



U.S. DEPARTMENT OF
ENERGY



**UNIVERSITY OF
CALIFORNIA**



BERKELEY LAB
LAWRENCE BERKELEY NATIONAL LABORATORY



Using the Gold Standard for data archival at kilohertz speeds

Aaron S. Brewster

August 14th, 2021

Acknowledgements: NERSC, DLS and EuXFEL



Johannes Blaschke,
NERSC



Robert Bosman, DLS

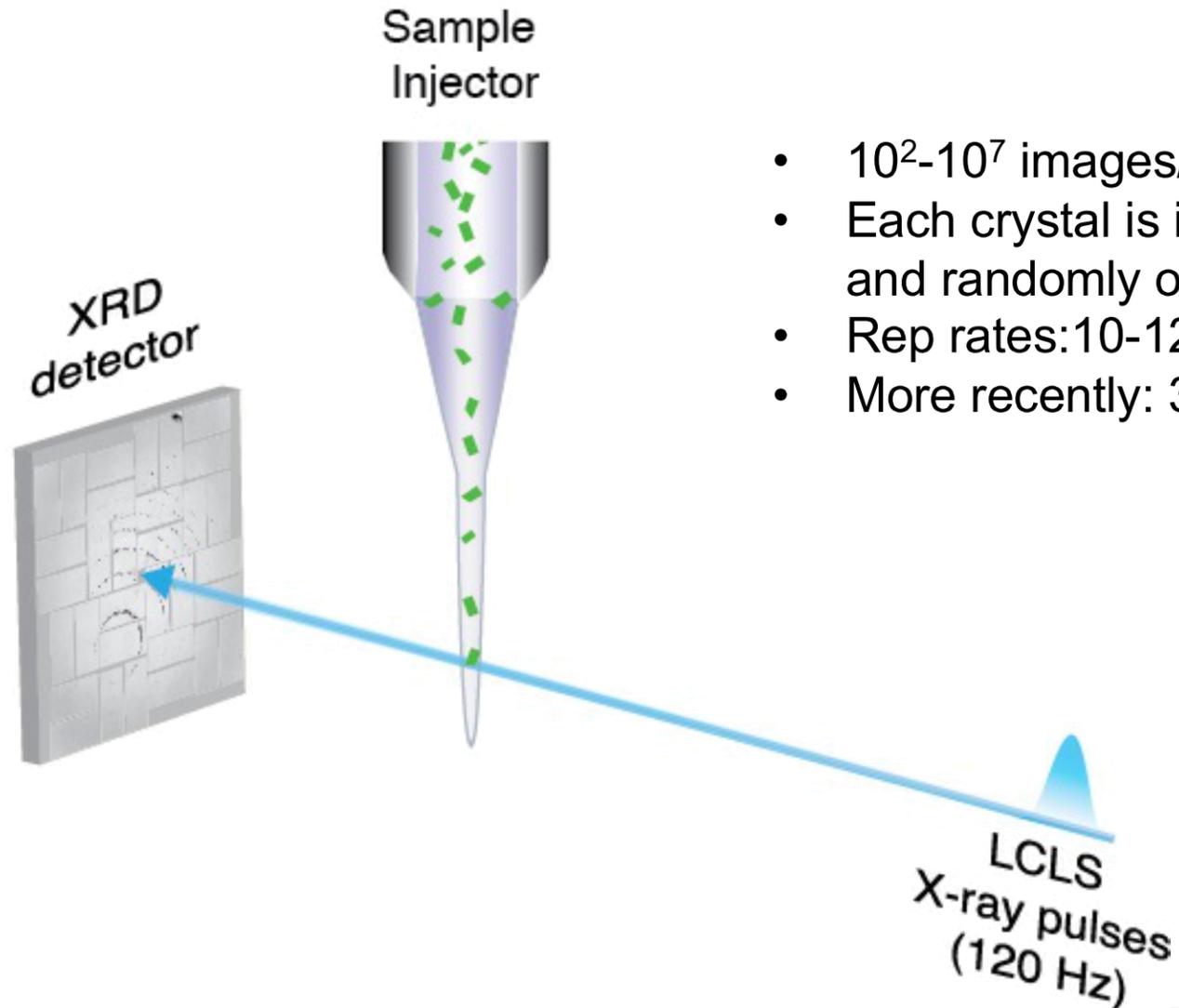


Tiankun³ Zhou, DLS



Fabio Dall'Antonia,
EuXFEL

Serial crystallography



- 10^2 - 10^7 images/dataset
- Each crystal is independent and randomly oriented
- Rep rates: 10-120 Hz
- More recently: 3 kHz

SFX: The Experiment

- Pump/probe (many datasets)
 - Laser excitation
 - Mixing (gas, ligand)
 - Temperature
 - Femtosecond dynamics
- Not usually *ab initio* structure determination
- Beam time is...
 - Scarce
 - Concentrated
 - Fast
- What are the data processing goals?

Goal: scale up

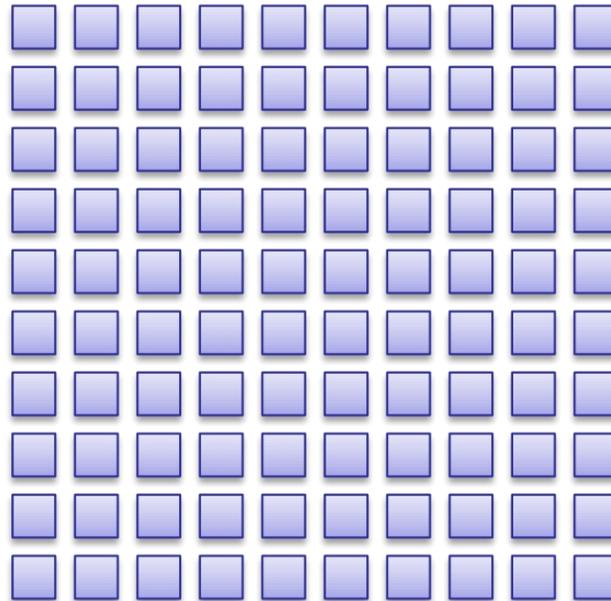
LCLS: 20 Hz Rayonix
6K images in 5 min



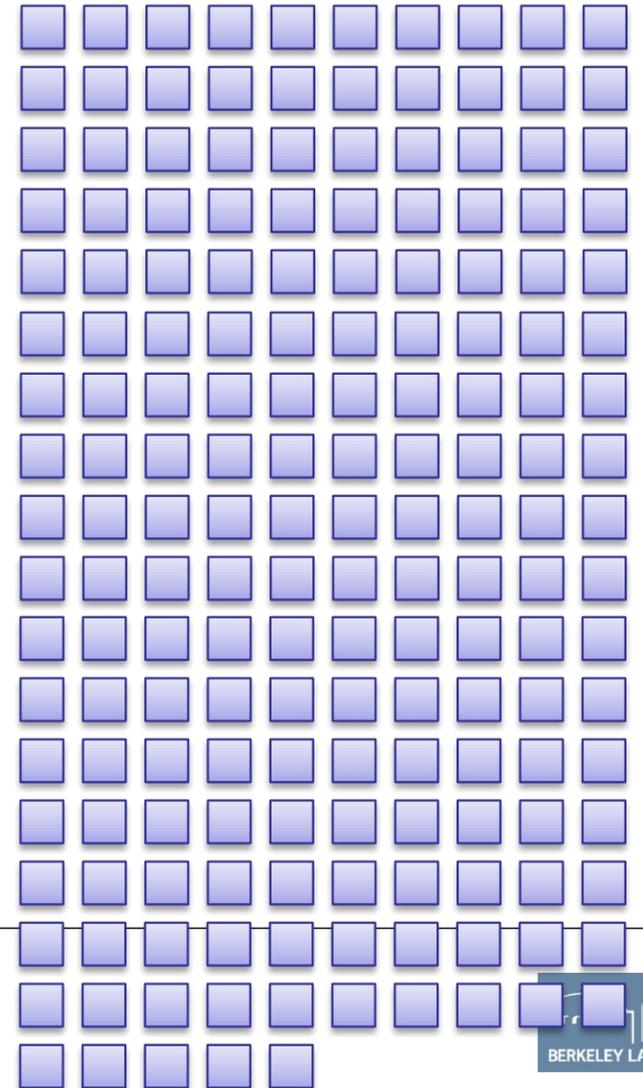
LCLS: 120 Hz CSPAD
36K images in 5 min



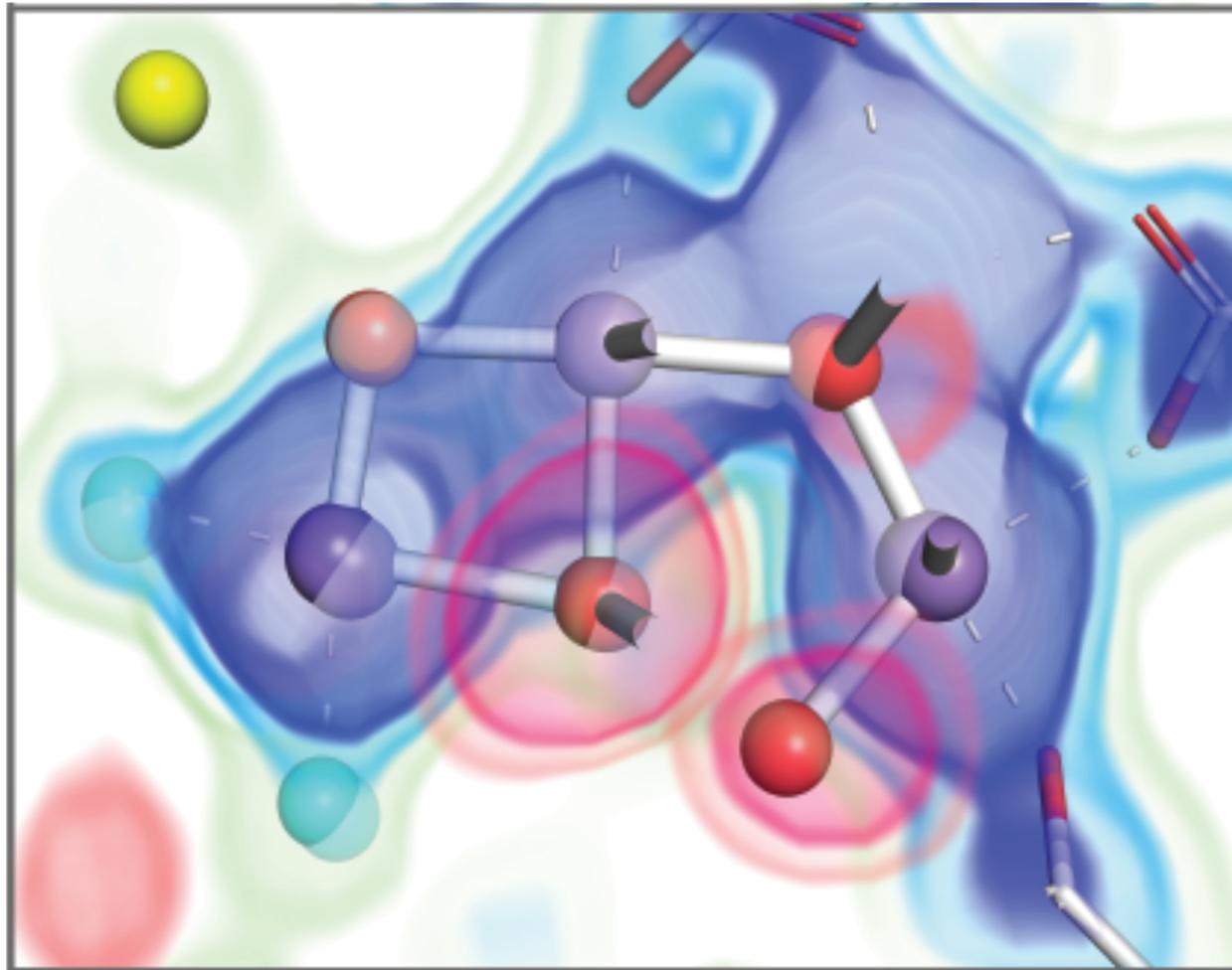
EuXFEL: 2000 Hz AGIPD
600K images in 5 min



EuXFEL: 3500 Hz AGIPD
900K images in 5 min



Goal: answer biological questions



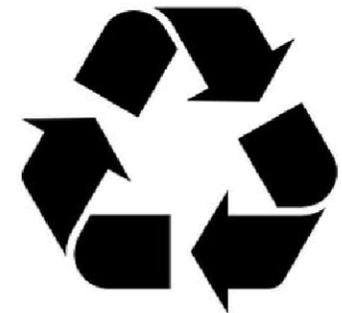
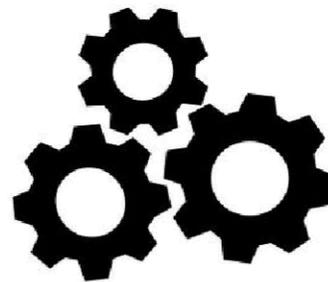
PSII 2Fo-Fc and Fo-Fc at 2.07 Å, S3 state

Goal: Fast Feedback

- Per-image metrics
 - Solvent hits
 - Crystal hits
 - Indexing rates
 - Crystal quality
- Global metrics
 - Unit cell isomorphism
 - Merged completeness/resolution

Goal: FAIR

F_{indable} A_{ccessible} I_{nteroperable} R_{eusable}



Wilkinson, M., Dumontier, M., Aalbersberg, I. *et al.* The FAIR Guiding Principles for scientific data management and stewardship. *Sci Data* 3, 160018 (2016). <https://doi.org/10.1038/sdata.2016.18>

SwissFEL: JF16M

EuXFEL: AGIPD

PAL: JF4M

NeXus

Bernstein, H. J., Forster, A., *et al.* Gold Standard for macromolecular crystallography diffraction data (2020). *IUCrJ* 7, 784-792.

Goal: organize datasets

Example: LCLS / MFX December 2018

dataset								
1	<ul style="list-style-type: none"> • Four 12-hour shifts at MFX (LU50 / P143) • 20 – 30 Hz overall collection rate (Rayonix 340) • 594,230 total indexed images • > 8.4 indexed images s⁻¹ (31% of all shots) • Overall 48% collection duty cycle • ~ 54 tr-SFX + tr-XES data sets • ~ 12 types of enzymes • Typically ~ 1 mg protein per dataset • Some data beyond 1.3 Å resolution 						340	
2							rate	
3								Z
4								Z
5								Z
6								Z
7								Z
8								Z
9								Z
10								Z
11								Z
12								
13								Z
14								Z
15	Enz 01 oxidized (no run 20, no data in run	1.6	1.76	16851	45		30 Hz	

Goals

- Real-time statistics
- Real-time electron density maps
- Dataset/metadata organization
- FAIR
- At kHz speeds

cctbx.xfel GUI

- Built on *cctbx* and DIALS

Winter G. (2018). DIALS: implementation and evaluation of a new integration package. *Acta Crystallogr D Struct Biol* **74**, 85-97

Brewster AS, et. al (2019): Processing serial crystallographic data from XFELs or synchrotrons using the *cctbx.xfel* GUI. *Computational Crystallography Newsletter* **10**, 22-39.

- Full SX workflow
 - Each image: import, spot-find, index, integrate, scale, post-refine
 - Dataset: merge, phenix.refine, upload
 - Monitor for new data and submit jobs
 - Organize processing many datasets
 - Massively parallel multiprocessing on the biggest computing clusters
 - MySQL backend allows scaling to the kHz regime

Help



Quit



Watch for new runs



Auto-submit jobs



Calibration



Settings



Large text

Runs | Trials | Jobs | Spotfinder | Run

Run Sample Tags

11	Thermolysin	Average
12	Thermolysin	Average
13	Thermolysin	Average
14	Thermolysin	Average
15	Thermolysin	Average
16	Thermolysin	Average
17	Thermolysin	Average
18	Thermolysin	Average
19	Thermolysin	Average
20	Thermolysin	Average
21	Thermolysin	Average
22	Thermolysin	Average
25		Average
26		Average
27		Average
28		Average
29		Average
30		Average
31		Average

Sample Tags

Available sample tags

- Thermolysin
- BAAAAD

Change Tags on Multiple Runs

Manage Persistent Tags

Manage Tags

● Run Sentinel

● Job Sentinel

● Job Monitor

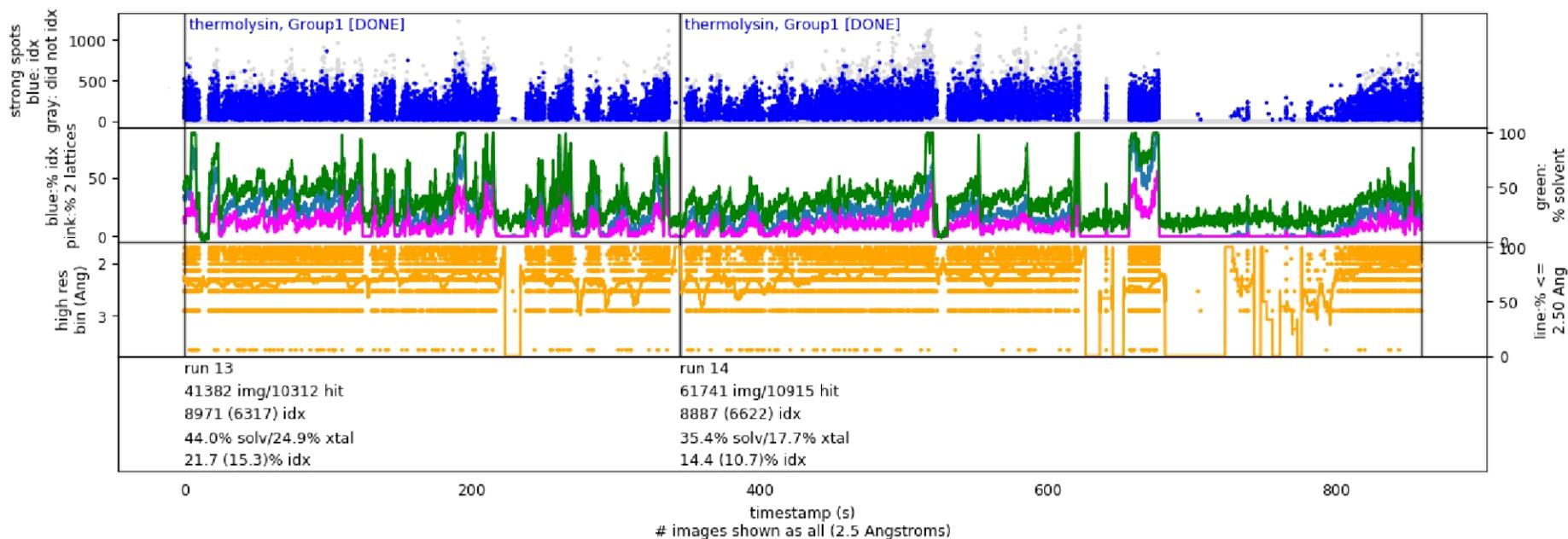
● Spotfinder

● Run Stats

● Unit Cell

Help

Run Statistics - Trial 17



Statistics Options

Trial: Selected runs:

11
 12
 13
 14
 15
 16
 17
 18
 19

Auto plot last five runs
 Auto plot entire experiment

high resolution limit:
 # multiples:
 two theta ratio:
 I/sig(I) cutoff:
 # strong spots:
 # images to dump:

Strongest Indexed Images

```

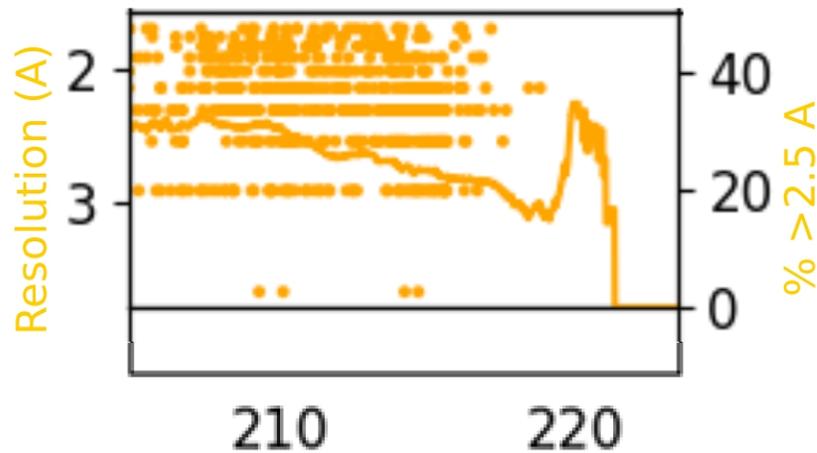
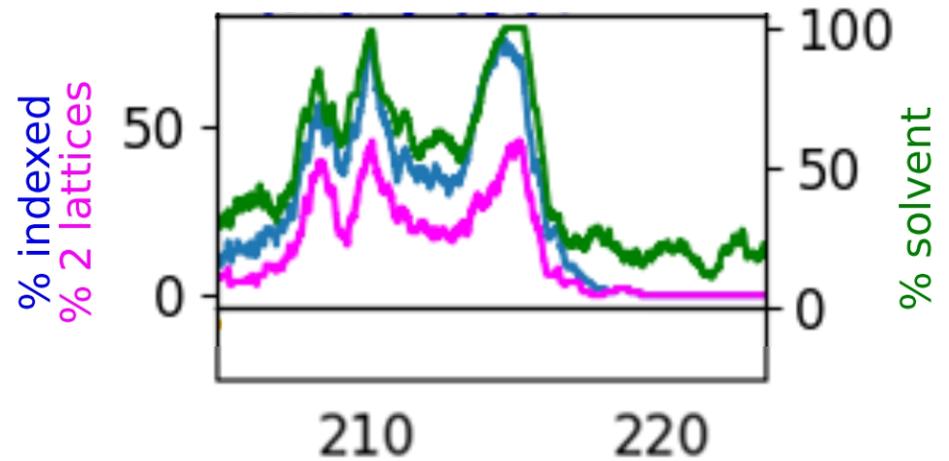
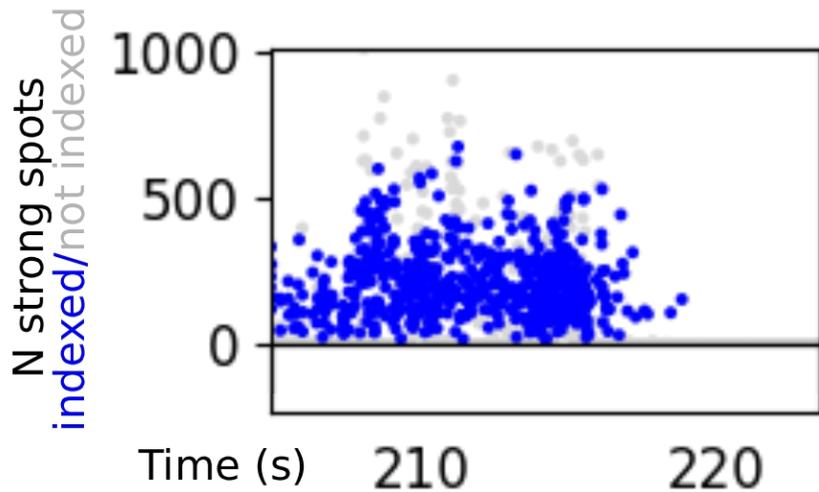
/reg/d/psdm/cxi/cxi78513/scratch/brewster/paper_2017/
results/r0013/017_rg013/out/
idx-20130301060250689.cbf
/reg/d/psdm/cxi/cxi78513/scratch/brewster/paper_2017/
results/r0013/017_rg013/out/
    
```

Strong Images that Didn't Index

```

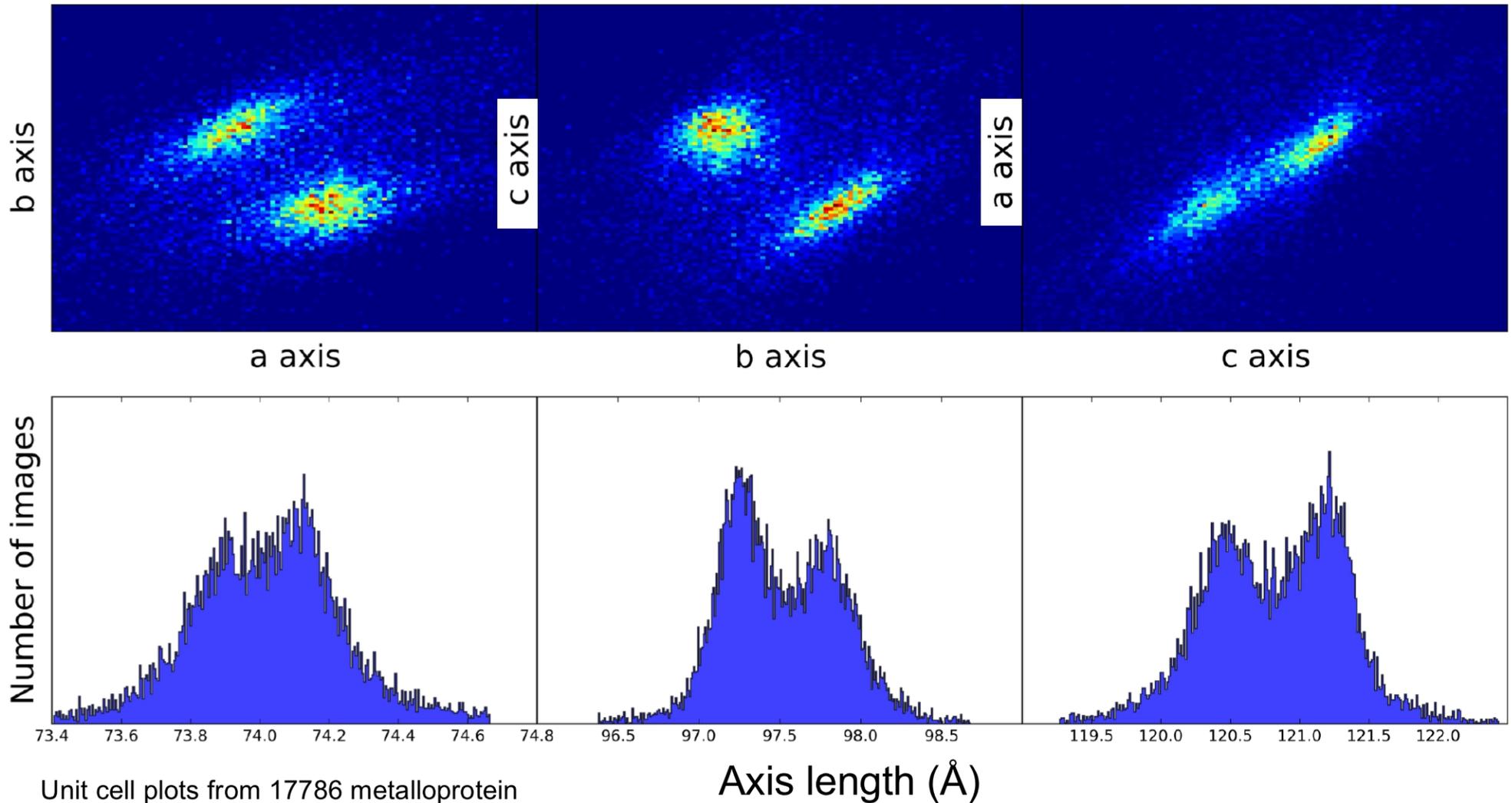
/reg/d/psdm/cxi/cxi78513/scratch/brewster/paper_2017/
results/r0013/017_rg013/all/
shot-20130301060251056.cbf
/reg/d/psdm/cxi/cxi78513/scratch/brewster/paper_2017/
results/r0013/017_rg013/all/
    
```

Rate tracking



run 13
41382 img/10312 hit
8971 (6317) idx
44.0% solv/24.9% xtal
21.7 (15.3)% idx

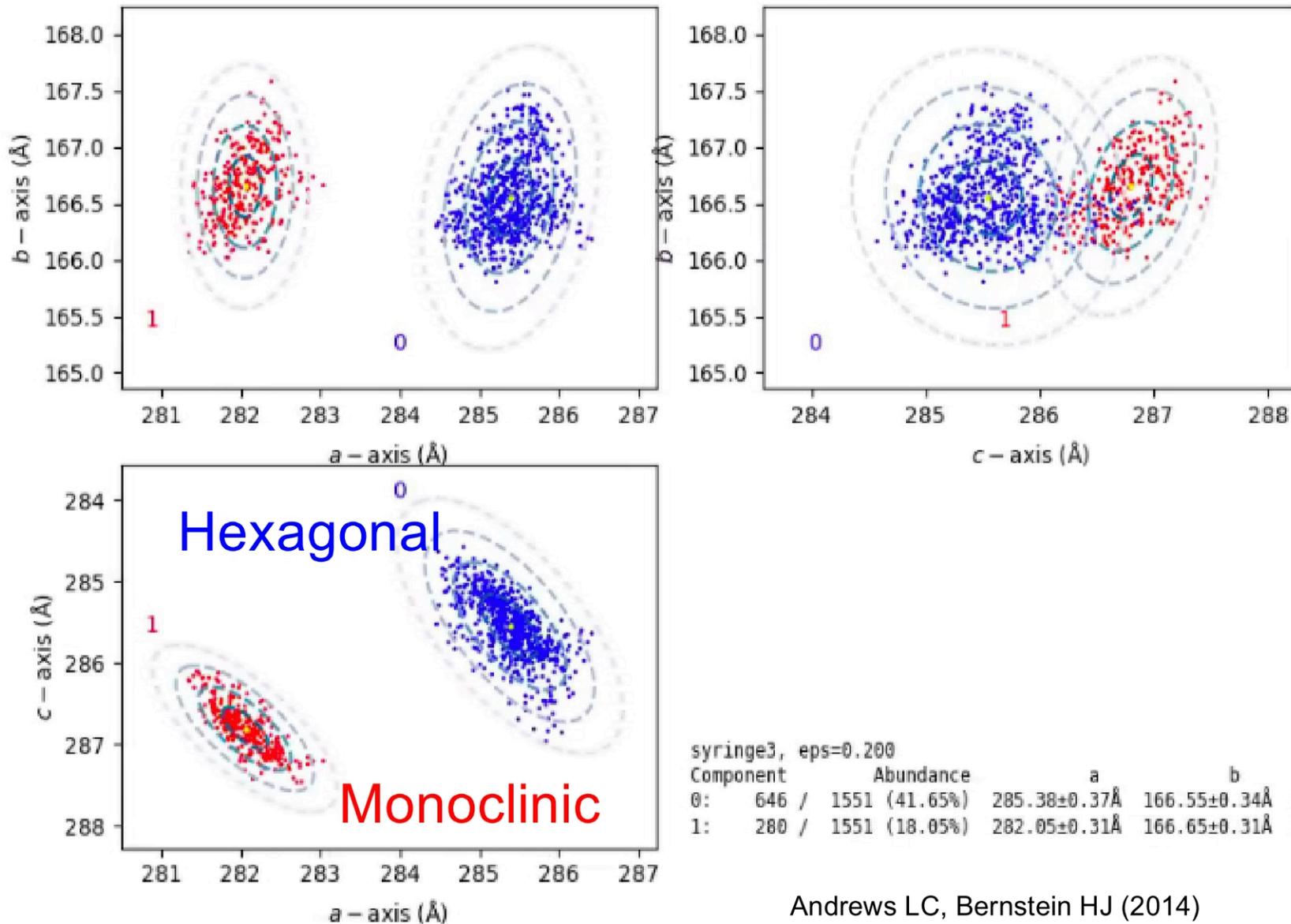
Non-isomorphism: two clusters



Unit cell plots from 17786 metalloprotein crystals (space group $P2_12_12_1$) collected at LCLS beamline MFX.

Resolve clustering on the fly

DbSCAN clustering

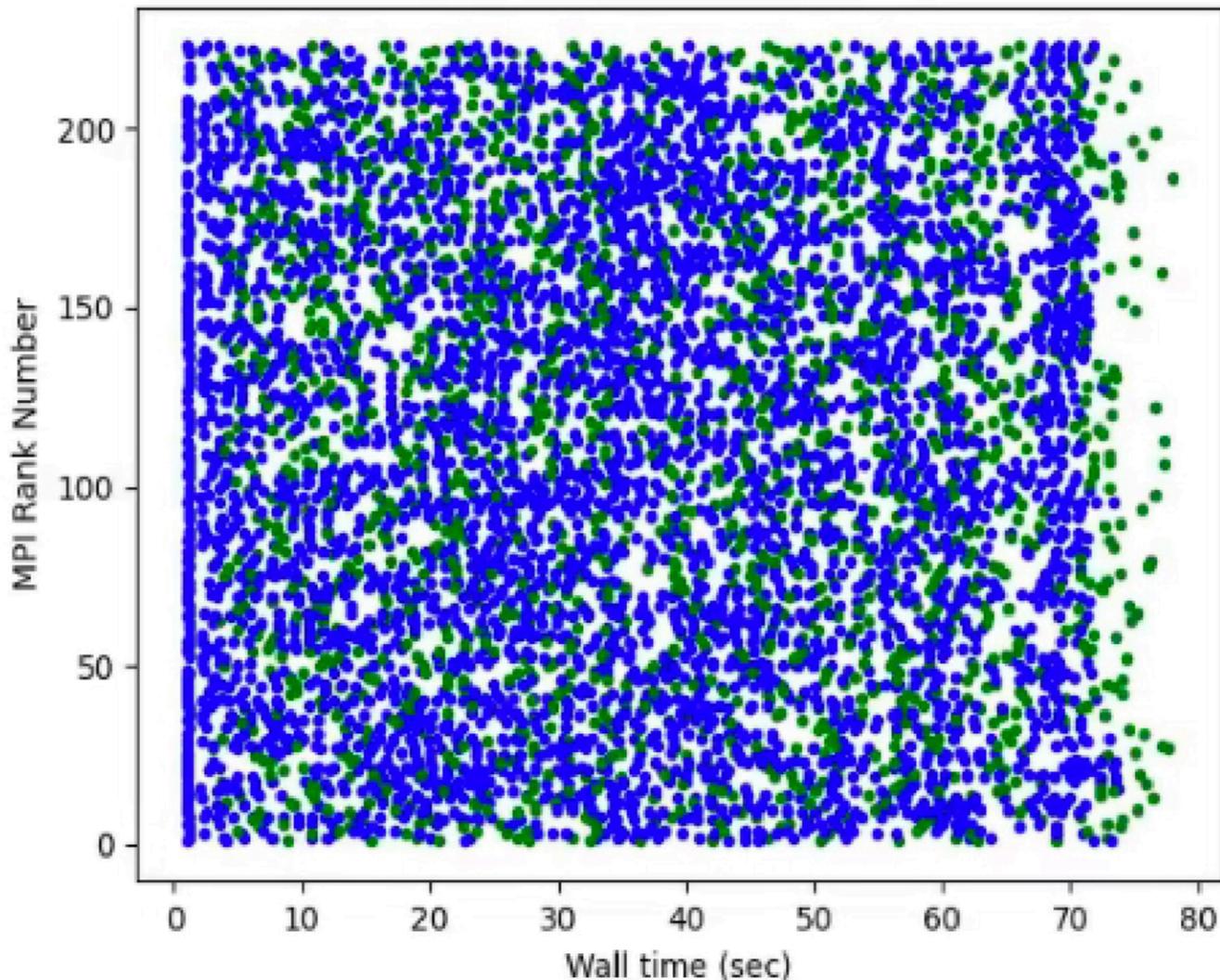


Andrews LC, Bernstein HJ (2014)

Andrews LC, Bernstein HJ and Sauter NK (2019)

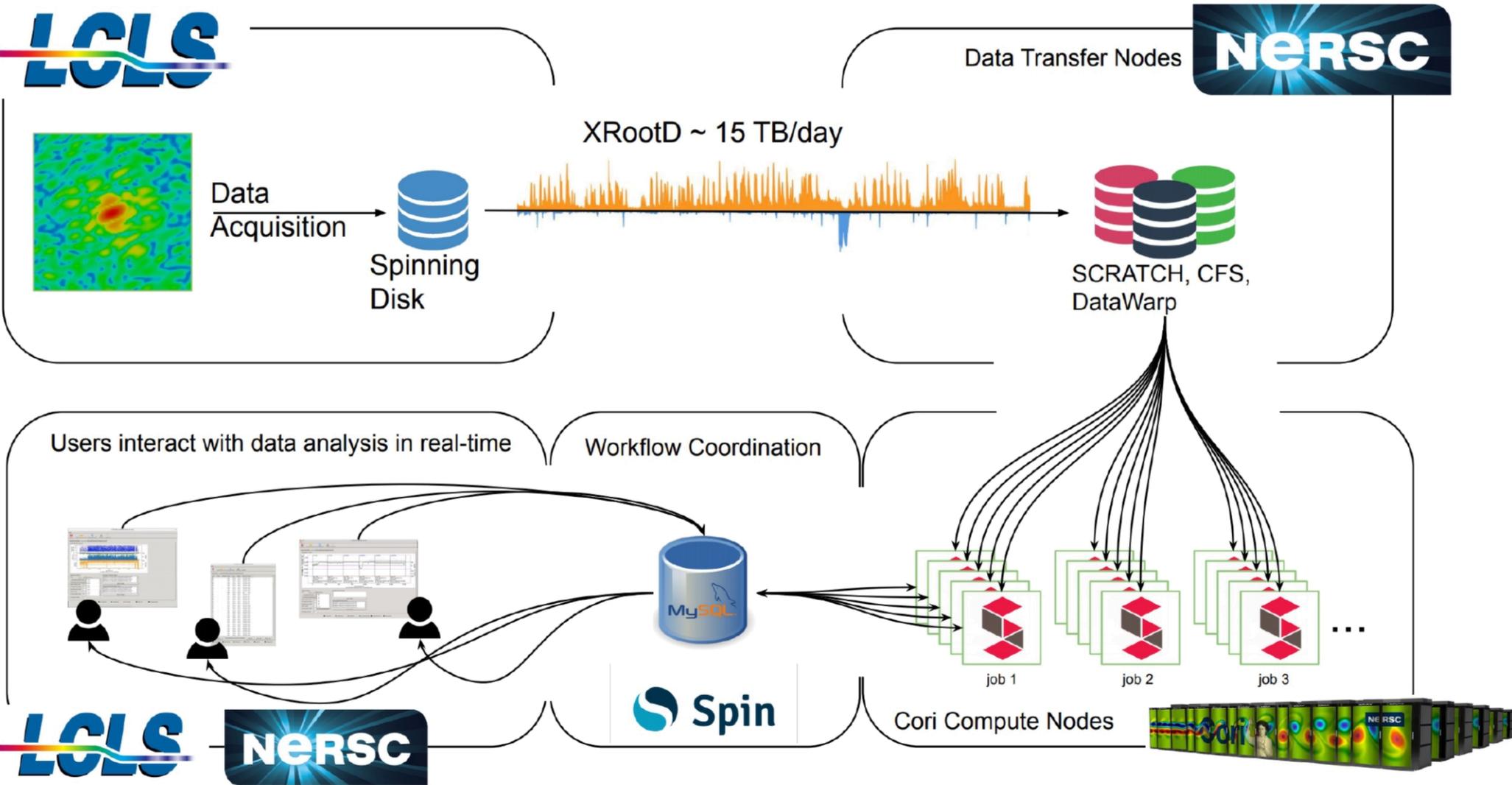
How many computing cores do we need?

Computational weather plot



- Most recent experiment: 20 Hz Rayonix, processed at NERSC
- How's the weather today?
- Median times:
 - Hits: 5.4s
 - Misses: 1.4s
- 256 cores

DOE ExaFEL project



EuXFEL: Spring 2021

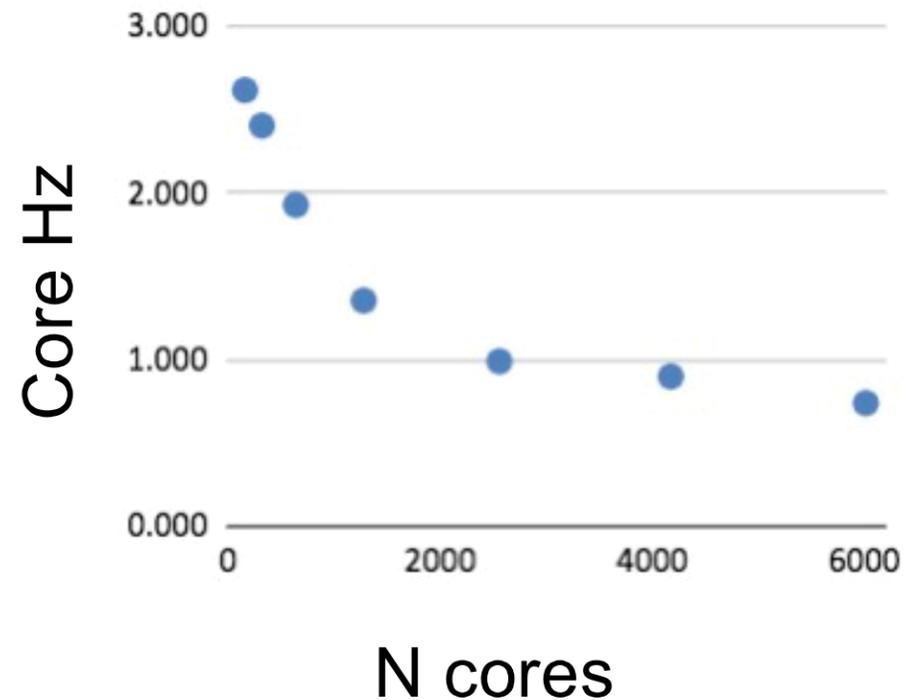
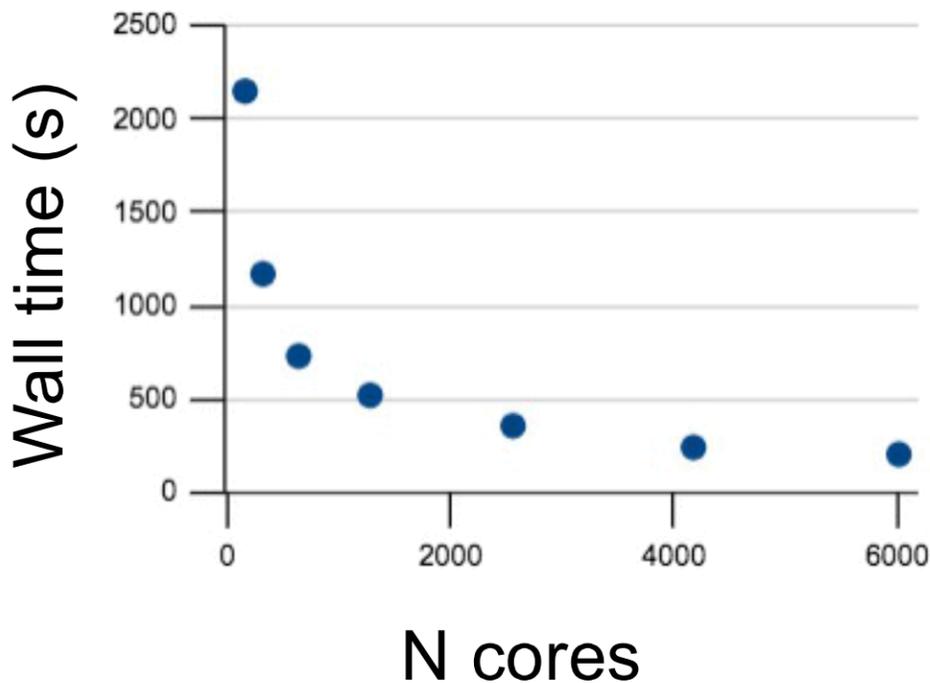
- Two 5-day experiments, separated by a month
- 593TB with a total of 354 runs, 256 with protein
- 2 kHz data collection, 600K images per run
- Maxwell HPC cluster at DESY: 96 nodes, 80-144 cores per node
- Week 1: focus on cctbx.xfel command line programs
- Week 2: focus on GUI integration

cctbx.xfel build on the Maxwell cluster

- **X** Conda build (openmpi + HDF5)
- **X** Attempt to use other pre-built Maxwell MPI's
- **X** Build own MPI
- **✓** Get help! Local Maxwell MPI/networking expert, Frank Schluenzen.
 - Specific gcc9.3 build of python3 + openmpi 3.1.6 + an mpi-enabled hdf5 library (1.10.6)
 - Use virtual environment + pip to install cctbx dependencies
 - Build cctbx (some linking adjustments needed)
 - Use communication protocol named UCX to take advantage of Infiniband. Frank's openmpi build had this enabled using a custom flag.

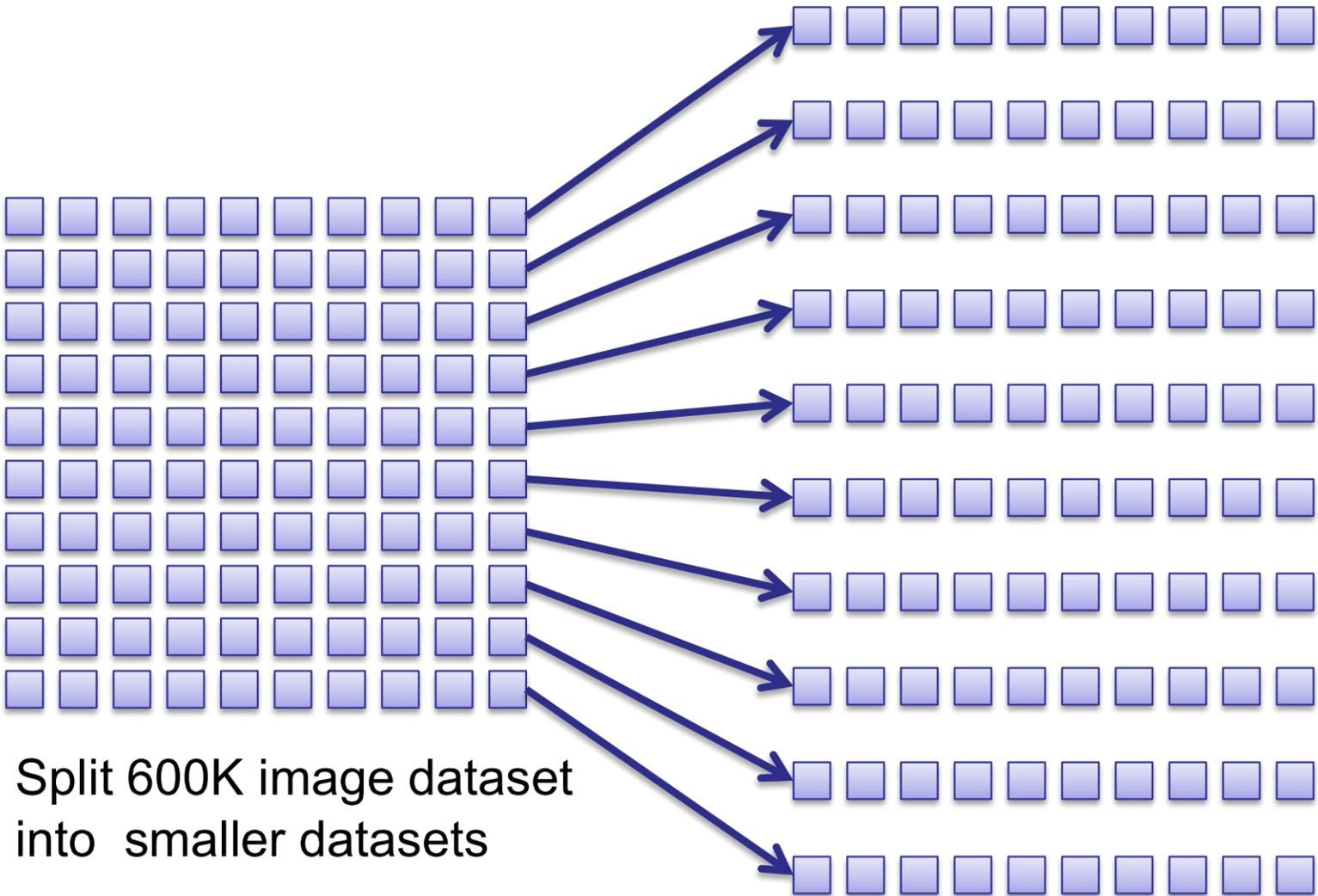
Early profiling: 3.5 kHz run, 5 min (900K images)

- Simple test: only read and sum the images: non linear scaling



- `cctbx.xfel` also did not scale linearly

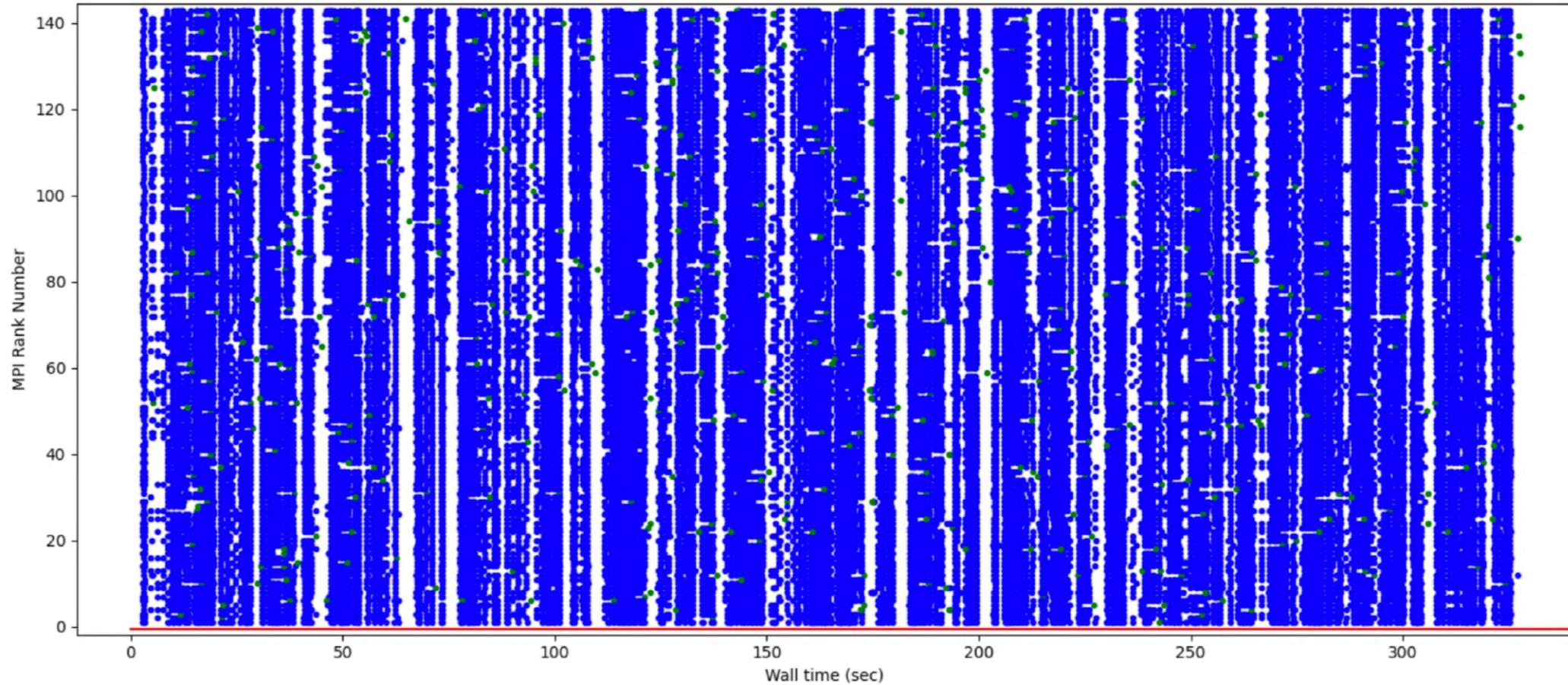
Solution: subfiling



Separate jobs,
8 nodes each

Split 600K image dataset
into smaller datasets

Computational weather plot

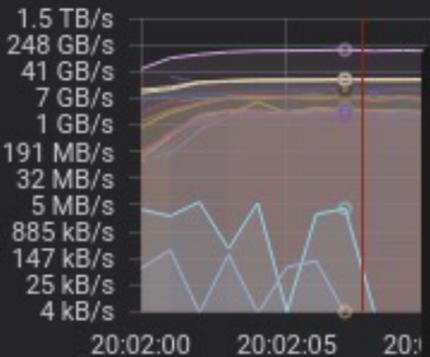


Median timings:

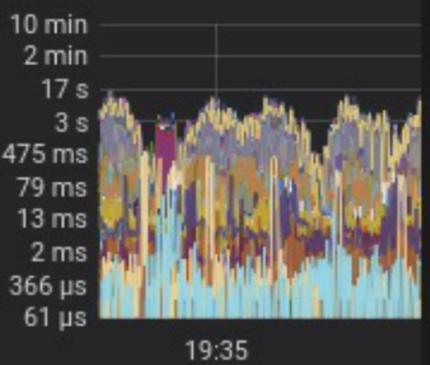
- Hits: 3.3s
- Misses: 0.6s

Off-line storage - gpfs_nsdofs_bytes_read - exfld

2021-04-30 20:02:07

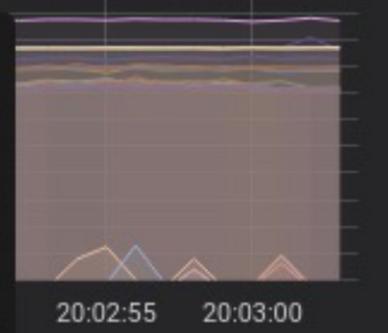


gpfs_nsdofs_bytes_read{node=exfl-ofs-gl003.desy.de, gpfs_fs_name=exfld}: 3.4 GB/s
 gpfs_nsdofs_bytes_read{node=exfl-ofs-gl004.desy.de, gpfs_fs_name=exfld}: 3.1 GB/s
 gpfs_nsdofs_bytes_read{node=exfl-ofs-gl005.desy.de, gpfs_fs_name=exfld}: 2.8 GB/s
 gpfs_nsdofs_bytes_read{node=exfl-ofs-gl006.desy.de, gpfs_fs_name=exfld}: 2.8 GB/s
 gpfs_nsdofs_bytes_read{node=exfl-ofs-gl009.desy.de, gpfs_fs_name=exfld}: 2.9 GB/s
 gpfs_nsdofs_bytes_read{node=exfl-ofs-gl010.desy.de, gpfs_fs_name=exfld}: 2.8 GB/s

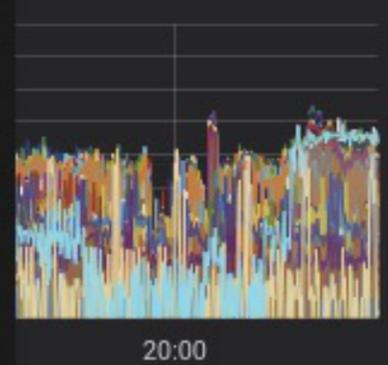


gpfs_nsdds_tot_disk_wait_wrt{node=exfl-ofs-gl003.desy.de, gpfs_fs_name=exfld}: 3.4 GB/s
 gpfs_nsdds_tot_disk_wait_wrt{node=exfl-ofs-gl004.desy.de, gpfs_fs_name=exfld}: 3.1 GB/s

gpfs_nsdofs_bytes_read{node=exfl-ofs-gl003.desy.de, gpfs_fs_name=exfld}: 3.4 GB/s	3.4 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl004.desy.de, gpfs_fs_name=exfld}: 3.1 GB/s	3.1 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl005.desy.de, gpfs_fs_name=exfld}: 2.8 GB/s	2.8 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl006.desy.de, gpfs_fs_name=exfld}: 2.8 GB/s	2.8 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl009.desy.de, gpfs_fs_name=exfld}: 2.9 GB/s	2.9 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl010.desy.de, gpfs_fs_name=exfld}: 2.8 GB/s	2.8 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl011.desy.de, gpfs_fs_name=exfld}: 2.1 GB/s	2.1 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl012.desy.de, gpfs_fs_name=exfld}: 3.1 GB/s	3.1 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl013.desy.de, gpfs_fs_name=exfld}: 7.9 GB/s	7.9 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl014.desy.de, gpfs_fs_name=exfld}: 8.1 GB/s	8.1 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl015.desy.de, gpfs_fs_name=exfld}: 7.1 GB/s	7.1 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl016.desy.de, gpfs_fs_name=exfld}: 8.3 GB/s	8.3 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl017.desy.de, gpfs_fs_name=exfld}: 11.9 GB/s	11.9 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl018.desy.de, gpfs_fs_name=exfld}: 12.8 GB/s	12.8 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl019.desy.de, gpfs_fs_name=exfld}: 24.5 GB/s	24.5 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl020.desy.de, gpfs_fs_name=exfld}: 24.0 GB/s	24.0 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl021.desy.de, gpfs_fs_name=exfld}: 24.8 GB/s	24.8 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl022.desy.de, gpfs_fs_name=exfld}: 23.3 GB/s	23.3 GB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gs001.desy.de, gpfs_fs_name=exfld}: 4 MB/s	4 MB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gs002.desy.de, gpfs_fs_name=exfld}: 4 kB/s	4 kB/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gs003.desy.de, gpfs_fs_name=exfld}: 0 B/s	0 B/s
gpfs_nsdofs_bytes_read{node=exfl-ofs-gs004.desy.de, gpfs_fs_name=exfld}: 0 B/s	0 B/s
gpfs_nsdofs_bytes_read(gpfs_fs_name=exfld):	175.6 GB/s



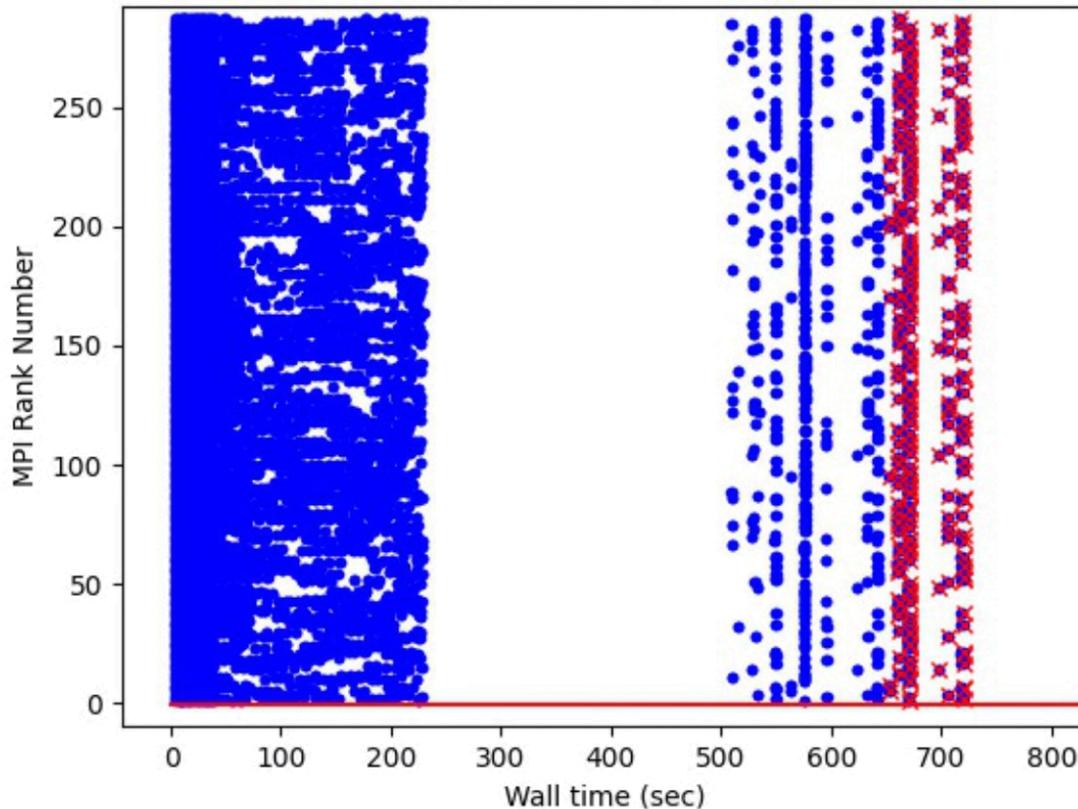
gpfs_nsdofs_bytes_read{node=exfl-ofs-gl003.desy.de, gpfs_fs_name=exfld}: 3.4 GB/s
 gpfs_nsdofs_bytes_read{node=exfl-ofs-gl004.desy.de, gpfs_fs_name=exfld}: 3.1 GB/s
 gpfs_nsdofs_bytes_read{node=exfl-ofs-gl005.desy.de, gpfs_fs_name=exfld}: 2.8 GB/s
 gpfs_nsdofs_bytes_read{node=exfl-ofs-gl006.desy.de, gpfs_fs_name=exfld}: 2.8 GB/s
 gpfs_nsdofs_bytes_read{node=exfl-ofs-gl009.desy.de, gpfs_fs_name=exfld}: 2.9 GB/s
 gpfs_nsdofs_bytes_read{node=exfl-ofs-gl010.desy.de, gpfs_fs_name=exfld}: 2.8 GB/s



gpfs_nsdds_tot_disk_wait_wrt{node=exfl-ofs-gl003.desy.de, gpfs_fs_name=exfld}: 3.4 GB/s
 gpfs_nsdds_tot_disk_wait_wrt{node=exfl-ofs-gl004.desy.de, gpfs_fs_name=exfld}: 3.1 GB/s

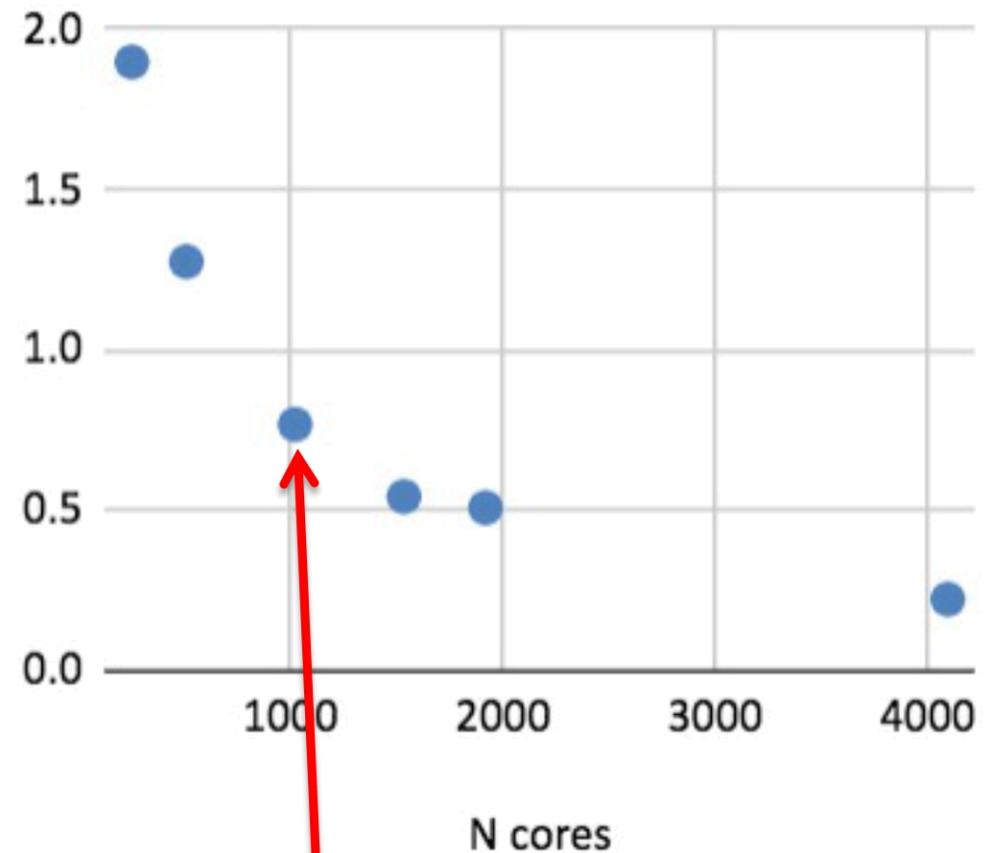
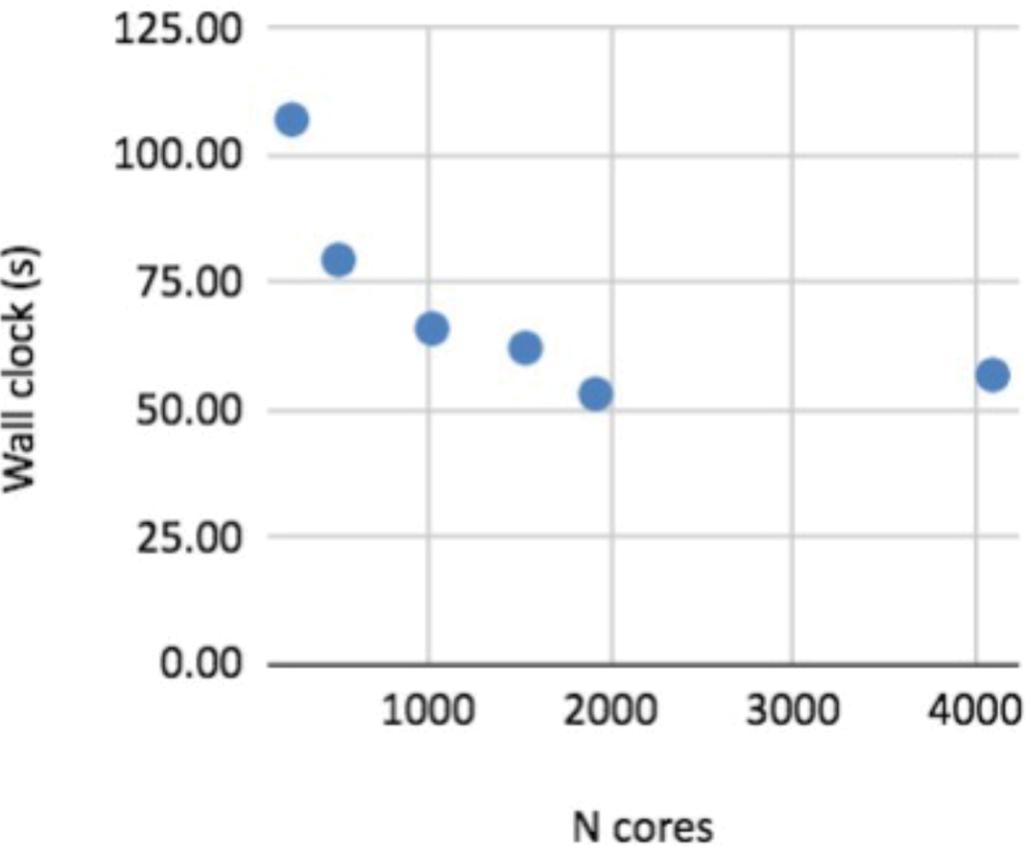
Scale up: GUI

Computational weather plot



- Queue full: huge delays from MySQL
- >1hr to log 50K images
- Solution: restructure MySQL commits using transactions
- 50K images: log in 0.07s using single MySQL query comprising 130K lines

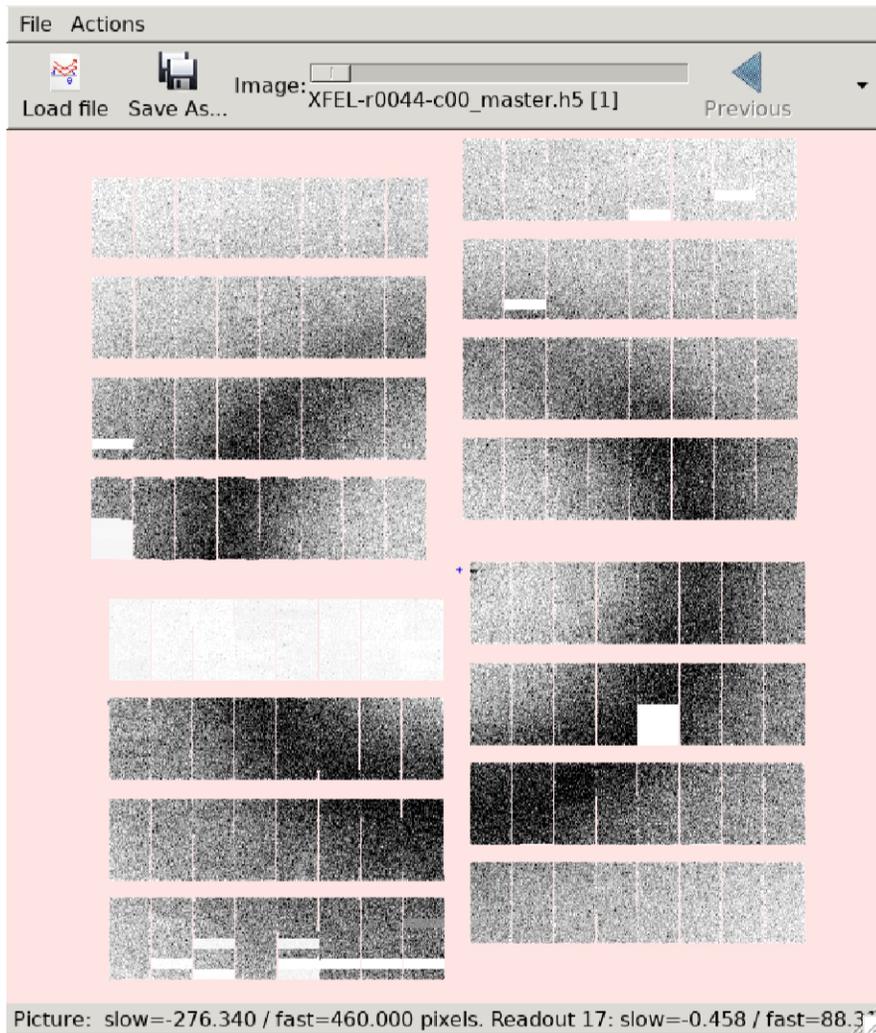
Future work: still need better scaling



Scaling test on 50K image subfile

Overall: on 8x12 nodes, 9.4 kHz!

FAIR using NeXus



HDFView 2.13

File Window Tools Help

Recent Files Clear Text

XFEL-r0044-c00_master.h5

- entry
 - data
 - definition
 - instrument
 - AGIPD
 - group_index
 - group_names
 - group_parent
 - group_type
 - transformations
 - AXIS_D0
 - AXIS_D0Q0
 - AXIS_D0Q0M0
 - AXIS_D0Q0M0A0
 - AXIS_D0Q0M0A1
 - AXIS_D0Q0M0A2

AXIS_D0Q0M0 (20384, 2)
32-bit floating-point, 1
Number of attributes = 8
depends_on = AXIS_D0Q0
equipment = detector
equipment_component = detector_module
offset = 0.06763182971870663,46.827408607259244,0.0
offset_units = mm
transformation_type = rotation
units = degrees
vector = 0.0,0.0,-1.0

Log Info Metadata

Bernstein, H. J., Forster, A., *et. al.* Gold Standard for macromolecular crystallography diffraction data (2020). IUCrJ 7, 784-792.

Full automated pipeline

- Spotfind/Index
- Joint refinement/integrate
- Scale/postrefine
- Merge
- Phenix.refine
- Upload to google drive

Ready to scale up to even higher rep-rate XFELs coming online

Deployment: every XFEL

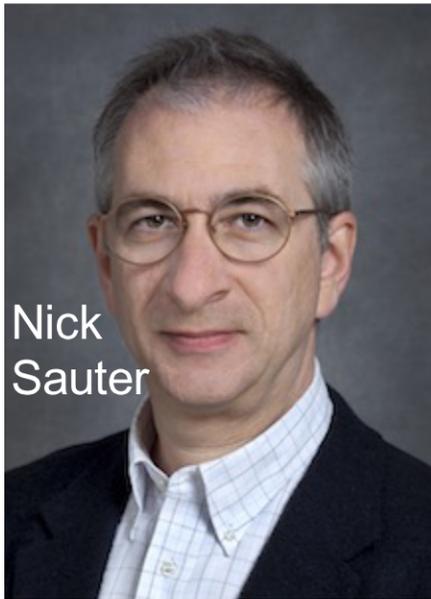
	LCLS	SACLA	PAL-XFEL	SwissFEL	EuXFEL
Location	Stanford, CA USA	Harima, Japan	Pohang, South Korea	Aargau, Switzerland	Schenefeld, Germany
Computing	NERSC or SDF	Local	KISTI	PSI	Maxwell
Detectors	CSPAD, ePix, Jungfrau, Rayonix	Octal-8 MPCCD, Rayonix	Rayonix	Jungfrau 16M	AGIPD

Supports LSF, SGE, Slurm, HTCondor, Docker/Shifter

New use of GUI: DLS beamline I24 (Pilatus3 6M)

Example of a current result: LCLS + NERSC, 5 minute turnaround for fully merged dataset

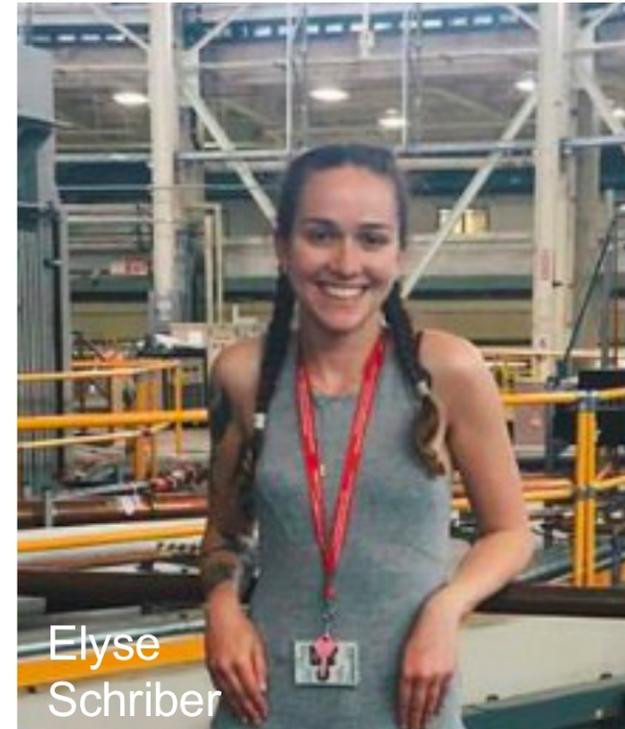
XFEL @ LBL



Nick Sauter



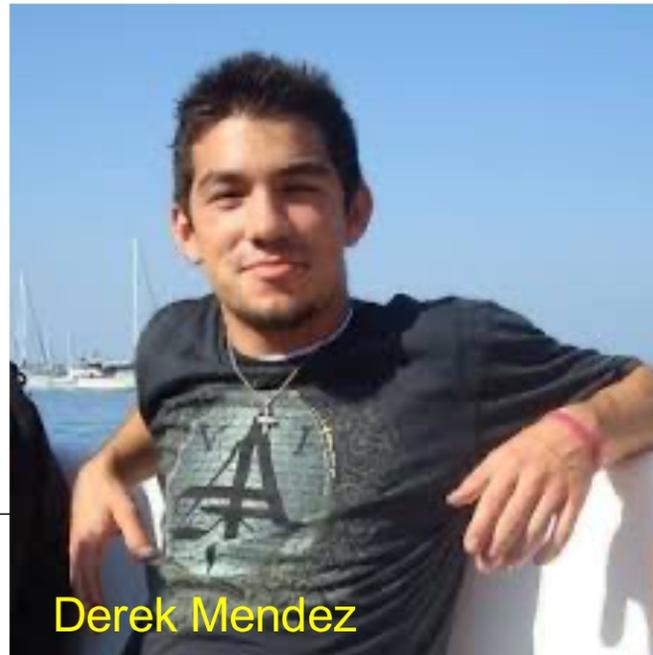
Asmit Bhowmick



Elyse Schriber



Aaron Brewster



Derek Mendez



Dan Paley

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Nicholas Sauter
Asmit Bhowmick
Derek Mendez
Dan Paley
Elyse Schriber
Paul Adams
Peter Zwart
Vittal Yachandra
Junko Yano
Jan Kern
Ruchira Chatterjee
James Holton
Johannes Blaschke
In-Sik Kim
Cindy C. Pham
Joshua Heinemann
Louise Lasalle
Billy K. Poon

EuXFEL

Fabio Dall'Antonia
Adrian Mancuso
Adam Round
Krzysztof Wrona
Frank Schluenzen

Brookhaven

Herbert Bernstein

Nebraska

Limei Zhang

CCP4

David Waterman

LLNL

Michael Wall

LCLS

Uwe Bergmann
Franklin Fuller
Roberto Alonso-Mori
Sebastien Boutet
Mengning Liang
Amedeo Perazzo
Chuck Yoon
Chris O'Grady
Mark Hunter
Jason Koglin
Ray Sierra
Mona Uervirojnangkoorn
Alexander Batyuk
Diling Zhu
Anton D. Loukianov

UCSF

James Fraser
Iris Young
Michael Thompson
Alex Wolff
Rahel Woldeyes

Diamond Light Source

Gwyndaf Evans
Graeme Winter
David Stuart
Jonathan Grimes
James Parkhurst
Luis Fuentes-Montero
Markus Gerstel
Nicholas Devenish
Allen Orville
Pierre Aller
Agata Butryn
Danny Axford
Tiankun Zhou
Jos Kamps
Robert Bosman

Harvard

Kevin Dalton
Doeke Hekstra

UCLA

David Eisenberg
Duilio Cascio
Michael Sawaya
Jose Rodriguez
Luki Goldschmidt
Johan Hattne

Stanford University

Axel Brunger
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