

# Deep Learning for Physicists

Tutorial #0

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 Introduction to Python language: <a href="https://docs.python.org/3.7/tutorial/index.html">https://docs.python.org/3.7/tutorial/index.html</a>

- 1. Whetting Your Appetite
- 2. Using the Python Interpreter
  - 2.1. Invoking the Interpreter
    - 2.1.1. Argument Passing
    - 2.1.2. Interactive Mode
  - 2.2. The Interpreter and Its Environment
    - 2.2.1. Source Code Encoding
- 3. An Informal Introduction to Python
  - 3.1. Using Python as a Calculator
    - **3.1.1.** Numbers
    - 3.1.2. Strings
    - **3.1.3. Lists**
  - 3.2. First Steps Towards Programming
- 4. More Control Flow Tools
  - 4.1. if Statements
  - 4.2. for Statements
  - 4.3. The range() Function

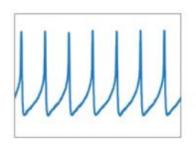
• Numpy:

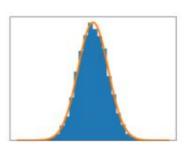
https://numpy.org/doc/stable/user/quickstart.html

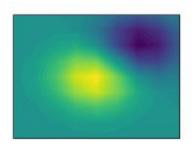
> widely used library for numerical operations in Python

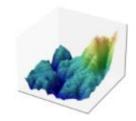
```
>>> import numpy as np
>>> a = np.arange(15).reshape(3, 5)
>>> a
array([[0, 1, 2, 3, 4],
       [5, 6, 7, 8, 9],
       [10, 11, 12, 13, 14]])
>>> a.shape
(3, 5)
>>> a.ndim
2
>>> a.dtype.name
'int64'
>>> a.itemsize
8
>>> a.size
15
>>> type(a)
<class 'numpy.ndarray'>
>>> b = np.array([6, 7, 8])
>>> b
array([6, 7, 8])
>>> type(b)
<class 'numpy.ndarray'>
```

- Matplotlib: <a href="https://matplotlib.org/">https://matplotlib.org/</a>
  - ➤ Basic visualization with Python
  - > Easy to use library for creating static, animated, and interactive visualizations









- Pandas: <a href="https://pandas.pydata.org/">https://pandas.pydata.org/</a>
  - > Fast, powerful, flexible and easy to use data analysis and manipulation tool

#### Take a Quick Look at the Data Structure

In [5]: housing = load\_housing\_data()
housing.head()

Out[5]:

|   |   | longitude | latitude | housing_median_age | total_rooms | total_bedrooms | population | households | median_income | median_house_value | ocean_proximity |
|---|---|-----------|----------|--------------------|-------------|----------------|------------|------------|---------------|--------------------|-----------------|
| ( | ) | -122.23   | 37.88    | 41.0               | 880.0       | 129.0          | 322.0      | 126.0      | 8.3252        | 452600.0           | NEAR BAY        |
| • | 1 | -122.22   | 37.86    | 21.0               | 7099.0      | 1106.0         | 2401.0     | 1138.0     | 8.3014        | 358500.0           | NEAR BAY        |
| 2 | 2 | -122.24   | 37.85    | 52.0               | 1467.0      | 190.0          | 496.0      | 177.0      | 7.2574        | 352100.0           | NEAR BAY        |
| ; | 3 | -122.25   | 37.85    | 52.0               | 1274.0      | 235.0          | 558.0      | 219.0      | 5.6431        | 341300.0           | NEAR BAY        |
| 4 | 1 | -122.25   | 37.85    | 52.0               | 1627.0      | 280.0          | 565.0      | 259.0      | 3.8462        | 342200.0           | NEAR BAY        |

- Keras: <a href="https://keras.io/">https://keras.io/</a>
  - ➤ beginner-friendly Deep Learning library
  - ➤ Main package to be used in the computational assignments
  - ➤ **TensorFlow** will be used as backend: <a href="https://www.tensorflow.org/">https://www.tensorflow.org/</a>

```
from tensorflow import keras
import numpy as np
```

- SciKit-Learn: <a href="https://scikit-learn.org/stable/">https://scikit-learn.org/stable/</a>
  - ➤ Helpful machine-learning library
  - ➤ Widely used tool in data science

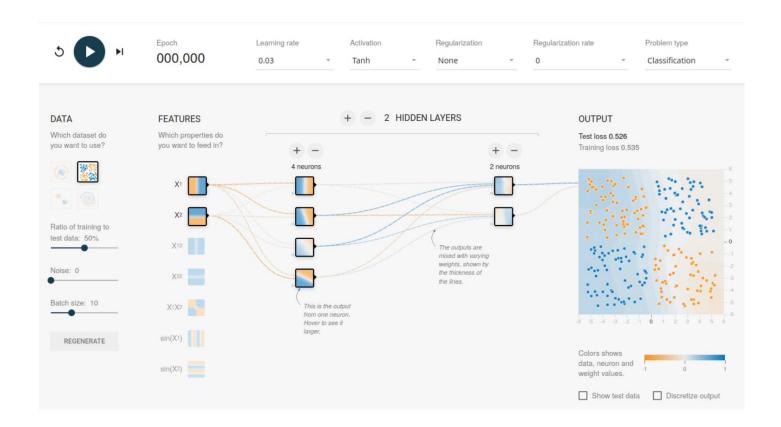
- Anaconda distribution: <a href="https://www.anaconda.com/products/individual">https://www.anaconda.com/products/individual</a>
  - > Python distribution for local installation
  - > Anaconda includes the so-called Jupyter Notebooks or JupyterLab: <a href="https://jupyter.org/">https://jupyter.org/</a>
  - > Computational assignments will be of the **Jupyter Notebook** format

#### Working with Jupyter Notebooks

- See notebook Tutorial\_O.ipynbk in folder Tutorial O
- Analysis of the California Housing data set (Luís Torgo's page): https://www.dcc.fc.up.pt/~ltorgo/Regression/cal housing.html
  - Reference:
    - ➤ Pace, R. Kelley and Ronald Barry, Sparse Spatial Autoregressions, Statistics and Probability Letters, 33 (1997) 291-297
  - Description:
    - ➤ Collected information on the variables using all the block groups in California from the 1990 Concensus
    - ➤ Includes 1425.5 individuals living in a geographically compact areas
    - Final data contained 20,640 observations on 9 variables

- Google Colab: <a href="https://colab.research.google.com/">https://colab.research.google.com/</a>
  - ➤ Similar to Jupyter notebooks but in your web-browser
  - ➤ Files stored on Google Drive
  - > Computational resources provided by Google, including virtual CPUs and GPUs
  - Tutorial: <a href="https://www.youtube.com/watch?v=inN8seMm7UI">https://www.youtube.com/watch?v=inN8seMm7UI</a>
  - ➤ Jupyter Notebooks can be uploaded to Google Drive and be used in Colab: <a href="https://medium.com/swlh/migrating-from-jupyter-to-colaboratory-2888332d57a7">https://medium.com/swlh/migrating-from-jupyter-to-colaboratory-2888332d57a7</a>

• TensorFlow Playground: <u>www.playground.tensorflow.org</u>



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  - Description:
    - > Data corresponds to a 2D probability distribution and is represented by the value pairs (x1, x2)
    - Second data set: regions x1, x2 > 0 and x1, x2 < 0 are shown by one color, value pairs with x1 > 0, x2 < 0 and x1 < 0, x2 > 0, the regions are indicated by a different color.
  - Questions:
    - 1. Using ReLU activation function, what is the smallest network that gives a good fit result?
    - 2. What do you observe when training networks with the same settings multiple times?
    - 3. Which of the features is most helpful?

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- Answers:
  - 1. A network with a single layer having 3 nodes seems to work but this configuration is not stable. A single layer with 4 nodes is more stable
  - 2. Due to the random initialization of weights, the network training development is always a bit different, leading to different results
  - 3. Obviously,  $x1 \cdot x2!$

#### For next time...

- See folder *Tutorial 1* 
  - > Try to work on the problems in Jupyter notebook *Tutorial\_1*