magnetite', 'hematite', 'greigite'):
    print(magnetic_mineral)
```

```
magnetite
hematite
greigite
```

enumerate give access to the indices when needed

```
for idx, c in enumerate(range(-3,3)):
    print(idx, c, idx*c)
```

```
0 -3 0
1 -2 -2
2 -1 -2
3 0 0
4 1 4
5 2 10
```

```
for x in 'ABCDE':
    for y in range(4):
        print( "{}{}".format(x,y)
```

```
A0
A1
A2
A3
B0
B1
B2
B3
C0
C1
C2
C3
D0
D1
D2
D3
E0
E1
E2
E3
```

List comprehensions

instead of doing something like this:

```
cubes = []
for c in range(4):
    cubes.append(c**3)
print(cubes)
```

```
[0, 1, 8, 27]
```

we can write:

```
[n**3 for n in range(4)]
```

```
[0, 1, 8, 27]
```

```
[(x,x**2) for x in range(1,5)]
```

```
[(1, 1), (2, 4), (3, 9), (4, 16)]
```

```
[s.upper() for s in ['small', 'little', 'tiny']]
```

```
['SMALL', 'LITTLE', 'TINY']
```

```
["{}{}".format(x,y) for x in "ABCDE" for y in range(4)]
```

```
['A0',  
'A1',  
'A2',  
'A3',  
'B0',  
'B1',  
'B2',  
'B3',  
'C0',  
'C1',  
'C2',  
'C3',  
'D0',  
'D1',  
'D2',  
'D3',  
'E0',  
'E1',  
'E2',  
'E3']
```

```
[x for x in range(10) if x > 3 and x < 8]
```

```
[4, 5, 6, 7]
```

```
vec = [[1,2,3], [4,5,6], [7,8,9]]  
[num for elem in vec for num in elem if num % 2 == 0]
```

```
[2, 4, 6, 8]
```

Dictionary comprehensions

```
{x.upper(): x*3 for x in 'abcd'}
```

```
{'A': 'aaa', 'B': 'bbb', 'C': 'ccc', 'D': 'ddd'}
```

while

```
c = 0  
while c < 5:  
    c += 1  
    print(c)  
print("done")
```

```
1  
2  
3  
4  
5  
done
```


1.4.3 Functions

```
def f():
    print("got called")
```

```
f()
```

```
got called
```

```
def sqrt(n):
    """
    return square root of n
    """
    return n**0.5
```

```
sqrt(2)
```

```
1.4142135623730951
```

```
def mul(a,b):
    """
    multiply a and b
    """
    return a*b
```

```
mul(2,3)
```

```
6
```

```
def div(a,b):
    """
    divide a by b
    return int division and remainder
    """
    return a // b, a % b
```

```
div(20,6)
```

```
(3, 2)
```

docstrings can be retrieved by builtin help function

```
help(div)
```

```
Help on function div in module __main__:
```

```
div(a, b)
    divide a by b
    return int division and remainder
```

works with any object that has a doc string

```
help(sorted)
```

Help on built-in function `sorted` in module `builtins`:

```
sorted(...)  
    sorted(iterable, key=None, reverse=False) --> new sorted list
```

```
def add(a,b=1):  
    """  
    add a and b  
    if b is not given it is assumed to be 1  
    """  
    return a+b  
  
print(add(2,3))  
print(add(7))
```

```
5  
8
```

anonymous functions: `lambda`

```
square = lambda n: n**2
```

```
square(3)
```

```
9
```

for efficient computation, functions can be applied to a list of parameters

```
map( square, range(10))
```

```
<map at 0x7f1394041c18>
```

```
map( lambda x: x**3, range(10))
```

```
<map at 0x7f1394041e10>
```

1.4.4 Exceptions

exceptions output error messages

```
1+a
```

```
-----  
NameError                                Traceback (most recent call last)  
  
<ipython-input-33-f9dd4f57d0fd> in <module> ()  
----> 1 1+a  
  
NameError: name 'a' is not defined
```

```
a = 2
a[1]
```

```
-----
TypeError                                 Traceback (most recent call last)
<ipython-input-34-79d66ab95ee2> in <module>()
      1 a = 2
----> 2 a[1]

TypeError: 'int' object is not subscriptable
```

```
try:
    zz *= 2
except NameError:
    print("Caught NameError: zz not known")
```

```
Caught NameError: zz not known
```

1.4.5 Modules and Namespaces

```
import math
```

```
math.cos( math.radians(45))
```

```
0.7071067811865476
```

```
from math import sin, degrees
```

```
sin( degrees(45))
```

```
0.8060754911159176
```

```
dir(math)
```

```
['__doc__',
 '__file__',
 '__loader__',
 '__name__',
 '__package__',
 '__spec__',
 'acos',
 'acosh',
 'asin',
 'asinh',
 'atan',
 'atan2',
 'atanh',
 'ceil',
```

(continues on next page)

(continued from previous page)

```
'copysign',
'cos',
'cosh',
'degrees',
'e',
'erf',
'erfc',
'exp',
'expm1',
'fabs',
'factorial',
'floor',
'fmod',
'frexp',
'fsum',
'gamma',
'hypot',
'isfinite',
'isinf',
'isnan',
'ldexp',
'lgamma',
'log',
'log10',
'log1p',
'log2',
'modf',
'pi',
'pow',
'radians',
'sin',
'sinh',
'sqrt',
'tan',
'tanh',
'trunc']
```

```
help(math)
```

Help on module math:

NAME

math

MODULE REFERENCE

<http://docs.python.org/3.4/library/math>

The following documentation is automatically generated from the Python source files. It may be incomplete, incorrect or include features that are considered implementation detail and may vary between Python implementations. When in doubt, consult the module reference at the location listed above.

DESCRIPTION

This module is always available. It provides access to the mathematical functions defined by the C standard.

(continues on next page)

(continued from previous page)

FUNCTIONS

```
acos(...)  
acos(x)
```

Return the arc cosine (measured in radians) of x .

```
acosh(...)  
acosh(x)
```

Return the inverse hyperbolic cosine of x .

```
asin(...)  
asin(x)
```

Return the arc sine (measured in radians) of x .

```
asinh(...)  
asinh(x)
```

Return the inverse hyperbolic sine of x .

```
atan(...)  
atan(x)
```

Return the arc tangent (measured in radians) of x .

```
atan2(...)  
atan2(y, x)
```

Return the arc tangent (measured in radians) of y/x .
Unlike `atan(y/x)`, the signs of both x and y are considered.

```
atanh(...)  
atanh(x)
```

Return the inverse hyperbolic tangent of x .

```
ceil(...)  
ceil(x)
```

Return the ceiling of x as an int.
This is the smallest integral value $\geq x$.

```
copysign(...)  
copysign(x, y)
```

Return a float with the magnitude (absolute value) of x but the sign of y . On platforms that support signed zeros, `copysign(1.0, -0.0)` returns `-1.0`.

```
cos(...)  
cos(x)
```

Return the cosine of x (measured in radians).

```
cosh(...)
```

(continues on next page)

(continued from previous page)

```

cosh(x)

Return the hyperbolic cosine of x.

degrees(...)
degrees(x)

Convert angle x from radians to degrees.

erf(...)
erf(x)

Error function at x.

erfc(...)
erfc(x)

Complementary error function at x.

exp(...)
exp(x)

Return e raised to the power of x.

expm1(...)
expm1(x)

Return exp(x)-1.
This function avoids the loss of precision involved in the direct evaluation
↳of exp(x)-1 for small x.

fabs(...)
fabs(x)

Return the absolute value of the float x.

factorial(...)
factorial(x) -> Integral

Find x!. Raise a ValueError if x is negative or non-integral.

floor(...)
floor(x)

Return the floor of x as an int.
This is the largest integral value <= x.

fmod(...)
fmod(x, y)

Return fmod(x, y), according to platform C. x % y may differ.

frexp(...)
frexp(x)

Return the mantissa and exponent of x, as pair (m, e).
m is a float and e is an int, such that x = m * 2.**e.

```

(continues on next page)

(continued from previous page)

```
If x is 0, m and e are both 0. Else 0.5 <= abs(m) < 1.0.
```

```
fsum(...)  
fsum(iterable)
```

Return an accurate floating point sum of values in the iterable.
Assumes IEEE-754 floating point arithmetic.

```
gamma(...)  
gamma(x)
```

Gamma function at x.

```
hypot(...)  
hypot(x, y)
```

Return the Euclidean distance, $\sqrt{x^2 + y^2}$.

```
isfinite(...)  
isfinite(x) -> bool
```

Return True if x is neither an infinity nor a NaN, and False otherwise.

```
isinf(...)  
isinf(x) -> bool
```

Return True if x is a positive or negative infinity, and False otherwise.

```
isnan(...)  
isnan(x) -> bool
```

Return True if x is a NaN (not a number), and False otherwise.

```
ldexp(...)  
ldexp(x, i)
```

Return $x * (2^{**i})$.

```
lgamma(...)  
lgamma(x)
```

Natural logarithm of absolute value of Gamma function at x.

```
log(...)  
log(x[, base])
```

Return the logarithm of x to the given base.
If the base not specified, returns the natural logarithm (base e) of x.

```
log10(...)  
log10(x)
```

Return the base 10 logarithm of x.

```
log1p(...)  
log1p(x)
```

(continues on next page)

(continued from previous page)

Return the natural logarithm of 1+x (base e).
The result is computed in a way which is accurate for x near zero.

```
log2(...)  
log2(x)
```

Return the base 2 logarithm of x.

```
modf(...)  
modf(x)
```

Return the fractional and integer parts of x. Both results carry the sign of x and are floats.

```
pow(...)  
pow(x, y)
```

Return $x^{**}y$ (x to the power of y).

```
radians(...)  
radians(x)
```

Convert angle x from degrees to radians.

```
sin(...)  
sin(x)
```

Return the sine of x (measured in radians).

```
sinh(...)  
sinh(x)
```

Return the hyperbolic sine of x.

```
sqrt(...)  
sqrt(x)
```

Return the square root of x.

```
tan(...)  
tan(x)
```

Return the tangent of x (measured in radians).

```
tanh(...)  
tanh(x)
```

Return the hyperbolic tangent of x.

```
trunc(...)  
trunc(x:Real) -> Integral
```

Truncates x to the nearest Integral toward 0. Uses the `__trunc__` magic method.

DATA

```
e = 2.718281828459045  
pi = 3.141592653589793
```

(continues on next page)

(continued from previous page)

```
FILE
/home/wack/bin/anaconda3/lib/python3.4/lib-dynload/math.cpython-34m.so
```

```
help(math.sqrt)
```

```
Help on built-in function sqrt in module math:
```

```
sqrt(...)
    sqrt(x)

    Return the square root of x.
```

1.5 Pylab - Matlab style Python

Pylab is a module that provides a Matlab like namespace by importing functions from the modules Numpy and Matplotlib. Numpy provides efficient numerical vector calculations based on underlying Fortran and C binary libraries. Matplotlib contains functions to create visualizations of data.

```
# this ipython magic command imports pylab and allows the plots to reside within the
↳notebook
%pylab inline
```

```
Populating the interactive namespace from numpy and matplotlib
```

```
Value error parsing header in AFM: b'UnderlinePosition' b'-133rUnderlineThickness'
↳20rVersion 7.000'
```

The following examples are based on Florian Lhuillier’s lecture on Matlab which can be found online:

<http://geophysik.uni-muenchen.de/~lhuillier/teaching/AD2010/>

1.5.1 Examples based on “Rappels d’utilisation de MATLAB”

numpy.array

```
M = array(((1,2,3), (4,5,6), (7,8,9)))
```

```
M
```

```
array([[1, 2, 3],
       [4, 5, 6],
       [7, 8, 9]])
```

```
L=array((1,2,3))
```

```
C=array((1,2,3)).T
```

```
L, C
```

```
(array([1, 2, 3]), array([1, 2, 3]))
```

```
t1=arange(1,11); t1
```

```
array([ 1,  2,  3,  4,  5,  6,  7,  8,  9, 10])
```

```
t2=arange(1,11,2); t2
```

```
array([1, 3, 5, 7, 9])
```

```
t3=arange(10,0,-1); t3
```

```
array([10,  9,  8,  7,  6,  5,  4,  3,  2,  1])
```

get specific elements

```
t1
```

```
array([ 1,  2,  3,  4,  5,  6,  7,  8,  9, 10])
```

```
t1[4]
```

```
5
```

```
t1[[0,4,9]]
```

```
array([ 1,  5, 10])
```

```
t1[0:5]
```

```
array([1, 2, 3, 4, 5])
```

```
t1[0::2]
```

```
array([1, 3, 5, 7, 9])
```

```
t1[1::2]
```

```
array([ 2,  4,  6,  8, 10])
```

```
t1>5
```

```
array([False, False, False, False, False, True, True, True, True, True],  
      ↪dtype=bool)
```

```
t1[t1>5]
```

```
array([ 6,  7,  8,  9, 10])
```

```
t1%2==0
```

```
array([False,  True,  False,  True,  False,  True,  False,  True,  False,  True],  
      ↪dtype=bool)
```

```
t1[t1%2==0]
```

```
array([ 2,  4,  6,  8, 10])
```

```
t1%2==1
```

```
array([ True,  False,  True,  False,  True,  False,  True,  False,  True,  False],  
      ↪dtype=bool)
```

```
t1[t1%2==1]
```

```
array([1, 3, 5, 7, 9])
```

Matplotlib plotting

```
t = arange(-2*pi,2*pi,0.1); t
```

```
array([-6.28318531, -6.18318531, -6.08318531, -5.98318531, -5.88318531,  
       -5.78318531, -5.68318531, -5.58318531, -5.48318531, -5.38318531,  
       -5.28318531, -5.18318531, -5.08318531, -4.98318531, -4.88318531,  
       -4.78318531, -4.68318531, -4.58318531, -4.48318531, -4.38318531,  
       -4.28318531, -4.18318531, -4.08318531, -3.98318531, -3.88318531,  
       -3.78318531, -3.68318531, -3.58318531, -3.48318531, -3.38318531,  
       -3.28318531, -3.18318531, -3.08318531, -2.98318531, -2.88318531,  
       -2.78318531, -2.68318531, -2.58318531, -2.48318531, -2.38318531,  
       -2.28318531, -2.18318531, -2.08318531, -1.98318531, -1.88318531,  
       -1.78318531, -1.68318531, -1.58318531, -1.48318531, -1.38318531,  
       -1.28318531, -1.18318531, -1.08318531, -0.98318531, -0.88318531,  
       -0.78318531, -0.68318531, -0.58318531, -0.48318531, -0.38318531,  
       -0.28318531, -0.18318531, -0.08318531,  0.01681469,  0.11681469,  
        0.21681469,  0.31681469,  0.41681469,  0.51681469,  0.61681469,  
        0.71681469,  0.81681469,  0.91681469,  1.01681469,  1.11681469,  
        1.21681469,  1.31681469,  1.41681469,  1.51681469,  1.61681469,  
        1.71681469,  1.81681469,  1.91681469,  2.01681469,  2.11681469,  
        2.21681469,  2.31681469,  2.41681469,  2.51681469,  2.61681469,  
        2.71681469,  2.81681469,  2.91681469,  3.01681469,  3.11681469,  
        3.21681469,  3.31681469,  3.41681469,  3.51681469,  3.61681469,  
        3.71681469,  3.81681469,  3.91681469,  4.01681469,  4.11681469,  
        4.21681469,  4.31681469,  4.41681469,  4.51681469,  4.61681469,  
        4.71681469,  4.81681469,  4.91681469,  5.01681469,  5.11681469,  
        5.21681469,  5.31681469,  5.41681469,  5.51681469,  5.61681469,  
        5.71681469,  5.81681469,  5.91681469,  6.01681469,  6.11681469,  
        6.21681469])
```

```
x1=cos(t)
```

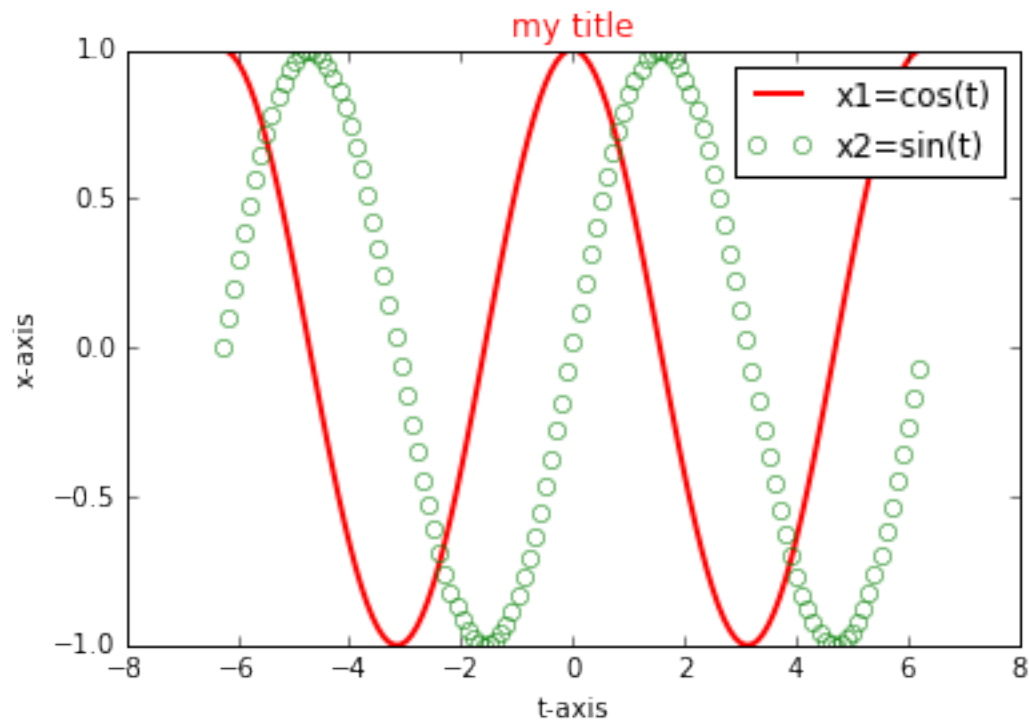
```
x2=sin(t)
```

```
len(x2)
```

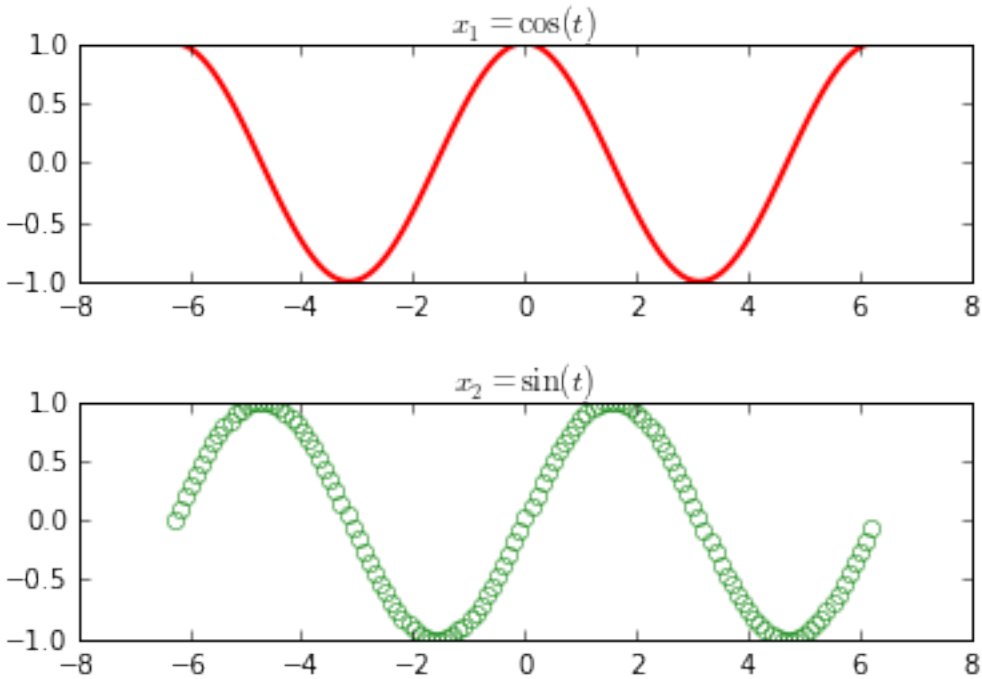
```
126
```

```
plot(t,x1, color='r', linewidth=2, label='x1=cos(t)')
plot(t, x2, ' o', markeredgecolor='g', markerfacecolor="None", label='x2=sin(t)')
title('my title', color='r')
xlabel('t-axis')
ylabel('x-axis')
legend()
```

```
<matplotlib.legend.Legend at 0x7f5fe9c0dc18>
```



```
subplot(211)
plot(t, x1, 'r', linewidth=2)
title('$x_1=\cos(t)$')
subplot(212)
plot(t, x2, ' o', markeredgecolor='g', markerfacecolor="None")
title('$x_2=\sin(t)$')
subplots_adjust(hspace=.5)
```



1.5.2 Examples based on “familiarisation avec Matlab”

```
set_printoptions(precision=2, suppress=True)
```

Exercice 1

```
x=array((17,8,12,15,6,11,9,18,16,10,13,19)); x
```

```
array([17,  8, 12, 15,  6, 11,  9, 18, 16, 10, 13, 19])
```

```
N = len(x); N
```

```
12
```

```
S = sum(x); S
```

```
154
```

```
xbarre = S / N; xbarre
```

```
12.833333333333334
```

```
xbarre = mean(x); xbarre
```

```
12.833333333333334
```

```
sigma = sqrt(sum((x-xbarre)**2)/(N-1)); sigma
```

```
4.1959576506514704
```

```
sigma = std(x, ddof=1); sigma
```

```
4.1959576506514704
```

```
dx = x[1:]-x[0:-1]; dx
```

```
array([-9,  4,  3, -9,  5, -2,  9, -2, -6,  3,  6])
```

```
dx = diff(x); dx
```

```
array([-9,  4,  3, -9,  5, -2,  9, -2, -6,  3,  6])
```

Excercise 2

```
t = linspace(-25,25,51); t
```

```
array([-25., -24., -23., -22., -21., -20., -19., -18., -17., -16., -15.,
       -14., -13., -12., -11., -10.,  -9.,  -8.,  -7.,  -6.,  -5.,  -4.,
        -3.,  -2.,  -1.,   0.,   1.,   2.,   3.,   4.,   5.,   6.,   7.,
         8.,   9.,  10.,  11.,  12.,  13.,  14.,  15.,  16.,  17.,  18.,
        19.,  20.,  21.,  22.,  23.,  24.,  25.]
```

```
x = t**2; x
```

```
array([ 625.,  576.,  529.,  484.,  441.,  400.,  361.,  324.,  289.,
        256.,  225.,  196.,  169.,  144.,  121.,  100.,   81.,   64.,
         49.,   36.,   25.,   16.,   9.,   4.,   1.,   0.,   1.,
          4.,   9.,  16.,  25.,  36.,  49.,  64.,  81., 100.,
        121., 144., 169., 196., 225., 256., 289., 324., 361.,
        400., 441., 484., 529., 576., 625.]
```

```
y = t[::-1]**3; y
```

```
array([ 15625.,  13824.,  12167.,  10648.,   9261.,   8000.,   6859.,
         5832.,   4913.,   4096.,   3375.,   2744.,   2197.,   1728.,
        1331.,   1000.,   729.,   512.,   343.,   216.,   125.,
          64.,   27.,    8.,    1.,    0.,   -1.,   -8.,
        -27.,   -64.,  -125.,  -216.,  -343.,  -512.,  -729.,
       -1000., -1331., -1728., -2197., -2744., -3375., -4096.,
       -4913., -5832., -6859., -8000., -9261., -10648., -12167.,
      -13824., -15625.]
```

```
fliplr(t[newaxis])**3
```

```
array([[ 15625.,  13824.,  12167.,  10648.,   9261.,   8000.,   6859.,
         5832.,   4913.,   4096.,   3375.,   2744.,   2197.,   1728.,
```

(continues on next page)

(continued from previous page)

```

1331., 1000., 729., 512., 343., 216., 125.,
 64., 27., 8., 1., 0., -1., -8.,
-27., -64., -125., -216., -343., -512., -729.,
-1000., -1331., -1728., -2197., -2744., -3375., -4096.,
-4913., -5832., -6859., -8000., -9261., -10648., -12167.,
-13824., -15625.]]))

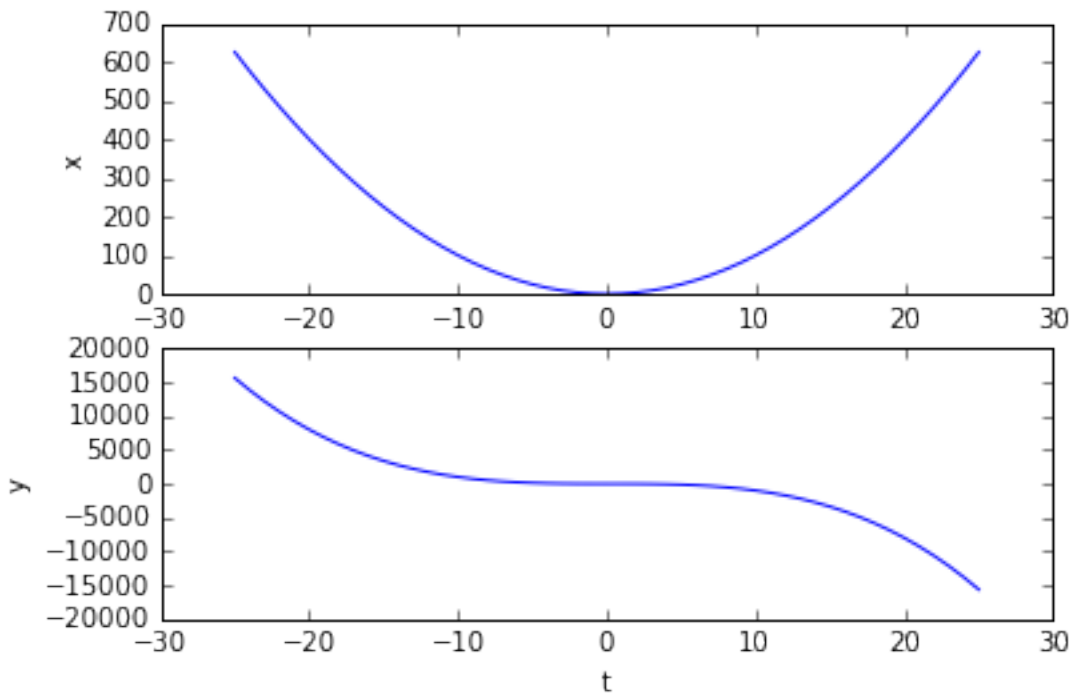
```

```

subplot(2,1,1)
plot(t,x)
xlabel('t'); ylabel('x')
subplot(212)
plot(t,y)
xlabel('t'); ylabel('y')

```

```
<matplotlib.text.Text at 0x7f5fe95ac978>
```



```
fix(x/2)==x/2
```

```

array([False,  True,  False,  True,  False,  True,  False,  True,  False,
       True,  False,  True,  False,  True,  False,  True,  False,  True,
       False,  True,  False,  True,  False,  True,  False,  True,  False,
       True,  False,  True,  False,  True,  False,  True,  False,  True,
       False,  True,  False,  True,  False,  True,  False,  True,  False,
       True,  False,  True,  False,  True,  False], dtype=bool)

```

```
sum( x[fix(x/2)==x/2])
```

```
5200.0
```

```
sum( x[remainder(x,2)==0])
```

```
5200.0
```

```
sum( x[x%2==0])
```

```
5200.0
```

```
sum( y[y>0])
```

```
105625.0
```

Excercise 3

```
t = arange(1,10.01,0.5); t
```

```
array([ 1. ,  1.5,  2. ,  2.5,  3. ,  3.5,  4. ,  4.5,  5. ,  
       5.5,  6. ,  6.5,  7. ,  7.5,  8. ,  8.5,  9. ,  9.5, 10. ])
```

```
A = array( (t, t**2, t**3, t**4)).T; A
```

```
array([[ 1. ,  1. ,  1. ,  1. ],  
       [ 1.5,  2.25,  3.38,  5.06],  
       [ 2. ,  4. ,  8. ,  16. ],  
       [ 2.5,  6.25, 15.62, 39.06],  
       [ 3. ,  9. , 27. ,  81. ],  
       [ 3.5, 12.25, 42.88, 150.06],  
       [ 4. , 16. , 64. , 256. ],  
       [ 4.5, 20.25, 91.12, 410.06],  
       [ 5. , 25. , 125. , 625. ],  
       [ 5.5, 30.25, 166.38, 915.06],  
       [ 6. , 36. , 216. , 1296. ],  
       [ 6.5, 42.25, 274.62, 1785.06],  
       [ 7. , 49. , 343. , 2401. ],  
       [ 7.5, 56.25, 421.88, 3164.06],  
       [ 8. , 64. , 512. , 4096. ],  
       [ 8.5, 72.25, 614.12, 5220.06],  
       [ 9. , 81. , 729. , 6561. ],  
       [ 9.5, 90.25, 857.38, 8145.06],  
       [ 10. , 100. , 1000. , 10000. ]])
```

```
A = column_stack((A, t>5)); A
```

```
array([[ 1. ,  1. ,  1. ,  1. ,  0. ],  
       [ 1.5,  2.25,  3.38,  5.06,  0. ],  
       [ 2. ,  4. ,  8. ,  16. ,  0. ],  
       [ 2.5,  6.25, 15.62, 39.06,  0. ],  
       [ 3. ,  9. , 27. ,  81. ,  0. ],  
       [ 3.5, 12.25, 42.88, 150.06,  0. ],  
       [ 4. , 16. , 64. , 256. ,  0. ],  
       [ 4.5, 20.25, 91.12, 410.06,  0. ],
```

(continues on next page)

(continued from previous page)

```
[ 5. , 25. , 125. , 625. , 0. ],
[ 5.5 , 30.25, 166.38, 915.06, 1. ],
[ 6. , 36. , 216. , 1296. , 1. ],
[ 6.5 , 42.25, 274.62, 1785.06, 1. ],
[ 7. , 49. , 343. , 2401. , 1. ],
[ 7.5 , 56.25, 421.88, 3164.06, 1. ],
[ 8. , 64. , 512. , 4096. , 1. ],
[ 8.5 , 72.25, 614.12, 5220.06, 1. ],
[ 9. , 81. , 729. , 6561. , 1. ],
[ 9.5 , 90.25, 857.38, 8145.06, 1. ],
[ 10. , 100. , 1000. , 10000. , 1. ]])
```

```
column_stack((A, (fix(t)==t)*5))
```

```
array([[ 1. , 1. , 1. , 1. , 0. , 5. ],
 [ 1.5 , 2.25, 3.38, 5.06, 0. , 0. ],
 [ 2. , 4. , 8. , 16. , 0. , 5. ],
 [ 2.5 , 6.25, 15.62, 39.06, 0. , 0. ],
 [ 3. , 9. , 27. , 81. , 0. , 5. ],
 [ 3.5 , 12.25, 42.88, 150.06, 0. , 0. ],
 [ 4. , 16. , 64. , 256. , 0. , 5. ],
 [ 4.5 , 20.25, 91.12, 410.06, 0. , 0. ],
 [ 5. , 25. , 125. , 625. , 0. , 5. ],
 [ 5.5 , 30.25, 166.38, 915.06, 1. , 0. ],
 [ 6. , 36. , 216. , 1296. , 1. , 5. ],
 [ 6.5 , 42.25, 274.62, 1785.06, 1. , 0. ],
 [ 7. , 49. , 343. , 2401. , 1. , 5. ],
 [ 7.5 , 56.25, 421.88, 3164.06, 1. , 0. ],
 [ 8. , 64. , 512. , 4096. , 1. , 5. ],
 [ 8.5 , 72.25, 614.12, 5220.06, 1. , 0. ],
 [ 9. , 81. , 729. , 6561. , 1. , 5. ],
 [ 9.5 , 90.25, 857.38, 8145.06, 1. , 0. ],
 [ 10. , 100. , 1000. , 10000. , 1. , 5. ]])
```

```
column_stack((A, (remainder(t,1)==0)*5))
```

```
array([[ 1. , 1. , 1. , 1. , 0. , 5. ],
 [ 1.5 , 2.25, 3.38, 5.06, 0. , 0. ],
 [ 2. , 4. , 8. , 16. , 0. , 5. ],
 [ 2.5 , 6.25, 15.62, 39.06, 0. , 0. ],
 [ 3. , 9. , 27. , 81. , 0. , 5. ],
 [ 3.5 , 12.25, 42.88, 150.06, 0. , 0. ],
 [ 4. , 16. , 64. , 256. , 0. , 5. ],
 [ 4.5 , 20.25, 91.12, 410.06, 0. , 0. ],
 [ 5. , 25. , 125. , 625. , 0. , 5. ],
 [ 5.5 , 30.25, 166.38, 915.06, 1. , 0. ],
 [ 6. , 36. , 216. , 1296. , 1. , 5. ],
 [ 6.5 , 42.25, 274.62, 1785.06, 1. , 0. ],
 [ 7. , 49. , 343. , 2401. , 1. , 5. ],
 [ 7.5 , 56.25, 421.88, 3164.06, 1. , 0. ],
 [ 8. , 64. , 512. , 4096. , 1. , 5. ],
 [ 8.5 , 72.25, 614.12, 5220.06, 1. , 0. ],
 [ 9. , 81. , 729. , 6561. , 1. , 5. ],
 [ 9.5 , 90.25, 857.38, 8145.06, 1. , 0. ],
 [ 10. , 100. , 1000. , 10000. , 1. , 5. ]])
```

```
column_stack((A, (mod(t,1)==0)*5))
```

```
array([[ 1. ,  1. ,  1. ,  1. ,  0. ,  5. ],
       [ 1.5,  2.25,  3.38,  5.06,  0. ,  0. ],
       [ 2. ,  4. ,  8. ,  16. ,  0. ,  5. ],
       [ 2.5,  6.25, 15.62, 39.06,  0. ,  0. ],
       [ 3. ,  9. ,  27. ,  81. ,  0. ,  5. ],
       [ 3.5, 12.25, 42.88, 150.06,  0. ,  0. ],
       [ 4. , 16. ,  64. , 256. ,  0. ,  5. ],
       [ 4.5, 20.25, 91.12, 410.06,  0. ,  0. ],
       [ 5. , 25. , 125. , 625. ,  0. ,  5. ],
       [ 5.5, 30.25, 166.38, 915.06,  1. ,  0. ],
       [ 6. , 36. , 216. , 1296. ,  1. ,  5. ],
       [ 6.5, 42.25, 274.62, 1785.06,  1. ,  0. ],
       [ 7. , 49. , 343. , 2401. ,  1. ,  5. ],
       [ 7.5, 56.25, 421.88, 3164.06,  1. ,  0. ],
       [ 8. , 64. , 512. , 4096. ,  1. ,  5. ],
       [ 8.5, 72.25, 614.12, 5220.06,  1. ,  0. ],
       [ 9. , 81. , 729. , 6561. ,  1. ,  5. ],
       [ 9.5, 90.25, 857.38, 8145.06,  1. ,  0. ],
       [10. , 100. , 1000. , 10000. ,  1. ,  5.]])
```

```
column_stack((A, (t % 1==0)*5))
```

```
array([[ 1. ,  1. ,  1. ,  1. ,  0. ,  5. ],
       [ 1.5,  2.25,  3.38,  5.06,  0. ,  0. ],
       [ 2. ,  4. ,  8. ,  16. ,  0. ,  5. ],
       [ 2.5,  6.25, 15.62, 39.06,  0. ,  0. ],
       [ 3. ,  9. ,  27. ,  81. ,  0. ,  5. ],
       [ 3.5, 12.25, 42.88, 150.06,  0. ,  0. ],
       [ 4. , 16. ,  64. , 256. ,  0. ,  5. ],
       [ 4.5, 20.25, 91.12, 410.06,  0. ,  0. ],
       [ 5. , 25. , 125. , 625. ,  0. ,  5. ],
       [ 5.5, 30.25, 166.38, 915.06,  1. ,  0. ],
       [ 6. , 36. , 216. , 1296. ,  1. ,  5. ],
       [ 6.5, 42.25, 274.62, 1785.06,  1. ,  0. ],
       [ 7. , 49. , 343. , 2401. ,  1. ,  5. ],
       [ 7.5, 56.25, 421.88, 3164.06,  1. ,  0. ],
       [ 8. , 64. , 512. , 4096. ,  1. ,  5. ],
       [ 8.5, 72.25, 614.12, 5220.06,  1. ,  0. ],
       [ 9. , 81. , 729. , 6561. ,  1. ,  5. ],
       [ 9.5, 90.25, 857.38, 8145.06,  1. ,  0. ],
       [10. , 100. , 1000. , 10000. ,  1. ,  5.]])
```

```
column_stack((A, (A[:,1] % 1==0)*5))
```

```
array([[ 1. ,  1. ,  1. ,  1. ,  0. ,  5. ],
       [ 1.5,  2.25,  3.38,  5.06,  0. ,  0. ],
       [ 2. ,  4. ,  8. ,  16. ,  0. ,  5. ],
       [ 2.5,  6.25, 15.62, 39.06,  0. ,  0. ],
       [ 3. ,  9. ,  27. ,  81. ,  0. ,  5. ],
       [ 3.5, 12.25, 42.88, 150.06,  0. ,  0. ],
       [ 4. , 16. ,  64. , 256. ,  0. ,  5. ],
       [ 4.5, 20.25, 91.12, 410.06,  0. ,  0. ],
       [ 5. , 25. , 125. , 625. ,  0. ,  5.]])
```

(continues on next page)

(continued from previous page)

```

[ 5.5 , 30.25, 166.38, 915.06, 1. , 0. ],
[ 6. , 36. , 216. , 1296. , 1. , 5. ],
[ 6.5 , 42.25, 274.62, 1785.06, 1. , 0. ],
[ 7. , 49. , 343. , 2401. , 1. , 5. ],
[ 7.5 , 56.25, 421.88, 3164.06, 1. , 0. ],
[ 8. , 64. , 512. , 4096. , 1. , 5. ],
[ 8.5 , 72.25, 614.12, 5220.06, 1. , 0. ],
[ 9. , 81. , 729. , 6561. , 1. , 5. ],
[ 9.5 , 90.25, 857.38, 8145.06, 1. , 0. ],
[ 10. , 100. , 1000. , 10000. , 1. , 5. ]])

```

Exercise 4

```

def matrace(A):
    if A.shape[0] == A.shape[1]: # square matrix
        return sum(A.diagonal())
    else:
        return -1

```

```
B = randn(10,2); B
```

```

array([[ 0.63495405, -0.41332203],
       [-0.7815181 , -0.13233533],
       [ 0.7135537 , -2.28650789],
       [ 1.06424592, -0.59932232],
       [-0.92327638,  1.08949032],
       [-0.3044619 , -1.41034731],
       [ 2.43510089,  1.79379768],
       [ 1.72210238, -0.07562774],
       [-1.01335264, -0.55329476],
       [-0.02516625,  0.3408787 ]])

```

```
C = rand(10,10); C
```

```

array([[ 0.50088428,  0.93300777,  0.37201697,  0.77327375,  0.46656404,
         0.62428764,  0.22893919,  0.05437433,  0.25646812,  0.61869992],
       [ 0.21738864,  0.14611412,  0.6931886 ,  0.01817277,  0.77878839,
         0.72566348,  0.04703873,  0.93371262,  0.83055894,  0.58275793],
       [ 0.4355275 ,  0.64907709,  0.74873456,  0.01012651,  0.24467361,
         0.2129306 ,  0.55225695,  0.84802033,  0.76059712,  0.4016598 ],
       [ 0.30799587,  0.27933615,  0.86267317,  0.39175961,  0.6428809 ,
         0.75737427,  0.41230321,  0.56131722,  0.69304986,  0.94859853],
       [ 0.62737424,  0.37229053,  0.75572847,  0.0568789 ,  0.94284048,
         0.97024807,  0.22325789,  0.93904313,  0.83170287,  0.65638246],
       [ 0.45016252,  0.68649037,  0.71527278,  0.16762903,  0.33766686,
         0.60118736,  0.34700568,  0.72236911,  0.70477416,  0.25416372],
       [ 0.61660476,  0.1965179 ,  0.28903584,  0.10889469,  0.76724818,
         0.68422022,  0.79335408,  0.46277956,  0.91468881,  0.67903228],
       [ 0.12111865,  0.59213305,  0.1991645 ,  0.08751303,  0.89810622,
         0.15385135,  0.90440875,  0.47300424,  0.92589573,  0.12016823],
       [ 0.04863678,  0.12421563,  0.44208702,  0.52011922,  0.4823349 ,
         0.27295407,  0.8477118 ,  0.77363518,  0.74753611,  0.01119114],
       [ 0.82594717,  0.33727314,  0.04060328,  0.28458626,  0.9967468 ,
         0.18169722,  0.10745559,  0.74661605,  0.42308565,  0.52056614]])

```

```
D = around(rand(10,10)*10); D
```

```
array([[ 9.,  2.,  8.,  3.,  9.,  1.,  9.,  9.,  1.,  2.],
       [ 8.,  5.,  8.,  3.,  3.,  7.,  2.,  4.,  4.,  8.],
       [ 3.,  5.,  0.,  6.,  9.,  5., 10.,  3.,  4.,  2.],
       [ 3.,  9.,  9.,  9.,  2.,  1.,  8.,  3.,  6.,  1.],
       [ 4.,  8.,  5.,  5.,  1.,  1.,  3.,  1.,  2., 10.],
       [ 8.,  9.,  8.,  7.,  4.,  7.,  9.,  1.,  3.,  6.],
       [ 4.,  5.,  3.,  0.,  9.,  6.,  7.,  6.,  8.,  4.],
       [ 3.,  6.,  6.,  2.,  1.,  7.,  2.,  5.,  4.,  1.],
       [ 6.,  4.,  8.,  9.,  5.,  2.,  8.,  9.,  1.,  9.],
       [ 9.,  8.,  5.,  7.,  6.,  6.,  2.,  5.,  6.,  2.]])
```

```
matrace(B), B.trace()
```

```
(-1, 0.50261872238441196)
```

```
matrace(D), D.trace()
```

```
(46.0, 46.0)
```

```
matrace(D.T), D.T.trace()
```

```
(46.0, 46.0)
```

```
matrace(inv(D)), inv(D).trace()
```

```
(1.2606176554219353, 1.2606176554219353)
```

```
F = array(((1,2,3), (-1,-2,-3), (2,1,0))); F
```

```
array([[ 1,  2,  3],
       [-1, -2, -3],
       [ 2,  1,  0]])
```

```
G = array(((1,2,3), (-1,-2,-3))); G
```

```
array([[ 1,  2,  3],
       [-1, -2, -3]])
```

```
matrace(F), F.trace() ## -1 = error or result?
```

```
(-1, -1)
```

```
matrace(G), G.trace() ## -1 = error or result?
```

```
(-1, -1)
```

Try to use exceptions to indicate an error condition!

```
def matrace(A):
    if A.shape[0] == A.shape[1]: # square matrix
        return sum(A.diagonal())
    else:
        raise ValueError("Not a square matrix. Sorry.")
```

```
matrace(F), F.trace() ## -1 must is result
```

```
(-1, -1)
```

```
matrace(G), G.trace() ## error throws exception
```

```
-----
ValueError                                Traceback (most recent call last)
<ipython-input-17-a14741b5c239> in <module>()
----> 1 matrace(G), G.trace() ## error throws exception

<ipython-input-15-933595dad0e3> in matrace(A)
      3         return sum(A.diagonal())
      4     else:
----> 5         raise ValueError("Not a square matrix. Sorry.")

ValueError: Not a square matrix. Sorry.
```

```
try:
    matrace(G)
except (ValueError):
    print("Exception caught! Calculation of trace didn't work")
```

```
Exception caught! Calculation of trace didn't work
```

```
# this ipython magic command imports pylab and allows the plots to reside within the_
↪ notebook
%pylab inline
```

```
Populating the interactive namespace from numpy and matplotlib
```

The following examples are based on Florian Lhuillier's lecture on Matlab which can be found online:

<http://geophysik.uni-muenchen.de/~lhuillier/teaching/AD2010/>

1.6 Pylab continued ...

1.6.1 Examples based on "... des données sous MATLAB"

```
set_printoptions(precision=2, suppress=True)
```

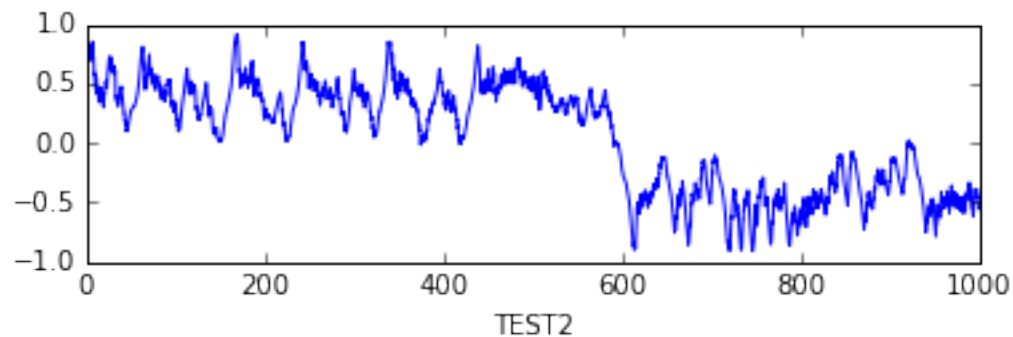
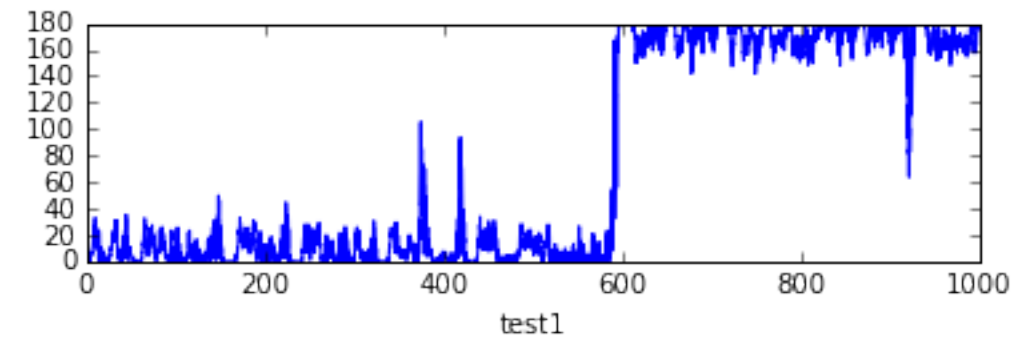
Exercice 1

```
aa = loadtxt('dipole_ref.txt')
```

```
aa.shape
```

```
(21481, 3)
```

```
subplot(211)
plot(aa[:,0], aa[:,1])
xlabel("test1")
subplot(212)
plot(aa[:,0], aa[:,2])
xlabel('TEST2')
subplots_adjust(hspace=.5)
```



Excercise 2

```
aa = loadtxt('dipole_ref.txt')
```

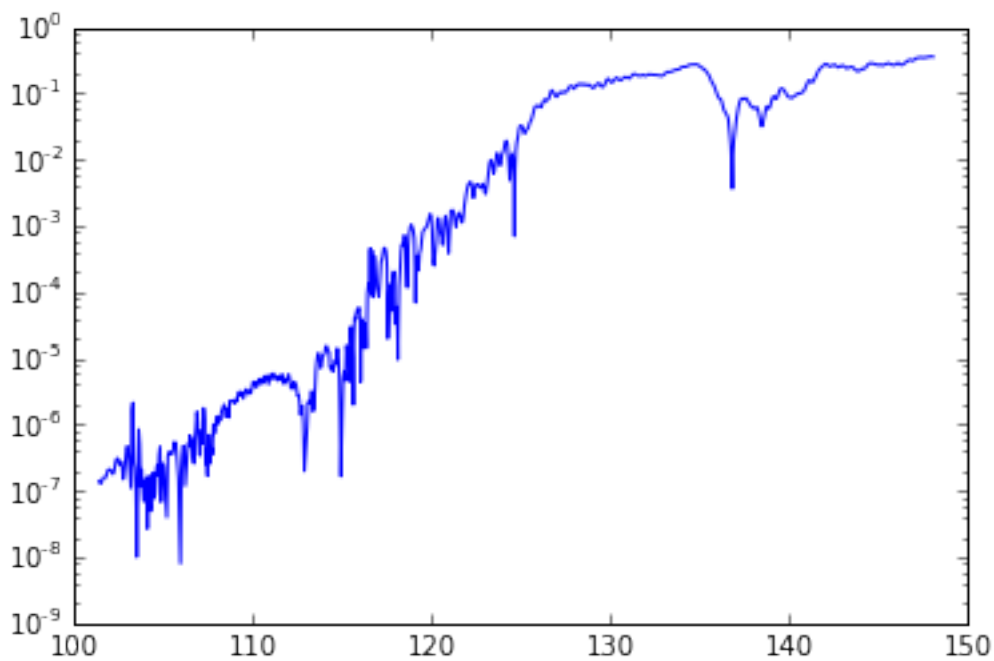
```
bb = loadtxt('dipole_pert.txt')
```

```
t = bb[:,0];
```

```
d = bb[:,2] - interp(t, aa[:,0],aa[:,2]);
```

```
semilogy(t, abs(d))
```

```
[<matplotlib.lines.Line2D at 0x7f911be2add8>]
```

**Excercise 3**

```
d = genfromtxt('spectre.txt', skip_header=1, dtype=None, names=('name', 'number',
↪ 'amplitude'))
```

```
d
```

```
array([(b'a', 1, 9.5960921), (b'b', 2, 9.4450301), (b'c', 3, 7.5000147),
      (b'd', 4, 6.7446755), (b'e', 5, 4.7442346), (b'f', 6, 4.3416987),
      (b'g', 7, 2.9904522), (b'h', 8, 2.3769902), (b'i', 9, 1.8908512),
      (b'j', 10, 1.3387981), (b'k', 11, 1.0044059),
      (b'l', 12, 0.79748122), (b'm', 13, 0.5872564),
      (b'n', 14, 0.48502449), (b'p', 15, 0.34799267),
      (b'q', 16, 0.28167023), (b'r', 17, 0.20974501),
```

(continues on next page)

(continued from previous page)

```
(b's', 18, 0.16570928), (b't', 19, 0.12762576),
(b'u', 20, 0.098378887)],
dtype=[('name', 'S1'), ('number', '<i8'), ('amplitude', '<f8')])
```

```
Y=log(d['amplitude']); Y
```

```
array([ 2.26,  2.25,  2.01,  1.91,  1.56,  1.47,  1.1 ,  0.87,  0.64,
        0.29,  0. , -0.23, -0.53, -0.72, -1.06, -1.27, -1.56, -1.8 ,
       -2.06, -2.32])
```

```
X = array((d['number'], 0*d['number']+1)).T; X
```

```
array([[ 1,  1],
       [ 2,  1],
       [ 3,  1],
       [ 4,  1],
       [ 5,  1],
       [ 6,  1],
       [ 7,  1],
       [ 8,  1],
       [ 9,  1],
       [10,  1],
       [11,  1],
       [12,  1],
       [13,  1],
       [14,  1],
       [15,  1],
       [16,  1],
       [17,  1],
       [18,  1],
       [19,  1],
       [20,  1]])
```

```
X.shape, Y.shape
```

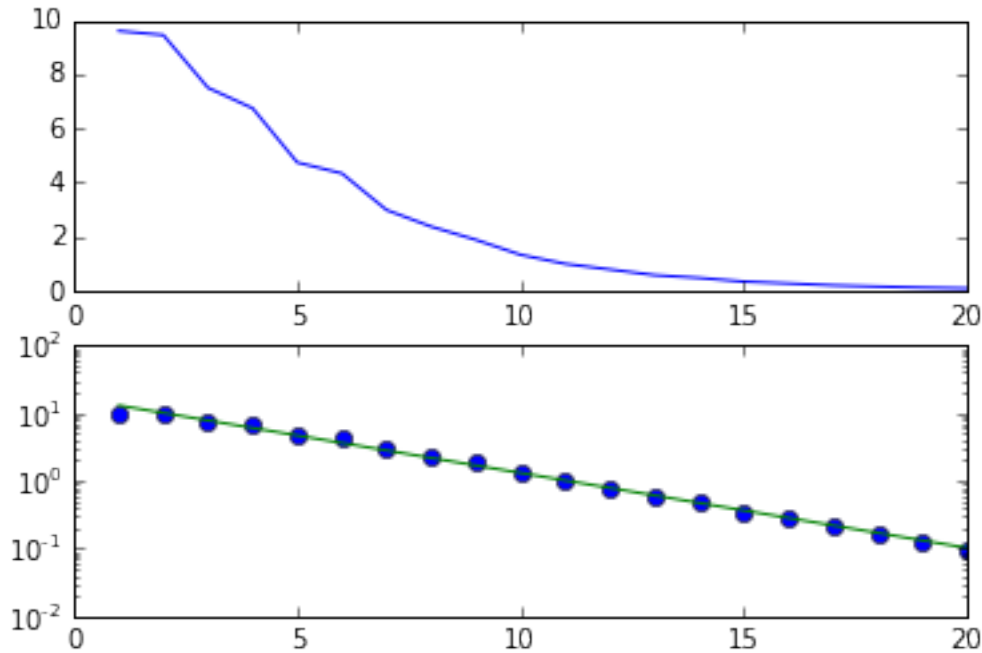
```
((20, 2), (20,))
```

```
A = lstsq(X, Y)[0]; A
```

```
array([-0.25,  2.82])
```

```
subplot(211)
plot(d['number'], d['amplitude'])
subplot(212)
semilogy(d['number'], d['amplitude'], 'o')
semilogy(d['number'], exp(X.dot(A)))
```

```
[<matplotlib.lines.Line2D at 0x7f9119b37ac8>]
```

Excercise 4

```
aa = loadtxt('anomalie.txt')
```

```
nx = len( unique(aa[:,0])); nx
```

```
21
```

```
ny = len( unique(aa[:,1])); ny
```

```
11
```

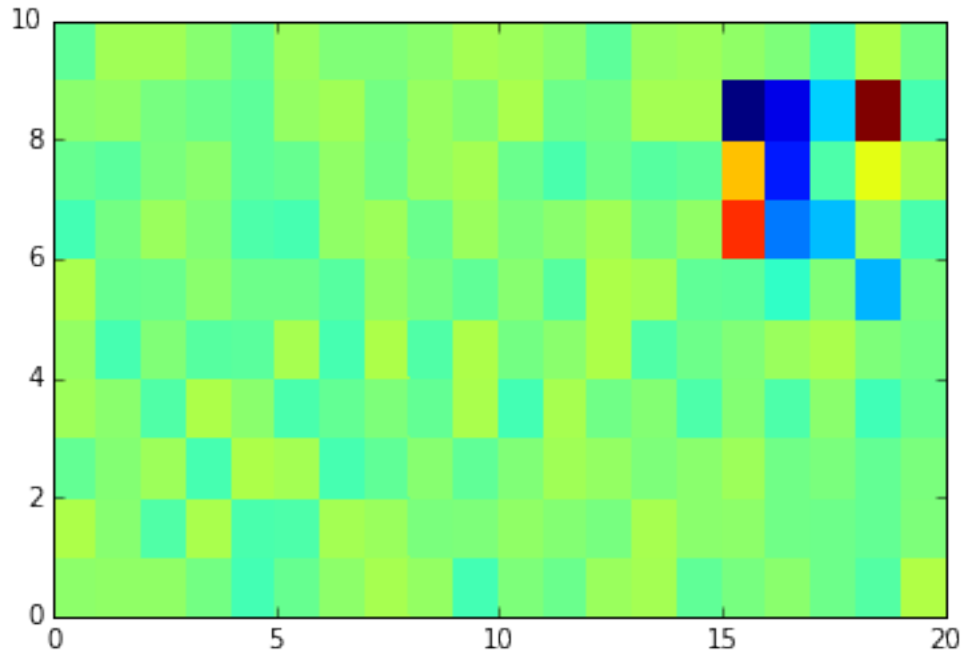
```
X=aa[:,0].reshape((nx, ny));
```

```
Y=aa[:,1].reshape((nx, ny));
```

```
data = aa[:,2].reshape((nx, ny));
```

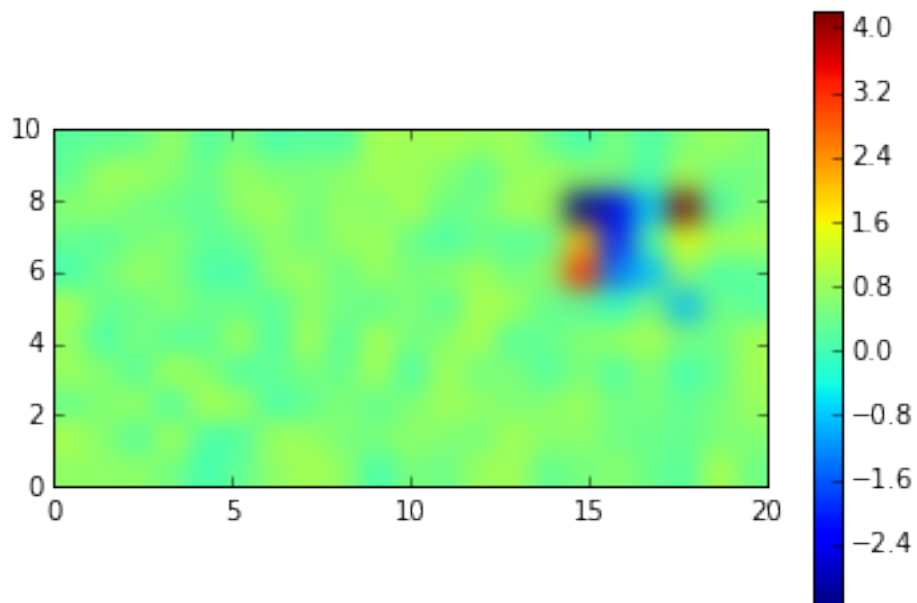
```
pcolor( X, Y, data)
```

```
<matplotlib.collections.PolyCollection at 0x7f9119cbe278>
```



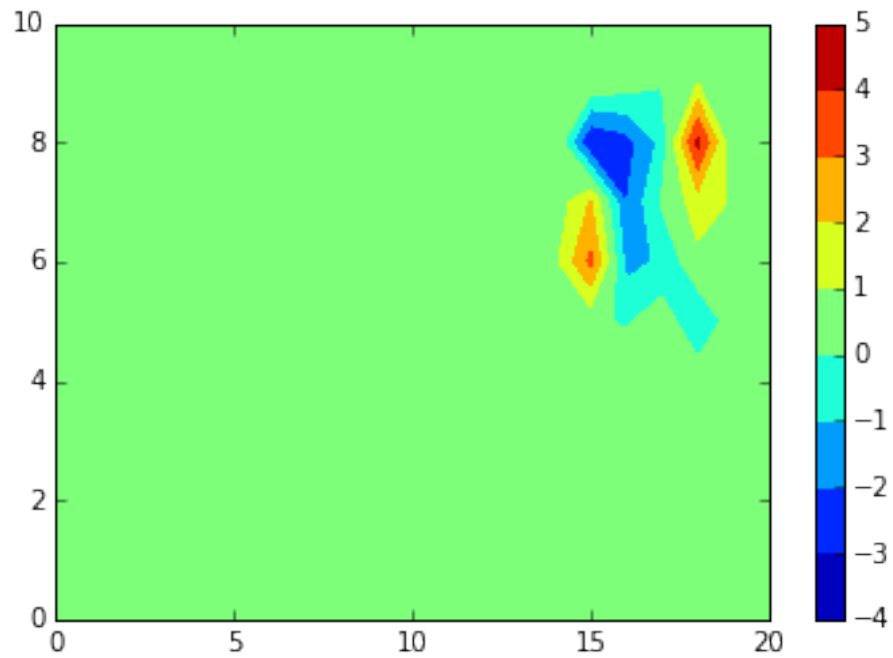
```
imshow(data.T,
        extent=[X.min(), X.max(), Y.min(), Y.max()],
        interpolation='gaussian', origin='lower')
colorbar()
```

```
<matplotlib.colorbar.Colorbar at 0x7f9119b30ef0>
```



```
contourf( X, Y, data)
colorbar()
```

```
<matplotlib.colorbar.Colorbar at 0x7f9119d93470>
```

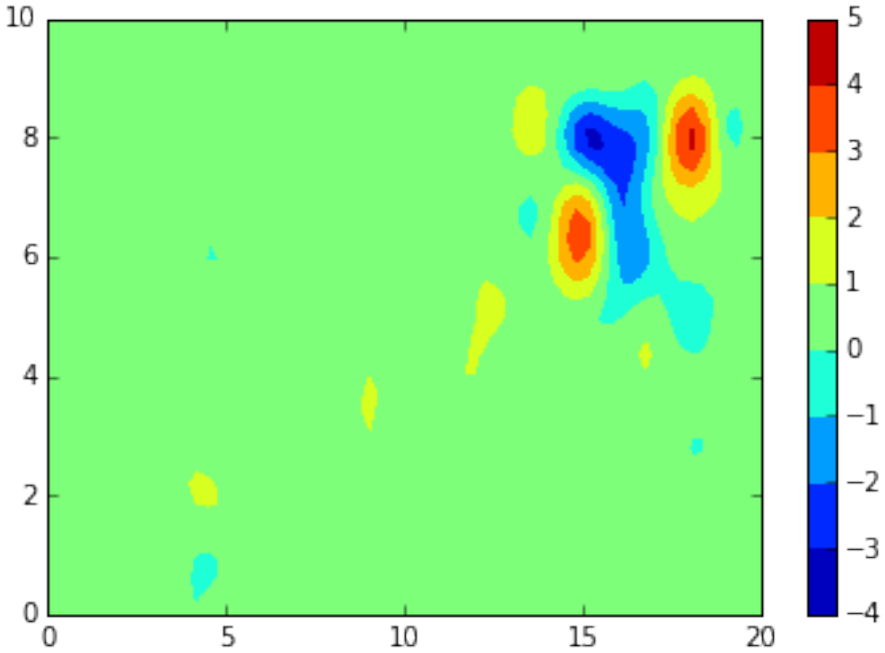


```
from scipy.ndimage import zoom
```

```
data = array(zoom(data,3)).T
```

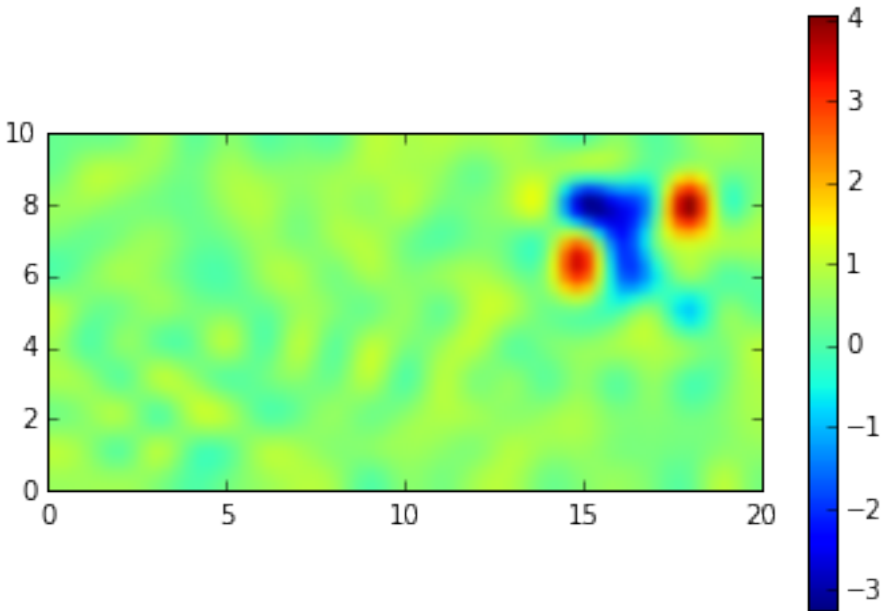
```
contourf(data, extent=[X.min(), X.max(), Y.min(), Y.max()])  
colorbar()  
#axis("equal")
```

```
<matplotlib.colorbar.Colorbar at 0x7f9116fb7be0>
```



```
imshow(data,  
       extent=[X.min(), X.max(), Y.min(), Y.max()],  
       interpolation='gaussian', origin='lower', aspect=1)  
colorbar()
```

```
<matplotlib.colorbar.Colorbar at 0x7f9116ef5240>
```



1.7 Object Oriented Programming (OOP)

OOP allows you to encapsulate specific behaviour into so called classes. Instances of those classes can be used to write intuitive program code. Below is an example using classes defined in rock.py to create instances of fruits and rocks and to determine their cumulative weight on a scale. Classes can represent real world objects as in this example but also abstract things like a button in a graphical user interface or a list with special sorting algorithms.

Normally you would import the classes from the module rock like this:

```
#from rock import Rock, Sediment, MagneticMatter, MagneticSediment, Scale, Fruit
```

Alternatively you can use the magic %load command to get the whole file into this ipython notebook:

```
# %load rock.py
# object oriented programming with Python
# Michael Wack 2015

class Fruit:
    def __init__(self, weight):
        self.weight = weight

    def __repr__(self):
        return( "fruit with weight {:.2e}".format( self.weight))

class Rock:
    # class variable
    rockcounter=0

    @classmethod
    def BlueRock(cls, weight, volume):
        return cls( color="blue", weight=weight, volume=volume)

    @staticmethod
    def density( weight, volume):
        return weight / volume

    def __init__(self, color, weight, volume=11e-6):
        self.color = color
        self.weight = weight # SI: kg
        self.volume = volume # SI: m^3

        Rock.rockcounter += 1
        self.no = Rock.rockcounter

        print("{} . rock created".format(Rock.rockcounter))

    def calculate_density(self):
        return Rock.density( self.weight, self.volume) # SI: kg / m^3

    def __repr__(self):
        return( "{} rock (No {}) with a density of {:.2f}".format( self.color, self.
↪no, self.calculate_density()))
```

(continues on next page)

(continued from previous page)

```

class Sediment( Rock):
    def __init__(self, color, weight, volume=11e-6, grainsize=0):
        super().__init__(color, weight, volume)

        self.grainsize = grainsize

    def double_grainsize(self):
        self.grainsize *= 2

    def __repr__(self):
        return ( "{} sediment (No {}) with a density of {:.2e} and a grainsize of {:.
↪2e}").format( self.color, self.no, self.calculate_density(), self.grainsize)

class MagneticMatter(): # all volume normalized
    def __init__(self, magnetization=0, susceptibilitiy=0):
        self.magnetization = magnetization # Am^2 / m^3 = A/m
        self.susceptibility = susceptibilitiy # volume normalized -> no units

    def induced_magnetization(self, external_field_H): # SI A/m
        return self.susceptibility * external_field_H

    def total_magnetization(self, external_field_H): # SI A/m
        return self.induced_magnetization(external_field_H) + self.magnetization

class MagneticSediment( MagneticMatter, Sediment):
    def __init__(self, color, weight, volume, grainsize=0, magnetization=0, ↪
↪susceptibility=0):
        MagneticMatter.__init__( self, magnetization, susceptibility)
        Sediment.__init__( self, color, weight, volume)

    def magnetic_moment(self):
        return self.magnetization * self.volume

# class to determine weight of other object instances
class Scale():
    def __init__(self, weight_limit=100):
        self.weight_limit = weight_limit
        self.instances = []

    def put_on(self, inst):
        if inst in self.instances:
            print("{} is already on scale.".format(inst))
        else:
            self.instances.append(inst)
            print("{} placed on scale.".format(inst))

    def take_off(self, inst):
        try:
            self.instances.remove(inst)
            print("{} removed.".format(inst))

```

(continues on next page)

(continued from previous page)

```

    except KeyError:
        print("{} was not on scale.".format(inst))

    @property
    def weight(self):
        weight = 0
        for i in self.instances:
            weight += i.weight
        if weight > self.weight_limit:
            print("Scale overloaded.")

        return weight

```

```
apple = Fruit(weight=0.2)
```

```
apple
```

```
fruit with weight 2.00e-01
```

```
my_first_rock = Rock(color='red', weight=10)
```

```
1. rock created
```

```
my_first_rock
```

```
red rock (No 1) with a density of 909090.91
```

```
my_second_rock = Sediment(color='yellow', weight=12)
```

```
2. rock created
```

```
blue_rock = Rock.BlueRock(weight=3, volume = 0.1)
```

```
3. rock created
```

```
blue_rock
```

```
blue rock (No 3) with a density of 30.00
```

```
my_last_rock = MagneticSediment(color='purple', weight=1, volume=0.01,
↳magnetization=1e-3, susceptibility=5e-3)
```

```
4. rock created
```

```
my_last_rock.induced_magnetization(external_field_H = 40)
```

```
0.2
```

```
my_last_rock.total_magnetization(external_field_H = 40)
```

```
0.201
```

```
myscale = Scale(weight_limit = 20)
```

```
myscale
```

```
<__main__.Scale at 0x7f45b01a36d8>
```

```
myscale.put_on( blue_rock)
```

```
blue rock (No 3) with a density of 30.00 placed on scale.
```

```
myscale.weight
```

```
3
```

```
myscale.put_on( my_second_rock)
```

```
yellow sediment (No 2) with a density of 1.09e+06 and a grainsize of 0.00e+00 placed_  
↪on scale.
```

```
myscale.weight
```

```
15
```

```
myscale.put_on( my_second_rock)
```

```
yellow sediment (No 2) with a density of 1.09e+06 and a grainsize of 0.00e+00 is_  
↪already on scale.
```

```
myscale.weight
```

```
15
```

```
myscale.put_on( my_first_rock)
```

```
red rock (No 1) with a density of 909090.91 placed on scale.
```

```
myscale.weight
```

```
Scale overloaded.
```

```
25
```

```
myscale.take_off( blue_rock)
```



```
blue rock (No 3) with a density of 30.00 removed.
```

```
myscale.weight
```

```
Scale overloaded.
```

```
22
```

1.8 MagWire

As a first example how to use the modules and concepts that we have seen so far, we will develop two python classes that allow the calculation of magnetic fields generated by an arbitrary electric current geometry. This is done by exploiting the law of Biot-Savart.

The source code including some examples is available [here](#).

The first class Wire is found in wire.py. It represents a continuous path for an electrical current (i.e. a wire). The path is specified as a sequence of 3D coordinates. The member property discretized_path returns the original path with linearly interpolated segments shorter than the specified discretization length.

```

1  __author__ = 'wack'
2
3  # part of the magwire package
4
5  # calculate magnetic fields arising from electrical current through wires of
6  ↪arbitrary shape
7  # with the law of Biot-Savart
8
9  # written by Michael Wack
10 # wack@geophysik.uni-muenchen.de
11
12 # tested with python 3.4.3
13
14 from copy import deepcopy
15 import numpy as np
16 try:
17     import visvis as vv
18     visvis_avail = True
19 except ImportError:
20     visvis_avail = False
21     print("visvis not found.")
22
23 class Wire:
24     '''
25     represents an arbitrary 3D wire geometry
26     '''
27     def __init__(self, current=1, path=None, discretization_length=0.01):
28         '''
29
30         :param current: electrical current in Ampere used for field calculations
31         :param path: geometry of the wire specified as path of n 3D (x,y,z) points in
32         ↪a numpy array with dimension n x 3
33             length unit is meter

```

(continues on next page)

(continued from previous page)

```

33     :param discretization_length: length of dL after discretization
34     """
35     self.current = current
36     self.path = path
37     self.discretization_length = discretization_length
38
39
40     @property
41     def discretized_path(self):
42         """
43         calculate end points of segments of discretized path
44         approximate discretization length is given by self.discretization_length
45         elements will never be combined
46         elements longer than self.discretization_length will be divided into pieces
47         :return: discretized path as m x 3 numpy array
48         """
49
50         try:
51             return self.dpath
52         except AttributeError:
53             pass
54
55         self.dpath = deepcopy(self.path)
56         for c in range(len(self.dpath)-2, -1, -1):
57             # go backwards through all elements
58             # length of element
59             element = self.dpath[c+1]-self.dpath[c]
60             el_len = np.linalg.norm(element)
61             npts = int(np.ceil(el_len / self.discretization_length)) # number of
↪parts that this element should be split up into
62             if npts > 1:
63                 # element too long -> create points between
64                 # length of new sub elements
65                 sel = el_len / float(npts)
66                 for d in range(npts-1, 0, -1):
67                     self.dpath = np.insert(self.dpath, c+1, self.dpath[c] + element /
↪el_len * sel * d, axis=0)
68
69             return self.dpath
70
71     @property
72     def IdL_r1(self):
73         """
74         calculate discretized path elements dL and their center point r1
75         :return: numpy array with I * dL vectors, numpy array of r1 vectors (center
↪point of element dL)
76         """
77         npts = len(self.discretized_path)
78         if npts < 2:
79             print("discretized path must have at least two points")
80             return
81
82         IdL = np.array([self.discretized_path[c+1]-self.discretized_path[c] for c in
↪range(npts-1)]) * self.current
83         r1 = np.array([(self.discretized_path[c+1]+self.discretized_path[c])*0.5 for
↪c in range(npts-1)])
84

```

(continues on next page)

(continued from previous page)

```

85     return IdL, r1
86
87
88     def vv_plot_path(self, discretized=True, color='r'):
89         if not visvis_avail:
90             print("plot path works only with visvis module")
91             return
92
93         if discretized:
94             p = self.discretized_path
95         else:
96             p = self.path
97
98         vv.plot(p, ms='x', mc=color, mw='2', ls='-', mew=0)
99
100
101     def mpl3d_plot_path(self, discretized=True, show=True, ax=None, plt_style='-r'):
102
103         if ax is None:
104             fig = plt.figure(None)
105             ax = ax3d.Axes3D(fig)
106
107         if discretized:
108             p = self.discretized_path
109         else:
110             p = self.path
111
112         ax.plot(p[:, 0], p[:, 1], p[:, 2], plt_style)
113         ax.set_xlabel('X')
114         ax.set_ylabel('Y')
115         ax.set_zlabel('Z')
116
117         # make all axes the same
118         #max_a = np.array((p[:, 0], p[:, 1], p[:, 2])).max()
119
120         #ax.set_xlim3d(min(p[:, 0]), max_a)
121         #ax.set_ylim3d(min(p[:, 1]), max_a)
122         #ax.set_zlim3d(min(p[:, 2]), max_a)
123
124
125         if show:
126             plt.show()
127
128         return ax
129
130     def ExtendPath(self, path):
131         """
132         extends existing path by another one
133         :param path: path to append
134         """
135         if self.path is None:
136             self.path = path
137         else:
138             # check if last point is identical to avoid zero length segments
139             if self.path[-1] == path[0]:
140                 self.path=np.append(self.path, path[1:], axis=1)
141             else:

```

(continues on next page)

```

142         self.path=np.append(self.path, path, axis=1)
143
144     def Translate(self, xyz):
145         '''
146         move the wire in space
147         :param xyz: 3 component vector that describes translation in x,y and z
↳direction
148         '''
149         if self.path is not None:
150             self.path += np.array(xyz)
151
152         return self
153
154     def Rotate(self, axis=(1,0,0), deg=0):
155         '''
156         rotate wire around given axis by deg degrees
157         :param axis: axis of rotation
158         :param deg: angle
159         '''
160         if self.path is not None:
161             n = axis
162             ca = np.cos(np.radians(deg))
163             sa = np.sin(np.radians(deg))
164             R = np.array([[n[0]**2*(1-ca)+ca, n[0]*n[1]*(1-ca)-n[2]*sa, n[0]*n[2]*(1-
↳ca)+n[1]*sa],
165                         [n[1]*n[0]*(1-ca)+n[2]*sa, n[1]**2*(1-ca)+ca, n[1]*n[2]*(1-
↳ca)-n[0]*sa],
166                         [n[2]*n[0]*(1-ca)-n[1]*sa, n[2]*n[1]*(1-ca)+n[0]*sa,
↳n[2]**2*(1-ca)+ca]])
167             self.path = np.dot(self.path, R.T)
168
169         return self
170
171
172
173     # different standard paths
174     @staticmethod
175     def LinearPath(pt1=(0, 0, 0), pt2=(0, 0, 1)):
176         return np.array([pt1, pt2]).T
177
178     @staticmethod
179     def RectangularPath(dx=0.1, dy=0.2):
180         dx2 = dx/2.0; dy2 = dy/2.0
181         return np.array([[dx2, dy2, 0], [dx2, -dy2, 0], [-dx2, -dy2, 0], [-dx2, dy2,
↳0], [dx2, dy2, 0]]).T
182
183     @staticmethod
184     def CircularPath(radius=0.1, pts=20):
185         return Wire.EllipticalPath(rx=radius, ry=radius, pts=pts)
186
187     @staticmethod
188     def SinusoidalCircularPath(radius=0.1, amplitude=0.01, frequency=10, pts=100):
189         t = np.linspace(0, 2 * np.pi, pts)
190         return np.array([radius * np.sin(t), radius * np.cos(t), amplitude * np.
↳cos(frequency*t)]).T
191
192     @staticmethod

```

(continues on next page)

(continued from previous page)

```

193 def EllipticalPath(rx=0.1, ry=0.2, pts=20):
194     t = np.linspace(0, 2 * np.pi, pts)
195     return np.array([rx * np.sin(t), ry * np.cos(t), 0]).T
196
197 @staticmethod
198 def SolenoidPath(radius=0.1, pitch=0.01, turns=30, pts_per_turn=20):
199     return Wire.EllipticalSolenoidPath(rx=radius, ry=radius, pitch=pitch,
↳turns=turns, pts_per_turn=pts_per_turn)
200
201 @staticmethod
202 def EllipticalSolenoidPath(rx=0.1, ry=0.2, pitch=0.01, turns=30, pts_per_turn=20):
203     t = np.linspace(0, 2 * np.pi * turns, pts_per_turn * turns)
204     return np.array([rx * np.sin(t), ry * np.cos(t), t / (2 * np.pi) * pitch]).T
205

```

The second class BiotSavart performs the actual calculations. An arbitrary number Wire class instances can be added to define the current distribution in space. The member function CalculateB accepts a list of 3D coordinates and returns a list of 3D vectors corresponding to the B field at those points

```

1  __author__ = 'wack'
2
3  # part of the magwire package
4
5  # calculate magnetic fields arising from electrical current through wires of
↳arbitrary shape
6  # with the law of Biot-Savart
7
8  # written by Michael Wack
9  # wack@geophysik.uni-muenchen.de
10
11 # tested with python 3.4.3
12
13
14 import numpy as np
15 import time
16 #import multiprocessing as mp
17 from matplotlib import pyplot as plt
18 import mpl_toolkits.mplot3d.axes3d as ax3d
19
20 class BiotSavart:
21     '''
22     calculates the magnetic field generated by currents flowing through wires
23     '''
24
25     def __init__(self, wire=None):
26         self.wires = []
27         if wire is not None:
28             self.wires.append(wire)
29
30     def AddWire(self, wire):
31         self.wires.append(wire)
32
33     def CalculateB(self, points):
34         """
35         calculate magnetic field B at given points
36         :param points: numpy array of n points (xyz)

```

(continues on next page)

(continued from previous page)

```

37     :return: numpy array of n vectors representing the B field at given points
38     """
39
40     print("found {} wire(s)".format(len(self.wires)))
41     c = 0
42     # generate list of IdL and r1 vectors from all wires
43     for w in self.wires:
44         c += 1
45         _IdL, _r1 = w.IdL_r1
46         print("wire {} has {} segments".format(c, len(_IdL)))
47         if c == 1:
48             IdL = _IdL
49             r1 = _r1
50         else:
51             IdL = np.vstack((IdL, _IdL))
52             r1 = np.vstack((r1, _r1))
53     print("total number of segments: {}".format(len(IdL)))
54     print("number of field points: {}".format(len(points)))
55     print("total number of calculations: {}".format(len(points)*len(IdL)))
56
57     # now we have
58     # all segment vectors multiplied by the flowing current in IdL
59     # and all vectors to the central points of the segments in r1
60
61     # calculate vector B*1e7 for each point in space
62     t1 = time.process_time()
63     # simple list comprehension to calculate B at each point r
64     B = np.array([BiotSavart._CalculateB1(r, IdL, r1) * 1e-7 for r in points])
65
66     # multi processing
67     # slower than single processing?
68     #pool = mp.Pool(processes=16)
69     #B = np.array([pool.apply(_CalculateB1, args=(r, IdL, r1)) for r in points])
70
71     t2 = time.process_time()
72     print("time needed for calculation: {} s".format(t2-t1))
73
74     return B
75
76     def vv_PlotWires(self):
77         for w in self.wires:
78             w.vv_plot_path()
79
80     def mpl3d_PlotWires(self, ax):
81         for w in self.wires:
82             w.mpl3d_plot_path(show=False, ax=ax)
83
84
85
86
87     @staticmethod
88     def _CalculateB1(r, IdL, r1):
89         '''
90         calculate magnetic field B for one point r in space
91         :param r: 3 component numpy array representing the location where B will be
↳calculated
92         :param IdL: all segment vectors multiplied by the flowing current

```

(continues on next page)

(continued from previous page)

```

93     :param r1: all vectors to the central points of the segments
94     :return: numpy array of 3 component vector of B multiplied by 1e7
95     '''
96
97     # calculate law of biot savart for all current elements at given point r
98     r2 = r - r1
99     r25 = np.linalg.norm(r2, axis=1)**3
100    r3 = r2 / r25[:, np.newaxis]
101
102    cr = np.cross(IdL, r3)
103
104    # calculate sum of contributions from all current elements
105    s = np.sum(cr, axis=0)
106
107    return s
108
109
110

```

solenoid_demo.py demonstrates the calculation and plotting of B fields generated by a simple solenoid.

```

1  __author__ = 'wack'
2
3  # part of the magwire package
4
5  # calculate magnetic fields arising from electrical current through wires of
6  ↪ arbitrary shape
7  # with the law of Biot-Savart
8
9  # written by Michael Wack 2015
10 # wack@geophysik.uni-muenchen.de
11
12 # tested with python 3.4.3
13
14 # some basic calculations for testing
15
16 import numpy as np
17 import matplotlib.pyplot as plt
18 import wire
19 import biotsavart
20
21 # simple solenoid
22 # approximated analytical solution:  $B = \mu_0 * I * n / l = 4\pi * 1e-7 [T*m/A] * 100 [A] * \frac{10}{0.5 [m]} = 2.5mT$ 
23 ↪
24
25 w = wire.Wire(path=wire.Wire.SolenoidPath(pitch=0.05, turns=10), discretization_
26 ↪ length=0.01, current=100).Rotate(axis=(1, 0, 0), deg=90) #.Translate((0.1, 0.1, 0)).
27 sol = biotsavart.BiotSavart(wire=w)
28
29 resolution = 0.04
30 volume_corner1 = (-.2, -.8, -.2)
31 volume_corner2 = (.2+1e-10, .3, .2)
32
33 # matplotlib plot 2D
34 # create list of xy coordinates

```

(continues on next page)

(continued from previous page)

```

34 grid = np.mgrid[volume_corner1[0]:volume_corner2[0]:resolution, volume_
   ↪corner1[1]:volume_corner2[1]:resolution]
35
36 # create list of grid points
37 points = np.vstack(map(np.ravel, grid)).T
38 points = np.hstack([points, np.zeros([len(points),1])])
39
40 # calculate B field at given points
41 B = sol.CalculateB(points=points)
42
43
44 Babs = np.linalg.norm(B, axis=1)
45
46 # remove big values close to the wire
47 cutoff = 0.005
48
49 B[Babs > cutoff] = [np.nan,np.nan,np.nan]
50 #Babs[Babs > cutoff] = np.nan
51
52 for ba in B:
53     print(ba)
54
55 #2d quiver
56 # get 2D values from one plane with Z = 0
57
58 fig = plt.figure()
59 ax = fig.gca()
60 ax.quiver(points[:, 0], points[:, 1], B[:, 0], B[:, 1], scale=.15)
61 X = np.unique(points[:, 0])
62 Y = np.unique(points[:, 1])
63 cs = ax.contour(X, Y, Babs.reshape([len(X), len(Y)]).T, 10)
64 ax.clabel(cs)
65 plt.xlabel('x')
66 plt.ylabel('y')
67 plt.axis('equal')
68 plt.show()
69
70
71 # matplotlib plot 3D
72
73 grid = np.mgrid[volume_corner1[0]:volume_corner2[0]:resolution*2, volume_
   ↪corner1[1]:volume_corner2[1]:resolution*2, volume_corner1[2]:volume_
   ↪corner2[2]:resolution*2]
74
75 # create list of grid points
76 points = np.vstack(map(np.ravel, grid)).T
77
78 # calculate B field at given points
79 B = sol.CalculateB(points=points)
80
81 Babs = np.linalg.norm(B, axis=1)
82
83 fig = plt.figure()
84 # 3d quiver
85 ax = fig.gca(projection='3d')
86 sol.mpl3d_PlotWires(ax)
87 ax.quiver(points[:, 0], points[:, 1], points[:, 2], B[:, 0], B[:, 1], B[:, 2],
   ↪length=0.04)

```

(continues on next page)

(continued from previous page)

```

88 plt.show()
89
90
91

```

1.9 SymPy

SymPy (<http://www.sympy.org/>) is a Python module for symbolic mathematics. It's similar to commercial computer algebra systems like Maple or Mathematica.

1.9.1 Usage

Web service

SymPy live <http://live.sympy.org/>

SymPy gamma <http://sympygamma.com/>

Python Module

SymPy can be installed, imported and used like any other regular Python module.

Output can be done as nicely formatted LaTeX. This is a great way to get more complicated formulae into your manuscript instead of hassling with nested LaTeX commands. Right click on the outputted formula in any ipython notebook or the above mentioned web services to extract the corresponding LaTeX commands.

1.9.2 Basic Examples

```

%matplotlib inline
from sympy import *

```

```

Value error parsing header in AFM: b'UnderlinePosition' b'-133rUnderlineThickness_
↪20rVersion 7.000'

```

`init_printing()` activates nicely formatted LaTeX output within an ipython notebook.

```
init_printing()
```

Symbols

Mathematical variables have to be defined as symbols before usage

```

x = Symbol('x')
type(x)

```

```
sympy.core.symbol.Symbol
```

```
(pi + x)**2
```

$$(x + \pi)^2$$

A short form of Symbol is S. Both can be used to define several symbols at once.

```
x, y, z = S('x, y, z')
```

```
x**2+y**2+z**2
```

$$x^2 + y^2 + z^2$$

Fractions

Fractions of numbers must be defined with Rational. Otherwise the numbers will be evaluated as a Python expression resulting in a regular Python floating point number.

```
4/7 # regular python division
```

0.5714285714285714

```
r1 = Rational(4,7) # sympy rational
r1
```

$$\frac{4}{7}$$

```
r2 = x/y # since x and y are already sympy symbols no explicit Rational definition is
↳required
r2
```

$$\frac{x}{y}$$

```
r1*r2+1
```

$$\frac{4x}{7y} + 1$$

Complex Numbers

The imaginary unit is noted as I in sympy.

```
1+I
```

$$1 + i$$

```
I**2
```

$$-1$$

```
simplify((1+I)**2)
```

$$2i$$

Numeric evaluation

```
r1.evalf(100)
```

0.5714285714285714285714285714285714285714285714285714285714285714285714285714285714285714285714285714285714

```
pi.evalf(100)
```

3.141592653589793238462643383279502884197169399375105820974944592307816406286208998628034825342117068

Substitution

```
f1 = x**2+x**3
```

subs can be used to evaluate a function at a specific point

```
f1.subs(x, 2)
```

12

or to substitute expressions

```
a=S('a')
```

```
f1.subs(x, a)
```

$$a^3 + a^2$$

```
f2 = f1.subs(x, sqrt(a))
f2
```

$$a^{\frac{3}{2}} + a$$

```
f2.subs(a, 1)
```

2

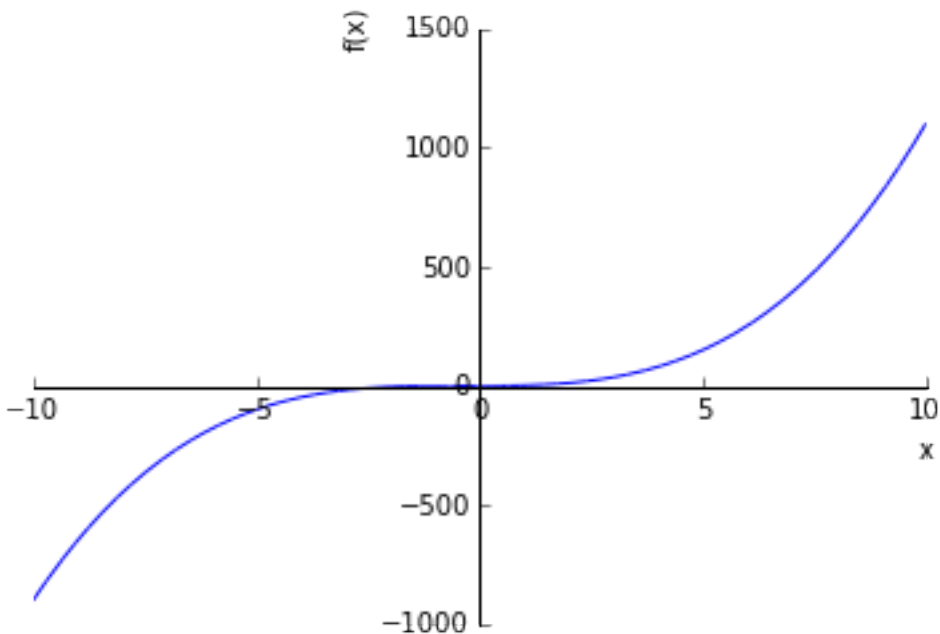
Plotting

```
from sympy.plotting import plot
```

```
f1
```

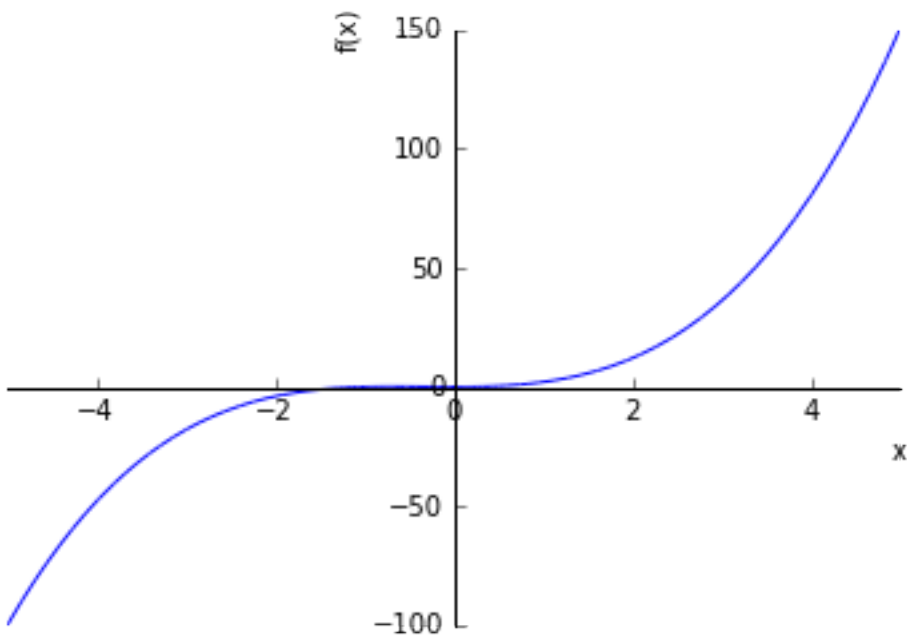
$$x^3 + x^2$$

```
plot(f1)
```



```
<sympy.plotting.plot.Plot at 0x7f1b3125a5f8>
```

```
plot(f1, (x, -5, 5))
```

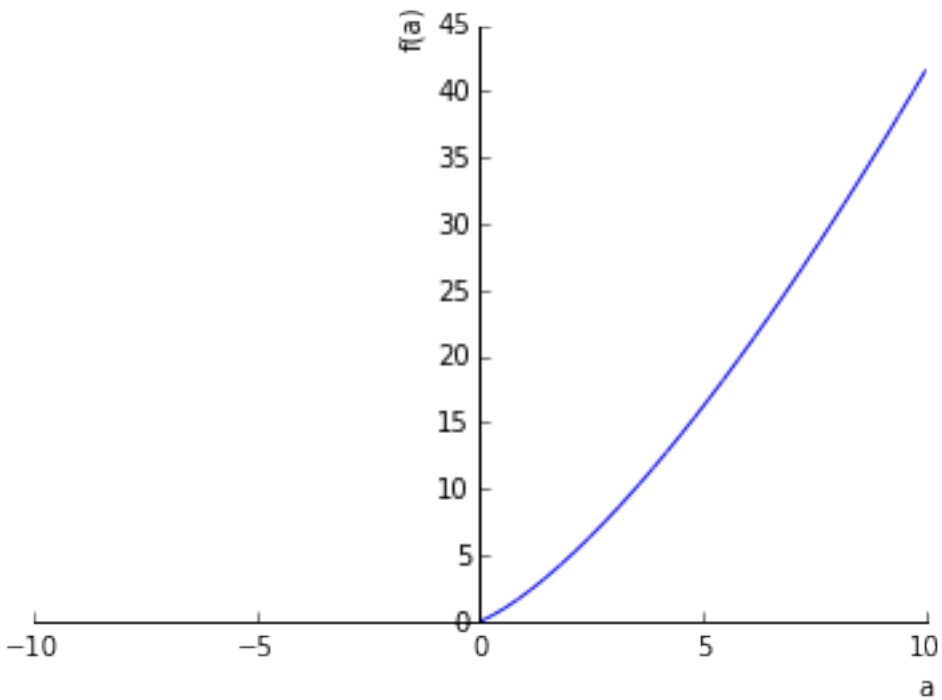


```
<sympy.plotting.plot.Plot at 0x7f1b11812e48>
```

```
f2
```

$$a^{\frac{3}{2}} + a$$

```
plot(f2)
```



```
<sympy.plotting.plot.Plot at 0x7f1b117e2898>
```

Simplification

```
x, y = S('x, y')
eq = (x**3 + x**2 - x - 1) / (x**2 + 2*x + 1)
eq
```

$$\frac{x^3 + x^2 - x - 1}{x^2 + 2x + 1}$$

```
simplify(eq)
```

$$x - 1$$

```
simplify(sin(x)**2 + cos(x)**2)
```

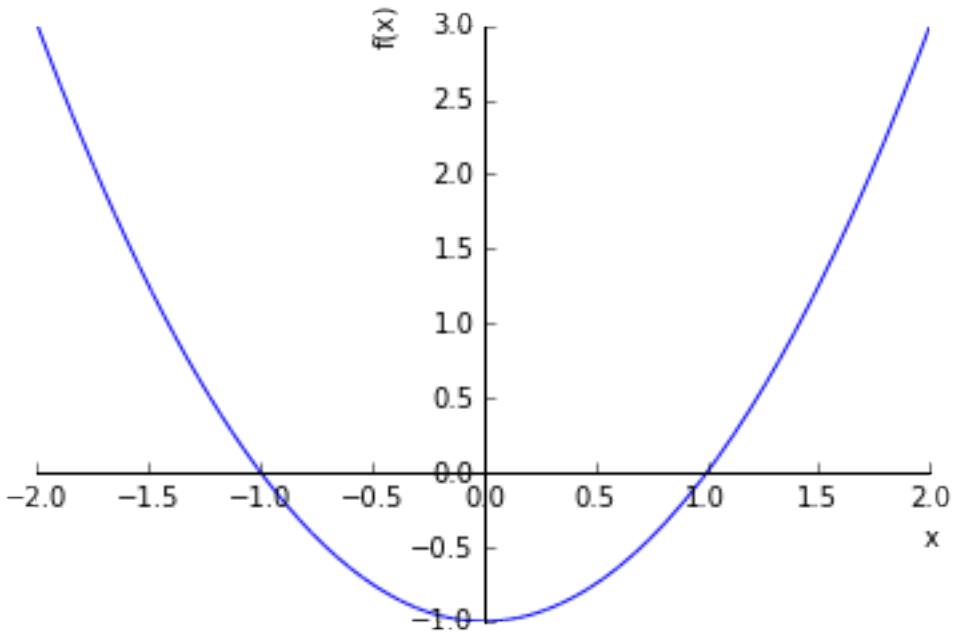
$$1$$

Solving equations

```
x = S('x')
eq = x**2 - 1
eq
```

$$x^2 - 1$$

```
plot(eq, (x, -2, +2))
```



```
<sympy.plotting.plot.Plot at 0x7f1b117665f8>
```

```
solve(eq, x)
```

$$[-1, 1]$$

```
eq = 2*x*y + y**2/2
```

```
solve(eq, y)
```

$$[0, -4x]$$

Differentiate

```
diff(2*x*y + y**2/2, y)
```

$$2x + y$$

Integrate

```
integrate(2*x*y + y**2/2, y)
```

$$xy^2 + \frac{y^3}{6}$$

Matrices

unity matrix

```
eye(10)
```

$$\begin{bmatrix} 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 \end{bmatrix}$$

```
m11, m12, m21, m22 = symbols("m11, m12, m21, m22")
b1, b2 = symbols("b1, b2")
```

```
A = Matrix([[m11, m12],[m21, m22]])
A
```

$$\begin{bmatrix} m_{11} & m_{12} \\ m_{21} & m_{22} \end{bmatrix}$$

```
b = Matrix([[b1], [b2]])
b
```

$$\begin{bmatrix} b_1 \\ b_2 \end{bmatrix}$$

```
A**2
```

$$\begin{bmatrix} m_{11}^2 + m_{12}m_{21} & m_{11}m_{12} + m_{12}m_{22} \\ m_{11}m_{21} + m_{21}m_{22} & m_{12}m_{21} + m_{22}^2 \end{bmatrix}$$

```
A * b
```

$$\begin{bmatrix} b_1 m_{11} + b_2 m_{12} \\ b_1 m_{21} + b_2 m_{22} \end{bmatrix}$$

A.det()

$$m_{11}m_{22} - m_{12}m_{21}$$

A.inv()

$$\begin{bmatrix} \frac{1}{m_{11}} + \frac{m_{12}m_{21}}{m_{11}^2(m_{22} - \frac{m_{12}m_{21}}{m_{11}})} & -\frac{m_{12}}{m_{11}(m_{22} - \frac{m_{12}m_{21}}{m_{11}})} \\ -\frac{m_{21}}{m_{11}(m_{22} - \frac{m_{12}m_{21}}{m_{11}})} & \frac{1}{m_{22} - \frac{m_{12}m_{21}}{m_{11}}} \end{bmatrix}$$

1.9.3 Example: Calculate determinant of matrices in a loop

```
from IPython.display import display

#b01a01
A = Matrix( [[2,2,-5],[5,4,1],[4,14,3]]) # assign matrix to variable A
B = Matrix( [[1,2,3],[0,4,5],[0,0,6]]) # assign matrix to variable B
C = Matrix( [[1,2,-1,2],[-3,5,-5,-2],[5,4,3,-4],[-4,-3,5,5]]) # assign matrix to
↳variable C

# show the result for each matrix
for M in (A, B, C):
    print( 'The determinant of matrix')
    display(M)
    print(' is ')
    display(M.det())
```

The determinant of matrix

$$\begin{bmatrix} 2 & 2 & -5 \\ 5 & 4 & 1 \\ 4 & 14 & 3 \end{bmatrix}$$

is

$$-296$$

The determinant of matrix

$$\begin{bmatrix} 1 & 2 & 3 \\ 0 & 4 & 5 \\ 0 & 0 & 6 \end{bmatrix}$$

is

$$24$$

The determinant of matrix

$$\begin{bmatrix} 1 & 2 & -1 & 2 \\ -3 & 5 & -5 & -2 \\ 5 & 4 & 3 & -4 \\ -4 & -3 & 5 & 5 \end{bmatrix}$$

```
is
```

1050

1.9.4 Example: Calculate Eigenvalues and Eigenvectors

```
a,b,c,d = S('a,b,c,d')
A = Matrix( [[a,b], [c,d]])
A
```

$$\begin{bmatrix} a & b \\ c & d \end{bmatrix}$$

```
A.eigenvals()
```

$$\left\{ \frac{a}{2} + \frac{d}{2} - \frac{1}{2}\sqrt{a^2 - 2ad + 4bc + d^2} : 1, \quad \frac{a}{2} + \frac{d}{2} + \frac{1}{2}\sqrt{a^2 - 2ad + 4bc + d^2} : 1 \right\}$$

```
A.eigenvects()
```

$$\left[\left(\frac{a}{2} + \frac{d}{2} - \frac{1}{2}\sqrt{a^2 - 2ad + 4bc + d^2}, \quad 1, \quad \left[\left[-\frac{\frac{a}{2} - \frac{d}{2} + \frac{1}{2}\sqrt{a^2 - 2ad + 4bc + d^2}}{1} \right] \right] \right), \left(\frac{a}{2} + \frac{d}{2} + \frac{1}{2}\sqrt{a^2 - 2ad + 4bc + d^2}, \quad 1, \quad \left[\left[\frac{\frac{a}{2} - \frac{d}{2} + \frac{1}{2}\sqrt{a^2 - 2ad + 4bc + d^2}}{1} \right] \right] \right) \right]$$

```
B = A.subs((a,1), (d,1))
B
```

$$\begin{bmatrix} 1 & b \\ c & 1 \end{bmatrix}$$

```
B.eigenvals()
```

$$\left\{ -\sqrt{bc} + 1 : 1, \quad \sqrt{bc} + 1 : 1 \right\}$$

```
B.eigenvects()
```

$$\left[\left(-\sqrt{bc} + 1, \quad 1, \quad \left[\left[-\frac{b}{\sqrt{bc}} \right] \right] \right), \left(\sqrt{bc} + 1, \quad 1, \quad \left[\left[\frac{b}{\sqrt{bc}} \right] \right] \right) \right]$$

1.10 PyCharm IDE

PyCharm is a state of the art IDE (Integrated Development Environment) for Python maintained by the company JetBrains (<http://www.jetbrains.com>).

It provides a code editor with syntax highlighting and many additional tools that help efficient software development. Layout, color schemes and keymaps are highly customizable to fit your own preferences.

Some of the most useful features are:

- Concurrent code analysis with error highlighting, code completion
- Navigation within your code: file / project structure views and direct jumping to definition of classes and functions
- Context aware refactoring (e.g. renaming a variable but not its name within a string literal)
- Integrated Python Debugger
- Version Control Systems
- Unit Testing

Official Tutorial:

<https://confluence.jetbrains.com/display/PYH/Getting+Started+with+PyCharm>

1.11 pandas

Pandas is a module for Python to manipulate and analyze tabular data. It allows easy reading and writing to different file formats (including MS Excel).

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
%matplotlib inline
```

1.11.1 working with Excel data

```
myexcel = pd.read_excel("pandas_test.xlsx", sheetname="mydata", skiprows=2)
```

```
myexcel
```

```
myexcel[['sample', 'weight']]
```

calculations with rows:

```
myexcel['density'] = myexcel['weight'] / myexcel['volume']
```

save pandas dataframe back to an excel file

```
myexcel.to_excel('new_excel_file.xlsx')
```

and a text file

```
myexcel.to_csv('new_excel_file.csv', sep='\t')
```

1.11.2 intermagnet data

Data from magnetic observatories all over the world can be downloaded here:

<http://www.intermagnet.org/data-donnee/download-eng.php>

we start by reading in the file downloaded from intermagnet in IAGA2002 format

```
clf = pd.read_csv("clf20160202vsec.sec", skiprows=22, sep='\s+')
```

```
clf
```

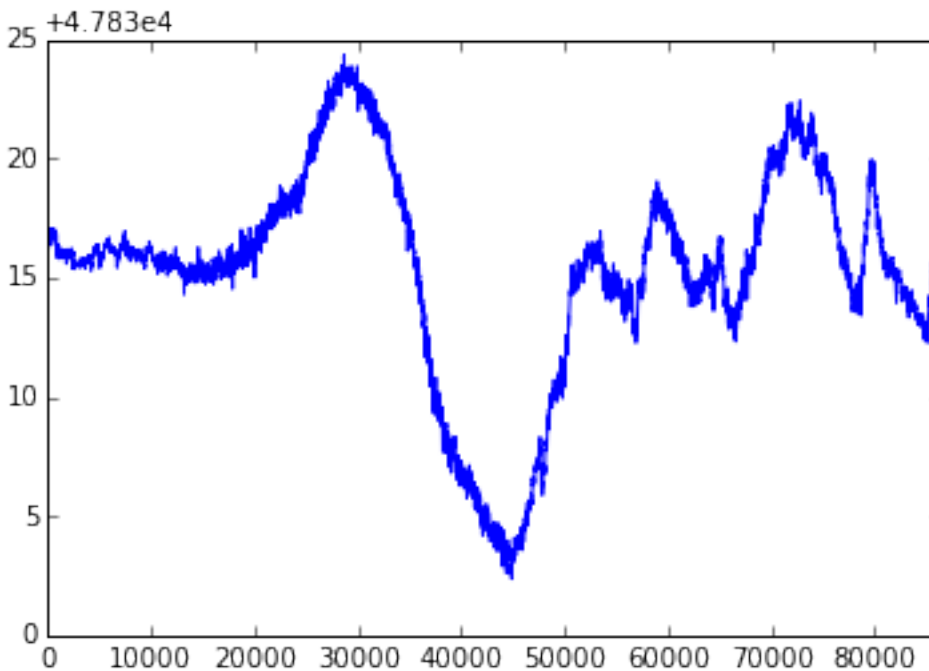
```
clf.dtypes
```

```
DATE      object
TIME      object
DOY       int64
CLFX      float64
CLFY      float64
CLFZ      float64
CLFF      float64
|         float64
dtype: object
```

plot single column

```
clf['CLFF'].plot()
```

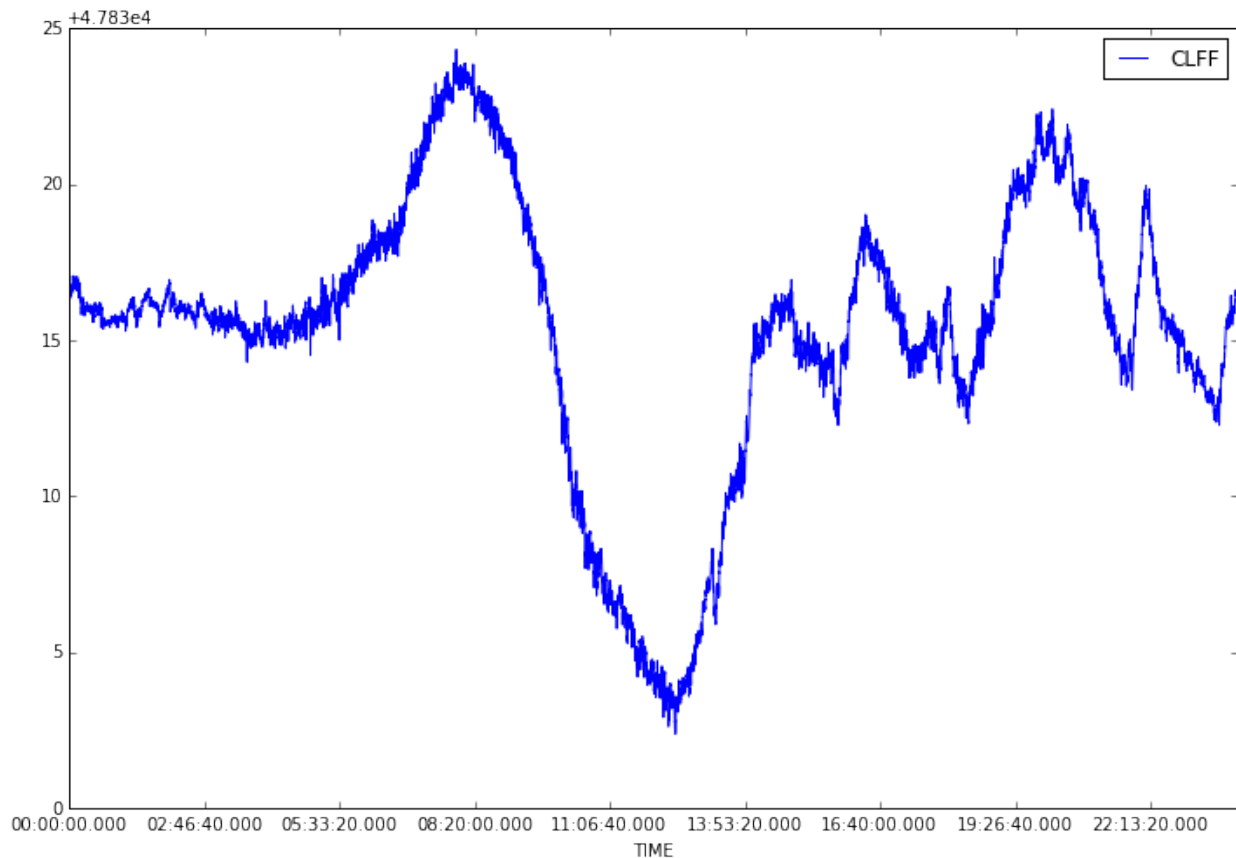
```
<matplotlib.axes._subplots.AxesSubplot at 0x97f59b0>
```



plot specific columns

```
clf.plot(x='TIME', y='CLFF', figsize=(12,8))
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x93d2710>
```

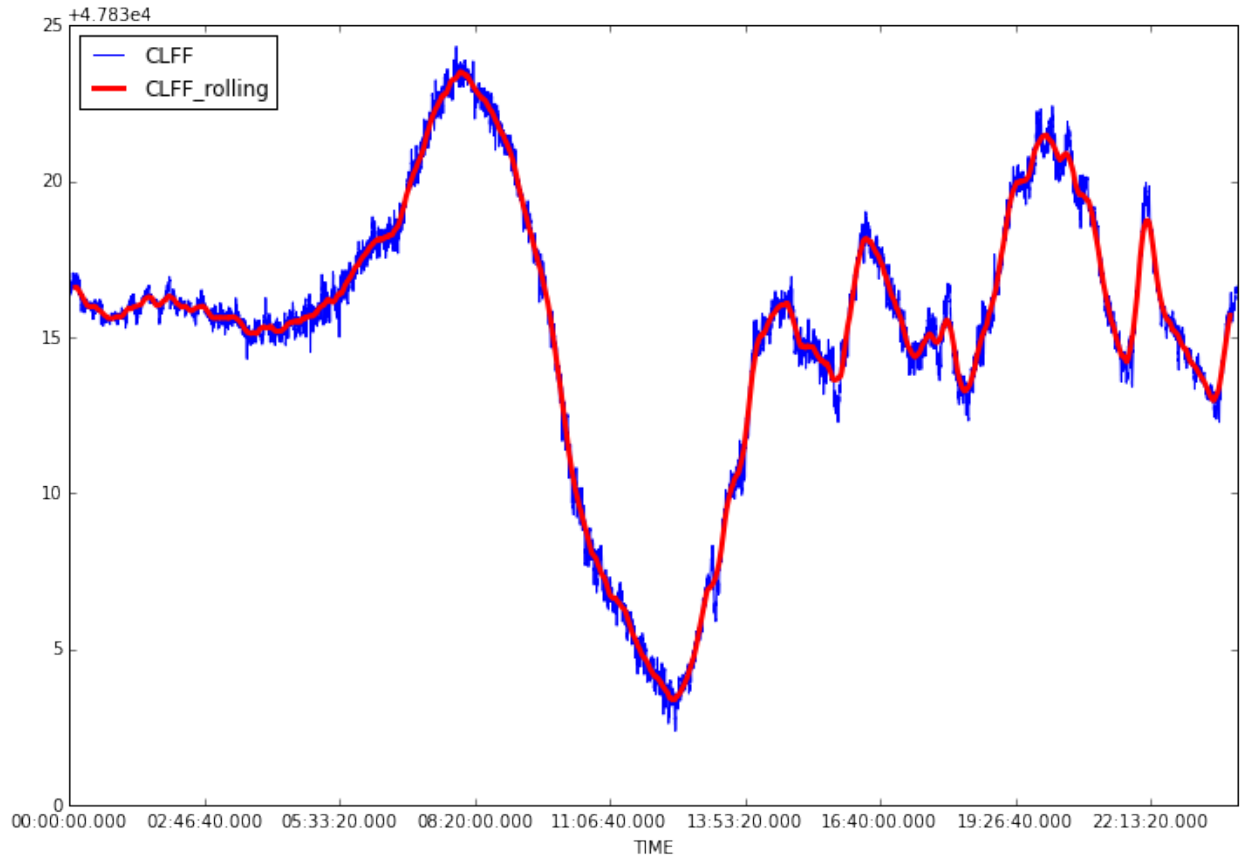


add a rolling mean

```
clf['CLFF_rolling'] = pd.rolling_mean( clf['CLFF'], window=1000, center=True)
```

```
clf.loc[490:530]
```

```
ax = clf.plot(x='TIME', y='CLFF', figsize=(12,8))
clf.plot(ax=ax, x='TIME', y='CLFF_rolling', color='r', linewidth=3)
plt.show()
```



DOWNLOADS:

All available ipython notebooks and source code can be found [here](#)

This documentation is also available in [pdf format](#)