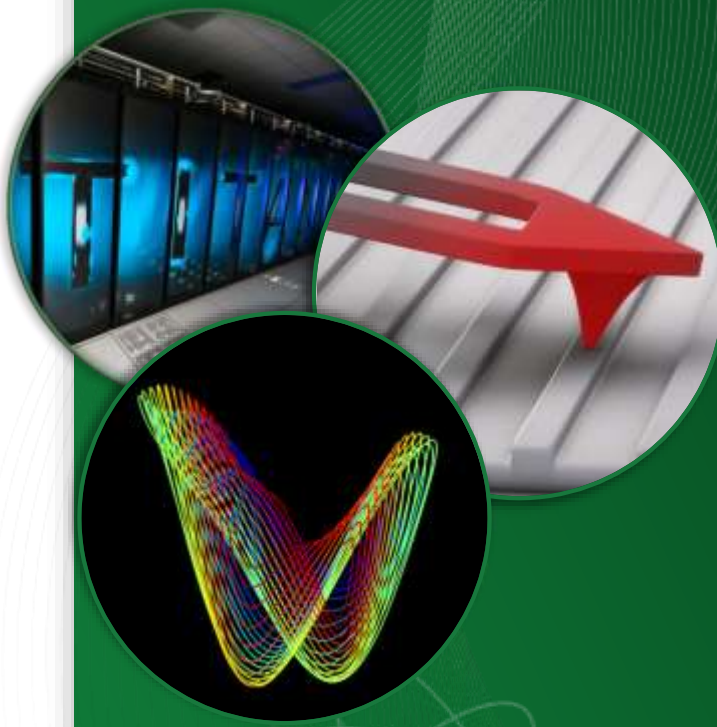
Imaging in the Information Dimension

- Suhas Somnath
- Chris R. Smith
- Stephen Jesse



OAK RIDGE National Laboratory | OAK RIDGE LEADERSHIP COMPUTING FACILITY

INSTITUTE FOR FUNCTIONAL IMAGING OF MATERIALS
OAK RIDGE NATIONAL LABORATORY | CENTER FOR NANOPHASE MATERIALS SCIENCES

Multitude of Instruments

Micro Raman Microscope

Atomic Force Microscope (AFM)

AFM with Infrared spectroscopy (AFM-IR)

Scanning Tunneling Microscope (STM)

Scanning Transmission Electron Microscope (STEM)

AFM with Raman spectroscopy

Suhas Somnath, somnaths@ornl.gov

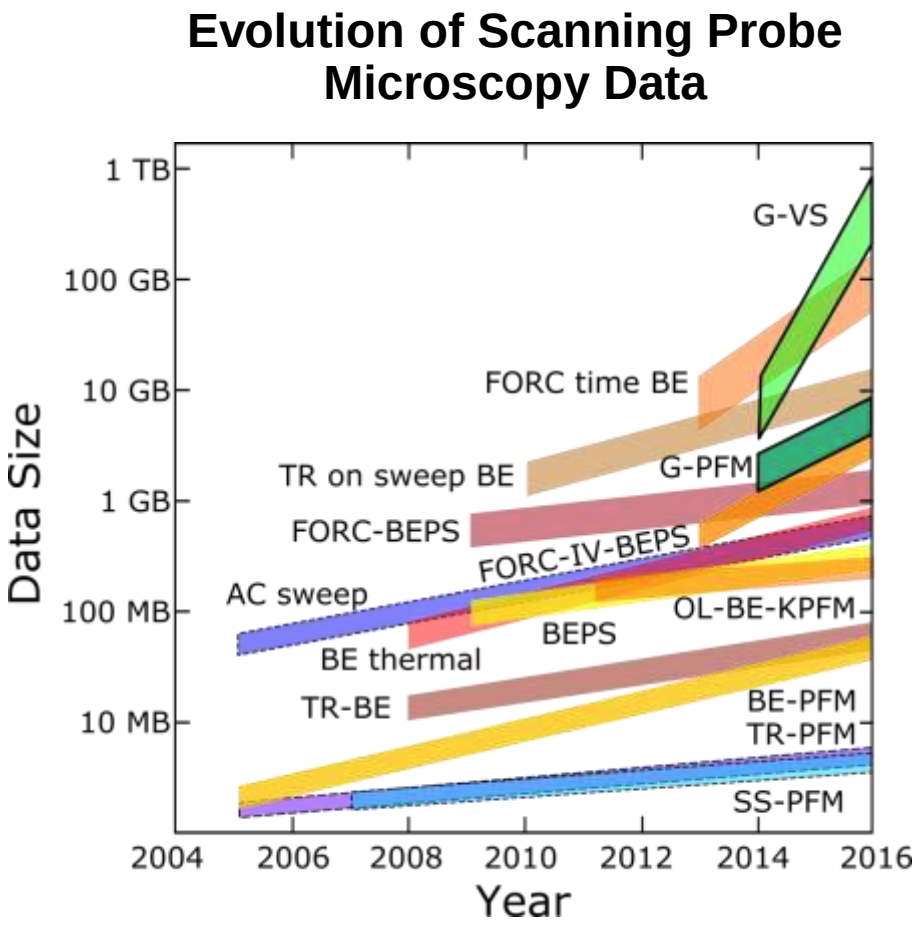
What we wanted

Instrument Tier

?

Interactive visualization, analysis, storage on supercomputers

Growing Data Sizes and Dimensionality



- Data sizes have grown from ~ 10 MB to ~ 1 TB in 10 years!
- Dimensionality ranges from 1D spectra to 7D hyperspectral datasets
- Cannot use laptops to analyze data

Kalinin et al., *ACS Nano*, 9068-9086, 2015

Instrumentation Software Inadequate for Analysis

- Software provided for controlling instruments typically only comes with basic data analysis capabilities
- Integrating user-developed functionality often impossible

Multitude of File Formats

.wdf

.ibw

.cdb

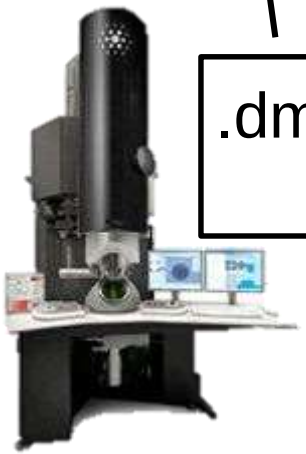
- Proprietary
- Incompatible

≠

.asc

.dm3

.mat



Disjoint & Unorganized Communities

- Clustering
- Fit spectra …

IGOR Pro

- Filter Image
- Register Image …

- Fit Spectra
- SVD Filtering …

- FFT Filtering
- SVD Filtering …

julia

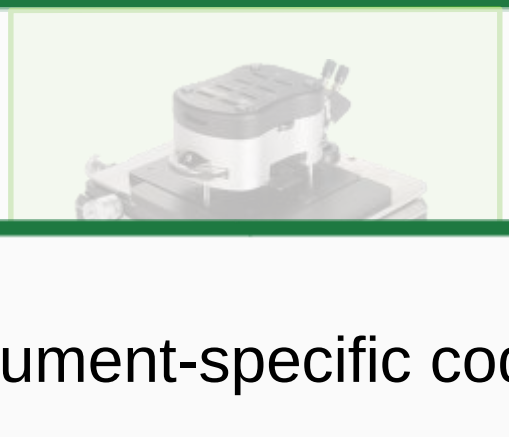
- FFT Filtering
- Classify Images …

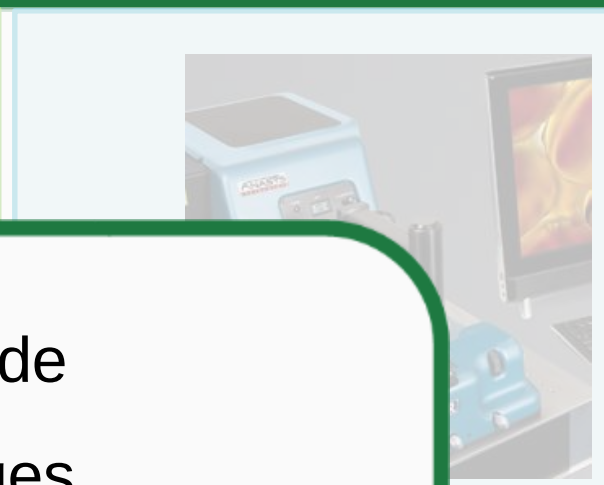
python

- Register Images
- Clustering

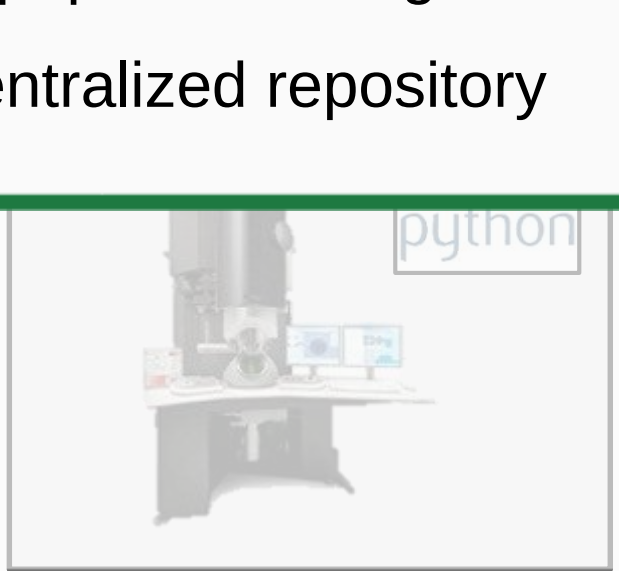
MATLAB

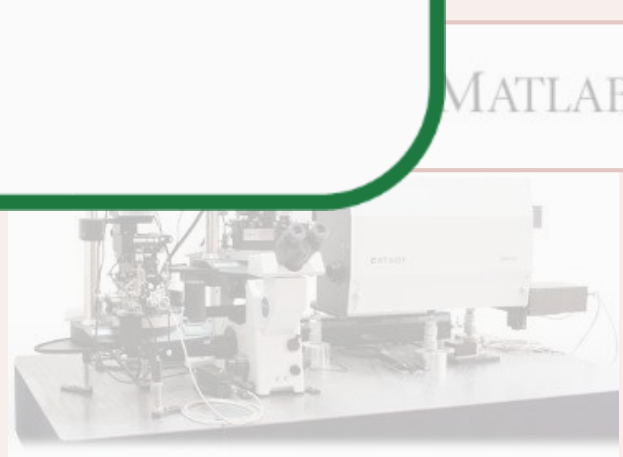
Cannot Share Code Efficiently





- HIGHLY instrument-specific code
- Different programming languages
- Often licensed / costly software like Matlab
- Most popular sharing method = email!
- No centralized repository





~~Problems~~ Opportunities in Imaging

1. Closed science
   a. No traceability for data analysis
   b. Results not (readily) reproducible
2. Multiple, incompatible, proprietary data formats
3. Disorganized and unorganized communities
4. No proper analysis software
5. Growing data volumes, variety, and dimensionality

The Solution

Instrument Tier

Automated, standardized, modularized data acquisition

Instrument-agnostic, self-describing, model in HPC-friendly file format

Centralized repository for data processing, analysis

Interactive visualization + analysis + storage on supercomputers

Expectation of Data Model

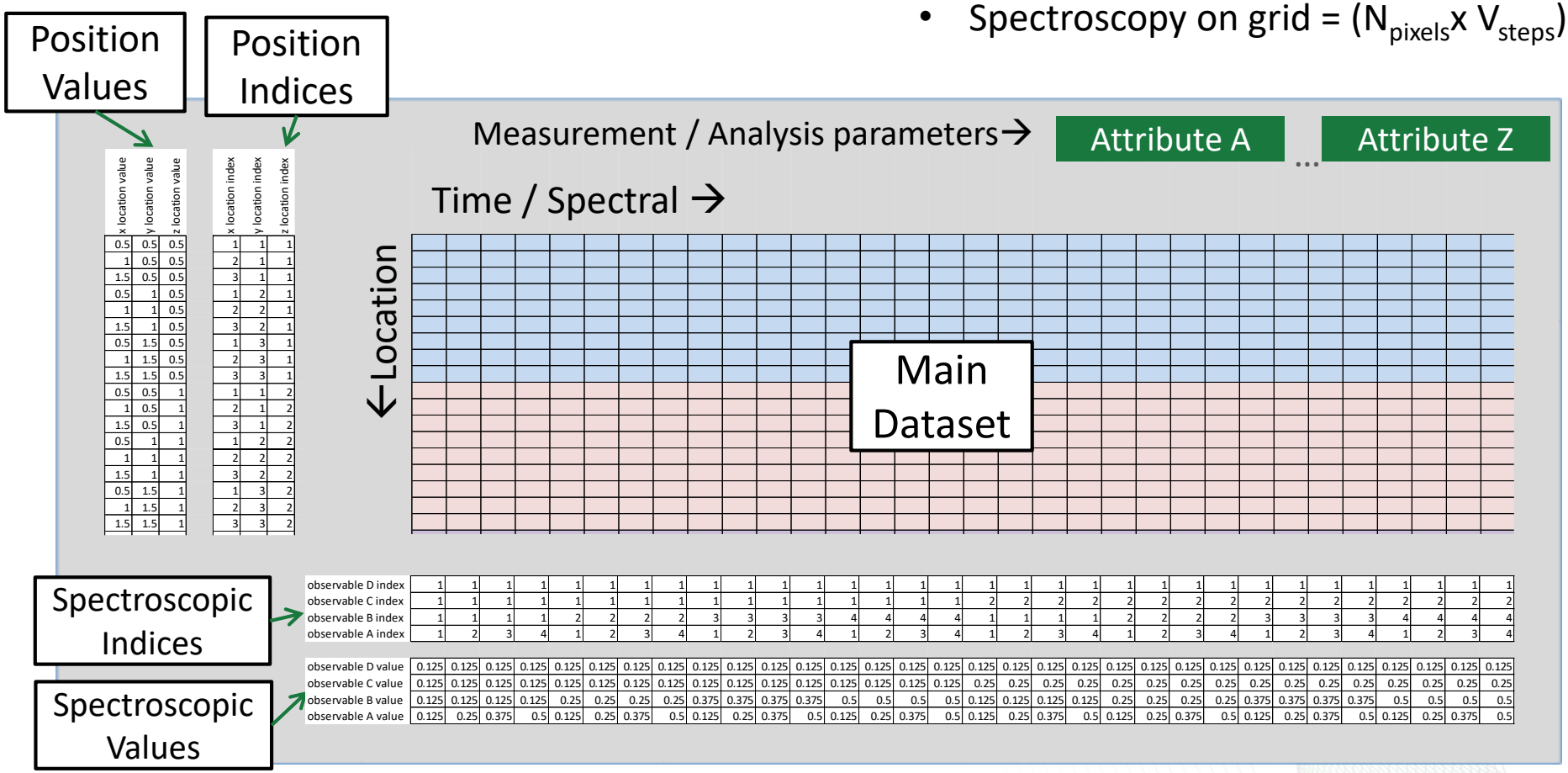
- Accommodate data of different shapes, dimensionalities, precision and sizes.
- Accommodate data without N-dimensional form
  - Compressed sensing / sparse sampling
  - Not all combinations of spectroscopic variables
  - Incomplete experimental data

Universal Imaging and Spectroscopic Data (USID)

- Data stored as 2D matrix of (position x spectral values) regardless of dimensionality
- Ancillary datasets explain the data

Example data types:

- 2D images = (N_{pixels} x 1)
- Single spectra = (1 x Z_{steps})
- Spectroscopy on grid = (N_{pixels}x V_{steps})



x location value	y location value	z location value
0.5	0.5	0.5
1	0.5	0.5
1.5	0.5	0.5
0.5	1	0.5
1	1	0.5
1.5	1	0.5
0.5	1.5	0.5
1	1.5	0.5
1.5	1.5	0.5
0.5	0.5	1
1	0.5	1
1.5	0.5	1
0.5	1	1
1	1	1
1.5	1	1
0.5	1.5	1
1	1.5	1
1.5	1.5	1

x location index	y location index	z location index
1	1	1
2	1	1
3	1	1
1	2	1
2	2	1
3	2	1
1	3	1
2	3	1
3	3	1
1	1	2
2	1	2
3	1	2
1	2	2
2	2	2
3	2	2
1	3	2
2	3	2
3	3	2

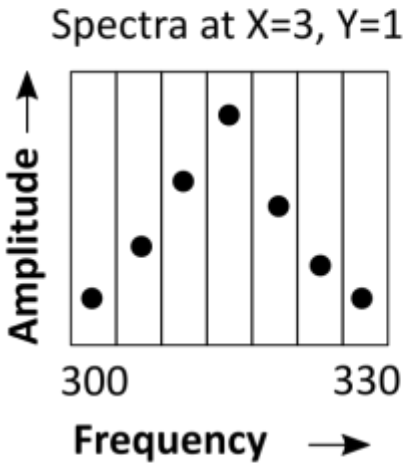
observable D index	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
observable C index	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2
observable B index	1	1	1	1	2	2	2	2	3	3	3	3	4	4	4	4	1	1	1	1	2	2	2	2	3	3	3	3	4	4	4	4
observable A index	1	2	3	4	1	2	3	4	1	2	3	4	1	2	3	4	1	2	3	4	1	2	3	4	1	2	3	4	1	2	3	4

observable D value	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125
observable C value	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.125	0.25	0.25	0.25	0.25	0.25	0.25	0.25	0.25	0.25	0.25	0.25	0.25	0.25	0.25	0.25	0.25
observable B value	0.125	0.125	0.125	0.125	0.25	0.25	0.25	0.25	0.375	0.375	0.375	0.375	0.5	0.5	0.5	0.5	0.125	0.125	0.125	0.125	0.25	0.25	0.25	0.25	0.375	0.375	0.375	0.375	0.5	0.5	0.5	0.5
observable A value	0.125	0.25	0.375	0.5	0.125	0.25	0.375	0.5	0.125	0.25	0.375	0.5	0.125	0.25	0.375	0.5	0.125	0.25	0.375	0.5	0.125	0.25	0.375	0.5	0.125	0.25	0.375	0.5	0.125	0.25	0.375	0.5

Detailed information on pyUSID website

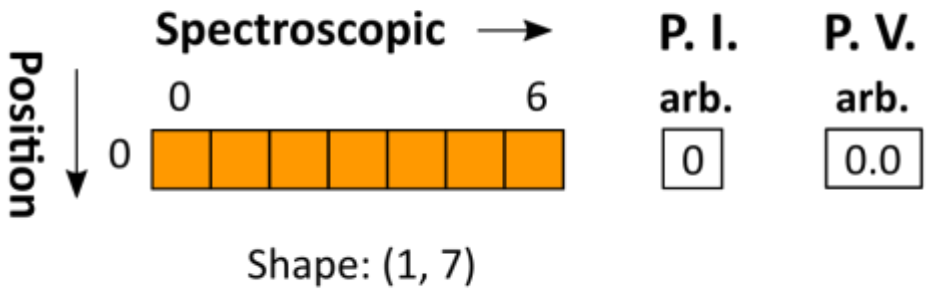
USID – 1D spectra

Original N-dimensional form



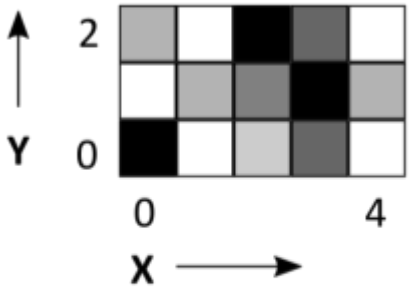
Shape: (7,)
Quantity: Amplitude
Units: V

USID 2-dimensional form



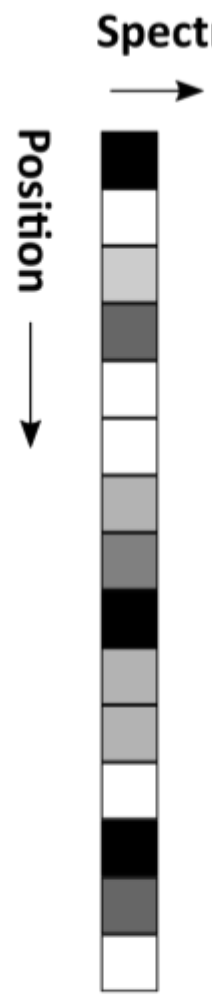
S. I.	Frequency	0	1	2	3	4	5	6
S. V.	Frequency	300	305	310	315	320	325	330

USID – 2D Image



Original N-D form

=



P. I. X	P. I. Y	P. V. X	P. V. Y
0	0	-250	0
1	0	-125	0
2	0	0	0
3	0	125	0
4	0	250	0
0	1	-250	3.5
1	1	-125	3.5
2	1	0	3.5
3	1	125	3.5
4	1	250	3.5
0	2	-250	7
1	2	-125	7
2	2	0	7
3	2	125	7
4	2	250	7

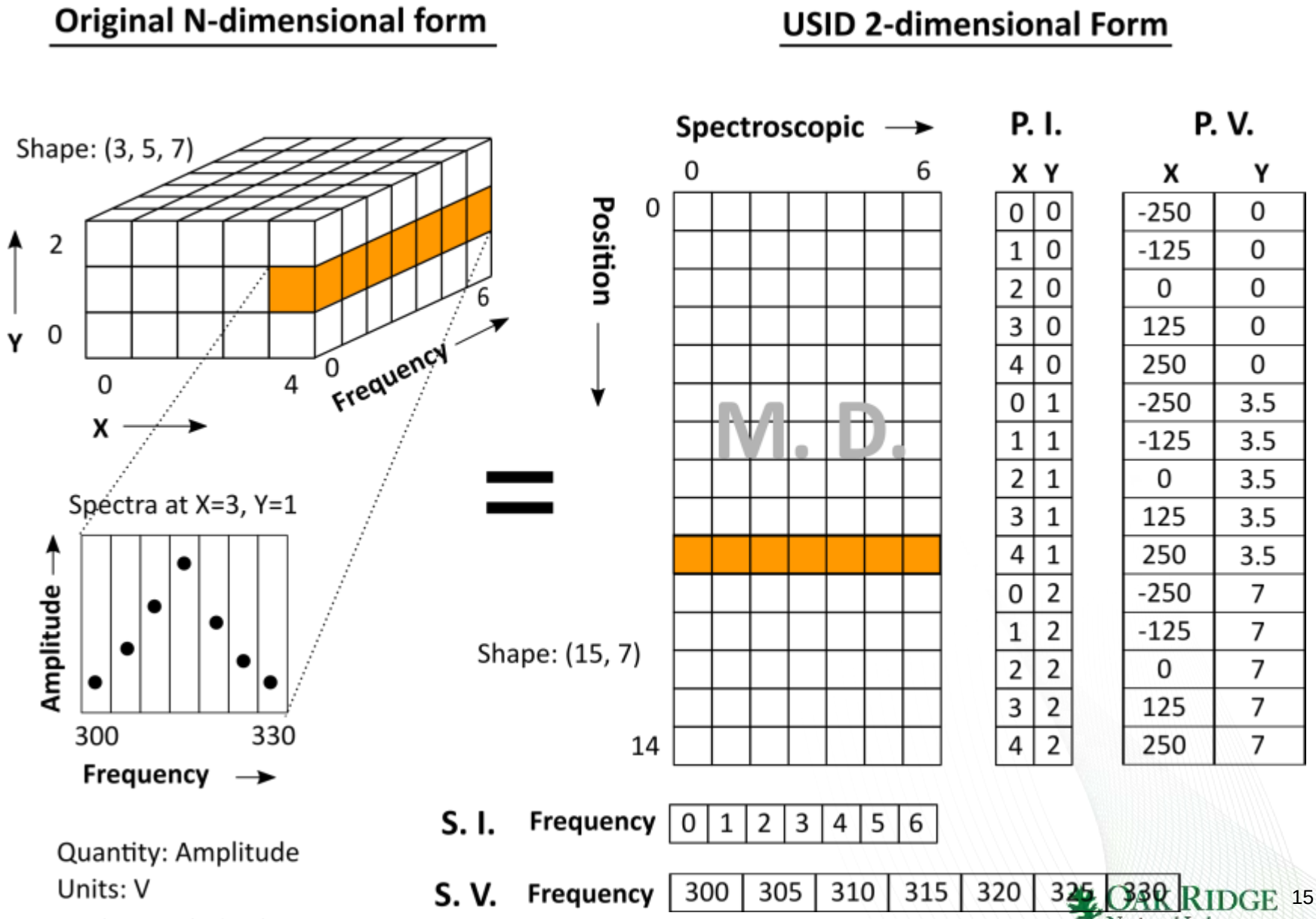
Shape: (15, 1)

USID 2D form

Quantity: Intensity
Units: arb. units

S. I.	arb.	0
S. V.	arb.	0.0

USID – Spectra on Grid (3D)



P. I. X	P. I. Y	P. V. X	P. V. Y
0	0	-250	0
1	0	-125	0
2	0	0	0
3	0	125	0
4	0	250	0
0	1	-250	3.5
1	1	-125	3.5
2	1	0	3.5
3	1	125	3.5
4	1	250	3.5
0	2	-250	7
1	2	-125	7
2	2	0	7
3	2	125	7
4	2	250	7

S. I. Frequency	0	1	2	3	4	5	6

S. V. Frequency	300	305	310	315	320	325	330

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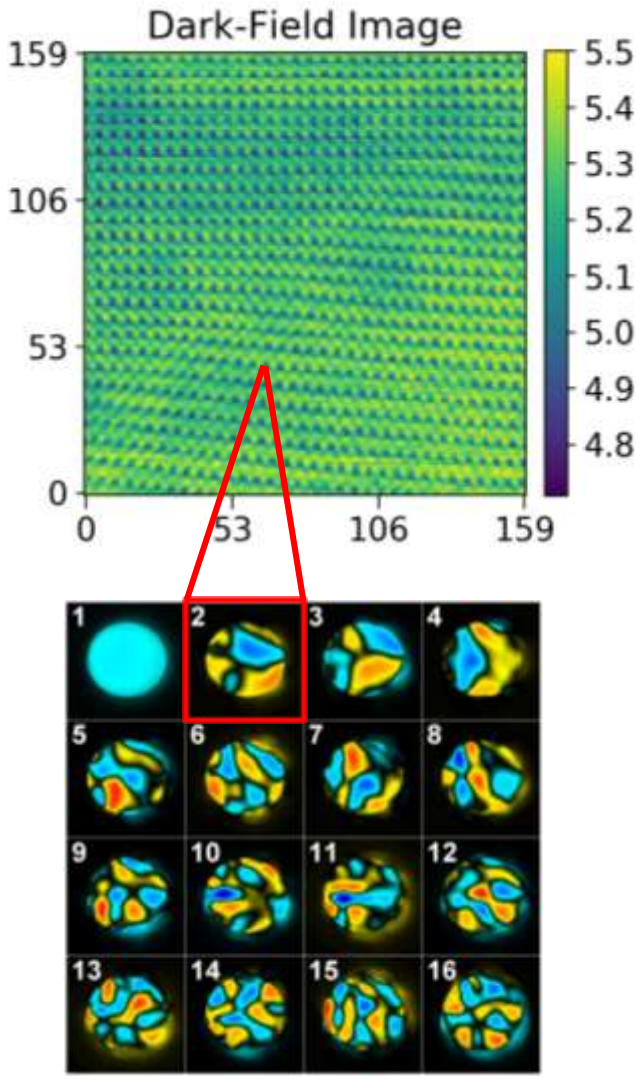
USID – Images on a grid (4D)



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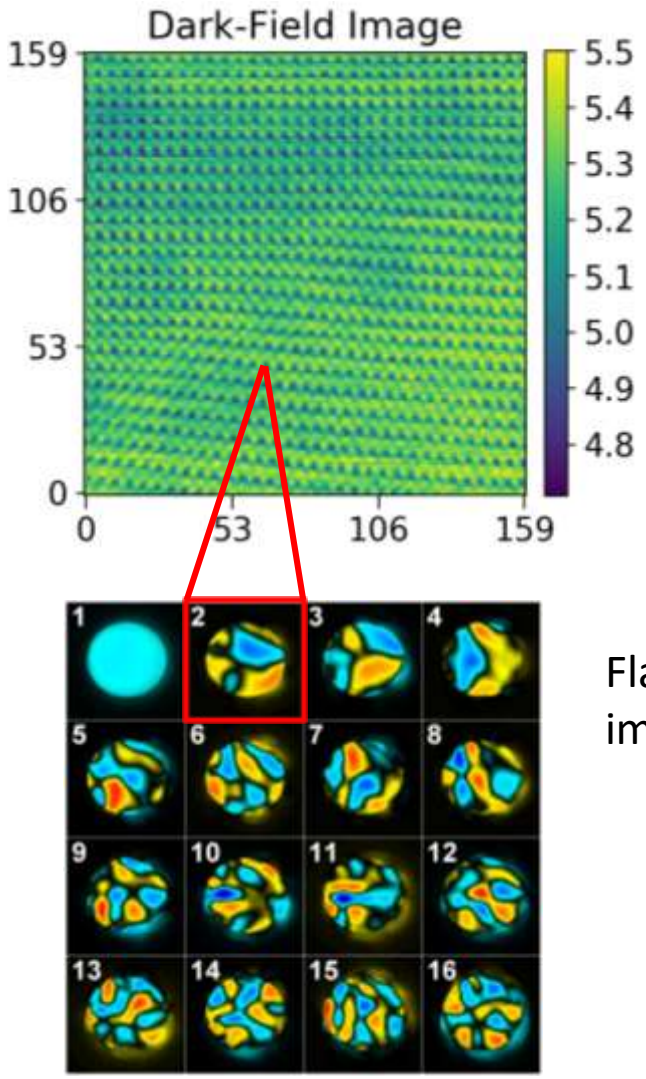
USID – Images on a grid (4D)



Flatten positions

Flatten images

Spectroscopic →

Position

	0						6
0							
			M. D.				
14							

.5, 7)

P. I.	
X	Y
0	0
1	0
2	0
3	0
4	0
0	1
1	1
2	1
3	1
4	1
0	2
1	2
2	2
3	2
4	2

P. V.	
X	Y
-250	0
-125	0
0	0
125	0
250	0
-250	3.5
-125	3.5
0	3.5
125	3.5
250	3.5
-250	7
-125	7
0	7
125	7
250	7

S. V.

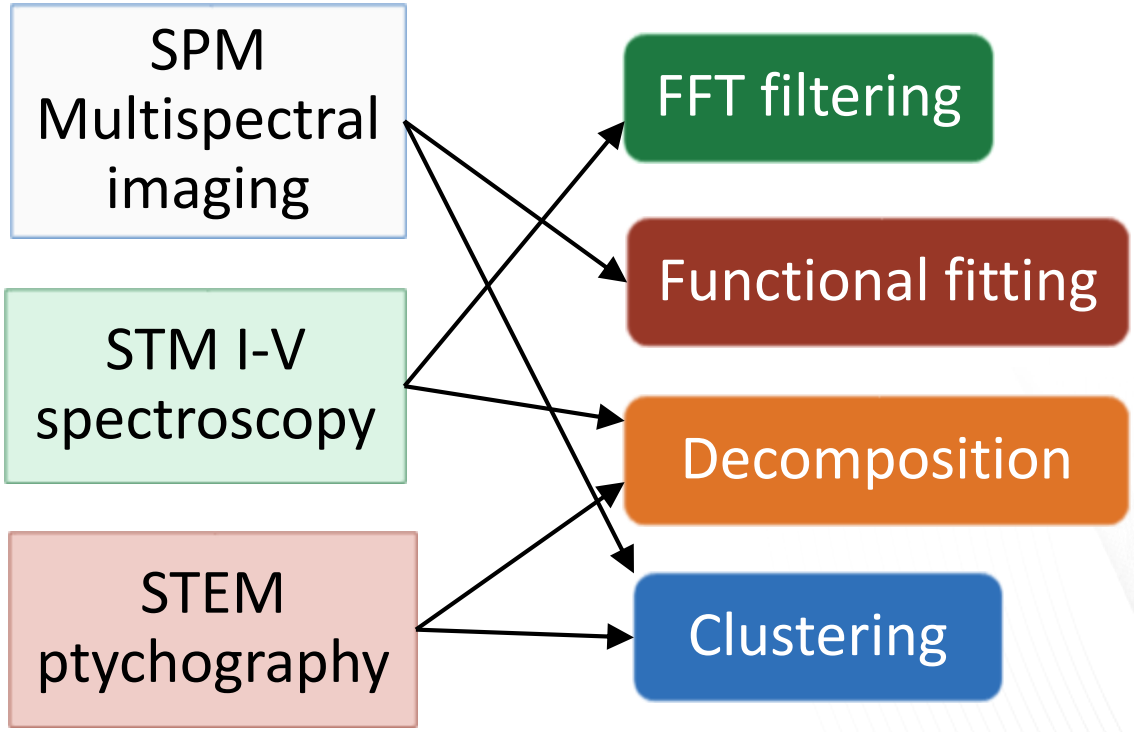
0	0	0	0	0	3.5	3.5	3.5	3.5	3.5	7	7	7	7	7
-250	-125	0	125	250	-250	-125	0	125	250	-250	-125	0	125	250

S. I.

0	1	2	3	4	0	1	2	3	4	0	1	2	3	4
0	0	0	0	0	1	1	1	1	1	2	2	2	2	2

USID - Instrument Agnostic Code

- Instrument-agnostic data allows instrument-agnostic code
- Single version of analysis and processing routine
- Brings multiple scientific communities together



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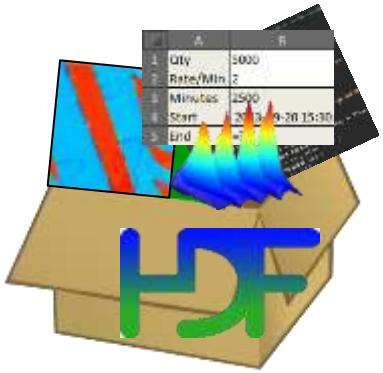
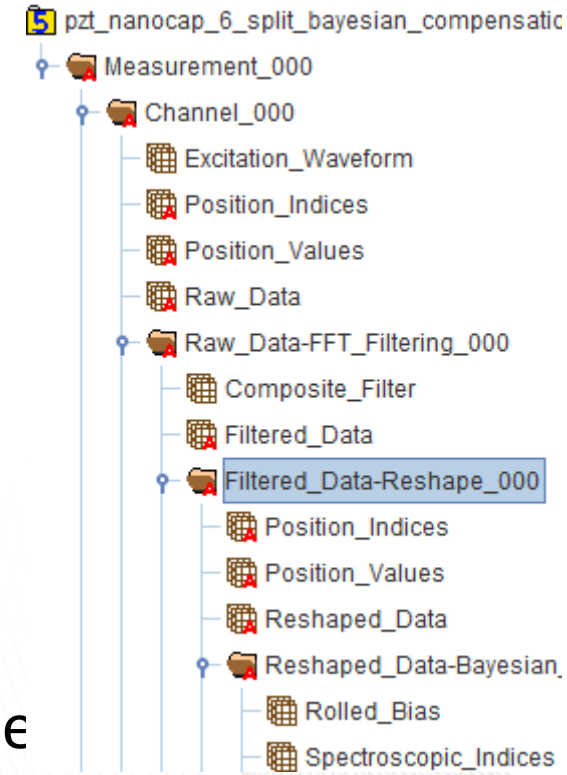
Hierarchical Data Format (HDF5)

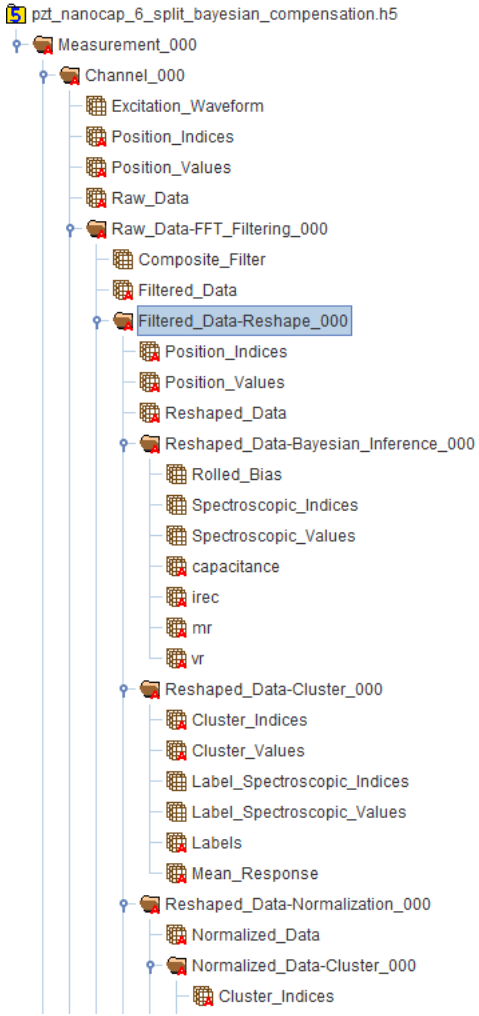
- A HDF5 file is a smart container
  - Capable of storing multidimensional datasets, Images, text, measurement parameters, etc.
  - Contents organized like traditional folders and files
    - **Groups** - Analogous to file folders
    - **Dataset** – 1 to N dimensional data
      - Integer, floating point, complex numbers etc
    - **Attributes** – {Key : value} pairs useful for describing data and experimental parameters, etc.
- Easily accessible – C, C++, python, Java….
- Tree structure + nomenclature +attributes are **records of workflow** applied to dataset
- Parallel read / write, HPC & cloud compatible





Traceability and Reproducibility

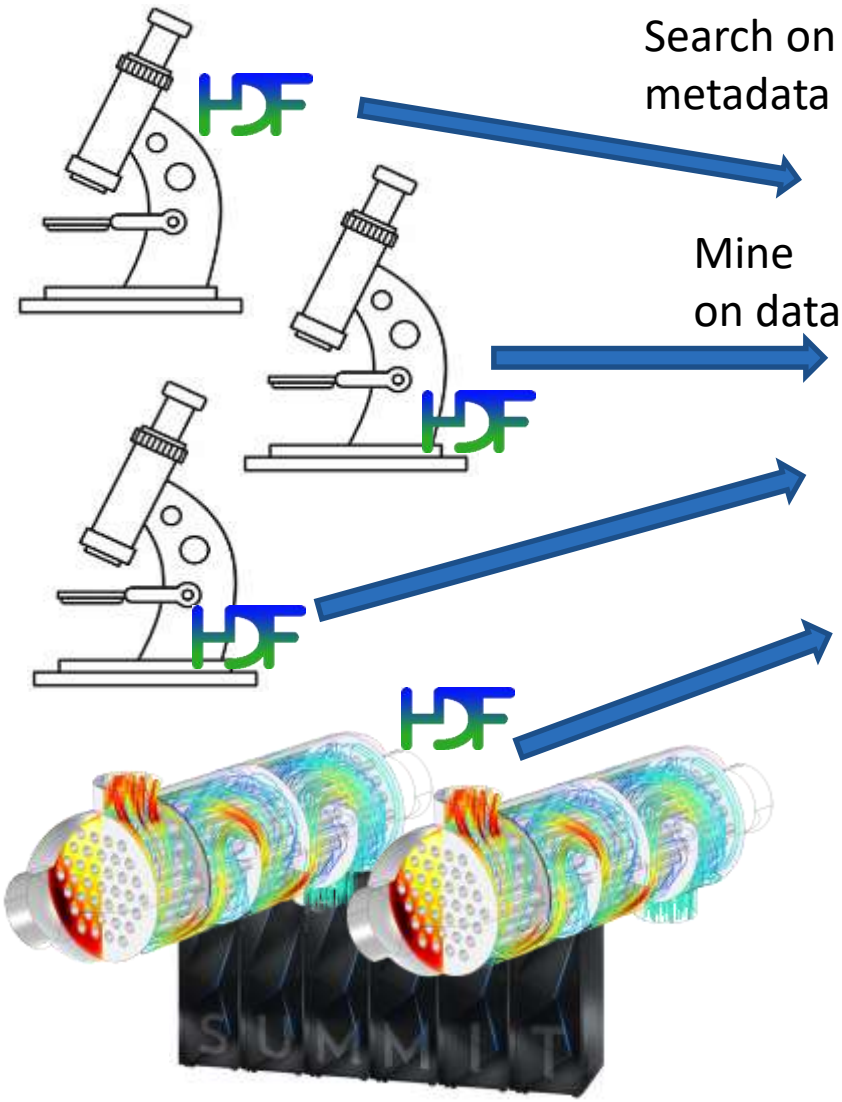
Raw, intermediate, final results stored in same file, leveraging hierarchy

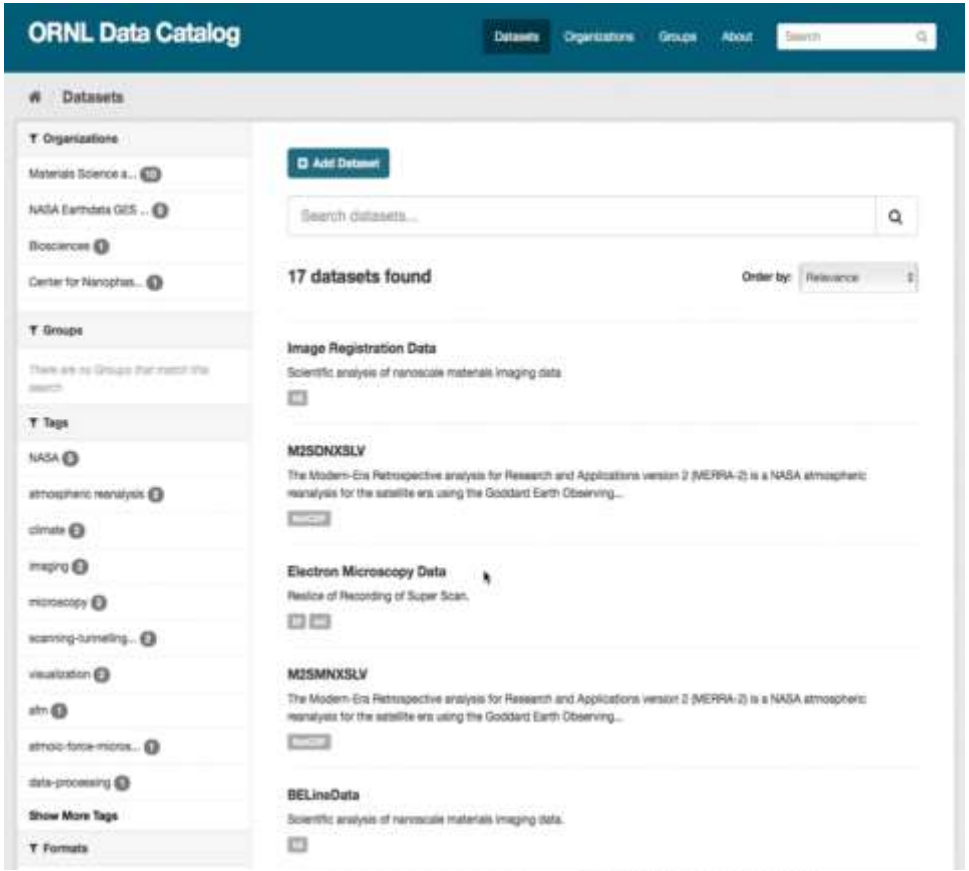


All measurement and analyses parameters stored for repeatability

```
Measurement_000 (2088, 4)
    Group size = 1
    Number of attributes = 43
        BE_actual_scan_time_[s] = 0.004
        BE_amplitude_[V] = 4
        BE_auto_smoothing = auto smoothing on
        BE_band_edge_trim = 0.14614
        BE_band_smoothing_[Hz] = 2560.5
        BE_band_width_[Hz] = 60000
        BE_bins_per_band = 0
        BE_center_frequency_[Hz] = 370000
        BE_phase_variation = 1
        BE_points_per_BE_wave = 0
        BE_repeats = 8
        BE_signal_type = chirp-sinc hybrid
        BE_time/pixel_[s] = 0.004
        File_date_and_time = 06-Feb-2015 11:46:13
        File_file_name = BELine
        File_file_path = C:\Users\Administrator\Documents\Asylum Research Data\150205\
        File_file_suffix = 9
        IO_AO_amplifier = 1
        IO_AO_range_[V] = +/- 10
        IO_Analog_Input_1 = +/- 1V, FFT
        IO_Analog_Input_2 = +/- 10V, mean
        IO_Analog_Input_3 = off
        IO_Analog_Input_4 = off
        IO_DAQ_platform = NI 5412/5122
        IO_rate_[Hz] = 4000000
        data_type = BELineData
        grid_contact_set_point_[V] = 1
        grid_current_row = 1
        grid_cycle_time_[s] = 0.05
        grid_lift_height_[m] = 5.0E-8
        grid_nap_mode = nap mode off
        grid_num_cols = 128
        grid_num_rows = 128
        grid_scan_time_/_line_[s] = 1
        grid_time_remaining_[h:m:s] = 10
        grid_total_time_[h:m:s] = 10
        machine_id = mac109728.ornl.gov
        num_bins = 44
        num_pix = 16384
        num_udvs_steps = 1
        platform = Darwin-17.4.0-x86_64-i386-64bit
        pycroscopy_version = 0.60.0rc1
        timestamp = 2018_05_03-15_23_37
```

Facilitating Data Mining



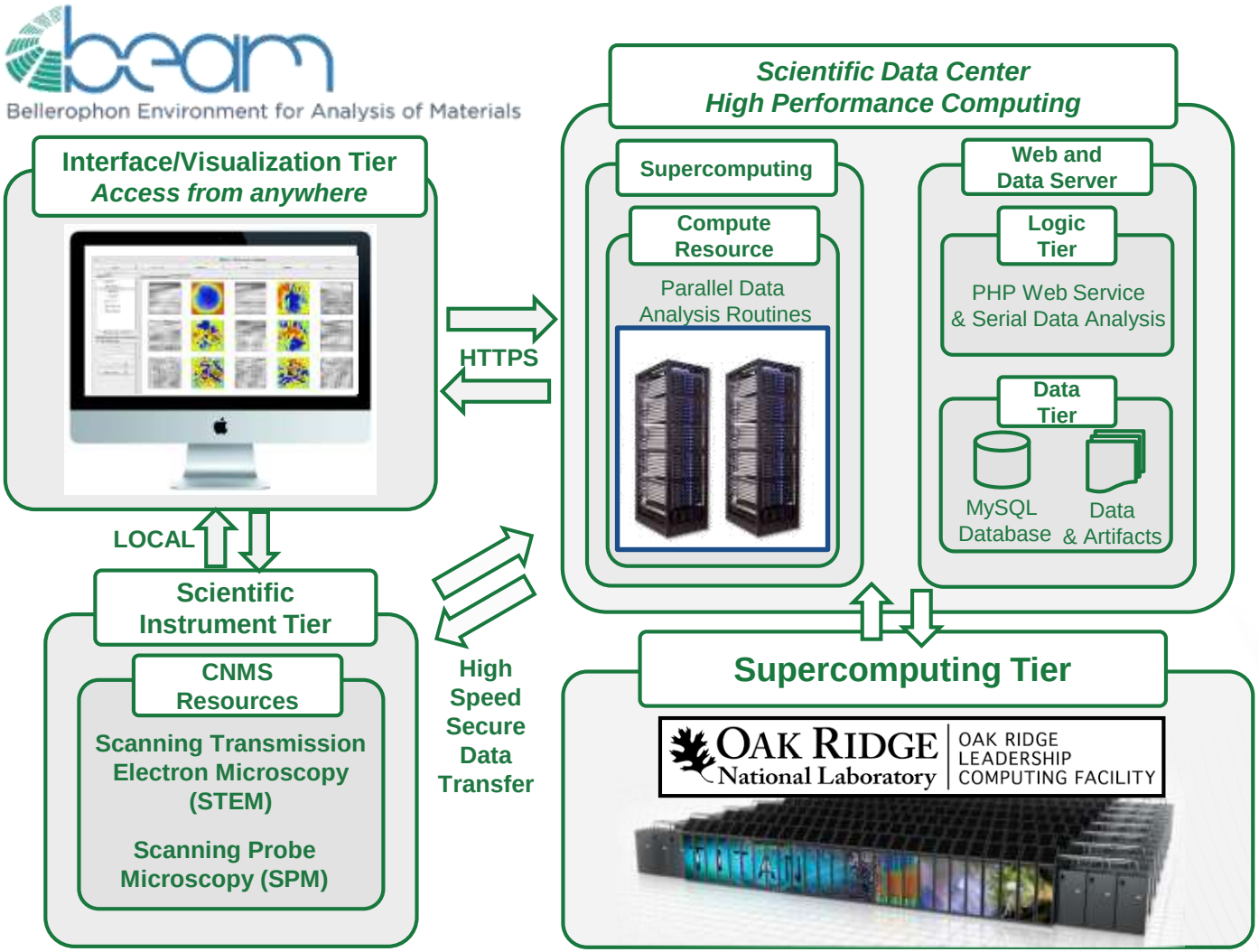


Expectation from Software

- Easy to learn and understand
- Strong support-base
- Established community standard
- Straightforward to implement and maintain
- Optimized libraries for scientific and numeric algorithms
- Access to existing imaging related packages
- Free
- Scalable to multiple CPU cores + distributed computing

(Purely) Programmer-Driven Solution

Software connecting scientific instruments to supercomputers



- **Successes**:
  - Easy to use – Point-click
  - Fast – on super-computers
- **Shortcomings**:
  - Very long development cycle
  - Very expensive
  - Brittle (points of failure)
  - Scientists had no control!!

Lingerfelt et al., *Procedia Computer Science* **80**, 2276-2280 (2016).

Python for Scientific Research

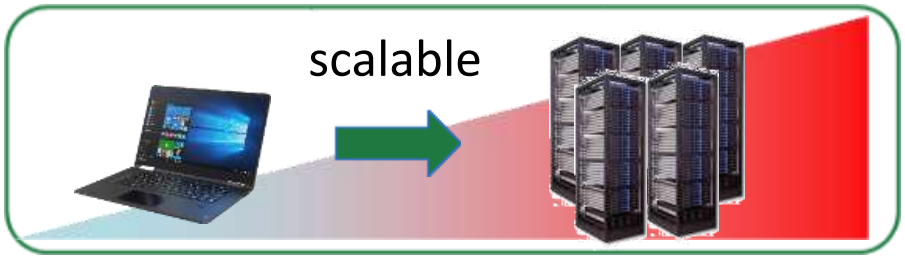
Very easy to learn + code

Numerous, **powerful** libraries for science

scikit learn

NumPy

SciPy



Strong user community

stackoverflow

open source™

- Facilitates innovation
- More robust code
- Improved adoption of new methods / standards
- Accelerates scientific progress

Cross-platform

Windows MacOS Linux

Established standard for:

- Microscopy
- Microbiology
- Deep learning
- Data science
- Neutron science
- More!

All for a princely sum of …. **$0!**

See Jake Vanderplas' Pycon 2017 Keynote talk:
http://www.youtube.com/watch?v=ZyjCqQEUa8o&t=19m20s

(2) Software Packages

- Written in Python
- Open source & free
- Written by scientists
- Data centric
- Instrument-independent data model in HDF5
- Instrument-independent analysis algorithms
  - Reusable across scientific domains

pyUSID

Software Organization

pycroscopy

I/O
- Data translators (proprietary formats to HDF5)

Visualization
- Plotting utilities
- Jupyter widgets

Simulation
- AFM Force-distance …

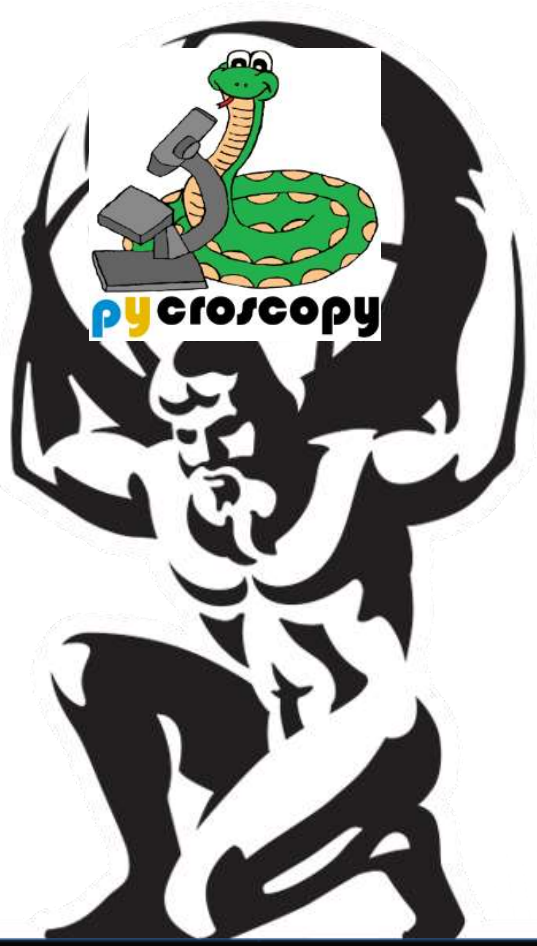
Analysis
- Physical model specific
- Fitting to model, etc.
- Physics based regression

Processing
- Physical model agnostic
- Image filtering, registration,
- Multivariate analysis

pyUSID
- HDF5 file i/o operations
- Base data processing,
- visualization…

Software Organization

Science / data analytics applications



File / data tools

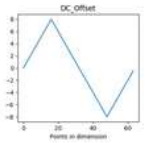
pyUSID

Well documented

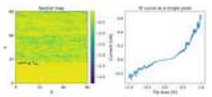
Beginner topics

To learn **how to use pyUSID**, Please go through the following documents in the recommended order:

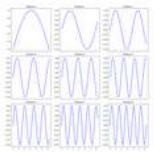
01. Primer to HDF5 and h5py



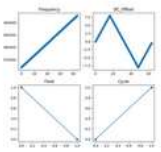
02. The USIDataset



03. Translation and the NumpyTranslator



04. Plotting utilities

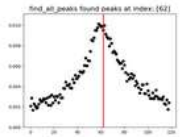


05. Utilities for reading h5USID files

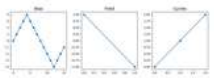
Intermediate topics

To learn **how to write to h5USID files, write data processing classes, or adding functionality to pyUSID**, go through these additional documents in the recommended order: Those interested in contributing to pyUSID are encouraged to read our guidelines for contributing code

06. Utilities for handling



07. Speed up



08. Utilities that assist

reshape_to_Ndims(*h5_main, h5_pos=None, h5_spec=None, get_labels=False, verbose=False, sort_dims=False*) [source]

Reshape the input 2D matrix to be N-dimensions based on the position and spectroscopic datasets.

Parameters:

- **h5_main** (*HDF5 Dataset*) – 2D data to be reshaped
- **h5_pos** (*HDF5 Dataset, optional*) – Position indices corresponding to rows in *h5_main*
- **h5_spec** (*HDF5 Dataset, optional*) – Spectroscopic indices corresponding to columns in *h5_main*
- **get_labels** (*bool, optional*) – Whether or not to return the dimension labels. Default False
- **verbose** (*bool, optional*) – Whether or not to print debugging statements
- **sort_dims** (*bool*) – If True, the data is sorted so that the dimensions are in order from fastest to slowest If False, the data is kept in the original order If *get_labels* is also True, the labels are sorted as well.

Returns:

- **ds_Nd** (*N-D numpy array*) – N dimensional numpy array arranged as [positions slowest to fastest, spectroscopic slowest to fastest]

To view the filt
('ifft2'). Remem
necessary to us
transform. Also
the inverse trar
symmetric abo
result in the inv
times smaller t
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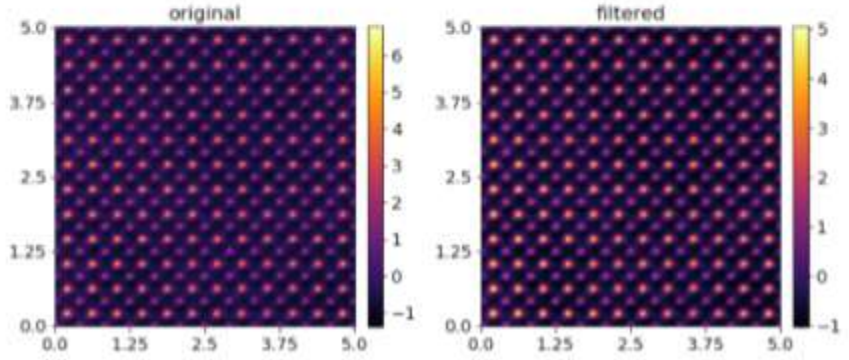
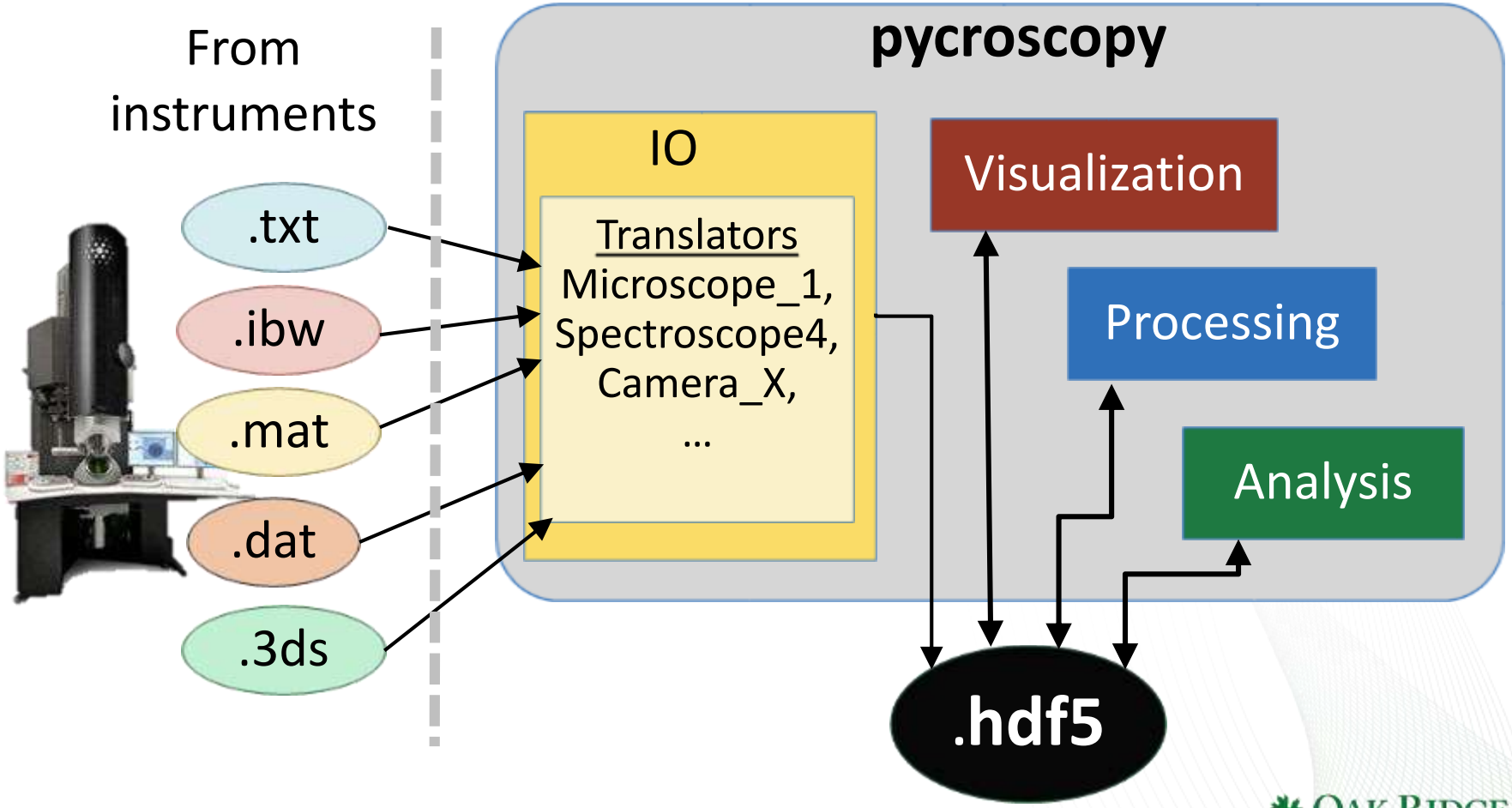
```
image_filtere
image_filtere

fig, axes = plt.subplots(ncols=2, figsize=(10, 5))
for axis, img, title in zip(axes, [image_raw, image_filtered], ['original', 'filtered']):
    _ = px.plot_utils.plot_map(axis, img, cmap=plt.cm.inferno,
                               x_size=x_edge_length, y_size=y_edge_length, num_ticks=5)
    axis.set_title(title)
fig.tight_layout()
```



Entering the USID Ecosystem

- hdf5 file is the hub for all operations
- Analysis, processing, visualization available after translation to .hdf5



Jupyter Notebooks

Jupyter Notebook

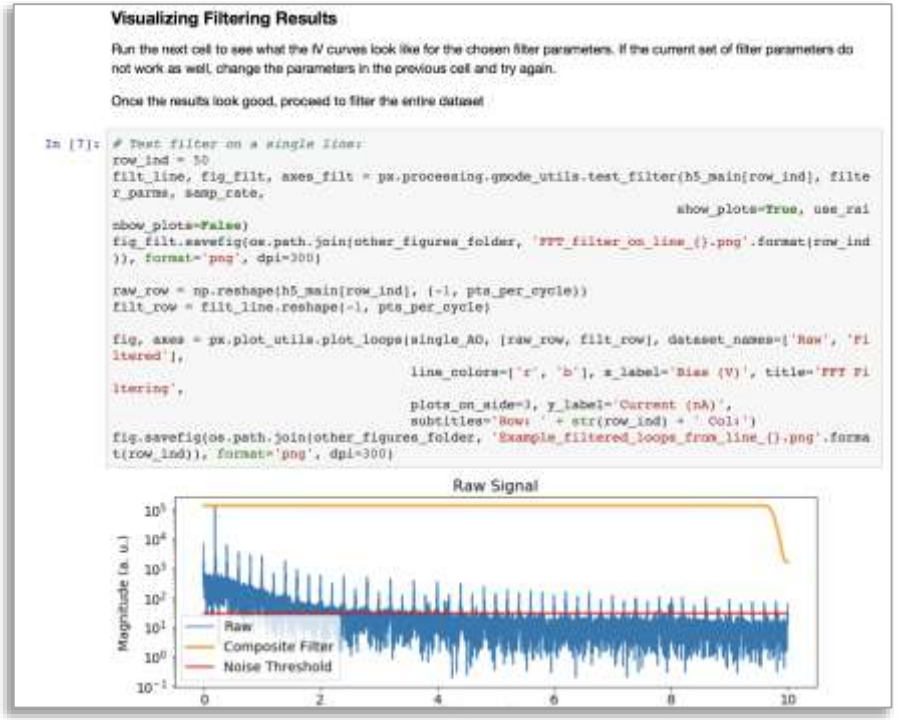
- Interactive documents
- Exploratory programming
- Code
- Text
- Images
- Interactive – slice through data, pan, move, rotate …

Truly Achieving Open Science, Reproducibility

Aim – ALL scientific journal papers accompanied with:

- Jupyter notebook that shows all analysis (raw data → figures).
- Data with DOI number

Jupyter notebook associated with paper



Visualizing Filtering Results

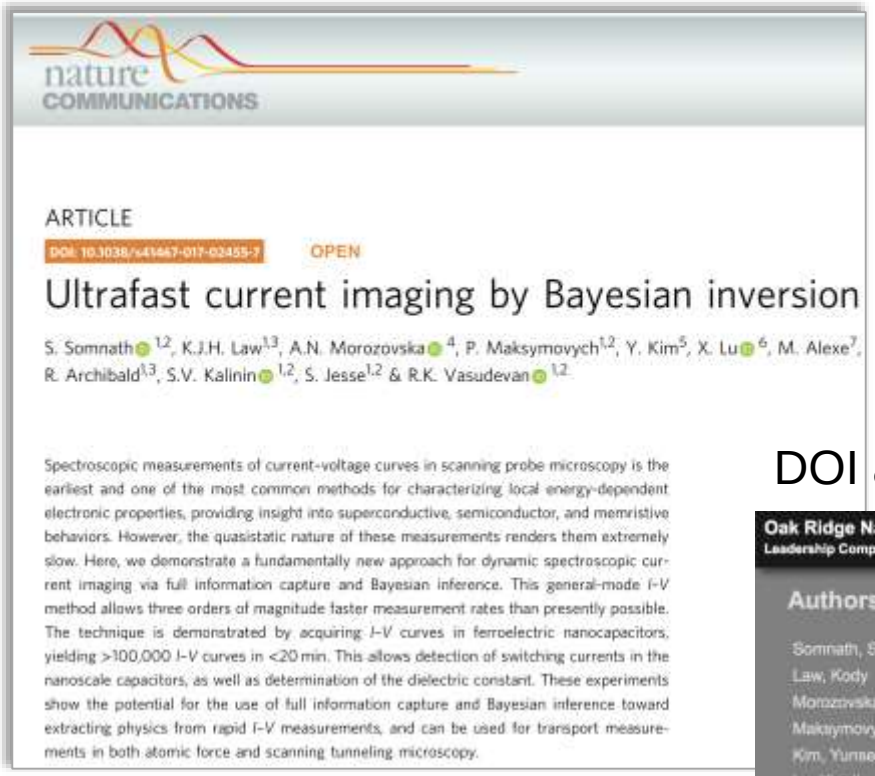
Run the next cell to see what the IV curves look like for the chosen filter parameters. If the current set of filter parameters do not work as well, change the parameters in the previous cell and try again.

Once the results look good, proceed to filter the entire dataset

```
In [7]: # Test filter on a single line:
row_ind = 50
filt_line, fig_filt, axes_filt = px.processing.gmode_utils.test_filter(h5_main[row_ind], filte
r_parms, samp_rate,
                                                                       show_plots=True, use_rai
sbow_plots=False)
fig_filt.savefig(os.path.join(other_figures_folder, 'FFT_filter_on_line_{}.png'.format(row_ind
)), format='png', dpi=300)

raw_row = np.reshape(h5_main[row_ind], (-1, pts_per_cycle))
filt_row = filt_line.reshape(-1, pts_per_cycle)

fig, axes = px.plot_utils.plot_loops(single_AO, [raw_row, filt_row], dataset_names=['Raw', 'Fi
ltered'],
                                     line_colors=['r', 'b'], x_label='Bias (V)', title='FFT Fi
ltering',
                                     plots_on_side=1, y_label='Current (nA)',
                                     subtitles='Row: ' + str(row_ind) + ' Col1')
fig.savefig(os.path.join(other_figures_folder, 'Example_filtered_loops_from_line_{}.png'.forma
t(row_ind)), format='png', dpi=300)
```

nature COMMUNICATIONS

ARTICLE

DOI: 10.1038/s41467-017-02455-7 OPEN

Ultrafast current imaging by Bayesian inversion

S. Somnath[1,2], K.J.H. Law[1,3], A.N. Morozovska[4], P. Maksymovych[1,2], Y. Kim[5], X. Lu[6], M. Alexe[7], R. Archibald[1,3], S.V. Kalinin[1,2], S. Jesse[1,2] & R.K. Vasudevan[1,2]

Spectroscopic measurements of current–voltage curves in scanning probe microscopy is the earliest and one of the most common methods for characterizing local energy-dependent electronic properties, providing insight into superconductive, semiconductor, and memristive behaviors. However, the quasistatic nature of these measurements renders them extremely slow. Here, we demonstrate a fundamentally new approach for dynamic spectroscopic current imaging via full information capture and Bayesian inference. This general-mode *I*–*V* method allows three orders of magnitude faster measurement rates than presently possible. The technique is demonstrated by acquiring *I*–*V* curves in ferroelectric nanocapacitors, yielding >100,000 *I*–*V* curves in <20 min. This allows detection of switching currents in the nanoscale capacitors, as well as determination of the dielectric constant. These experiments show the potential for the use of full information capture and Bayesian inference toward extracting physics from rapid *I*–*V* measurements, and can be used for transport measurements in both atomic force and scanning tunneling microscopy.

DOI associated with data (raw → paper figures)

Oak Ridge National Laboratory
Leadership Computing Facility

10.13139/OLCF/1410993

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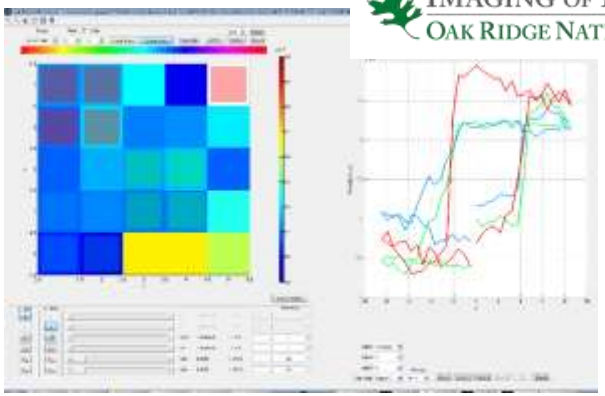
Lu, Xiaoli	xllu@xidian.edu.cn
Alexe, Marin	M.Alexe@warwick.ac.uk

Pycroscopy - Supporting User Research

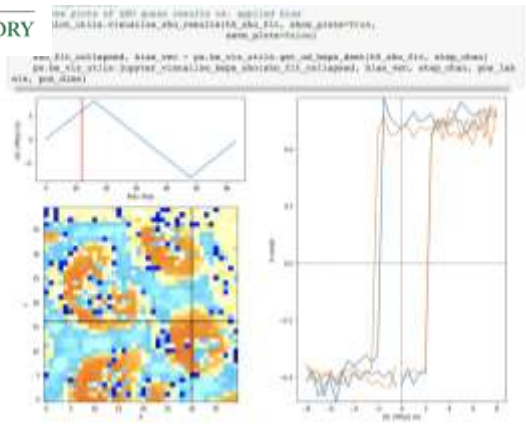
Before 2016

+



INSTITUTE FOR FUNCTIONAL IMAGING OF MATERIALS
OAK RIDGE NATIONAL LABORATORY

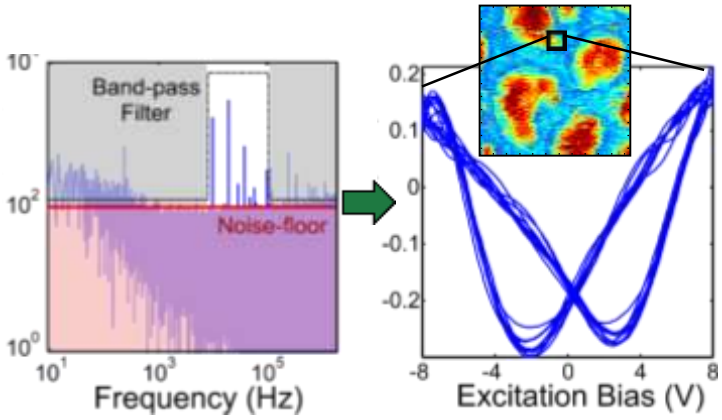
Since 2016



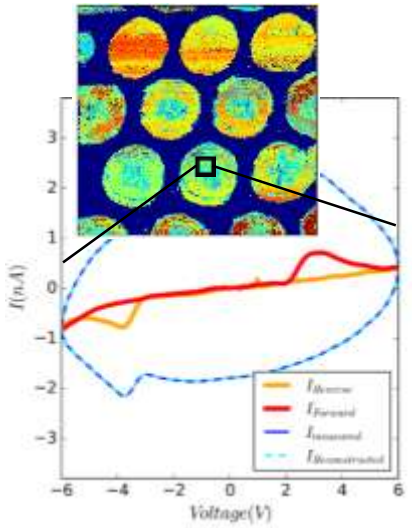
Scripts + complicated, Matlab GUI	Set of simple Jupyter notebooks
Witten by dedicated software engineer	Written by material scientists
Not customizable	Completely customizable.
2-3 hours of training before use	Notebooks include instructions. NO training required!
Deployed only on two offline workstations due to licensing restrictions = queue	Each user gets VMs with jupyter notebook server
Will remain on off-line desktops	In the process of switching to computations on clusters

Pycroscopy - Scientific Advancements

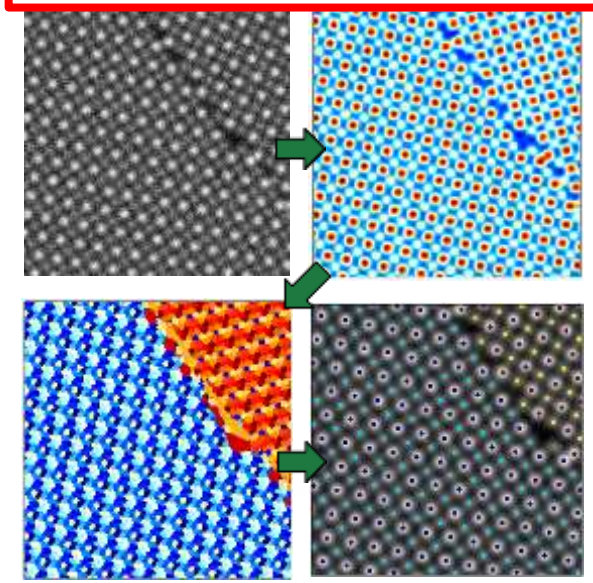
3,500x faster imaging via adaptive signal filtering, linear unmixing of signals



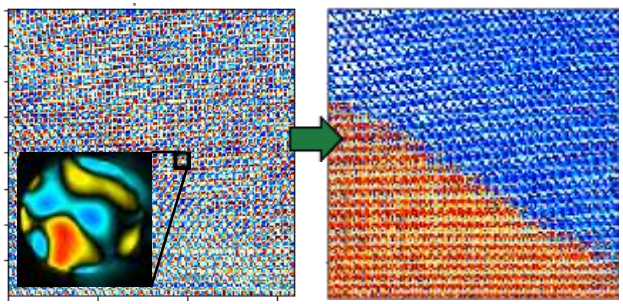
200x faster spectroscopy via Bayesian inference



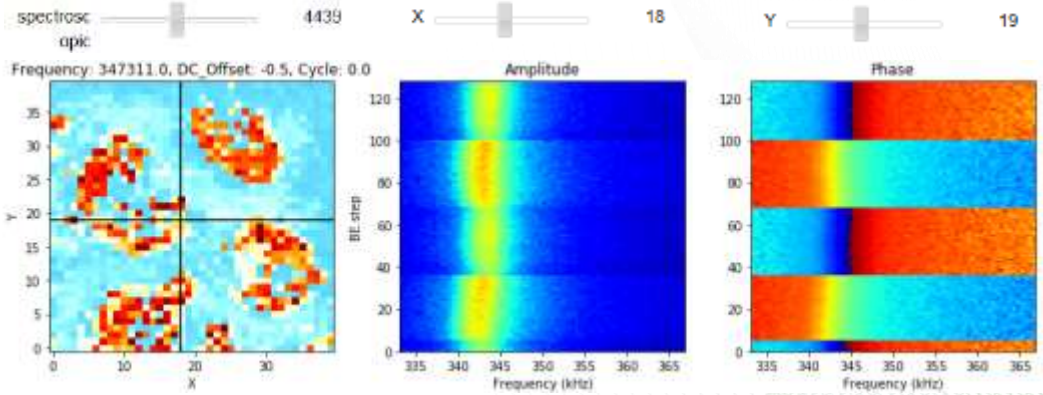
Separating uncorrelated data from correlated data to clean images



Identifying invisible patterns using multivariate analysis



Simplified navigation multidimensional data - users



Suhas Somnath, somnaths@ornl.gov

Software Progression

Scaling up Computing:

2016	2017	2018	2019
Single core	Multi-core Single CPU	Multi-core Multi CPU	JupyterHub On HPC

Emphasis always on ease-of-development instead of raw performance

New Scientific Domains:

2016	2017	2018	2019
Atomic Force Microscopy	+ Scanning Transmission Electron Microscopy	+ Mass Spectrometry + Bio-Chemistry	

Suhas Somnath, somnaths@ornl.gov

Thank you

Questions?

File / data tools related- https://groups.google.com/forum/#!forum/pyusid

Science, data analysis, reading proprietary instrument data …. - https://groups.google.com/forum/#!forum/pycroscopy