Applying The Hacker Within lessons to a research project

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Introduce myself

- Field: Materials Science and Engineering
- Research area: corrosion of Ti alloys for medical implants
- No formal programming training

My path to The Hacker Within

- Excel catastrophes early on. Origin much better, but still not enough
- Keyword: unnatural
- I had enough of Windows and GUIs, all the good tools seem to be developed for GNU/Linux and as Python packages
- 19 March 2018, Matt's welcome talk - the right talk at the right time
- Switch to GNU/Linux, command line, Emacs, Python, Git

What this presentation is about

- My first attempt to make a new analysis workflow for my recent research project, which is (computationally) reproducibile
- Describe the research
- Show the results I want to reproduce
- Show how I did it
- Show the new workflow

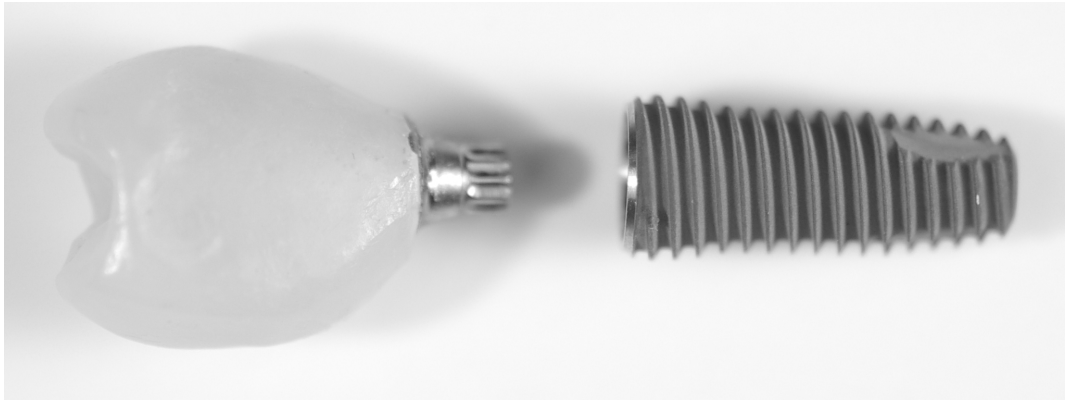
Practical stuff

- Let's see if my analysis can be reproduced on your machine:
- Navigate to:
  https://github.com/craicrai/xrd_analysis_workflow
- Fork
- Open terminal
- cd Desktop
- git clone
  https://github.com/*your-user-name*/xrd_analysis_workflow
- cd xrd_analysis_workflow
- make all

DESCRIBE THE RESEARCH

New titanium alloy for implants

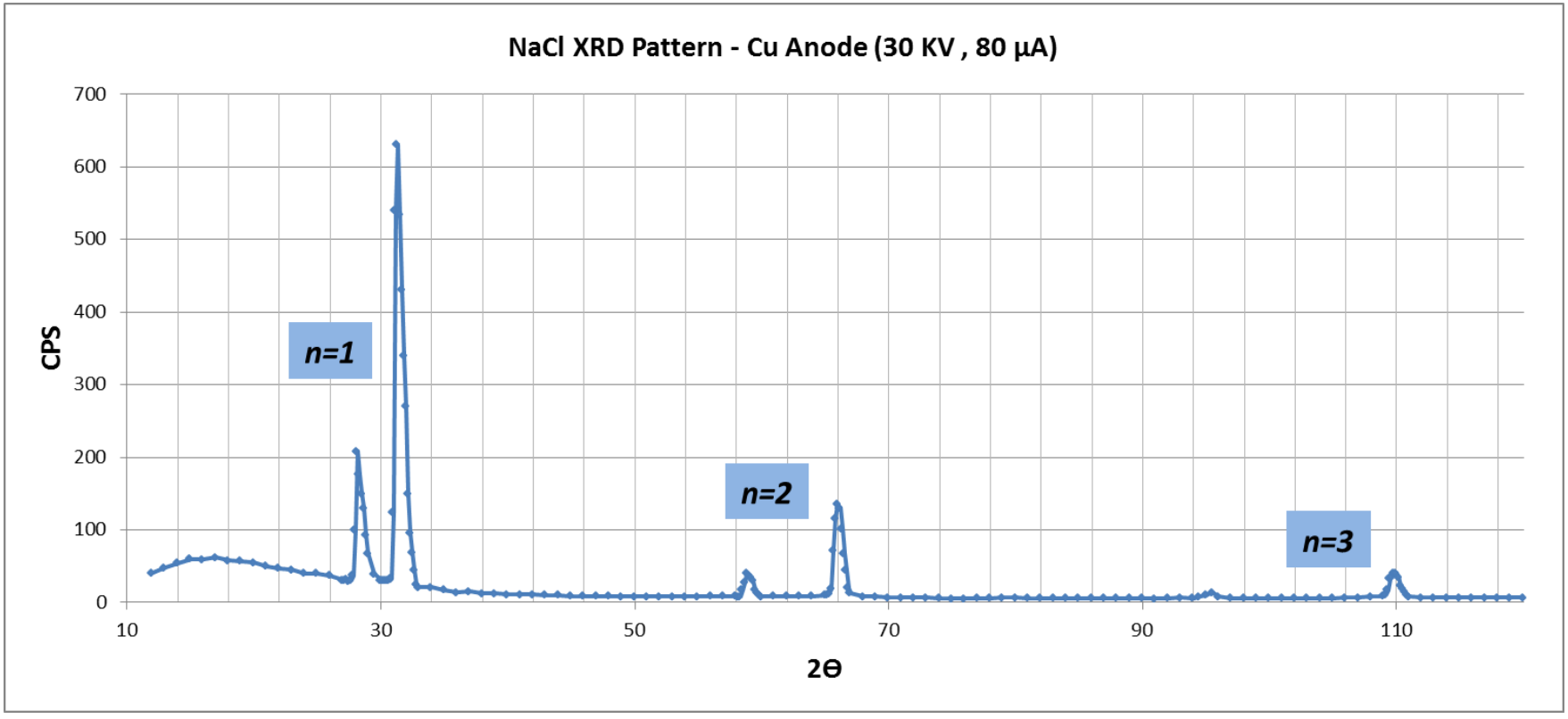
- More than 3000 tonnes of titanium alloys implanted in people every year
- Titanium is very corrosion resistant, but not perfect
- New alloy: Ti40Zr10Cu34Pd14Sn2 (at. %)
- It is important to know its corrosion products



Dental implant made of titanium

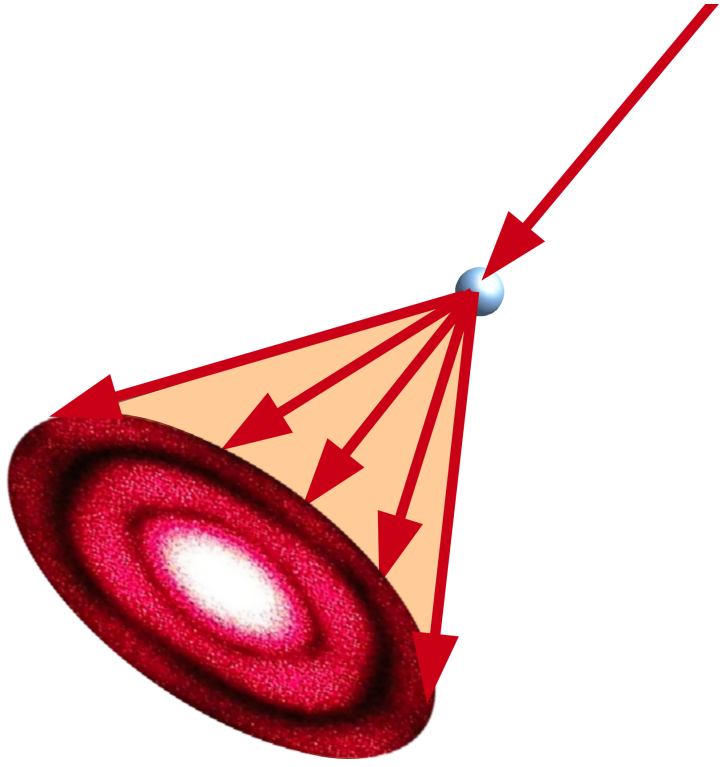
How can we see what the corrosion products are?

- Shine X-rays on corrosion products which diffract them
- Resulting diffraction pattern is like a fingerprint



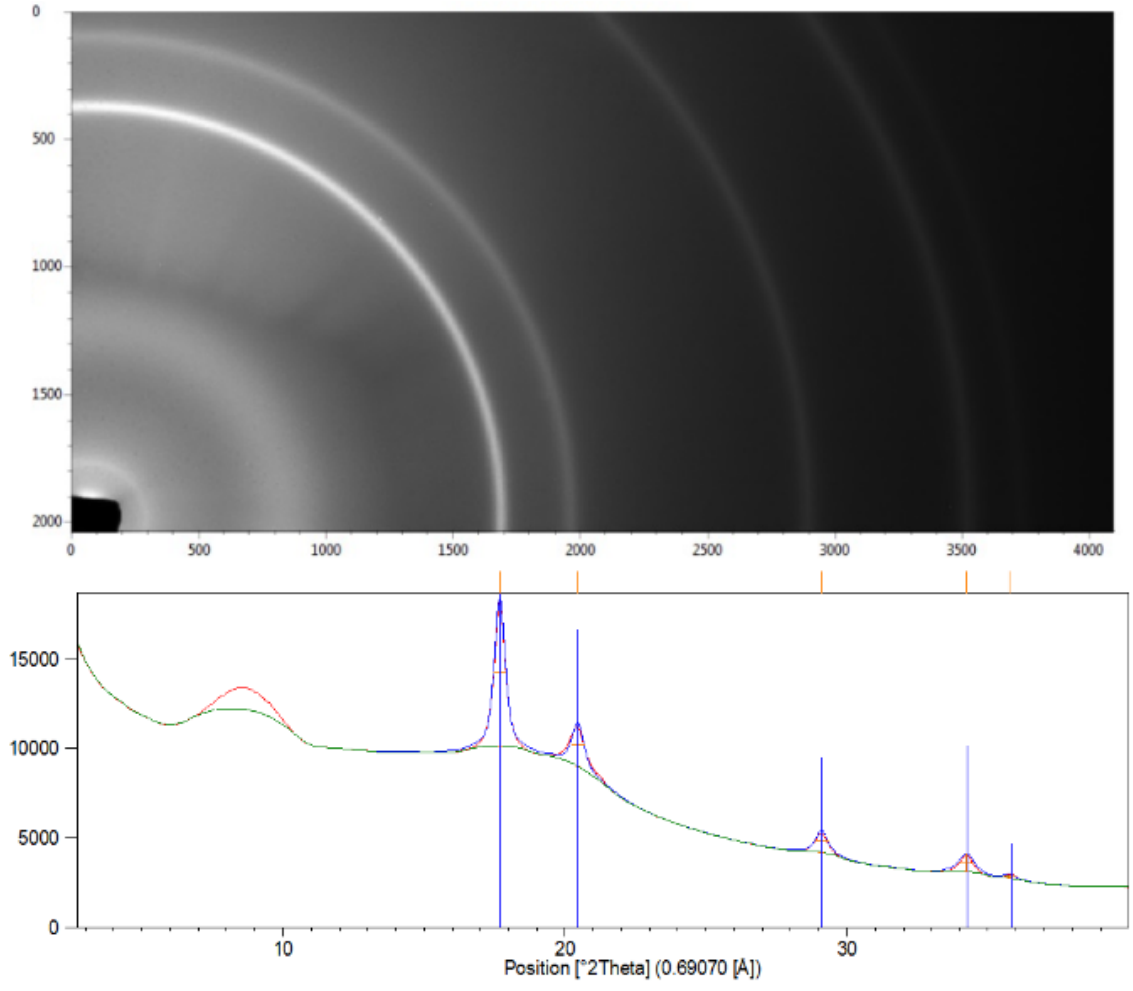
Diffraction pattern of NaCl (kitchen salt) from physicsopenlab.org

Diffraction experiment



Diffraction rings (from Wikipedia)

Azimuthal integration



Calibration required to find the centre and the detector tilt

SHOW THE RESULTS I WANT TO REPRODUCE

Selected raw 2D diffraction image

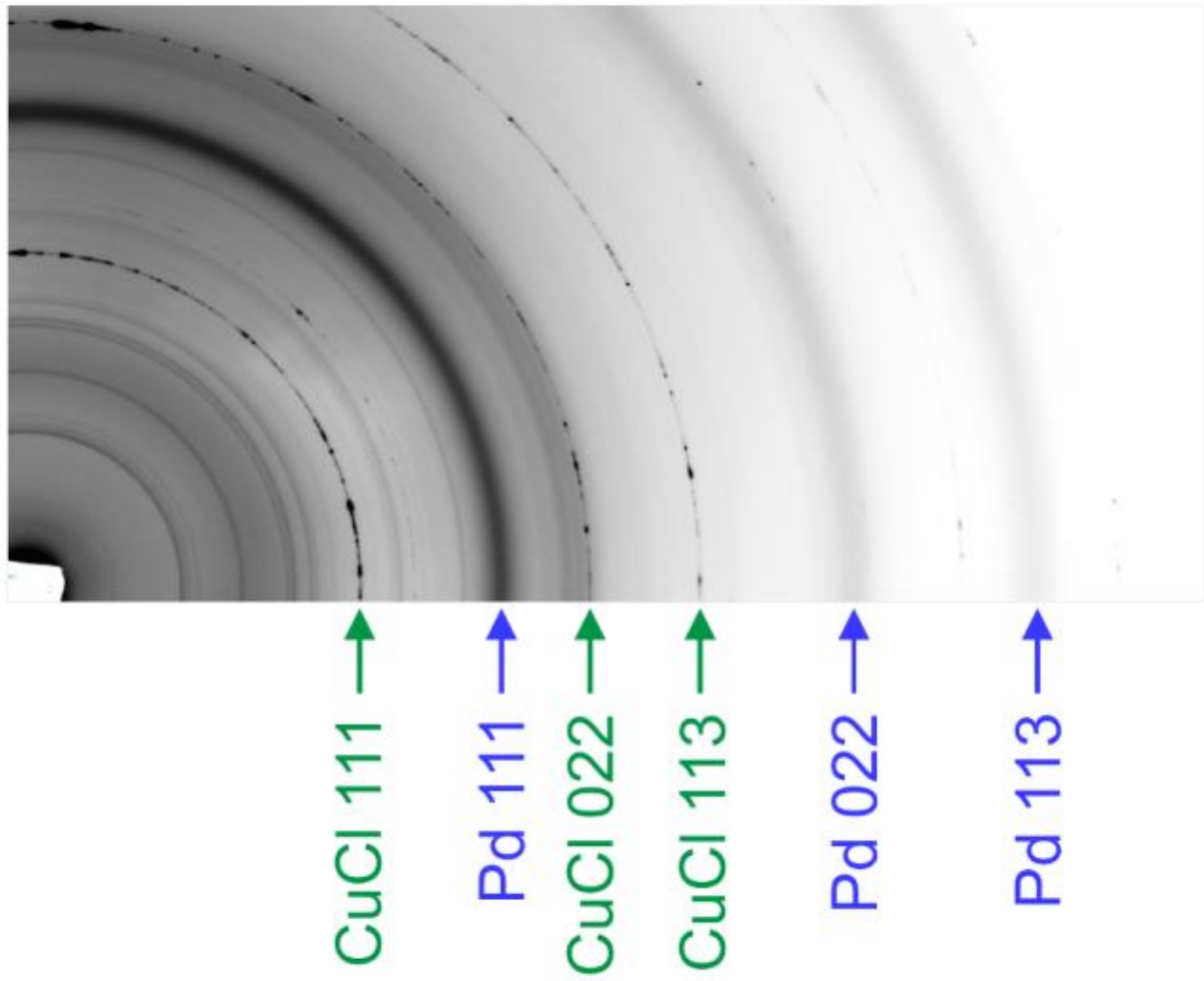


Figure S1 in paper

Stack of 1D diffraction patterns

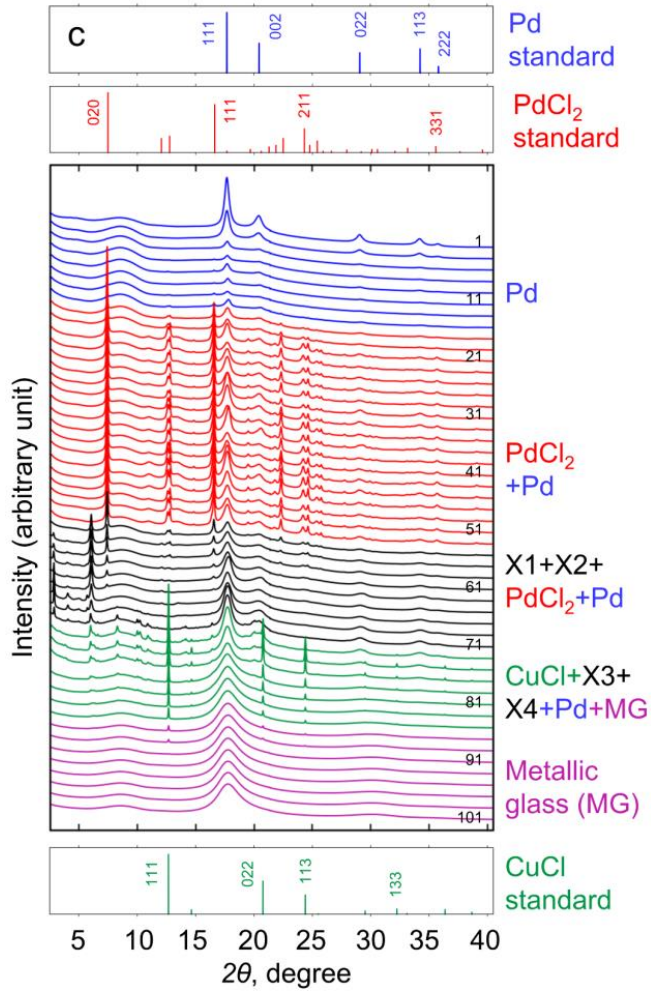


Figure 1c in paper

Extract peak info and calculate lattice spacing

Electrolyte/ Phase	Applied potential [V vs. Ag/AgCl]	Lattice parameter [Å]	Crystallite size [nm]	$n^{d)}$
PS[a)]		3.891(5)	6.8 ± 0.9	82
PS + A[b)]	1.3	3.887(3)	6.9 ± 0.5	43
PS + P[c)]		3.890(4)	5.0 ± 0.6	63
PS + A + P		3.892(3)	6 ± 1	21

Table 2 in paper

HOW I DID THE ANALYSIS ORIGINALLY

- complete chaos!
- conspicuously irreproducible

Documentation

- no repository, no appendix with details, just this:

  stepwise automatically with a constant predefined step size in the interval 3-200 m. Detector calibration and azimuthal integration of raw two-dimensional diffraction patterns were performed with the software DAWN.[45] Crystallite sizes were determined with Scherrer formula.[13] Instrumental broadening was assumed to have a value of 0.1°

  Excerpt paper

Project organization

- very poor organization
- afraid of losing track of which data is where: just leave it as it comes
- inconsistent structure
- mixed raw data with processed data with metadata with Python scripts etc.

Software

- DAWN Science for calibration and azimuthal integration
- Brucker X pert for peak detection, fitting and indexing
- Also used Match for the same thing as it had access to a different database
- CrystalDiffract
- CrystalMaker
- gnuplot for plotting

Version control

- ls | less

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Manuscript Flaviu Synchrotron Advanced Functional Materials ajd.docx
Manuscript Flaviu Synchrotron Advanced Functional Materials.docx
Manuscript Flaviu Synchrotron Advanced Functional Materials.docx.pdf
Manuscript Flaviu Synchrotron Advanced Functional Materials-oa.docx
Manuscript Flaviu Synchrotron Advanced Functional Materials-oa-pfg-ajd.docx
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HOW I WOULD DO THE ANALYSIS NOW

Resources

- Previous THW presentations
- Wilson et al. (2017). Good enough practices in scientific computing. PLoS Comput Biol 13(6): e1005510. https://doi.org/10.1371/journal.pcbi.1005510
- Millman et al. (2018). Teaching Computational Reproducibility for Neuroimaging. Front. Neurosci. 12:727. doi: 10.3389/fnins.2018.00727
- https://github.com/berkeley-stat159/project-alpha
- Matthew Brett. (2017) Curious git (0.2). https://matthew-brett.github.io/curious-git/index.html
- The Internet using DuckDuckGo, Stack Ovferflow

Tools

- Keep it simple!
- This presentation: done in Markdown, converted to pdf with Pandoc
- Version control: git. All git actions done in Bash, used GitHub only as remote repository
- Bash, Emacs, Python
- Instructions in README
- Left Jupyter and Binder for later

Ensuring a reproducible environment

- virtualenv
- made directory venv/ in project root
- pip freeze > requirements.txt, NO! better manually

“Always search for well-maintained software libraries that do what you need”

- fit2d, oldest (?) and most known
- pyFAI, in Python, faster than fit2d
- DAWN Science, it’s a GUI, in Java?
- GSAS-II, in Python and does a lot more!
  https://subversion.xray.aps.anl.gov/trac/pyGSAS

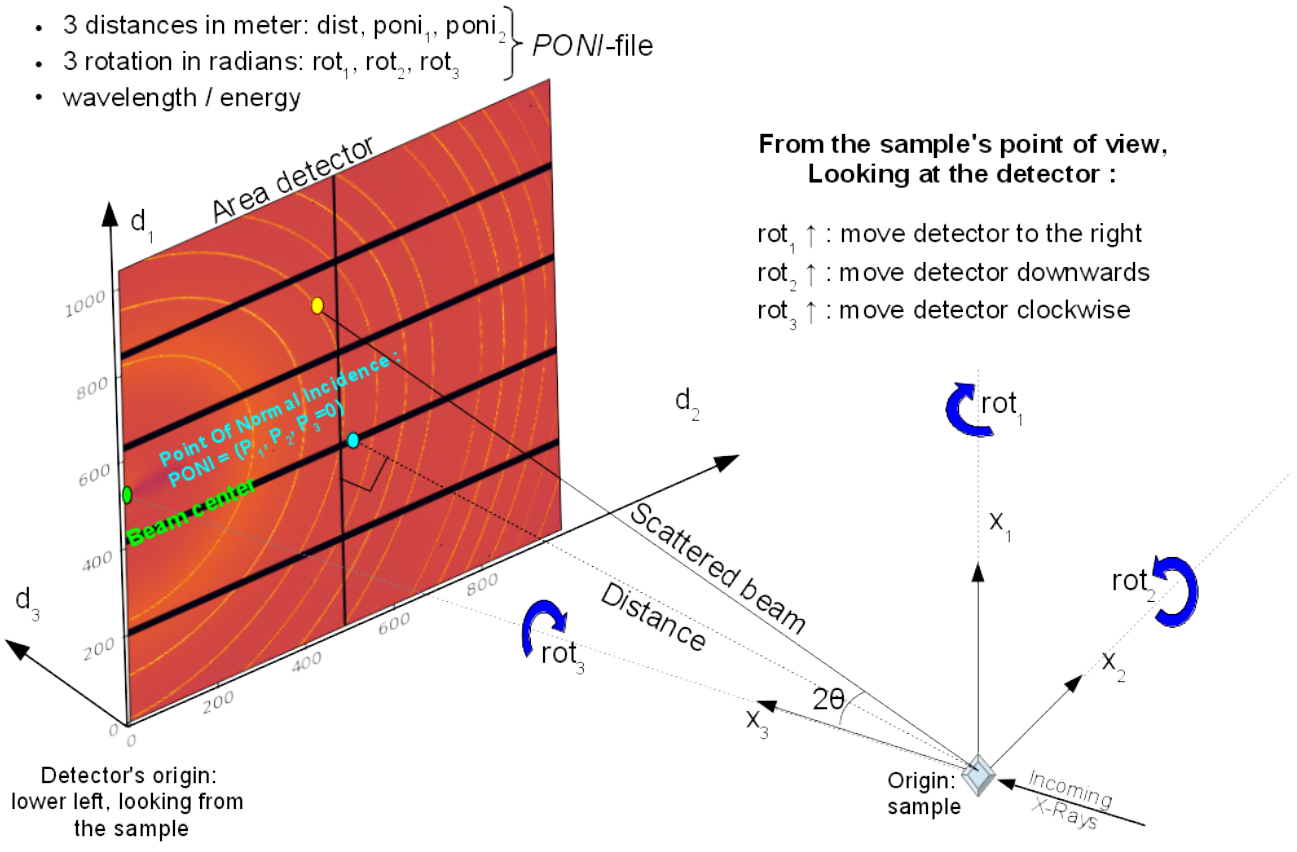
Data processing steps in pyFAI

- Calibration, calibrate experiment geometry and save it to a .poni file
- Azimuthal integration, use the .poni file

pyFAI import does not work

- import function does not work on my .hdf files! -> contact dev team, report bug, contribute?
- use h5py module. Spent a few good hours to understand how it works
- write small script to visualize the groups tree inside hdf files
- dataset is a 3D array (stack of 2D images)
- write function to extract individual diffraction images as 2D numpy arrays

Experiment geometry in pyFAI



PONI - point of normal incidence

Calibration

- normally, done using a GUI
- 'tell' the GUI which ring is which by clicking (!) five points on each ring
- how does one reproduce a click?
- ...
- the calibration determines the geometry of the setup, which is saved in a .poni file

Azimuthal integration

- create an AzimuthalIntegrator (ai) object with the .poni file
- ai.integrate1d(img to integrate as ndarray, etc) all diffration images

Test driven development?

- at the beginning, not really
- because struggling to figure out how everything should work together

Make raw data available

- uploads to Zenodo receive DOI as soon as the data is uploaded so there is no chance to modify it
- uploading an archive 1.3G to Google Drive did not work for me; wget cannot download directories from Google Drive
- finally uploaded 1.3G archive to Figshare
- when entire raw data set is ready, upload to Zenodo. Include code?

To do

- Remove variables from scripts and merge them in a txt file in data/ to avoid errors due to duplication, e.g. wavelength used in several scripts
- Create metadata and store in repository,
- Peak fitting, extract peak
- More plots

Check reproducibility by different people on different machines

- OceanNuclear, mkdir data and clarify README
- Greg, make README more concise and ImportError (tk . . .)
- Observations from auditorium?

Not the last slide

- Data processing workflow is reproducible
- . . . but it does not necessarily imply it is correct
- . . . but at least interested people have the chance to check it

My impressions

- This is so much fun!
- This is better than I imagined because
- I can go back to it anytime and see *exactly* how the analysis was done
- and I or someone else can re-use it for other projects
- this process actually helped better understand the processing of my data and build confidence