


2) Minería de Datos con Python

- Python
 - Instalación (Anaconda python)
 - Terminal
 - Spyder, (eclipse)
 - Ipython, jupyter
- Programación Python & Librerías típicas
 - Python Básico
 - Matplotlib
 - Numpy
 - Scipy
 - Pandas
 - scikit-learn
 - Word2vec, gensim

Python

- Rápido & Fácil de Aprender
- Interpretación intuitiva
- Entorno más utilizado para Data Science (junto a R)
- Utilizado para multitud de aplicaciones

 Use Python for... [>>> More](#)

Web Development: [Django](#) , [Pyramid](#) , [Bottle](#) , [Tornado](#) , [Flask](#) , [web2py](#)

GUI Development: [tkInter](#) , [PyGObject](#) , [PyQt](#) , [PySide](#) , [Kivy](#) , [wxPython](#)

Scientific and Numeric: [SciPy](#) , [Pandas](#) , [IPython](#)

Software Development: [Buildbot](#) , [Trac](#) , [Roundup](#)

System Administration: [Ansible](#) , [Salt](#) , [OpenStack](#)

Python



Instalación: Anaconda Python



- Plataforma Data Science basada en Python
- Paquete completo de instalación con multitud de paquetes/librerías utilizadas
- <https://www.continuum.io/downloads>

Python



Instalación: Anaconda



Interacción: Terminal, Spyder, Jupyter

```
Administrator: Símbolo del sistema
(c) 2016 Microsoft Corporation. Todos los derechos reservados.

C:\WINDOWS\system32>python
Python 3.5.2 |Anaconda 4.2.0 (64-bit)| (default, Jul  5 2016, 11:41:13)
[MSC v.1900 64 bit (AMD64)] on win32
Type "help", "copyright", "credits" or "license" for more information.
>>> x=5
>>> x
5
>>> x/float(2)
2.5
>>> exit()

C:\WINDOWS\system32>python program_1.py
```

Spyder



C:/Dropbox (MGEP)/MU/DATA_MINING/SpyderWorkspace/TensorFlow-Book - Spyder (Python 3.5)

Archivo | Editar | Buscar | Código fuente | Ejecutar | Depurar | Terminales | Proyectos | Herramientas | Ver | Ayuda

Explorador de proyectos | Editor - C:/Dropbox (MGEP)/MU/DATA_MINING/SpyderWorkspace/TensorFlow-Book/KERAS_1.py | Explorador de variables

Explorador de proyectos
 TensorFlow-Book
 + .ipynb_checkpoints
 + .spyproject
 + MNIST_data
 + model
 .spyderproject
 .CNN.py
 .DEEP-INTELINE.py
 .input_data.py
 .input_data.pyc
 .KERAS_1_validation.py
 ...
 .KERAS_1.py
 .KERAS.ipynb
 .kmeans.py
 .model.ckpt
 .mult.py
 .multiGPU.py
 .my_model_architecture.j
 .my_model_weights.h5
 .README.md
 .redneuronsimple.py
 .regression.py
 .RestoreModel.py
 .SaveModel.py
 .TB_1.py
 .TB_2.py
 .TestModel_1.py
 .TestModel_visualizeFilter

Editor - C:/Dropbox (MGEP)/MU/DATA_MINING/SpyderWorkspace/TensorFlow-Book/KERAS_1.py
 KERAS_1.py | Sin título 0.py

```

1 #-*- coding: utf-8 -*-
2 """
3 Created on Wed Jun 29 19:02:19 2016
4
5 @author: lortek
6 """
7
8 # KERAS
9 #
10 '''Trains a simple convnet on the MNIST dataset.
11 #
12 #Gets to 99.25% test accuracy after 12 epochs
13 #(there is still a lot of margin for parameter tuning).
14 #16 seconds per epoch on a GRID K520 GPU.
15 '''
16
17 from __future__ import print_function
18 import numpy as np
19 np.random.seed(1337) # for reproducibility
20
21 from keras.datasets import mnist
22 from keras.models import Sequential
23 from keras.layers import Dense, Dropout, Activation, Flatten
24 from keras.layers import Convolution2D, MaxPooling2D
25 from keras.utils import np_utils
26
27 batch_size = 128
28 nb_classes = 10
29 nb_epoch = 12
30
31 # input image dimensions
32 img_rows, img_cols = 28, 28
  
```

Explorador de variables

Nombre	Tipo	Tamaño	Valor
x	int	1	5

Explorador de archivos | Explorador de variables | Ayuda

Terminal de IPython
 Terminal 1/A

```

In [1]: x=5
Out[1]: 5

In [2]: x
Out[2]: 5

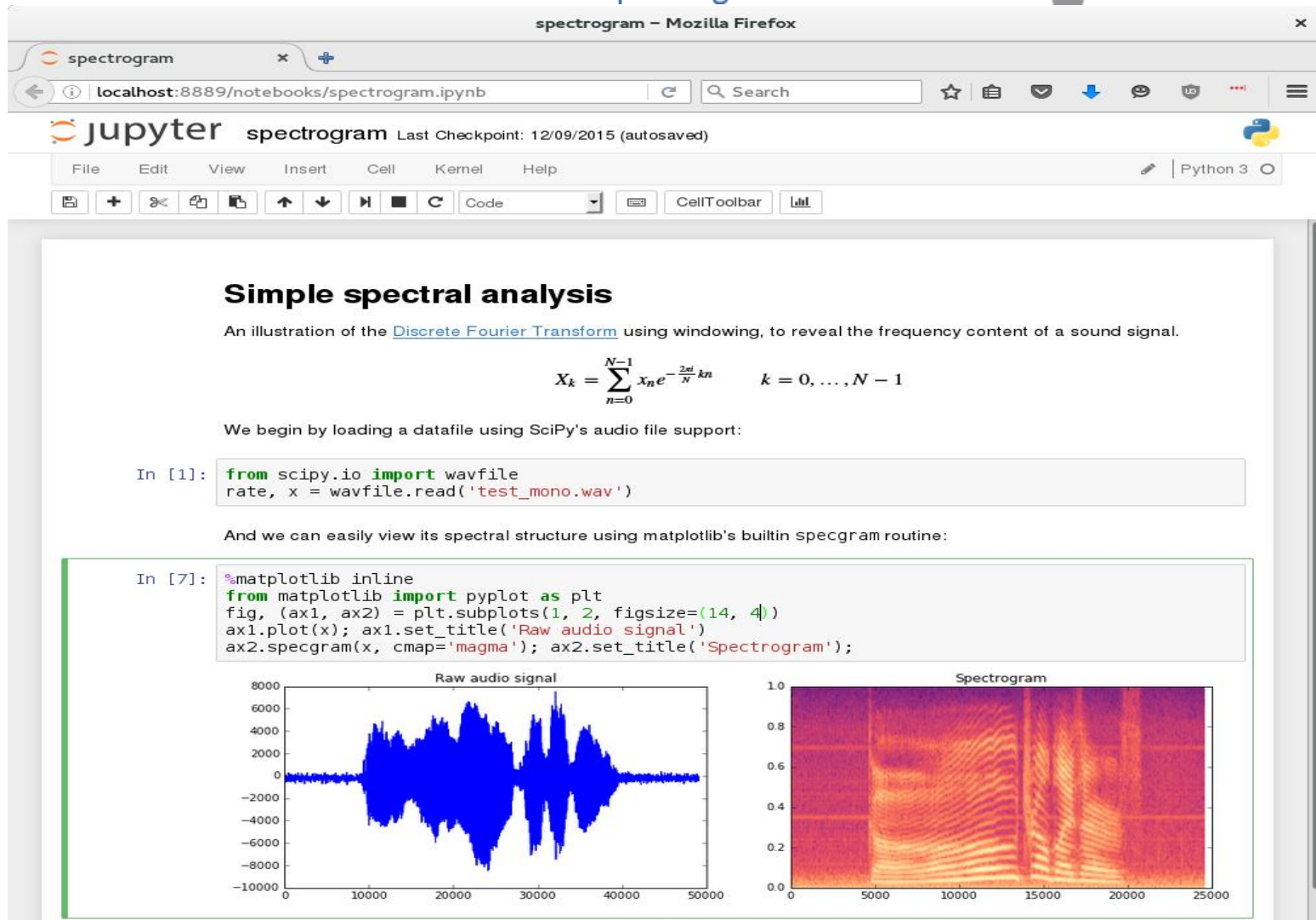
In [3]: x/float(2)
Out[3]: 2.5

In [4]:
  
```

Terminal de Py... | Historial de coma... | Terminal de IPy...

Permisos: RW | Fin de línea: LF | Codificación: UTF-8 | Línea: 1 | Columna: 1 | Memoria: 75 %

IP[y]: IPython



Probar Interacciones



- En terminal:
 - python
 - python program.py (editando en fichero .py)
 - ipython
- Spyder
 - Comandos en el ipython
 - Proyectos, gestión de ficheros
- Notebooks
 - ipython notebook (desde terminal)
 - jupyter notebook (desde terminal)

Programación Python & Librerías típicas:

- Python Básico

Variables and Data Types

Variable Assignment

```
>>> x=5
>>> x
5
```

Calculations With Variables

>>> x+2 7	Sum of two variables
>>> x-2 3	Subtraction of two variables
>>> x*2 10	Multiplication of two variables
>>> x**2 25	Exponentiation of a variable
>>> x%2 1	Remainder of a variable
>>> x/float(2) 2.5	Division of a variable

Types and Type Conversion

str()	'5', '3.45', 'True'	Variables to strings
int()	5, 3, 1	Variables to integers
float()	5.0, 1.0	Variables to floats
bool()	True, True, True	Variables to booleans

Asking For Help

```
>>> help(str)
```

Programación Python & Librerías típicas:

- Python Básico

Lists

Also see NumPy Arrays

```
>>> a = 'is'
>>> b = 'nice'
>>> my_list = ['my', 'list', a, b]
>>> my_list2 = [[4,5,6,7], [3,4,5,6]]
```

Selecting List Elements

Index starts at 0

Subset

```
>>> my_list[1]      Select item at index 1
>>> my_list[-3]     Select 3rd last item
```

Slice

```
>>> my_list[1:3]    Select items at index 1 and 2
>>> my_list[1:]     Select items after index 0
>>> my_list[:3]     Select items before index 3
>>> my_list[:]      Copy my_list
```

Subset Lists of Lists

```
>>> my_list2[1][0]  my_list[list][itemOfList]
>>> my_list2[1][:2]
```

List Operations

```
>>> my_list + my_list
['my', 'list', 'is', 'nice', 'my', 'list', 'is', 'nice']
>>> my_list * 2
['my', 'list', 'is', 'nice', 'my', 'list', 'is', 'nice']
>>> my_list2 > 4
True
```

List Methods

>>> my_list.index(a)	Get the index of an item
>>> my_list.count(a)	Count an item
>>> my_list.append('!')	Append an item at a time
>>> my_list.remove('!')	Remove an item
>>> del(my_list[0:1])	Remove an item
>>> my_list.reverse()	Reverse the list
>>> my_list.extend('!')	Append an item
>>> my_list.pop(-1)	Remove an item
>>> my_list.insert(0, '!')	Insert an item
>>> my_list.sort()	Sort the list

Programación Python & Librerías típicas:

- Python Básico

Strings

```
>>> my_string = 'thisStringIsAwesome'
>>> my_string
'thisStringIsAwesome'
```

String Operations

```
>>> my_string * 2
'thisStringIsAwesomethisStringIsAwesome'
>>> my_string + 'Innit'
'thisStringIsAwesomeInnit'
>>> 'm' in my_string
True
```

String Operations

Index starts at 0

```
>>> my_string[3]
>>> my_string[4:9]
```

String Methods

>>> my_string.upper()	String to uppercase
>>> my_string.lower()	String to lowercase
>>> my_string.count('w')	Count String elements
>>> my_string.replace('e', 'i')	Replace String elements
>>> my_string.strip()	Strip whitespace from ends

Programación Python & Librerías típicas:

- Python Básico

Libraries

Import libraries

```
>>> import numpy
>>> import numpy as np
```

Selective import

```
>>> from math import pi
```



Data analysis



Machine learning



NumPy
Scientific computing



matplotlib
2D plotting

Install Python



Leading open data science platform
powered by Python



Free IDE that is included
with Anaconda



Create and share
documents with live code,
visualizations, text, ...

Numpy Arrays

Also see Lists

```
>>> my_list = [1, 2, 3, 4]
>>> my_array = np.array(my_list)
>>> my_2darray = np.array([[1,2,3],[4,5,6]])
```

Selecting Numpy Array Elements

Index starts at 0

Subset

```
>>> my_array[1]
2
```

Select item at index 1

Slice

```
>>> my_array[0:2]
array([1, 2])
```

Select items at index 0 and 1

Subset 2D Numpy arrays

```
>>> my_2darray[:,0]
array([1, 4])
```

my_2darray[rows, columns]

Numpy Array Operations

```
>>> my_array > 3
array([False, False, False,  True], dtype=bool)
>>> my_array * 2
array([2, 4, 6, 8])
>>> my_array + np.array([5, 6, 7, 8])
array([6, 8, 10, 12])
```

Numpy Array Functions

>>> my_array.shape	Get the dimensions of the array
>>> np.append(other_array)	Append items to an array
>>> np.insert(my_array, 1, 5)	Insert items in an array
>>> np.delete(my_array, [1])	Delete items in an array
>>> np.mean(my_array)	Mean of the array
>>> np.median(my_array)	Median of the array
>>> my_array.corrcoef()	Correlation coefficient
>>> np.std(my_array)	Standard deviation

Programación Python & Librerías típicas:

- MATPLOTLIB

Matplotlib

Matplotlib is a Python 2D plotting library which produces publication-quality figures in a variety of hardcopy formats and interactive environments across platforms.



Programación Python & Librerías típicas:

- MATPLOTLIB

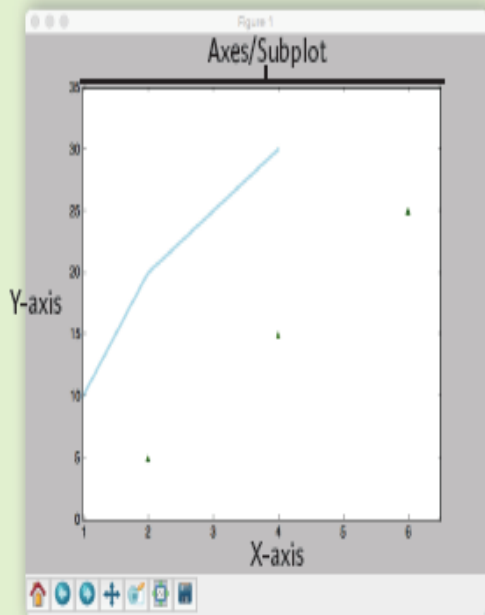
Matplotlib

Matplotlib is a Python 2D plotting library which produces publication-quality figures in a variety of hardcopy formats and interactive environments across platforms.



Plot Anatomy & Workflow

Plot Anatomy



Figure

Workflow

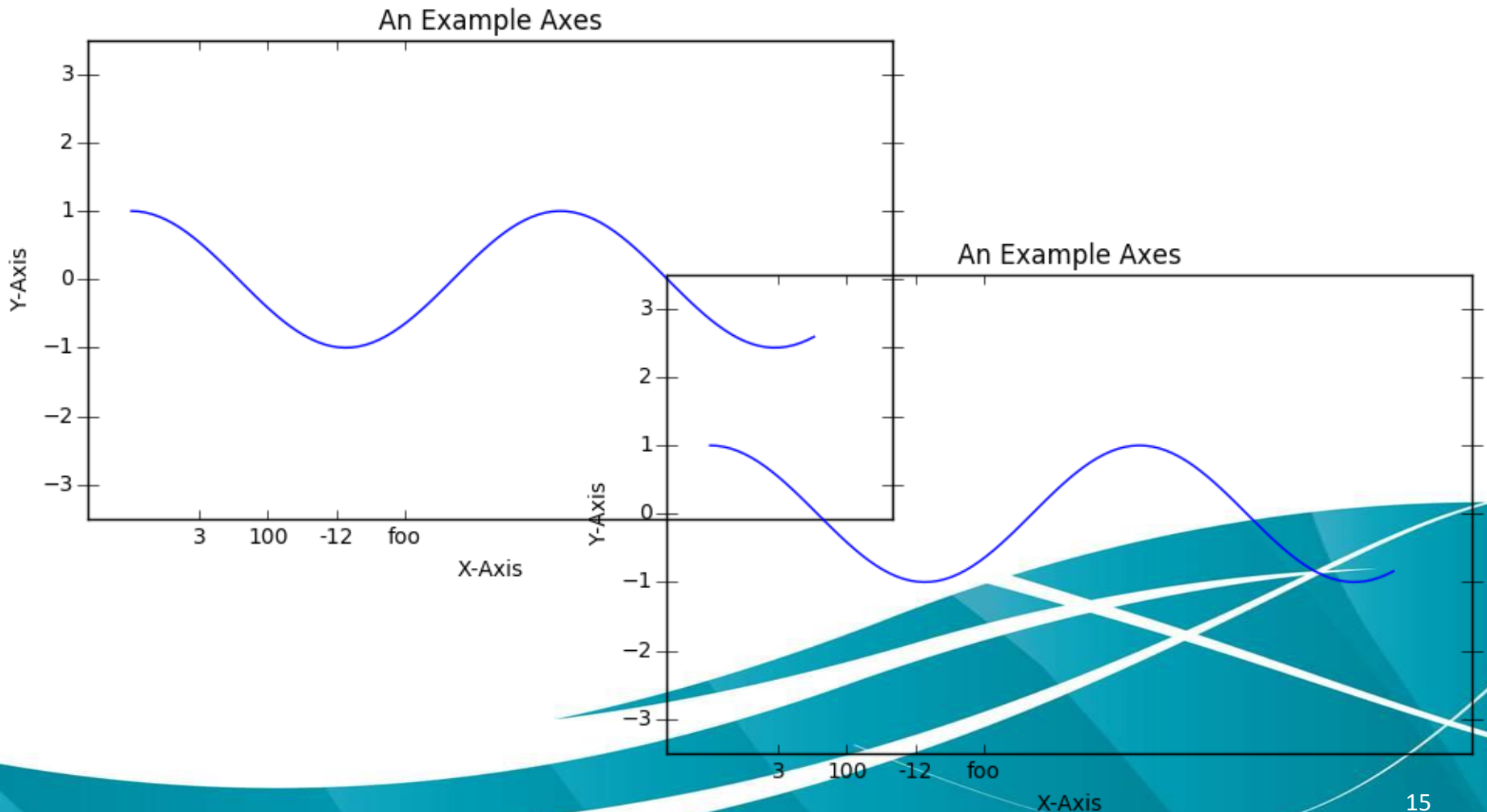
The basic steps to creating plots with matplotlib are:

- 1 Prepare data
- 2 Create plot
- 3 Plot
- 4 Customize plot
- 5 Save plot
- 6 Show plot

```
>>> import matplotlib.pyplot as plt
>>> x = [1,2,3,4]
>>> y = [10,20,25,30]
>>> fig = plt.figure()
>>> ax = fig.add_subplot(111)
>>> ax.plot(x, y, color='lightblue', linewidth=3)
>>> ax.scatter([2,4,6],
               [5,15,25],
               color='darkgreen',
               marker='^')
>>> ax.set_xlim(1, 6.5)
>>> plt.savefig('foo.png')
>>> plt.show()
```


Programación Python & Librerías típicas:

- MATPLOTLIB



Programación Python & Librerías típicas:

- NUMPY

NumPy

The NumPy library is the core library for scientific computing in Python. It provides a high-performance multidimensional array object, and tools for working with these arrays.

Use the following import convention:

```
>>> import numpy as np
```

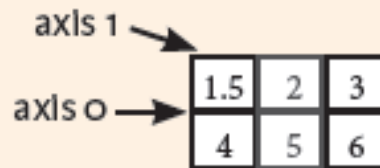


NumPy Arrays

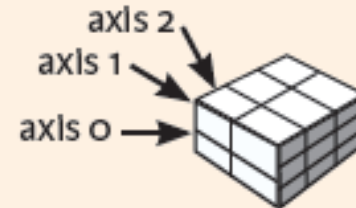
1D array



2D array



3D array



Programación Python & Librerías típicas:

- NUMPY

I/O

Saving & Loading On Disk

```
>>> np.save('my_array', a)
>>> np.savez('array.npz', a, b)
>>> np.load('my_array.npy')
```

Saving & Loading Text Files

```
>>> np.loadtxt("myfile.txt")
>>> np.genfromtxt("my_file.csv", delimiter=',')
>>> np.savetxt("myarray.txt", a, delimiter=" ")
```

Data Types

>>> np.int64	Signed 64-bit Integer types
>>> np.float32	Standard double-precision floating point
>>> np.complex	Complex numbers represented by 128 floats
>>> np.bool	Boolean type storing TRUE and FALSE values
>>> np.object	Python object type
>>> np.string_	Fixed-length string type
>>> np.unicode_	Fixed-length unicode type

Programación Python & Librerías típicas:

- NUMPY

Subsetting, Slicing, Indexing

Also see Lists

Subsetting

```
>>> a[2]
3
```

1	2	3
---	---	---

Select the element at the 2nd Index

```
>>> b[1,2]
6.0
```

1.5	2	3
4	5	6

Select the element at row 0 column 2
(equivalent to `b[1][2]`)

Slicing

```
>>> a[0:2]
array([1, 2])
```

1	2	3
---	---	---

Select Items at Index 0 and 1

```
>>> b[0:2,1]
array([ 2.,  5.])
```

1.5	2	3
4	5	6

Select Items at rows 0 and 1 in column 1

```
>>> b[:1]
array([[1.5, 2., 3.]])
```

1.5	2	3
4	5	6

Select all Items at row 0
(equivalent to `b[0:1, :]`)

```
>>> c[1,...]
array([[ 3.,  2.,  1.],
       [ 4.,  5.,  6.]])
```

Same as `[1, :, :]`

```
>>> a[ : :-1]
array([3, 2, 1])
```

Reversed array `a`

Boolean Indexing

```
>>> a[a<2]
array([1])
```

1	2	3
---	---	---

Select elements from `a` less than 2

Fancy Indexing

```
>>> b[[1, 0, 1, 0], [0, 1, 2, 0]]
array([ 4.,  2.,  6., 1.5])
```

Select elements (1,0), (0,1), (1,2) and (0,0)

```
>>> b[[1, 0, 1, 0]][:, [0,1,2,0]]
array([[ 4.,  5.,  6.,  4.],
       [ 1.5,  2.,  3.,  1.5],
       [ 4.,  5.,  6.,  4.],
       [ 1.5,  2.,  3.,  1.5]])
```

Select a subset of the matrix's rows and columns

Programación Python & Librerías típicas:

- Scipy

SciPy

The **SciPy** library is one of the core packages for scientific computing that provides mathematical algorithms and convenience functions built on the NumPy extension of Python.



Programación Python & Librerías típicas:

- Pandas

Pandas

The Pandas library is built on NumPy and provides easy-to-use data structures and data analysis tools for the Python programming language.

pandas 

 $y_i = \beta'x_i + \mu_i + \epsilon_i$

Use the following import convention:

```
>>> import pandas as pd
```

Pandas Data Structures

Series

A one-dimensional labeled array capable of holding any data type

Index →

A	3
B	-5
C	7
D	4

```
>>> s = pd.Series([3, -5, 7, 4], index=['a', 'b', 'c', 'd'])
```

DataFrame

Columns →

	Country	Capital	Population
1	Belgium	Brussels	11190846
2	India	New Delhi	1303171035
3	Brazil	Brasília	207847528

Index →

A two-dimensional labeled data structure with columns of potentially different types

```

>>> data = {'Country': ['Belgium', 'India', 'Brazil'],
            'Capital': ['Brussels', 'New Delhi', 'Brasília'],
            'Population': [11190846, 1303171035, 207847528]}

>>> df = pd.DataFrame(data,
                       columns=['Country', 'Capital', 'Population'])
  
```

Programación Python & Librerías típicas:

- Pandas

Selection

Also see NumPy Arrays

Getting

```
>>> s['b']
-5
```

Get one element

```
>>> df[1:]
  Country  Capital  Population
1  India  New Delhi  1303171035
2  Brazil  Brasília  207847528
```

Get subset of a DataFrame

Selecting, Boolean Indexing & Setting

By Position

```
>>> df.iloc([0],[0])
```

```
'Belgium'
```

```
>>> df.iat([0],[0])
```

```
'Belgium'
```

Select single value by row & column

By Label

```
>>> df.loc([0], ['Country'])
```

```
'Belgium'
```

```
>>> df.at([0], ['Country'])
```

```
'Belgium'
```

Select single value by row & column labels

By Label/Position

```
>>> df.ix[2]
```

```
Country      Brazil
Capital      Brasília
Population    207847528
```

Select single row of subset of rows

```
>>> df.ix[:, 'Capital']
```

```
0    Brussels
1    New Delhi
2    Brasília
```

Select a single column of subset of columns

```
>>> df.ix[1, 'Capital']
```

```
'New Delhi'
```

Select rows and columns

Boolean Indexing

```
>>> s[~(s > 1)]
```

```
>>> s[(s < -1) | (s > 2)]
```

```
>>> df[df['Population']>1200000000]
```

Series *s* where value is not >1
s where value is <-1 or >2

Use filter to adjust DataFrame

Setting

```
>>> s['a'] = 6
```

Set Index *a* of Series *s* to 6

Programación Python & Librerías típicas:

- Pandas

I/O

Read and Write to CSV

```
>>> pd.read_csv('file.csv', header=None, nrows=5)
>>> pd.to_csv('myDataFrame.csv')
```

Read and Write to Excel

```
>>> pd.read_excel('file.xlsx')
>>> pd.to_excel('dir/myDataFrame.xlsx', sheet_name='Sheet1')
```

Read multiple sheets from the same file

```
>>> xlsx = pd.ExcelFile('file.xls')
>>> df = pd.read_excel(xlsx, 'Sheet1')
```

Read and Write to SQL Query or Database Table

```
>>> from sqlalchemy import create_engine
>>> engine = create_engine('sqlite:///memory:')
>>> pd.read_sql("SELECT * FROM my_table;", engine)
>>> pd.read_sql_table('my_table', engine)
>>> pd.read_sql_query("SELECT * FROM my_table;", engine)
```

`read_sql()` is a convenience wrapper around `read_sql_table()` and `read_sql_query()`

```
>>> pd.to_sql('myDf', engine)
```


Programación Python & Librerías típicas: • Pandas

Dropping

<code>>>> s.drop(['a', 'c'])</code>	Drop values from rows (axis=0)
<code>>>> df.drop('Country', axis=1)</code>	Drop values from columns(axis=1)

Sort & Rank

<code>>>> df.sort_index()</code>	Sort by labels along an axis
<code>>>> df.sort_values(by='Country')</code>	Sort by the values along an axis
<code>>>> df.rank()</code>	Assign ranks to entries

Retrieving Series/DataFrame Information

Basic Information

<code>>>> df.shape</code>	(rows,columns)
<code>>>> df.index</code>	Describe index
<code>>>> df.columns</code>	Describe DataFrame columns
<code>>>> df.info()</code>	Info on DataFrame
<code>>>> df.count()</code>	Number of non-NA values

Summary

<code>>>> df.sum()</code>	Sum of values
<code>>>> df.cumsum()</code>	Cummulative sum of values
<code>>>> df.min()/df.max()</code>	Minimum/maximum values
<code>>>> df.idxmin()/df.idxmax()</code>	Minimum/Maximum index value
<code>>>> df.describe()</code>	Summary statistics
<code>>>> df.mean()</code>	Mean of values
<code>>>> df.median()</code>	Median of values

Applying Functions

<code>>>> f = lambda x: x*2</code>	
<code>>>> df.apply(f)</code>	Apply function
<code>>>> df.applymap(f)</code>	Apply function element-wise

Data Alignment

Internal Data Alignment

NA values are Introduced in the Indices that don't overlap:

```

>>> s3 = pd.Series([7, -2, 3], index=['a', 'c', 'd'])
>>> s + s3
a      10.0
b       NaN
c       5.0
d       7.0
  
```

Arithmetic Operations with Fill Methods

You can also do the Internal data alignment yourself with the help of the fill methods:

```

>>> s.add(s3, fill_value=0)
a      10.0
b      -5.0
c       5.0
d       7.0
>>> s.sub(s3, fill_value=2)
>>> s.div(s3, fill_value=4)
>>> s.mul(s3, fill_value=3)
  
```

Programación Python & Librerías típicas:

- Scikit-Learn

Scikit-learn

Scikit-learn is an open source Python library that implements a range of machine learning, preprocessing, cross-validation and visualization algorithms using a unified interface.



A Basic Example

```
>>> from sklearn import neighbors, datasets, preprocessing
>>> from sklearn.cross_validation import train_test_split
>>> from sklearn.metrics import accuracy_score
>>> iris = datasets.load_iris()
>>> X, y = iris.data[:, :2], iris.target
>>> X_train, X_test, y_train, y_test = train_test_split(X, y, random_state=33)
>>> scaler = preprocessing.StandardScaler().fit(X_train)
>>> X_train = scaler.transform(X_train)
>>> X_test = scaler.transform(X_test)
>>> knn = neighbors.KNeighborsClassifier(n_neighbors=5)
>>> knn.fit(X_train, y_train)
>>> y_pred = knn.predict(X_test)
>>> accuracy_score(y_test, y_pred)
```


Programación Python & Librerías típicas:

- Scikit-Learn

Loading The Data

Also see NumPy & Pandas

Your data needs to be numeric and stored as NumPy arrays or SciPy sparse matrices. Other types that are convertible to numeric arrays, such as Pandas DataFrame, are also acceptable.

```
>>> import numpy as np
>>> X = np.random.random((10,5))
>>> y = np.array(['M', 'M', 'F', 'F', 'M', 'F', 'M', 'M', 'F', 'F'])
>>> X[X < 0.7] = 0
```

Training And Test Data

```
>>> from sklearn.cross_validation import train_test_split
>>> X_train, X_test, y_train, y_test = train_test_split(X,
                                                         y,
                                                         random_state=0)
```

ESKERRIKASKO!!

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Robotics & Automation Area

Electronics and Computing Department

Mondragon University - Faculty of Engineering