



Luminescence Spectroscopy Data Analysis in Python Using  **HyperSpy** multi-dimensional data analysis

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Today: short intro –
complemented by interactive
tutorial on Friday morning

Why use python for scientific data analysis?

- Both a genuine programming and a scripting language
- **Free** as in speech (open source) and as in beer (no fees)
- **Portable**: Runs on any environment (Win, Mac, Linux)
- **Intuitive** and readable code

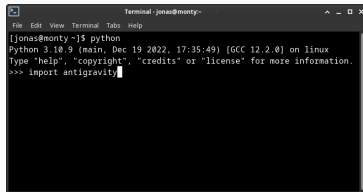
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 - `numpy` + `scipy` + `matplotlib` = Matlab replacement
 - `SymPy`, `scikit-image`, `scikit-learn`, ...



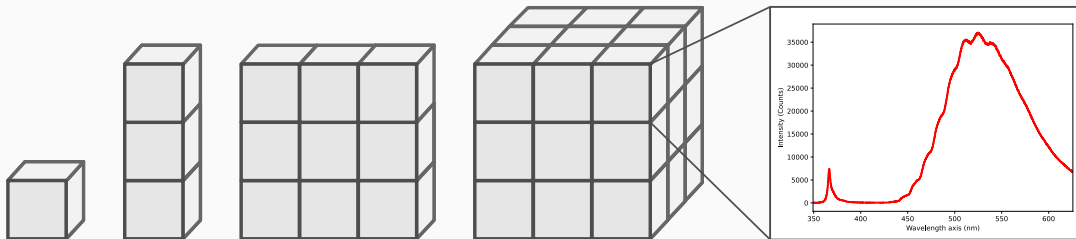
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 - `SymPy`, `scikit-image`, `scikit-learn`, ...
- Different environments:
 - Use interactive console: `python`, `ipython`
 - Run script files: `silly-walk.py`
 - Matlab-style integrated desktop environments: e.g. `spyder`
 - Mathematica-style notebooks: `Jupyter`
 - Dedicated frontends: e.g. `hyperspyUI`

A terminal window titled "Terminal - jonas@monty:-" showing a Python prompt. The user has entered `python`, which has started the Python 3.10.9 interpreter. The prompt is `>>> import antigavity`.

What is HyperSpy?

- Open-source **python** library for interactive **analysis of multi-dimensional data**
- Easily extend operations from a single spectrum/image to multi-dimensional arrays



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- Easy access to cutting-edge **signal processing tools**
- **Community-driven**: Developed by scientists for scientists



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- **Extension framework for different signal types:**
 - EELS and EDX (currently still in the main package)
 - Holography (currently still in the main package)
 - **pyxem**: STEM data from pixelated electron detectors
 - **Kikuchipy**: EBSD patterns
 - **LumiSpy**: Luminescence spectroscopy



- 2007-2012: Developed by Francisco de la Peña in his PhD (Univ. Paris-Sud) as EELSlab
- 2010: Renamed to HyperSpy and open-sourced on GitHub
- Now ...
 - over 850 citations
 - 46 releases
 - 61 contributors
 - 415 stars on GitHub (users with GitHub account)
 - used in (at least) 115 other GitHub projects
 - and still growing!



- Tools for loading/saving various **data file formats** (soon new library RosettaSciIO)
- **Analytical tools** that exploit the multidimensionality of datasets
- User-friendly and powerful framework for **model fitting**:
provides many standard functions, easily extended to custom ones
- **Machine learning algorithms**, useful for e.g. denoising data
- Efficient handling of **big datasets**
- **Data visualization**: evaluate datasets during the analysis, provide interactive operation for certain functions, and plotting
- **Extracting subsets** of data from multidimensional datasets:
regions of interest and a powerful numpy-style indexing mechanism
- Handling of **non-uniform data axes**



- **HyperSpy** extension for luminescence spectroscopy data
- Provides the framework to work with photoluminescence (PL), cathodoluminescence (CL), electroluminescence (EL) and Raman spectroscopy
- Adds **specific functions**
- Work in progress ... open for other contributors

- Specific signal types (python classes) for **luminescence spectra and transients**
- Transformation to electron volt and wavenumbers/Raman shift (non-uniform signal axes)
- **Tools** such as data normalization/scaling
- **Utility functions** useful in luminescence spectroscopy data analysis: joining multiple spectra, unit conversion, etc.

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- Utility functions useful in luminescence spectroscopy data analysis: joining multiple spectra, unit conversion, etc.
- All of the built-in HyperSpy tools!



- Website: <https://hyperspy.org>
- User guide: <https://hyperspy.org/hyperspy-doc/current/>
- Tutorial notebooks: <https://github.com/hyperspy/hyperspy-demos>
- Gitter chat: <https://gitter.im/hyperspy/hyperspy>



- User guide: <https://lumispy.org>
- Tutorial notebooks: <https://github.com/LumiSpy/lumispy-demos>

Anyone can make LumiSpy/HyperSpy better! **Don't be shy!**

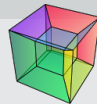
- Community driven development
- Report bugs on the github issue tracker
- Improve documentation
- Help review pull requests on github
- Contribute new functionalities:
 - Include tests and documentation
 - More effort than scripting for personal use
 - Shared development (avoid reinventing the wheel)

Interactive tutorial presented as Jupyter Notebook

Two ways to follow on your own PC:

Install python and relevant libraries on your Laptop:

- See LumiSpy User Guide: <https://lumispy.org>
- If you have python: get them from **pip** and **conda**
- We recommend installing the **HyperSpy-Bundle**
- A number of colleagues here can help you in the coffee breaks to get started!



Run the interactive web-based LumiSpy demo-notebooks on binder:

- <https://mybinder.org/v2/gh/lumispy/lumispy-demos/main>
- Easier start, but might be slower



PS: Find this presentation and relevant links on the workshop website!