# PROGRAMMING IN PYTHON I

## **Plotting in Python**



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# **PLOTTING IN PYTHON**



#### **Motivation**

- Often, we want to visualize data or handle images files
  - Visualize data and data distributions
  - Show/visualize image data
  - Create image data and save/load it from image files
  - □ ...
- We will now take a look at how this is done in Python and what we have to be aware of when dealing with image data

# **IMAGE FILES**



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  - ☐ https://en.wikipedia.org/wiki/Grayscale
- RGB(A) 2D image:
  - 3D array (2 spatial dimensions + 1 dimension for color channels)
  - □ Each pixel carries a brightness information of a specific color channel (red, green, blue, (alpha))
  - https://en.wikipedia.org/wiki/RGB\_color\_model

#### **JPEG**

- JPEG (Joint Photographic Experts Group)
- File suffix: .jpg or .jepg
- Pixel-based (stores values of pixels in image = raster graphics)
- Uses lossy compression
  - Data is lost when creating the file

#### **PNG**

- PNG (Portable Network Graphics)
- File suffix: .png
- Pixel-based (stores values of pixels in image = raster graphics)
- Uses lossless compression
  - No data is lost when creating the file

#### **SVG**

- SVG (Scalable Vector Graphics)
- File suffix: .svg
- Vector-based (stores code to produce image, e.g., coordinates of lines = vector graphics)
  - ☐ Image is "drawn" based on specifications in .svg file
  - □ No loss of resolution when zooming into image
  - □ E.g.: Draw line from x to y with line width w
- Uses lossless compression
- Mainly used for images where resolution is important and vector design is feasible
  - Line plots, histograms, neural network architecture depictions, . . .

# **MATPLOTLIB**



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- Vast range of functions, documentation sometimes lacking, differences between versions
- Typical usage: Search https://matplotlib.org/stable/gallery/index.html for something close to what you want and continue from there.
- Documentation/Tutorials: https://matplotlib.org/

#### matplotlib: Backends

- matplotlib will use the system backends, which depend on the OS
  - Different backends for different tasks (performance, user interaction, animations, 3D plots, etc.)
  - □ Plots might look different on different OS due to backends
  - ☐ Functionality depends on available backends, some backends can be installed manually
- matplotlib has an interactive and non-interactive mode
  - Interactive mode will show plots immediately, non-interactive mode only when explicitly shown
- https://matplotlib.org/stable/users/explain/ backends.html

## matplotlib: Figures and Axes (1)

matplotlib works with figures and axes

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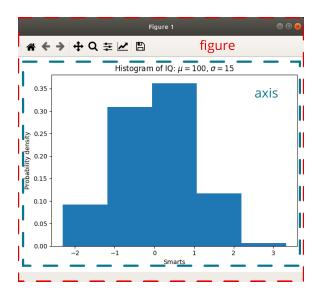
- matplotlib works with figures and axes
- Figure:
  - The window you are plotting in
  - Comes with tools for user interaction
  - □ Can be saved to image files

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- Figure:
  - The window you are plotting in
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  - Can be saved to image files
- Axis:<sup>1</sup>
  - The object we can use to plot on
  - ☐ A figure can have multiple axes
  - We can draw to an axis multiple times

<sup>&</sup>lt;sup>1</sup>To avoid confusion with "number lines" (x-axis, y-axis,), matplotlib actually always refers to the plotting object as Axes and to these number lines as Axis.

# matplotlib: Figures and Axes (2)



# ADDITIONAL INFORMATION: VISUAL PERCEPTION

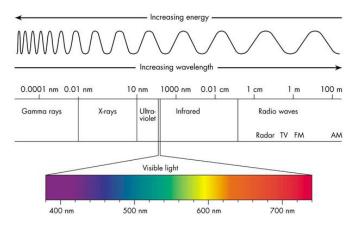


#### **Visual Perception**

The following (optional) slides just serve as a starting point if you are interested and want to delve deeper into the topic of visualization.

#### **Human Limitations and Biases (1)**

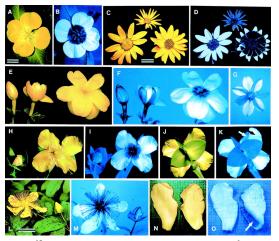
Human eyes only perceive a very small fraction of wavelengths at a limited frame-rate



[Source: https://www.cyberphysics.co.uk/topics/radioact/Radio/EMSpectrumcolor.jpg]

## **Human Limitations and Biases (2)**

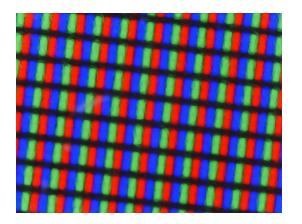
- A lot of things make more sense in spectra we cannot see
  - □ Flowers in UV spectrum provide signals for insects



[Source: https://www.pnas.org/content/98/24/13745]

#### **Human Limitations and Biases (3)**

 PC-screen under the microscope (humans perceive this as white color)



## **Human Limitations and Biases (4)**

- Human perception is biased towards certain wavelengths
  - □ Color perception differs across individuals (https://www.color-blindness.com/coblis-color-blindness-simulator/)
  - □ Different standards to mix RGB channels into grayscale image (https://en.wikipedia.org/wiki/Grayscale# Colorimetric\_(perceptual\_luminance-preserving) \_conversion\_to\_grayscale)
- Especially when dealing with ML, it is important to be aware of our natural limitations and biases!