

# Time series analysis in neuroscience

# **Outline / overview**

- **Section 1.** Data types and basic operations
- Section 2. IPython console
- Section 3. Packages
- Section 4. Debugging

## Time series analysis in neuroscience

#### Motivation

- Do **not afraid** to do programming, because everyone can do it. Often, you do not need to have advance level to accomplish your tasks.
- Improve your skills to make programming quick and efficient.
- **Use** programming on a daily basis in your projects and tasks.
- Remember that lectures are for **YOU**, so do not hesitate to ask questions.

**Section 1. Data types and basic operations** 

### I. Data types / number, string, list

#### **Purpose**

• Use of different type of information. For instance,

**See**, "L02\_variable\_types.py"

Optimization of execution time and memory allocation. For instance, np.int8 (1 byte) vs. np.float64 (8 bytes)

# II. Multiple executions / for, while

#### **Purpose**

- Repeat the same piece of code many times. For instance, n = n + 1 (10 times)
- Automation, i.e., automatic handling of indexed arrays. For instance, EEG[session][trial][sample]
- Data acquisition or time-dependent experiment. For instance, acquire data each 1 ms or show stimulus each 1 second

#### **Pitfalls**

- Array indexing: loops in Python are slow. For instance, y[n] = np.log(x[n] \*\* 2) vs. y = np.log(x[0:100000] \*\* 2);
   second command is almost twice faster
- Infinite loop: when the stop condition is always false

### II. Multiple executions / for, while

### **Example**

```
# parameters
  N = 10
  # loop "for"
  for n in range(0, N):
    print('%d' % (n))
 # loop "while"
  n = 0
  while n < N + 1: # do while condition is true
    print('%d' % (n))
    n = n + 1
 # nested loops
  conditions = ('C1', 'C2', 'C3')
  epochs = np.arange(0, 10)
  channels = [1, 2, 3, 4, 5]
  for condition in conditions:
    for epoch in epochs:
      for channel in channels:
See, "LO2 loops.py"
```

### III. Conditional execution / if, elif, else

### **Purpose**

- Conditional handling of execution steps. For instance, special cases, exceptions, etc.
- Comparison operators: == (equal), != (not equal), > (more), >= (more or equal), ...
- Logical operators: and, or, not

#### **Pitfalls**

• Self-excluding conditions. For instance, a < 0 and b > 0 and a > b

### III. Conditional execution / if, elif, else

### Example

```
# if, else
N = 10
for n in range(0, N):
    print("n = %d" % (n))
    if n >= 7:
        break # keyword
    elif n < 3:
        continue # keyword
    else:
        m = n * n;
    print("m = %d" % (m))</pre>
See, "L02_if_else.py"
```

### IV. Functions / def

#### **Purpose**

- Compact code and better readability
- Reuse of standard functions (e.g., load data, specific preprocessing, etc.)
- Modularity of the code: easy to add new functionality and easy to test

#### **Pitfalls**

- Number of functions: there should be a balance between length of the code and the number of functions.
   Functions execute slower than the linear code.
- Order and types of input and output parameters: always check the usage of function. For instance, function?
- Naming: function should have a meaningful name. For instance, "func\_1" vs. "remove\_mean", "removeMean",
   "RemoveMean"

### IV. Functions / def

### **Example**

```
def add(nStudents, n):
    nStudents = nStudents + n
    return nStudents
def L02_main():
    nStudents = 15
    # print message
    print('There are %d students in the class before add()' % (nStudents))
    # call sub-function
    nStudents = add(nStudents, 5)
    # print message
    print('There are %d students in the class after add()' % (nStudents))
if ___name__ == '___main___':
    L02_main()
See, "L02_functions.py", "L02_sub_functions.py"
```

## V. Classes and objects / class

### **Purpose**

- Encapsulation, i.e., properties and methods (functions) are accessible only by an object. For instance, object **Obj** from class A has access only to properties of class A, not class B. Obj = np.array((1, 2, 3)), Obj.max(), not Obj.fft()
- Inheritance, i.e., build specific classes from a class with common properties. For instance, classes **cat** and **dog** have many similar properties (e.g., name, color, etc.), and these properties can be implemented in a parent class **animal**
- Polymorphism, i.e., method has same name in all subclasses but class specific implementation. For instance, **animal** is a superclass (parent class) of subclasses **cat** and **dog**. The **animal** class has shared animal attributes (e.g., name, color, etc.) but abstract method **talk**() is implemented in the classes **cat** and **dog** differently. We can use cat.color() and cat.talk() in the same way as dog.color() and dog.talk()

#### **Pitfalls**

• Too many classes and subclasses to implement a simple data analysis approach

### V. Classes and objects / class

```
Example (1/2)
  class Student():
      # init
      def __init__(self, firstname, surname, ID):
          self.firstname = firstname
          self.surname = surname
          self.ID = ID
          self.grade = 0
      # print_info
      def print_info(self):
          print("%s %s, ID: %d, grade: %d" % (self.firstname, self.surname, \
                                               self.ID, self.grade)
      # get_ID
      def get_ID(self):
          return self.ID
      # set_grade
      def set_grade(self, grade):
          self.grade = grade
  See, "L02 classes and objects.py"
```

### V. Classes and objects / class

#### Example (2/2)

```
# create object
  tStudentA = Student('Muhammad', 'Lee', 123456)
  tStudentB = Student(firstname='Lena', surname='Wu', ID=234567)
  tStudentC = Student(ID=345678, surname='Chang', firstname='Max')
  # list of objects
  tStudentList = [tStudentA, tStudentB, tStudentC]
  # print info
  tStudentList[1].print_info()
  # set grade
  tStudentList[1].set_grade(5)
  # print info
  tStudentList[1].print_info()
See, "LO2 classes and objects.py"
```

# **VI. File operations**

### **Purpose**

Write and read data

#### **Pitfalls**

- Unspecified file format
- Multiple access to files

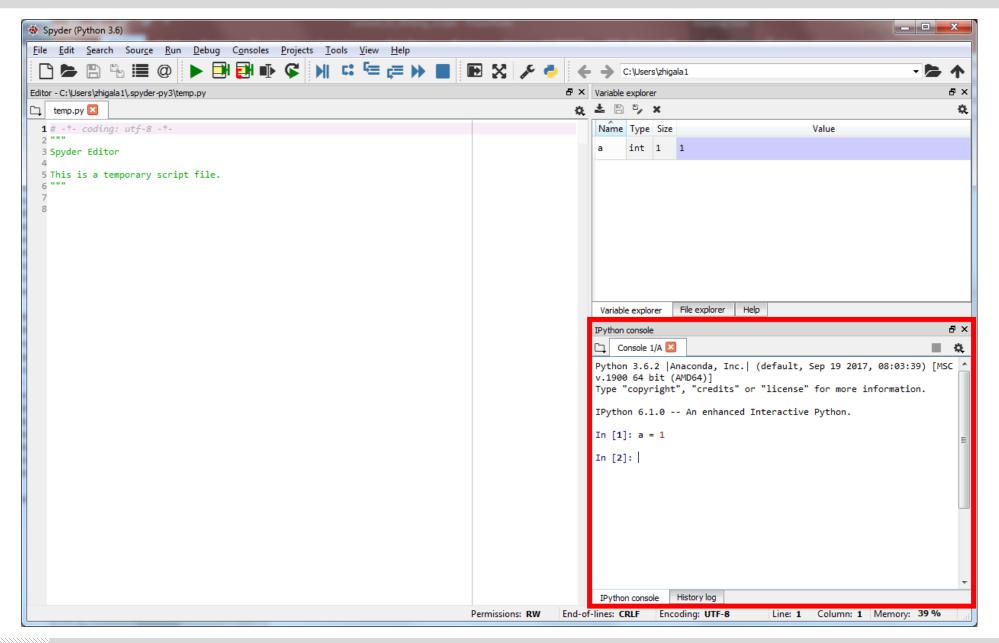
### **VI. File operations**

#### Example

```
# text to write
   aLine1 = 'Line 1\n'
   aLine2 = 'Line 2\n'
   # write text to file
   hFile = open('output.txt', 'w')
   hFile.write(aLine1) # write text to file
   hFile.write(aLine2) # add second line
   hFile.close() # close file
   # read text from file
   hFile = open('output.txt', 'r')
   aLines = hFile.read() # read text from file
   print(aLines) # print file content
   hFile.close() # close file
See, "L02_text_files.py"
```

**Section 2. IPython console** 

# Time series analysis in neuroscience



### Console

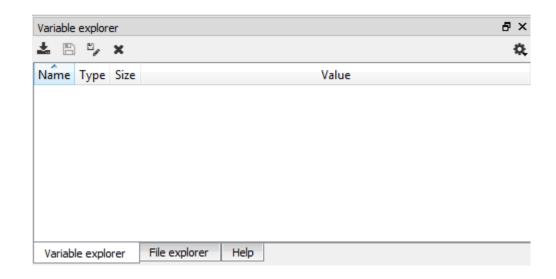
Quick and simple calculations.

#### **Useful commands**

- Restart kernel, "Ctrl + ."
- Clear variable in workspace, del variable
- Clear console, clear

## Example 1



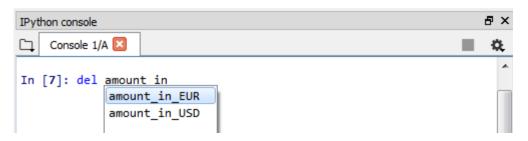


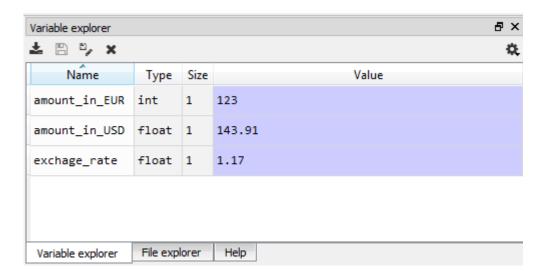
### **Example 2**

- variable name is case sensitive, i.e., amountInEur is not the same as amountineur
- variables should be meaningful, e.g., amount in EUR instead of j



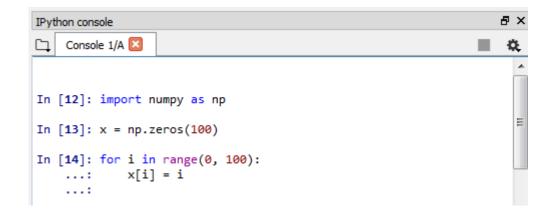
button "Tab" does autocompletion

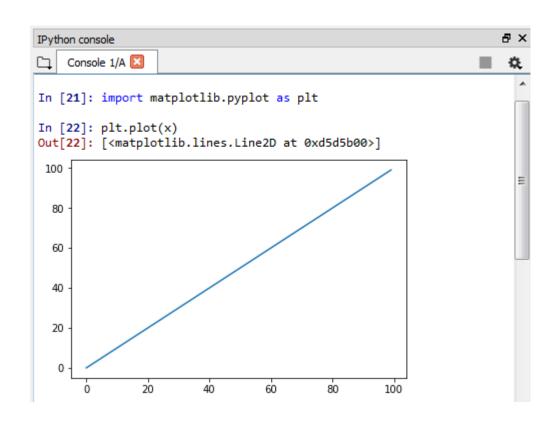




### Example 3

- "import numpy as np" and "import numpy" is the same as "np.zeros(10)" and "numpy.zeros(10)"
- import matplotlib.pyplot as plt





how to get a function parameters? For instance, np.linspace?

**Section 3. Packages** 

### numpy

https://docs.scipy.org/doc/numpy-dev/user/quickstart.html

```
import numpy as np
# vector
a = np.array([1,2,3,4])
a = np.array((1,2,3,4))
# matrix
b = np.zeros([3,4])
# arange
b = np.arange(10,30,5) \# (start, stop, step)
# random
b = np.random.random((2,3))
# reshape
c = np.arange(12).reshape(3,4)
# min, max, sum, abs
np.min(a), np.max(a), np.sum(a), np.abs()
```

```
# indexing
a = np.array([1,2,3,4])
# first item of array
a[0] = 1
# last item of array
a[3] = a[-1] = 4
# first two items: [0, 1, 2), 2 is not included
a[0:2] = a[:2]
# last two items
a[2:4] = a[-2:]
# first and third items two items
a[0:3:2] = a[::2] = a[start, stop, step]
# items in reverse order
a[-1::-1] = a[::-1]
```

### scipy

https://docs.scipy.org/doc/scipy-0.18.1/reference/tutorial/index.html

```
# interpolation
  from scipy.interpolate import interp1d
  f = interp1d(x, y, kind='cubic') # interpolation
  u = f(xnew) # interpolated data
See, "L02 scipy interpolate.py"
  # Fourier transform
  from scipy.fftpack import fft
  x = np.linspace(0.0, N*T, N)
  y = np.sin(50.0 * 2.0 * np.pi * x) + 0.5 * np.sin(80.0 * 2.0 * np.pi * x)
  u = fft(y)
See, "L02 scipy interpolate.py"
  # filter
  from scipy import signal
  b, a = signal.butter(4, [30.0 / (fs / 2), 60.0 / (fs / 2)], 'bandpass')
  u = signal.filtfilt(b, a, y)
See, "LO2 scipy filter.py"
```

Section 3 Packages

### matplotlib

https://matplotlib.org/examples/

https://matplotlib.org/api/pyplot\_summary.html

https://matplotlib.org/api/ as gen/matplotlib.pyplot.plot.html#matplotlib.pyplot.plot

https://matplotlib.org/users/pyplot\_tutorial.html

from matplotlib.pyplot import plot

```
plot(x, y)  # plot x and y using default line style and color
plot(x, y, 'bo') # plot x and y using blue circle markers
plot(y) # plot y using x as index array 0..N-1
plot(y, 'r+') # ditto, but with red plusses
```

Section 3 Packages

#### scikit-learn

http://scikit-learn.org/stable/

http://scikit-learn.org/stable/supervised\_learning.html#supervised-learning / classification

http://scikit-learn.org/stable/modules/clustering.html#clustering / clustering

http://scikit-learn.org/stable/modules/decomposition.html#decompositions / dimensionality reduction (PCA, ICA)

```
from sklearn.svm import SVC

# create and fit model
model = SVC(kernel='linear')
model.fit(X, y)

# predict
u = model.predict(Z)
u = u > 0.5

# accuracy
a = np.mean(y == u)

See, "LO2_scipy_svm.py"
```

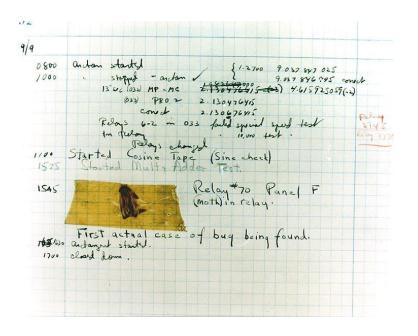
Section 3 Packages

**Section 4. Debugging** 

# **Debugging**

### What is the debugging process?

The name **debug** comes from a real life story, a bug (moth) stuck in a relay and thereby impeding operation.

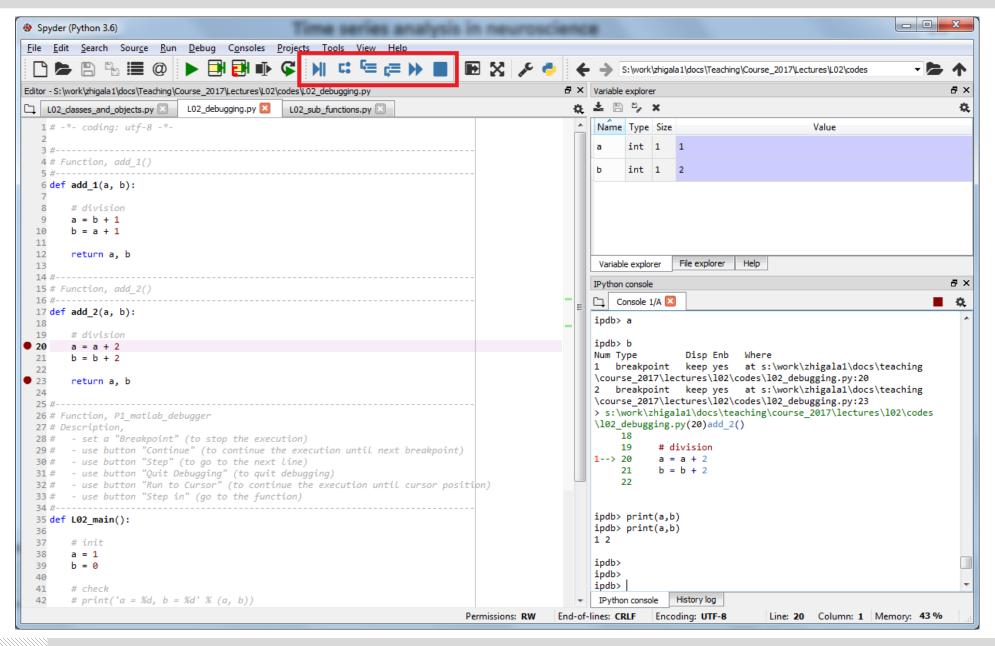


### Why is it important?

Program should handle errors / report all possible problems (warnings), especially, at the development stage.

Section 4 Debugging

# Time series analysis in neuroscience



# Literature

# Time series analysis in neuroscience

- Python programming language
- Downey A., "Think Python" (<a href="http://greenteapress.com/wp/think-python-2e/">http://greenteapress.com/wp/think-python-2e/</a>), see "materials/L02\_thinkpython2.pdf"
- <a href="http://www.scipy-lectures.org/">http://www.scipy-lectures.org/</a>, see "materials/L02\_ScipyLectures.pdf"
- Beazley and Jones, "Python Cookbook"
- Bressert E., "SciPy and NumPy: An Overview for Developers"
- <a href="http://science-it.aalto.fi/scip/pysc-fall-2016/">http://science-it.aalto.fi/scip/pysc-fall-2016/</a>, "Python for scientific computing" (slides)