

# Python Scientific Computing

## - numpy, scipy, matplotlib -

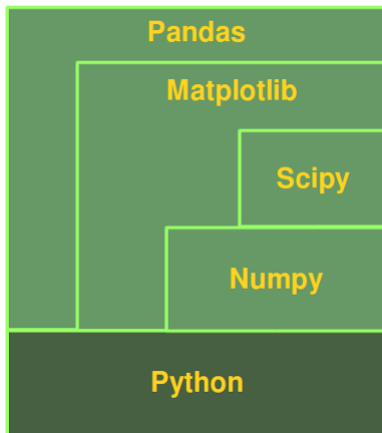
2017 - 2019

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## Related library around numpy



❖ **Pandas** (Python Data Analysis Library) is a software library written for the Python programming language for data manipulation and analysis

❖ **Matplotlib**

- ◆ Data visualization routine package for Python
- ◆ It provides MATLAB-like plotting functionality

❖ **PyLab**

- ◆ Plotting library (along with Matplotlib & SciPy)

❖ **SciPy**

- ◆ Scientific Python
- ◆ It adds even more MATLAB-like functionalities to Python (scientific algorithms)

❖ **NumPy**

- ◆ It is numerical Python package
- ◆ It is a library for the Python programming language, adding support for large, multi-dimensional arrays and matrices, along with a large collection of high-level mathematical functions to operate on these arrays. (array mathematics)

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## Installation on Python virtualenv

❖ Check status and version of additional packages

```
(my_python)$ pip list | grep <package_name>
```

❖ Install numpy if not installed yet

```
(my_python)$ pip install numpy
```

❖ Install matplotlib if not installed yet

```
(my_python)$ pip install matplotlib
```

❖ Install scipy if not installed yet

```
(my_python)$ pip install scipy
```

❖ If there are any errors while installing additional packages, just install TensorFlow as follows.

```
(my_python)$ pip install --upgrade tfBinaryURL
```

**tfBinaryURL** for Tensorflow CPU only with Python 2.7:

[https://storage.googleapis.com/tensorflow/linux/cpu/tensorflow-1.2.1-cp27-none-linux\\_x86\\_64.whl](https://storage.googleapis.com/tensorflow/linux/cpu/tensorflow-1.2.1-cp27-none-linux_x86_64.whl)

This may need following packages beforehand.

```
$ sudo apt-get install libpng-dev
```

```
$ sudo apt-get install libfreetype6-dev
```

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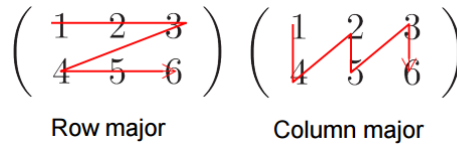
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# Numpy

❑ Numpy provides *multidimensional array object* and tools for working with these array.

❑ Numpy array: a grid of values, *all of the same type*.

- ◆ Indexing element: a tuple of nonnegative integer, i.e., 0, 1, ...
- ◆ **Rank** of the array: number of dimensions
- ◆ **Shape** of the array: a tuple of integers of the size of the array along each dimension
- ◆ Row or line major array
  - ❖ **row-major: C, python**
  - ❖ column-major: Fortran, matlab



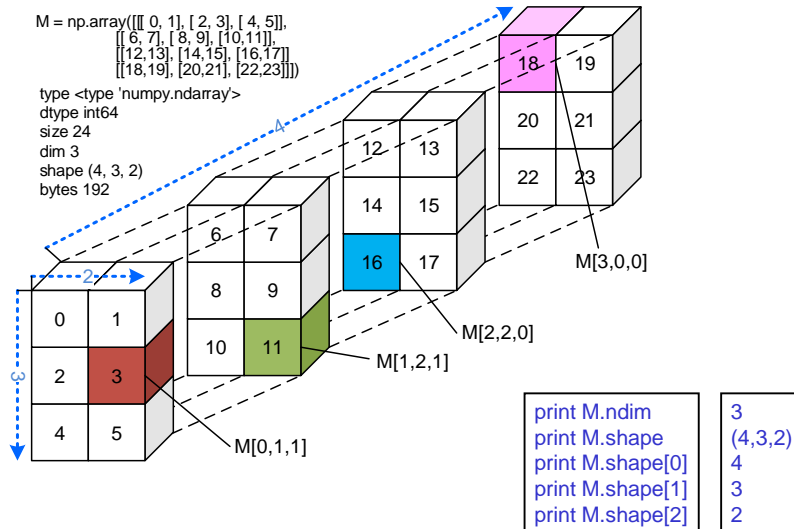
CuPy: NumPy-like API accelerated with CUDA

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## Numpy array indexing

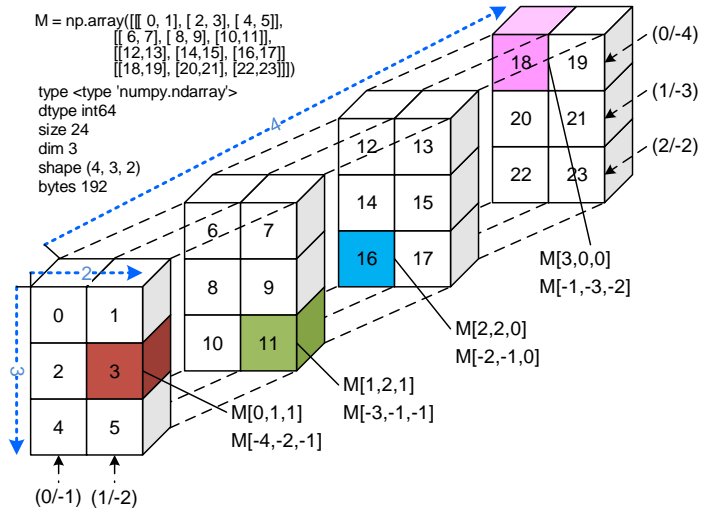


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## Numpy array indexing



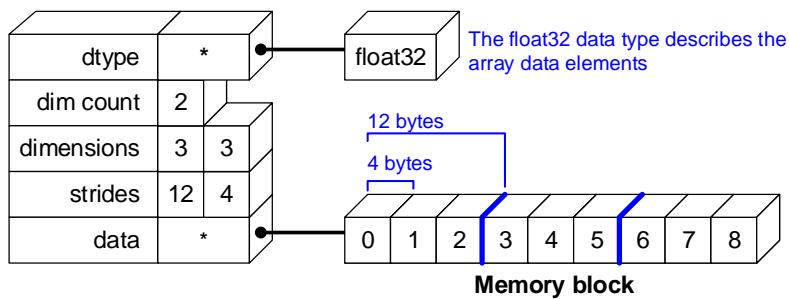
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## Numpy array data structure

### NDArray Data Structure



### Python View:

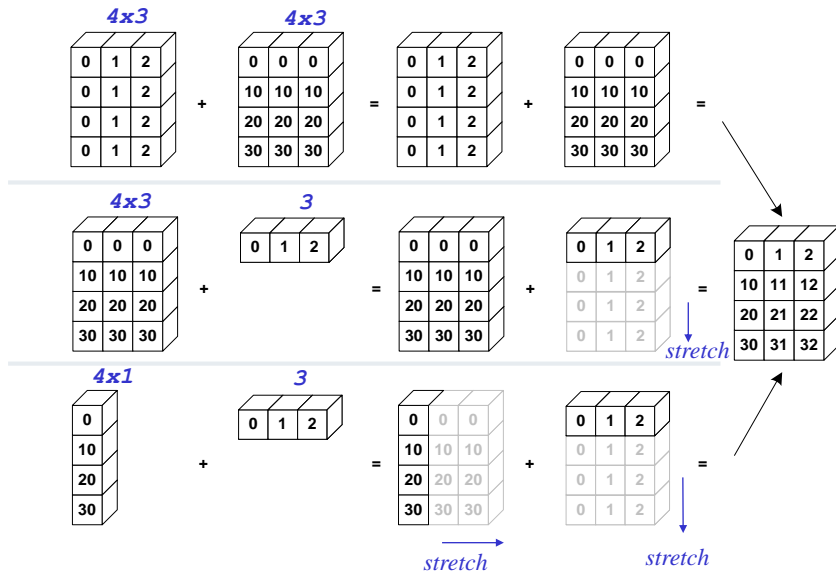
0	1	2
3	4	5
6	7	8

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## Numpy array broadcasting



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## SciPy

- ❑ SciPy builds on numpy, and provides a large number of functions that operate on numpy arrays and are useful for different types of scientific and engineering applications.
- ❑ An Open Source library of scientific tools for Python
  - ◆ Depends on the NumPy library
- ❑ Gathers a variety of high level science and engineering modules into one package
- ❑ Provides modules for
  - ◆ statistics
  - ◆ optimization
  - ◆ numerical integration
  - ◆ linear algebra
  - ◆ Fourier transforms
  - ◆ signal processing
  - ◆ image processing
  - ◆ genetic algorithms
  - ◆ ODE solvers
  - ◆ special functions
  - ◆ and more

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## References

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🏠 Python Numpy Tutorials

◆ <http://cs231n.github.io/python-numpy-tutorial/>

🏠 Numpy C-API

◆ <https://docs.scipy.org/doc/numpy/reference/c-api.html>

## Python Numpy C-API

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- ❖ NumPy C-API
- ❖ Manual wrapping C/C++ for Numpy

## Numpy C-API: Manual wrapping C/C++ for Numpy

- ❖ Step 1: include Python header file
- ❖ Step 2: prepare C function to be used
- ❖ Step 3: prepare Python callable function, i.e., wrapper
- ❖ Step 4: register the callable function within a module's symbol table
- ❖ Step 5: write an init function for the module
- ❖ Step 6: prepare a setup.py scrip

```
# test.py
import cos_module_np
import numpy as np
import pylab

x = np.arange(0, 2*np.pi, 0.1)
y = cos_module_np.cos_func_np(x)
pylab.plot(x, y)
pylab.show()
```

Import user defined module

Import necessary module

Call C function

Plot

## Python C-API: C function to be called by Python

```
#include <Python.h>
#define NPY_NO_DEPRECATED_API NPY_1_7_API_VERSION
#include <numpy/arrayobject.h>
#include <math.h>
//-----
static PyObject *cos_wrapper_np(PyObject *self, PyObject *args) {
    ....
}
//-----
// define functions in module
static PyMethodDef CosMethods[] = {
    {"cos_func_np", cos_wrapper_np, METH_VARARGS,
     "evaluate the cosine on a numpy array"},
    {NULL, NULL, 0, NULL}
};
//-----
// Module initialization
PyMODINIT_FUNC
initcos_module_np(void) {
    (void)Py_InitModule("cos_module_np", CosMethods);
    import_array();
}
```

## Python C-API: setup.py

```
from distutils.core import setup, Extension

module1 = Extension('hello', sources = ['hellomodule.c'])

setup ( name = 'Python C-API testing Package'
        , version = '1.0'
        , description = 'This is a testing package for Python C-API'
        , ext_modules = [module1] )
```



## Running 'cos' example

❏ This example shows how to call C function from Python

◆ Step 1: go to your project directory and invoke Python virtual environment

❏ [user@host] cd \$(PROJECT)/codes/python-projects/numpy\_C-API/cos

❏ [user@host] source ~/my\_python/bin/activate

◆ Step 2: see the codes

◆ Step 3: compile

❏ [user@host] make

◆ Step 4: run

❏ [user@host] make run

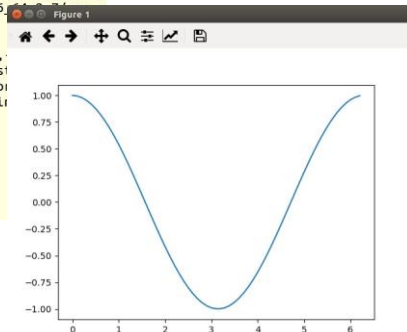
```
# test.py
import cos_module_np
import numpy as np
import pylab

x = np.arange(0, 2*np.pi, 0.1)
y = cos_module_np.cos_func_np(x)
pylab.plot(x, y)
pylab.show()
```

```
[user@host] cd $(PROJECT)/codes/python-projects/numpy_C-API/cos
[user@host] source ~/my_python/bin/activate
(my_python)$ make
(my_python)$ make run
(my_python)$ deactivate
[user@host]
```

## Running 'cos' example

```
adki@ando-ubuntu: ~/work/seminars/20170822_DeepLearningHWAcc/codes/python-projects/numpy
(tensorflow)$ ls
Clean.bat*  Clean.csh*  Clean.sh*  cos_module_np.c*  Makefile*  Makefile.old*
setup.py*  test.py*
(tensorflow)$ make
python2.7 setup.py build
running build
running build_ext
building 'cos_module_np' extension
creating build
creating build/temp.linux-x86_64-2.7
x86_64-linux-gnu-gcc -pthread -fno-strict-aliasing -DNDEBUG -g -fwrapv -O2 -Wall -Wstrict
t-prototypes -fPIC -I/home/adki/tensorflow/local/lib/python2.7/site-packages/numpy/core/
include -I/usr/include/python2.7 -c cos_module_np.c -o build/temp.linux-x86_64-2.7/cos
module_np.o
creating build/lib.linux-x86_64-2.7
x86_64-linux-gnu-gcc -pthread -shared -Wl,-O1 -Wl,-Bsymbolic-functions -Wl,-
ld,-z,relro -fno-strict-aliasing -DNDEBUG -g -fwrapv -O2 -Wall -Wstrict
-D_FORTIFY_SOURCE=2 -g -fstack-protector --param=ssp-buffer-size=4 -Wfo
rmat-security build/temp.linux-x86_64-2.7/cos_module_np.o -o build/lib.linux-x86_64-2.7/cos_module_np.so
(tensorflow)$ make run
python2.7 test.py
(tensorflow)$
```



## References

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### Python numpy C-API

- ◆ [http://www.scipy-lectures.org/advanced/advanced\\_numpy/index.html#advanced-numpy](http://www.scipy-lectures.org/advanced/advanced_numpy/index.html#advanced-numpy)
- ◆ [http://www.scipy-lectures.org/advanced/interfacing\\_with\\_c/interfacing\\_with\\_c.html](http://www.scipy-lectures.org/advanced/interfacing_with_c/interfacing_with_c.html)