

# Automated Experiments for STEM at CNMS

Andrew R Lupini

Center for Nanophase Materials Sciences  
Oak Ridge National Laboratory

ORNL is managed by UT-Battelle LLC for the US Department of Energy

UTK 2025/05/23

Appalachian Regional Electron Microscopy Society Topical Conference  
Third Summer School on ML for Electron Microscopy



# CNMS is one of five Nanoscale Science Research Centers (NSRCs) located at Oak Ridge National Laboratory



Molecular Foundry  
Lawrence Berkeley National Laboratory



Center for Nanoscale Materials  
Argonne National Laboratory



Center for Functional Nanomaterials  
Brookhaven National Laboratory



Center for Integrated Nanotechnologies  
Sandia National Laboratories  
Los Alamos National Laboratory



Center for Nanophase Materials Sciences  
Oak Ridge National Laboratory

# The eMMA Group at CNMS

- Mission "To advance atomic-scale electron-beam imaging and spectroscopy to enable new understanding of materials, quantum phenomena and energy technologies."



**Karren L More**

Interim Group Leader



**Lynda Amichi**

Scanning Transmission Electron Microscopy



**Jefferey S Baxter**

Scanning Transmission Electron Microscopy



**Matthew G Boebinger**

Scanning Transmission Electron Microscopy



**Andrew R Lupini**

Scanning Transmission Electron Microscopy



**Christopher T Nelson**

Nion & Titan (S)TEM, In-situ Biasing, Data Analysis



**Jonathan D Poplawsky**

Atom Probe Tomography Research



**K Shawn Reeves**

SEM, (S)TEM, Ultramicrotomy, and Specimen Prep



**Michael J Zachman**

Cryo-PFIB, cryo-(S)TEM, 4D-STEM, low-dose imaging, automated analytical (S)TEM



**Ana A Robbins**

Group Admin



**Albina Y Borisevich**

Nion US200, TF Krios G4, STEM, Energy Materials, Data Analysis, Cryo-EM



**James P Burns**

Atom Probe Tomography and FIB Specimen Prep



**Miaofang Chi**

Scanning Transmission Electron Microscopy



**David A Cullen**

Scanning Transmission Electron Microscopy



**Alexis N Williams**

CryoEM, 3D Reconstruction, HPC, and Cryo Sample Prep



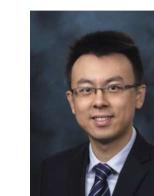
**Steffi Y Woo**

Scanning Transmission Electron Microscopy



**Fehmi S Yasin**

Magnetic Imaging, TEM, STEM, STEM-holography  
Analytical (S)TEM, Identical Location Electrochemistry, High-throughput Data Analysis



Open slide master to edit

# Motivation

"I would like to try and impress upon you the importance of improving the electron microscope by a hundred times. It is very easy to answer many of these fundamental (biological) questions; you just *look at the thing!*

I put this out as a challenge: **Is there no way to make the electron microscope more powerful?**

**What would happen if we could arrange the atoms one by one the way we want them?** (within reason, of course; you can't put them so that they are chemically unstable, for example.)"

- R. Feynman, 1959

*There's Plenty of Room at the Bottom*

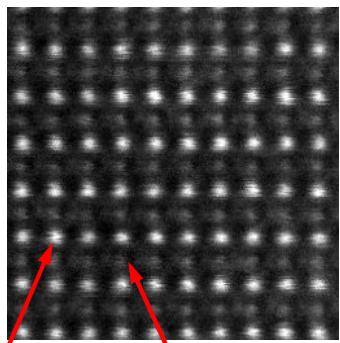
**Build materials and devices atom by atom  
Probe, understand and utilize novel properties**



<http://www.zyvex.com/nanotech/feynman.html>

# Scanning Transmission Electron Microscope

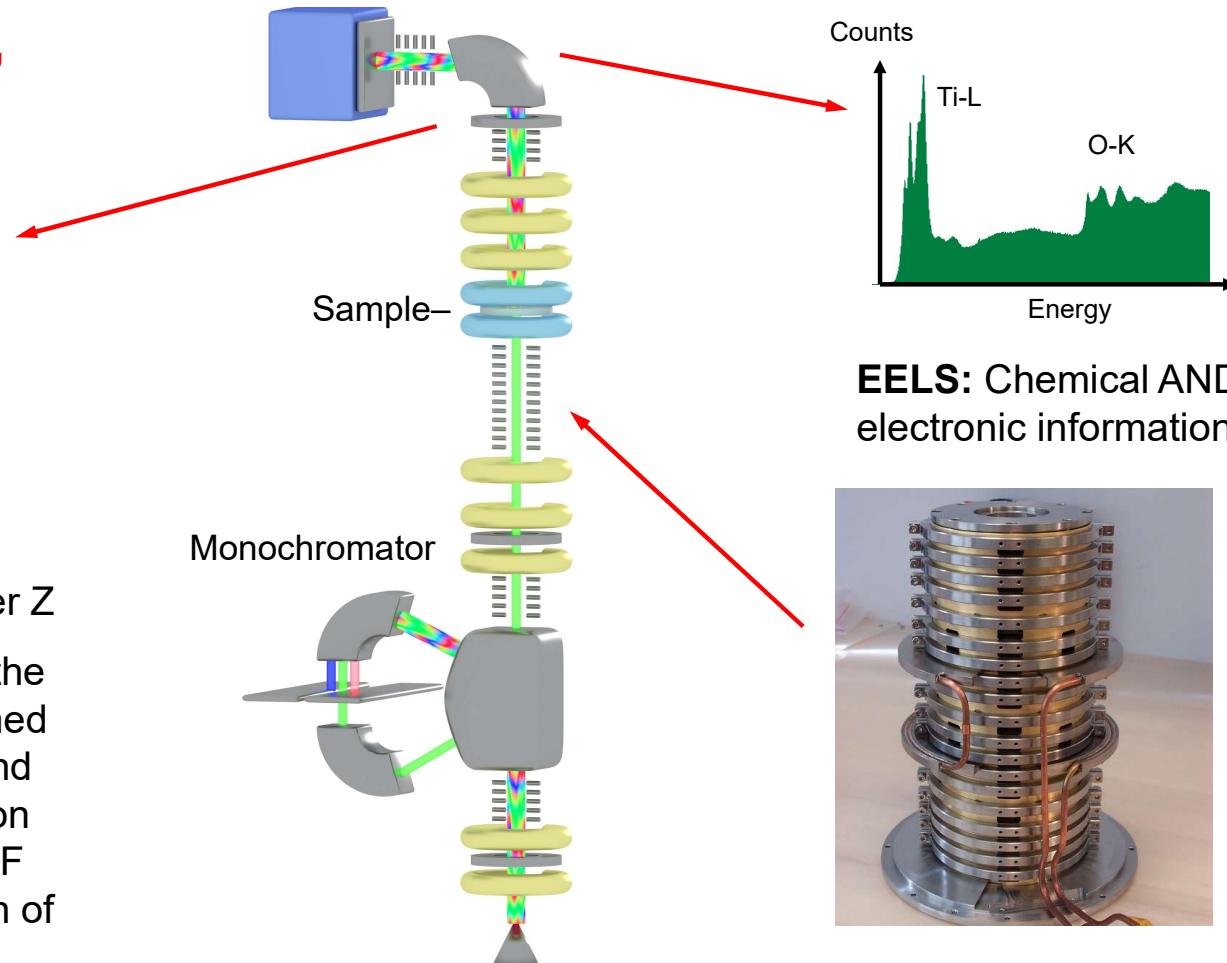
**“Z-contrast”**



Heavy      Light

Scattering to high angles depends on atomic number Z

A probe is focused onto the sample. Images are formed by scanning the probe and detecting the scattering on various detectors. HAADF only uses a small fraction of the electrons.



**EELS:** Chemical AND electronic information

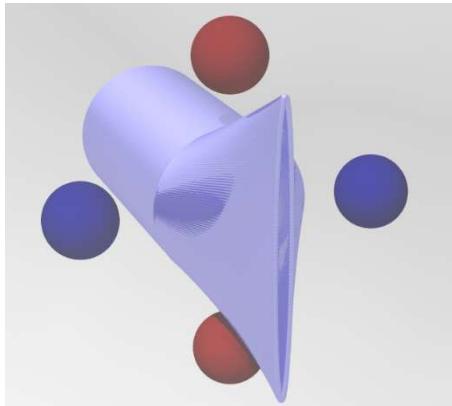


Aberration corrector has hundreds of optical elements

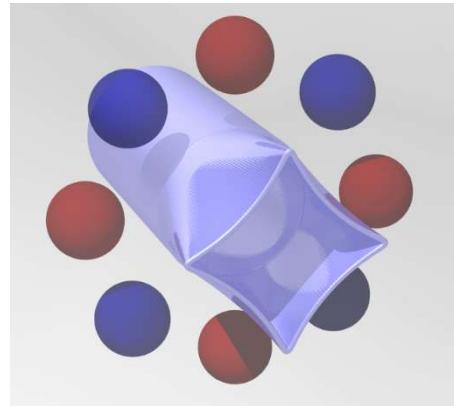
(P. Rez)

# Aberration Correction

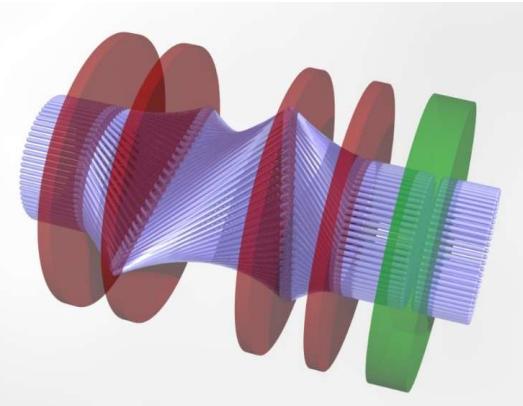
- Spherical aberration limits TEM resolution
- Scherzer (1936) – Spherical aberration unavoidable for static round lenses
- Scherzer (1947) – Combinations of **non-round** lenses can correct  $C_s$



Quadrupole



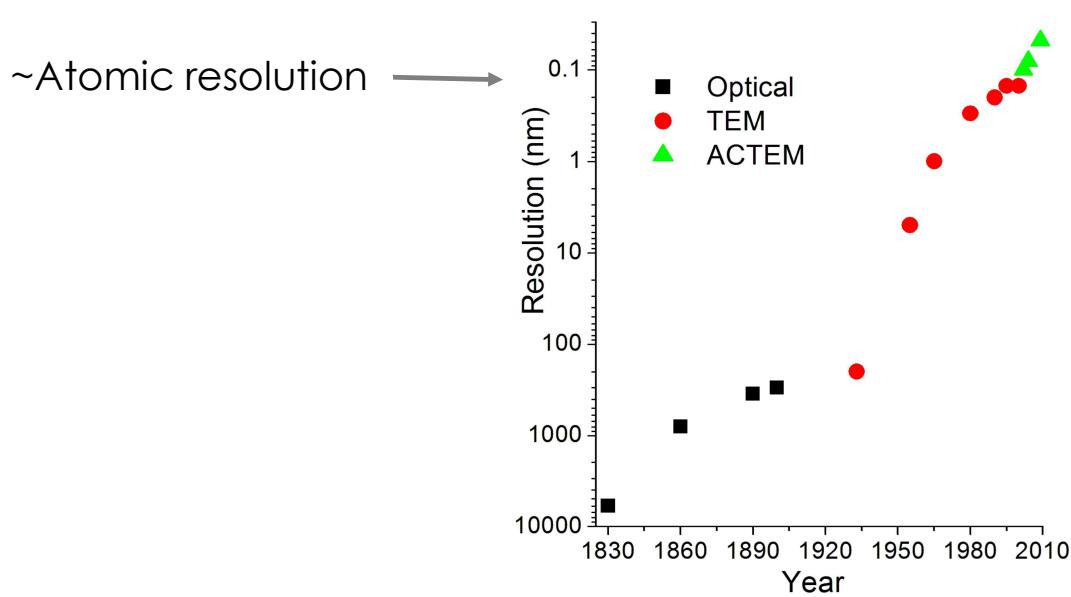
Octupole



Corrector

- Octupoles have the right field to correct  $C_s$  but a 4-fold symmetry
- Aberrations will depend on the beam *shape* as well as the field.
- A corrector is a complicated system – only practical 50 years later.
- Krianek, et al, Haider et al. ~1997
- Lot of extra knobs – Computer control is essential!

# Resolution Over Time – Aberration Correction!



Pennycook, S.J.; Varela, M.; Hetherington, C.J.D.; Kirkland, A.I. "Materials Advances through Aberration-Corrected Electron Microscopy" (PDF). MRS Bulletin. 31: 36–43. doi:10.1557/mrs2006.4. S2CID 41889433.  
After: H. Rose, Ultramicroscopy 56 (1994) p. 11

# 1977: First movies of single U atoms

Proc. Natl. Acad. Sci. USA  
Vol. 74, No. 5, pp. 1802–1806, May 1977  
Physics

## Direct observations of atomic diffusion by scanning transmission electron microscopy

(atom motion/single atom visibility/time-lapse cinematography)

M. ISAACSON, D. KOPF, M. UTLAUT, N. W. PARKER, AND A. V. CREWE\*

Department of Physics and the Enrico Fermi Institute, The University of Chicago, Chicago, Illinois 60637

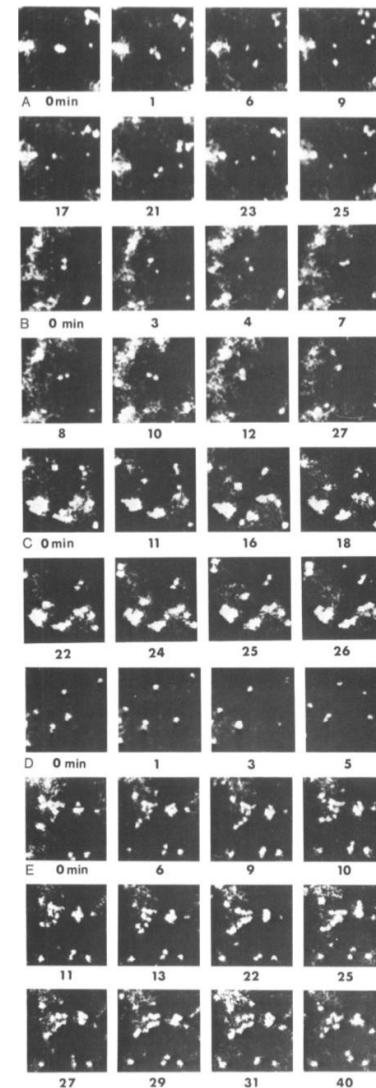
Contributed by Albert V. Crewe, January 21, 1977

**"I don't believe that atoms exist."** — Ernst Mach (1897) vs Boltzman

In 1871, Edmund Mills scathingly concluded that **"the atomic theory has no experimental basis, is untrue to nature generally, and consists in the main of a materialistic fallacy."**

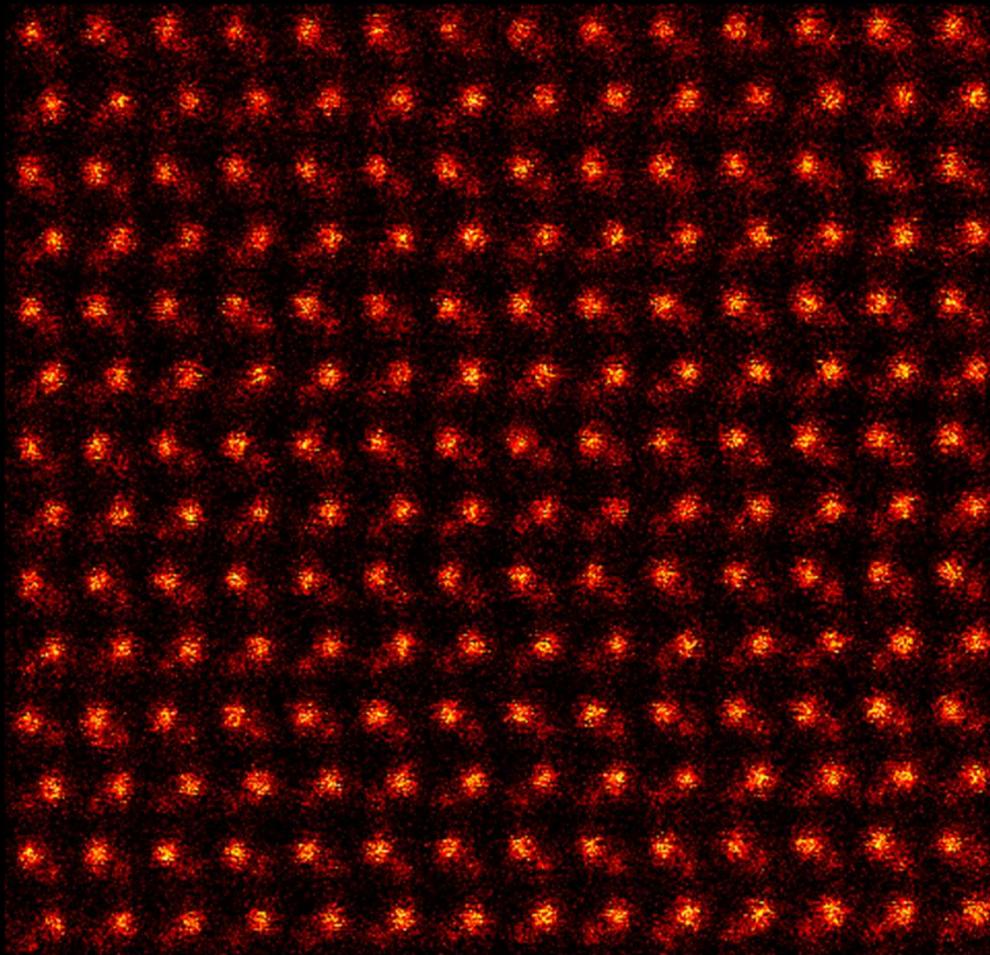
Albert Crewe was at Argonne from 1958-1967 and director from 1961-67 (starting at age ~34)

Physics: Isaacson *et al.*



1 slide master to edit

# Single Ce-dopant diffusion in AlN



STEM Sequential imaging, 80 Frames  
Ishikawa *et al.* PRL (2013), Sci Rep. (2014)

Open slide master to edit

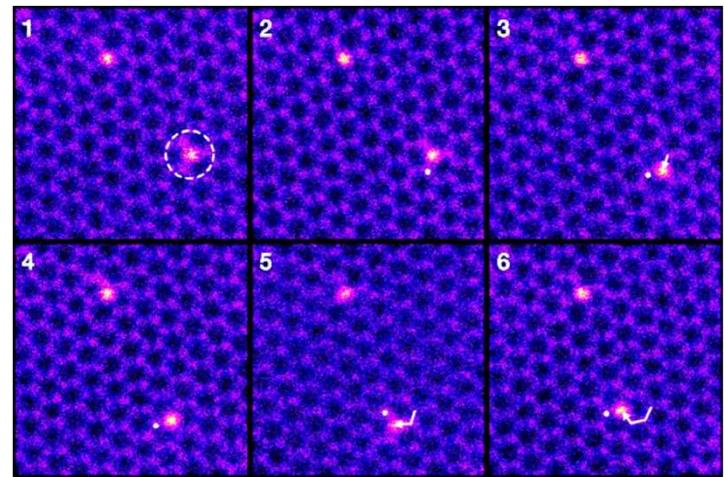
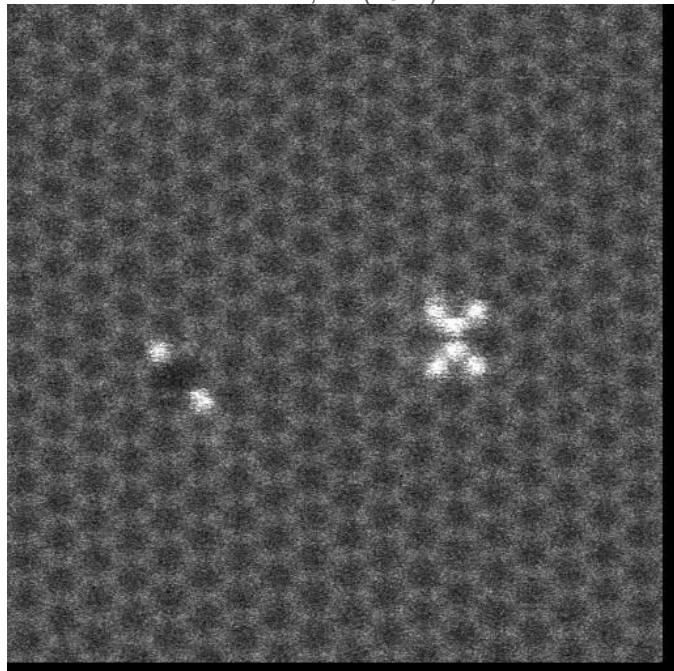
# Direct atom placement

- Atom positioning state-of-the-art is AFM and STM
- STEM suggested as a tool to manipulate atoms
- Atomic devices require atoms below the surface
- How do we control placement of dopants below a surface?
- “The Atomic Forge” – Kalinin

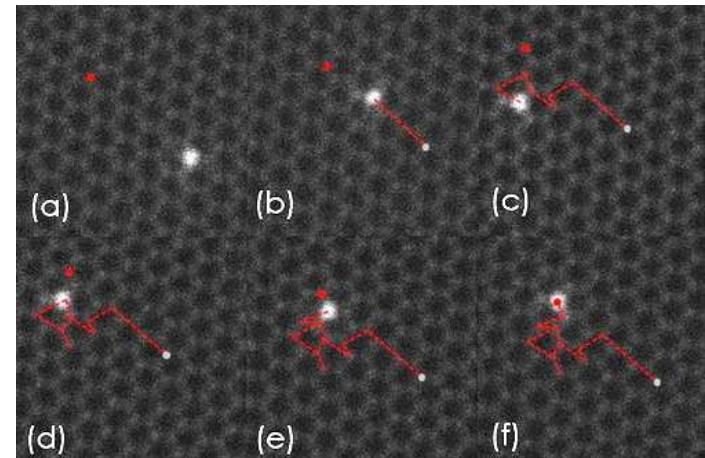


# Moving Atoms in STEM 2D materials at 60 kV

Lee, J. et. al. *Nat Commun*, **4**, 1650 (2013)  
Zhou, W. (2011)



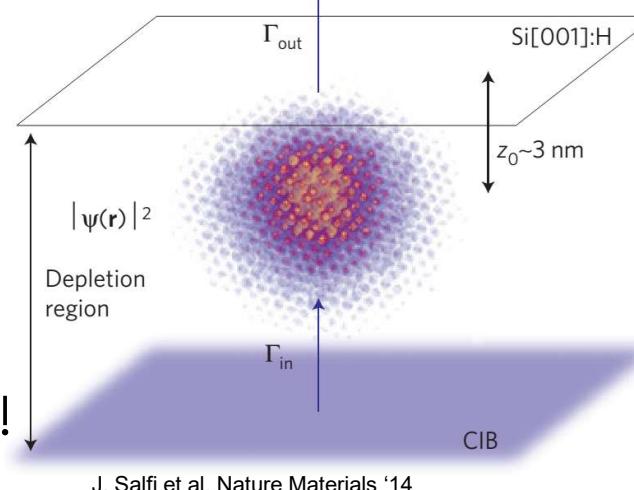
T. Susi et al., *Phys. Rev. Lett.* **113**, 115501 (2014).  
Susi, T. et. al. *Ultramicroscopy*, **180**, 163-172 (2017).



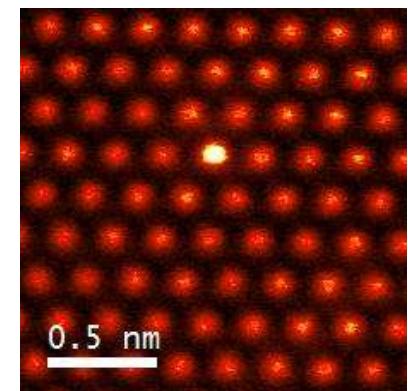
Dyck, O. et. al. *Appl. Phys. Lett.* **111**, 113104 (2017).  
Open slide master to edit

# Single-atom quantum computing

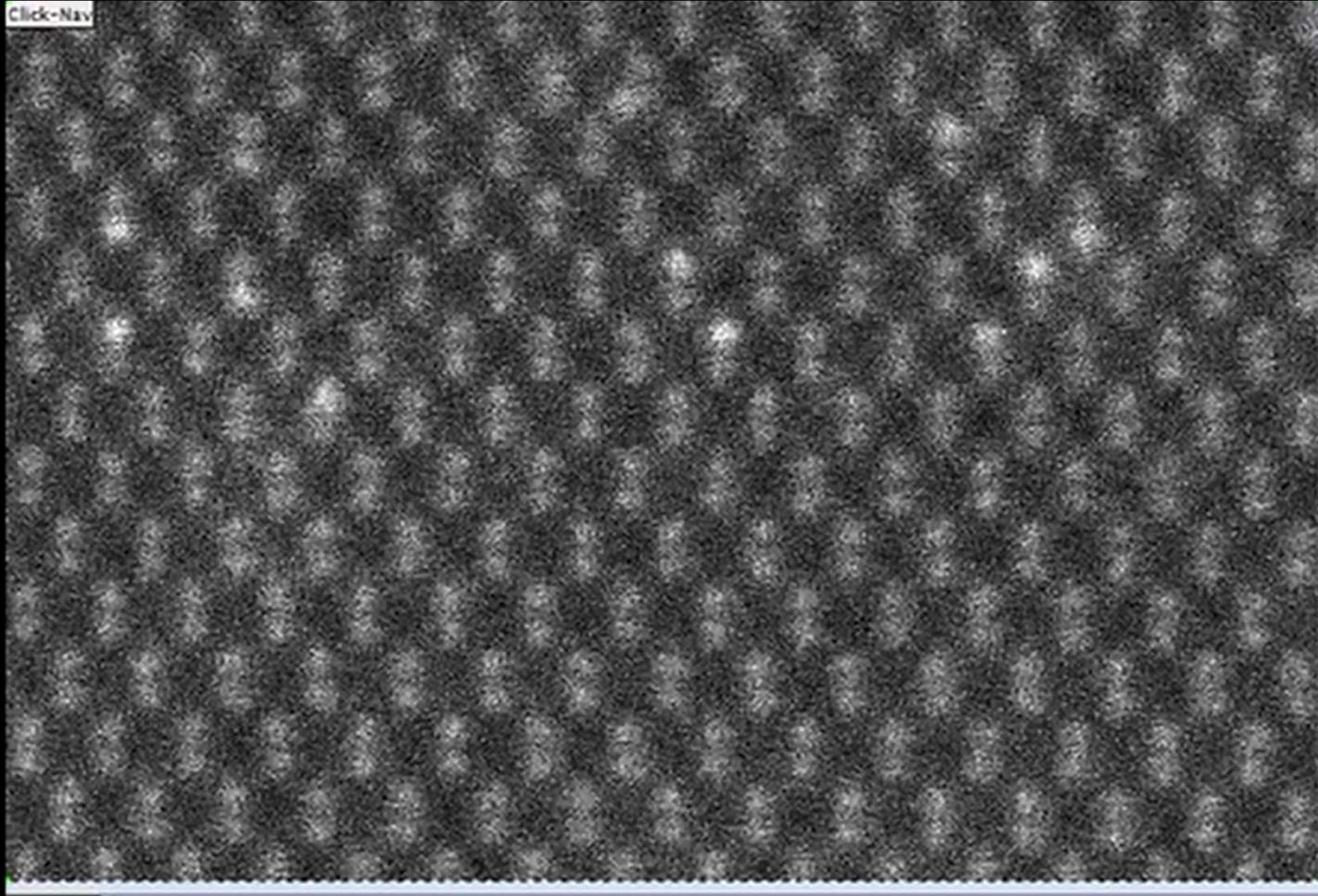
- Quantum computing could revolutionize cryptography, banking, scientific calculations, etc
- For functional single dopant qubits, one needs:
  - Accurate dopant positioning
  - Below but within a few atomic layers of the surface of a semiconductor
- Leverage existing technology:
  - Si based wafers
  - Single **P**, (As), Sb, **Bi**
  - Strong spin-orbit coupling
- Isotopically pure Si is expensive!
  - Use thin films
- Might only need a few dozen qubits to beat a supercomputer



J. Salfi et al. Nature Materials '14



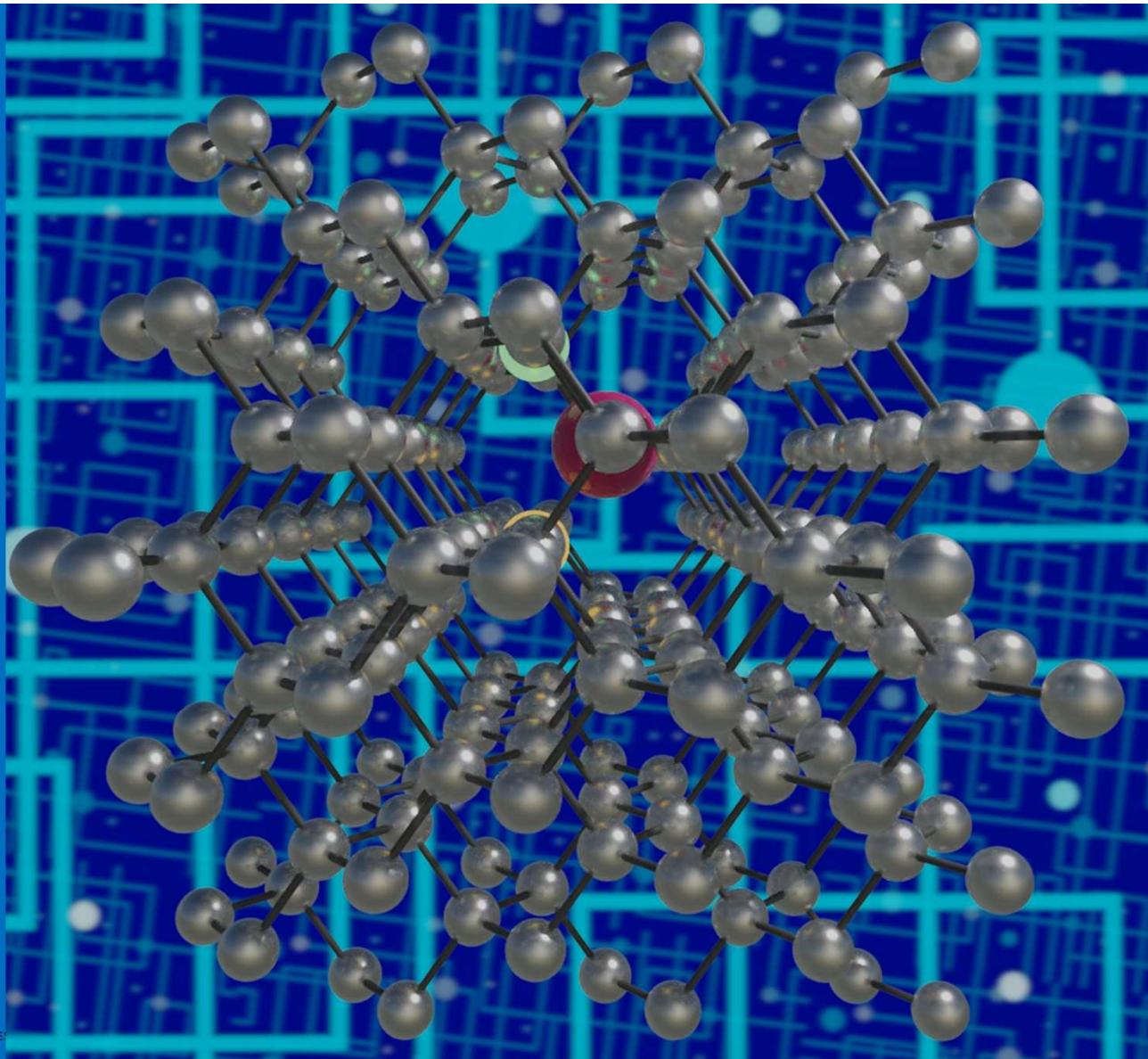
# Assembling atomic structures @ 160kV



Hudak, B.M *et al.*  
Directed Atom-by-  
Atom Assembly of  
Dopants in Silicon.  
*ACS Nano* (2018)

12:20:54 PM 06/07/2017 00:00.000

Open slide master to edit



M.D. simulations  
T. Susi, &  
A. Markevich

Open slide master to edit

# Other improvements: Detectors

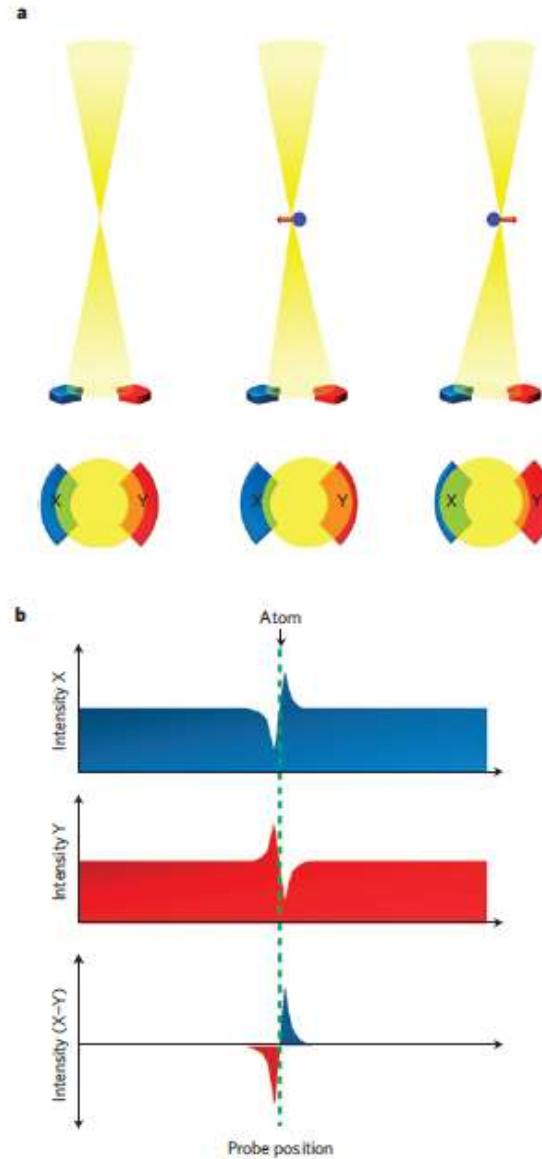
## Differential phase contrast (DPC)

The in plane field deflects the beam causing a contrast by subtracting perpendicular segments of a detector below

Dekkers & de Lang (1974) Optik  
H.Rose *Optik*

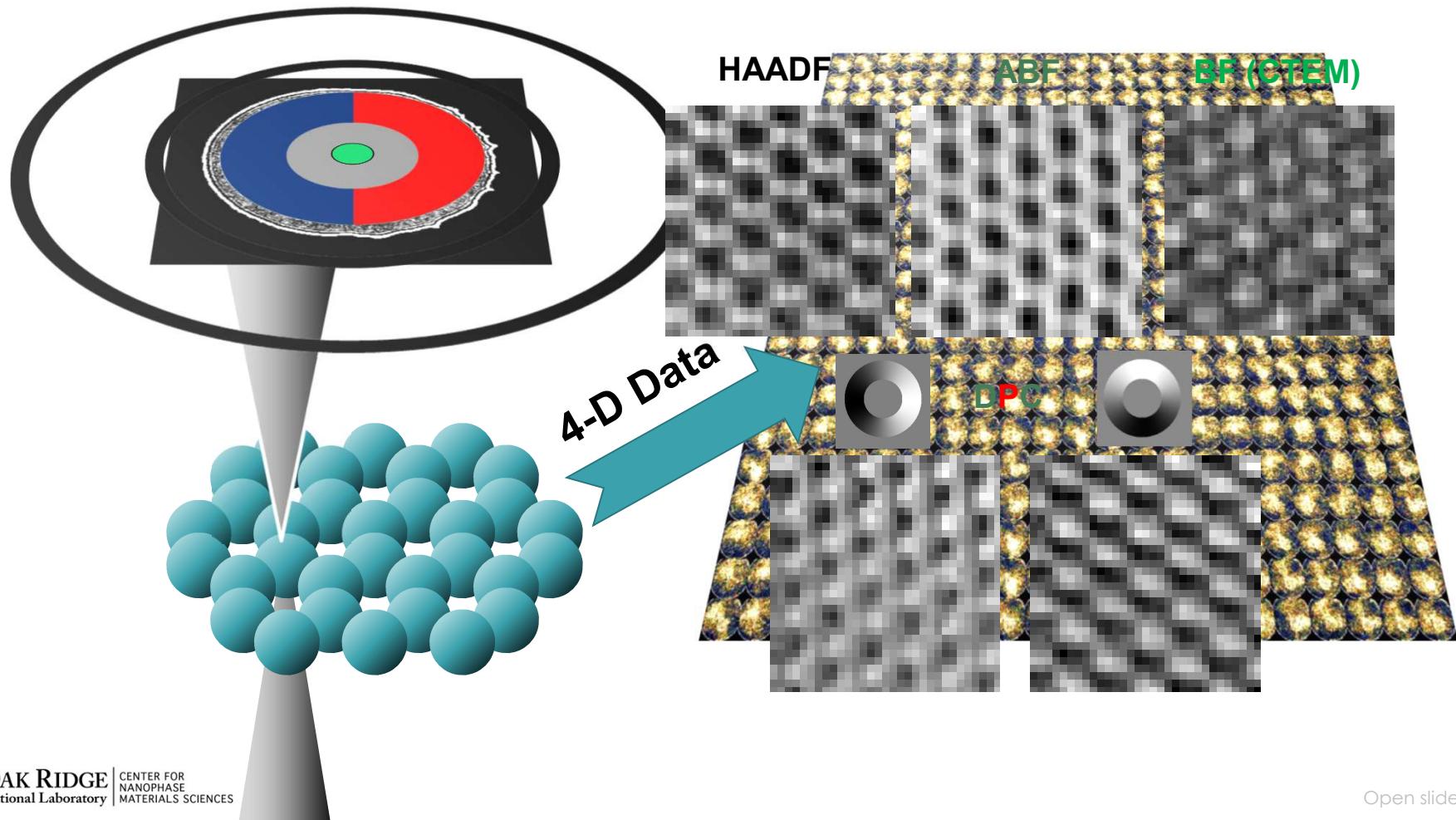
Shibata & Ikuhara et. al. (2012) *Nature Physics*.

Integrated differential phase contrast  
Bosch, Lazic & Lazar (2016)

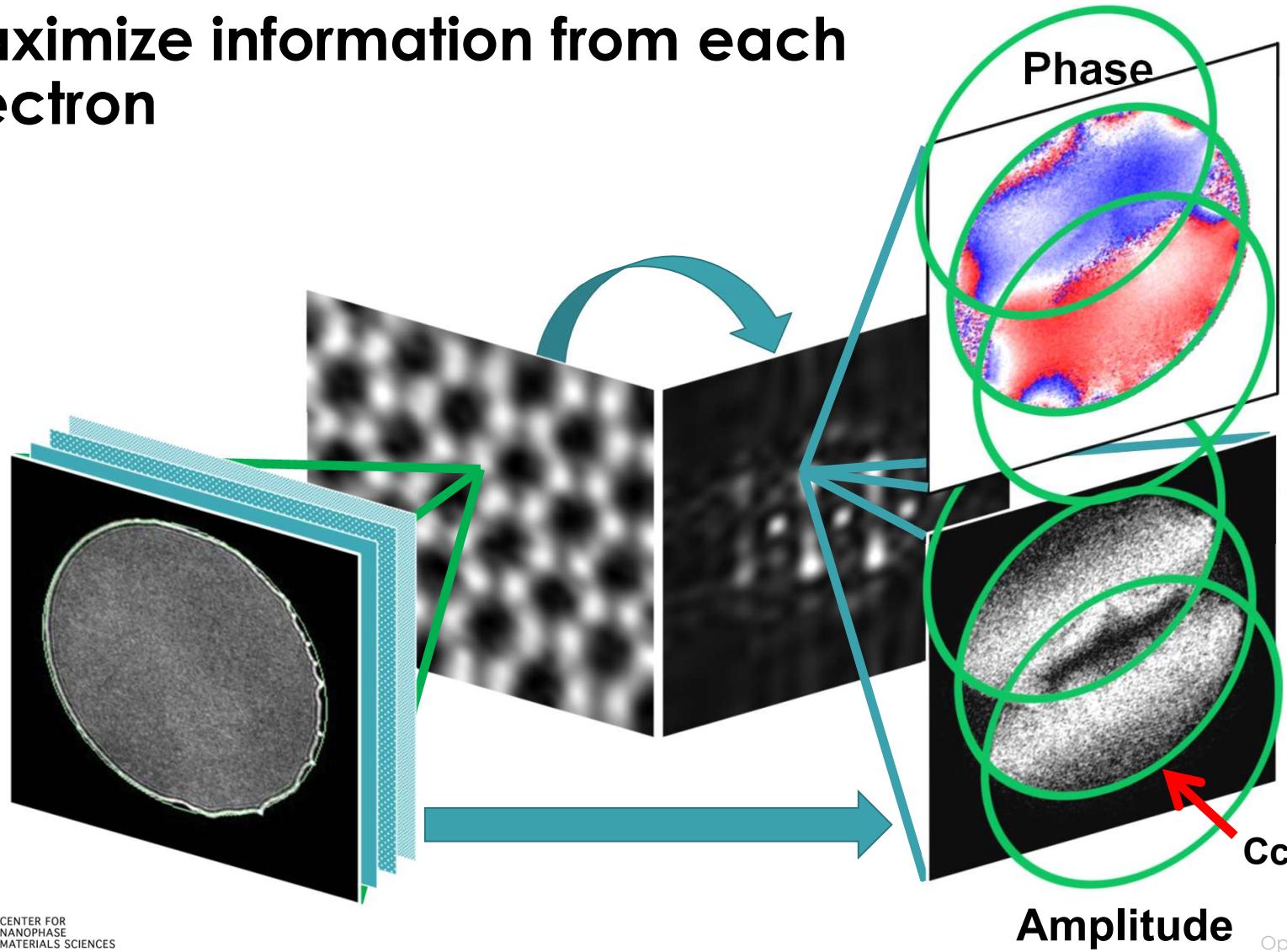


Open slide master to edit

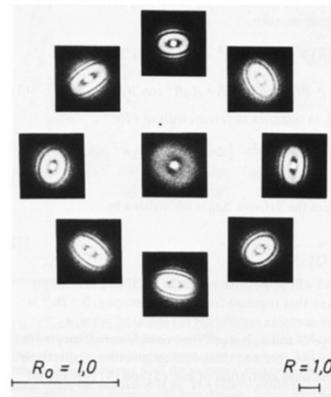
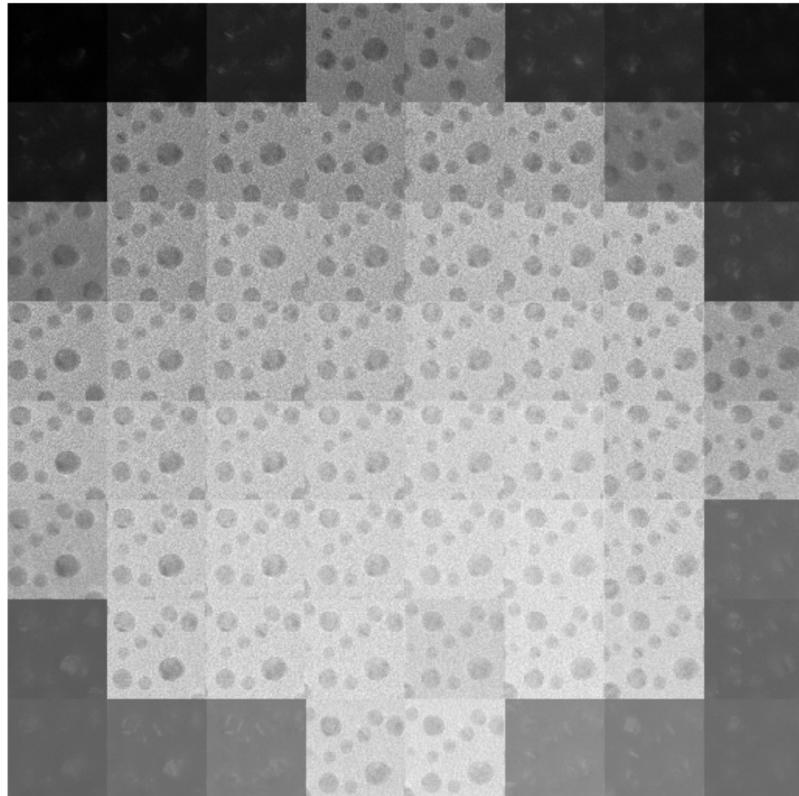
# “Universal Detector”



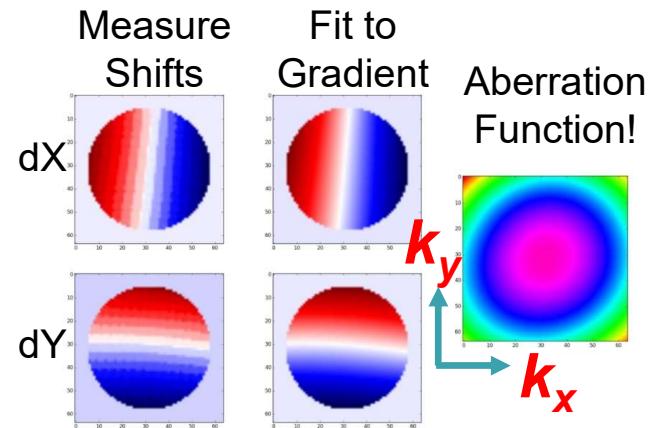
# Maximize information from each electron



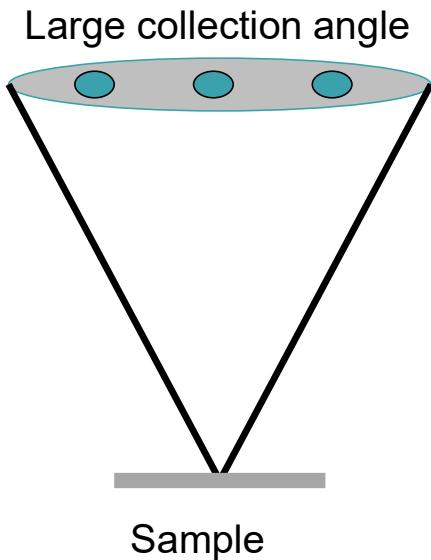
# Form an image for each detector pixel



Zemlin Tableau



# Limitations of STEM Bright Field



- **A large detector is the SUM of many smaller detectors at different angles**
- **Each would produce a different image**
- **The sum loses the smaller details...**
- **Damping envelope:**

$$E(k) = \exp\left(-\left(\frac{\pi}{\lambda}\sigma|\nabla\chi(k)|\right)^2\right)$$

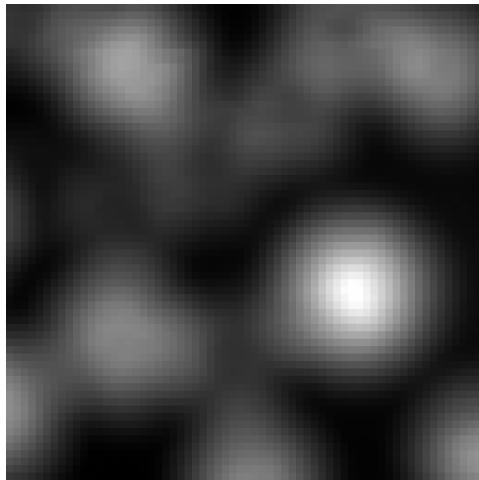
Aperture                      Gradient of  
                                        Aberration  
                                        function

Ref: J. Frank, Optik 1973

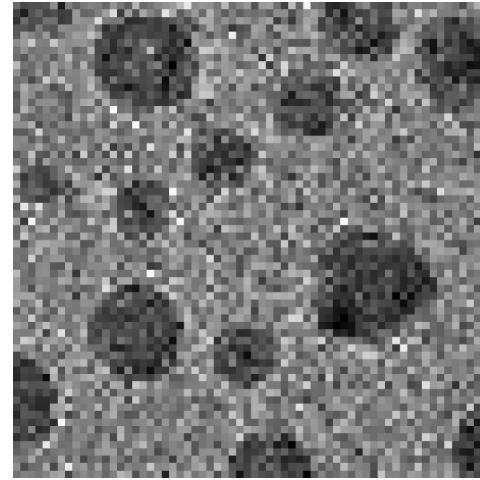
Open slide master to edit

# Simple Reconstruction

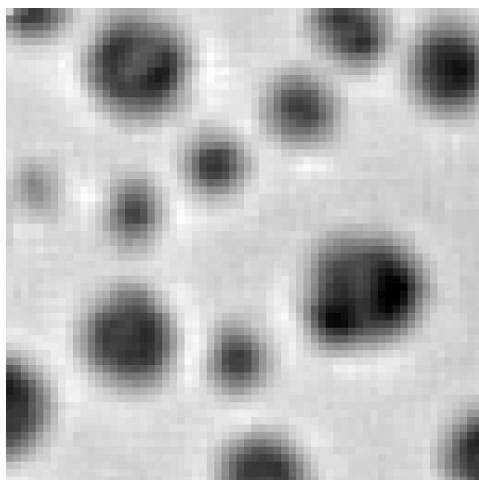
HAADF  
Image  
**64x64**  
probe  
positions,  
-250 nm  
defocus  
**Blurry!**



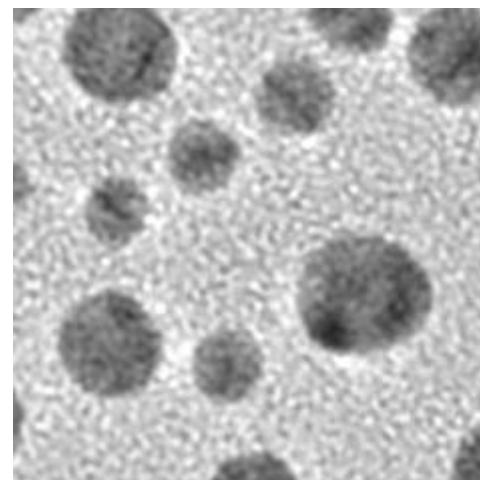
BF Image  
from single  
detector  
pixel  
**64x64**  
Probe  
positions  
**Noisy!**



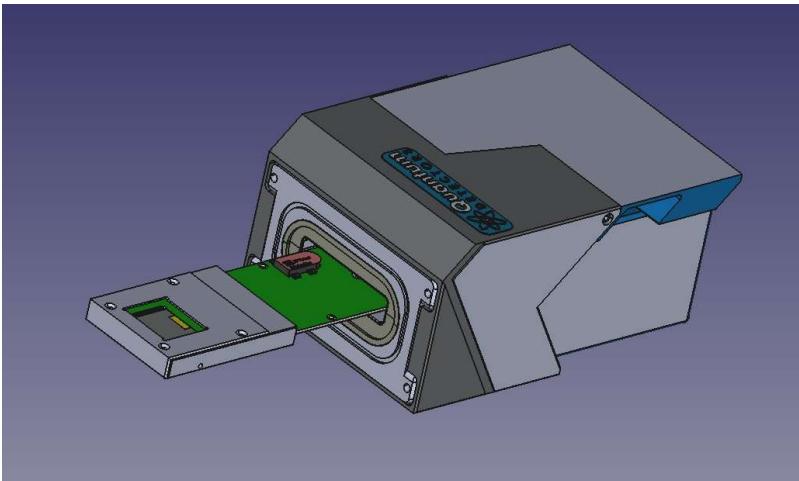
BF Image  
from large  
detector  
**64x64**  
Probe  
positions  
**Blurry!**



BF Image from shifting  
images by  $\text{grad}(\chi)$   
Reconstruct to **256x256**  
positions!  
(Lupini, Chi, Jesse,  
Journal Of Microscopy  
2016)



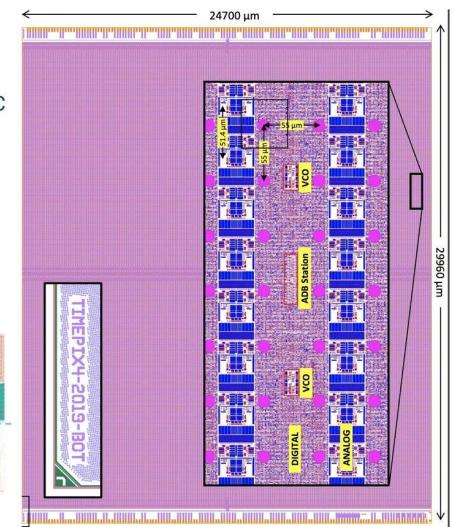
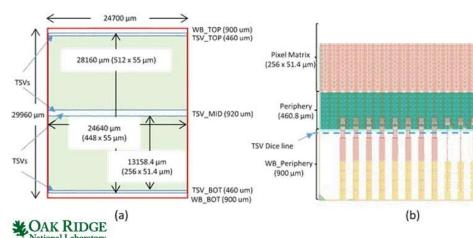
# Better Detectors



## The Timepix4 ASIC (65 nm)

Timepix4 aims to be the highest bandwidth pixel ASIC on the market and **4-side buttable!**

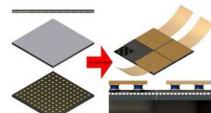
- **Large size ASIC** :  $25 \times 30 \text{ mm}$
- $55 \times 55 \mu\text{m}^2$  pixels, 800e threshold
- **Fully TSV compatible** with removable periphery
- $160 \text{ Gbps}, 3.6 \text{ Mhits/s/mm}^2$  capabilities
- **200 ps timing** capability on every pixel hit



## A Timepix4 with TSV

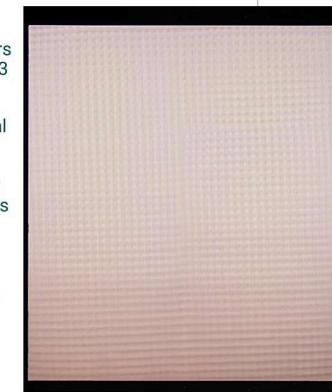
ORNL is collaborating with the CERN team in planning the processing of 12" wafers with IZM Berlin, securing 2-3 wafers (~70 chips)

- TSV processing essential for large area tiling
- We plan on developing integration methodology using ACP/ACF or bumps that is ultimately wire-bond less

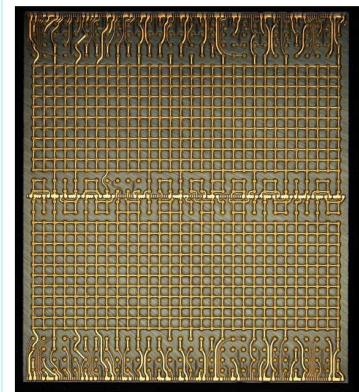


OAK RIDGE  
National Laboratory

Pixel side



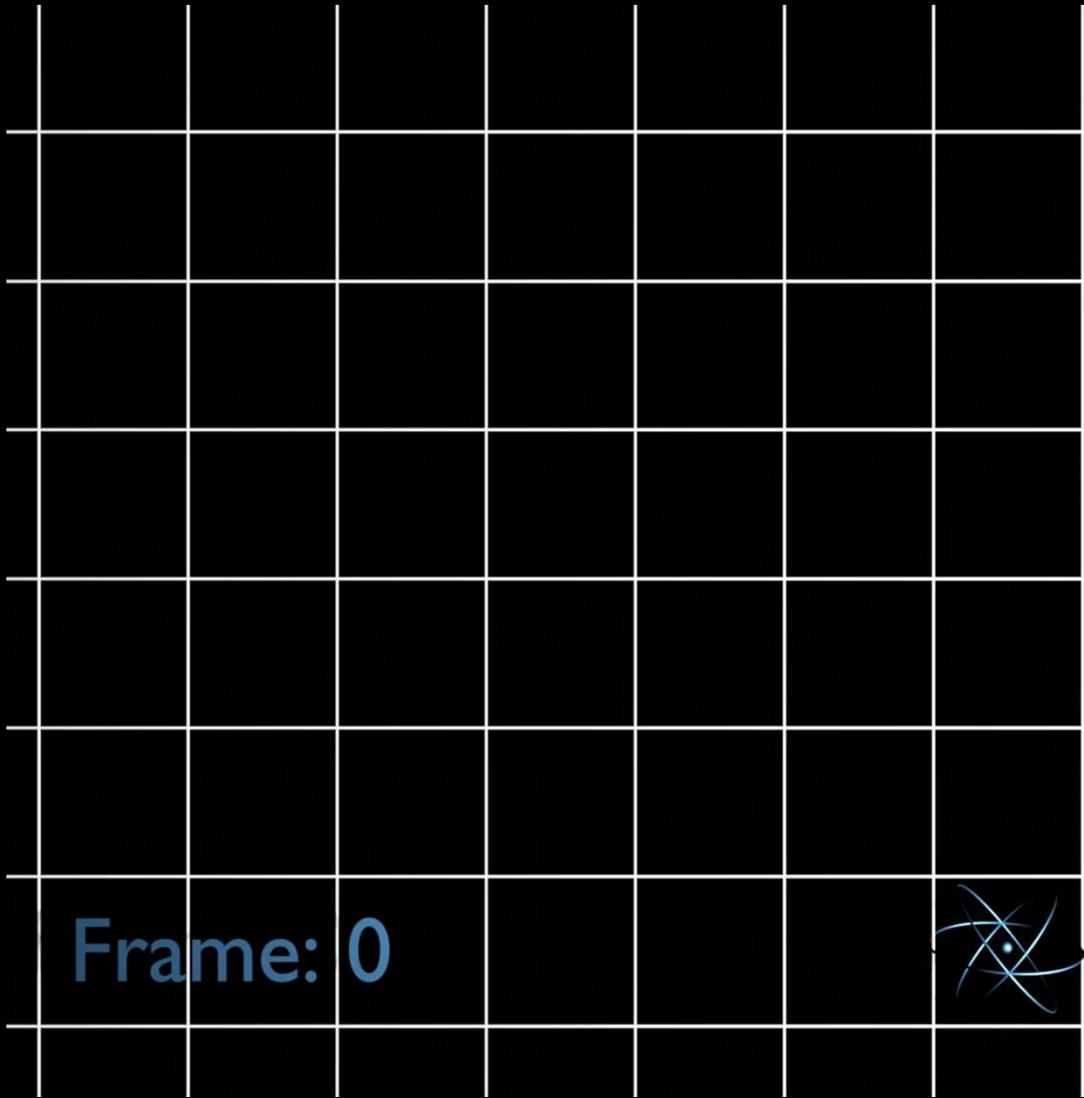
Back side



[https://indico.cern.ch/event/1439336/contributions/6261676/attachments/2978870/5244628/dr3\\_extra\\_results.pdf](https://indico.cern.ch/event/1439336/contributions/6261676/attachments/2978870/5244628/dr3_extra_results.pdf)

29

Open slide master to edit



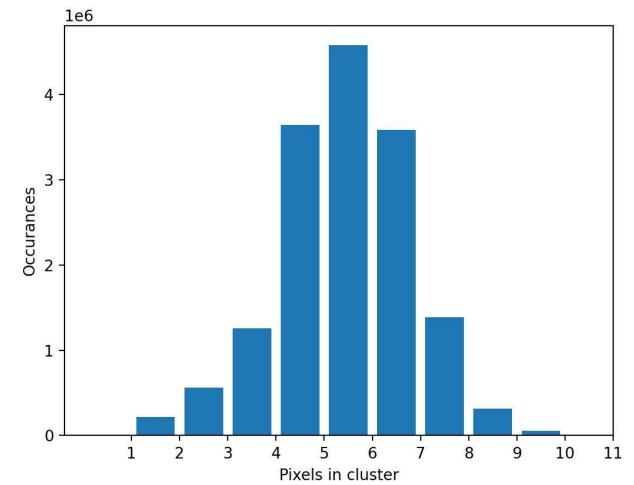
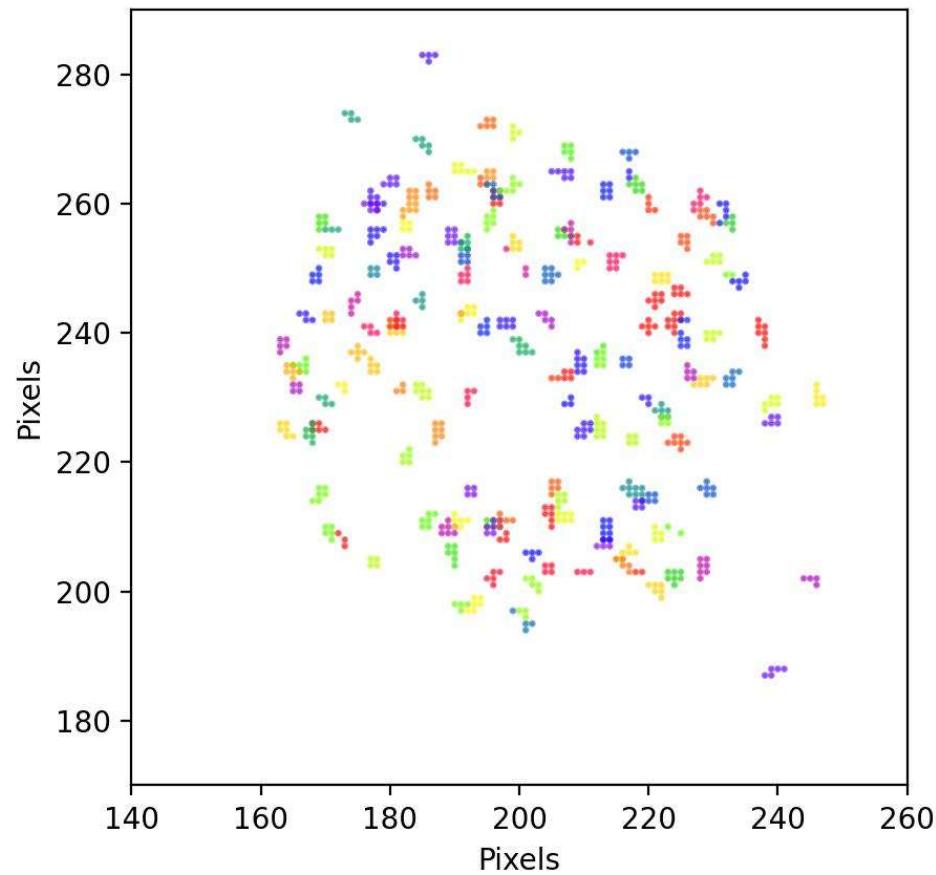
Frame: 0

Open slide master to edit

Time (uS): 0.0



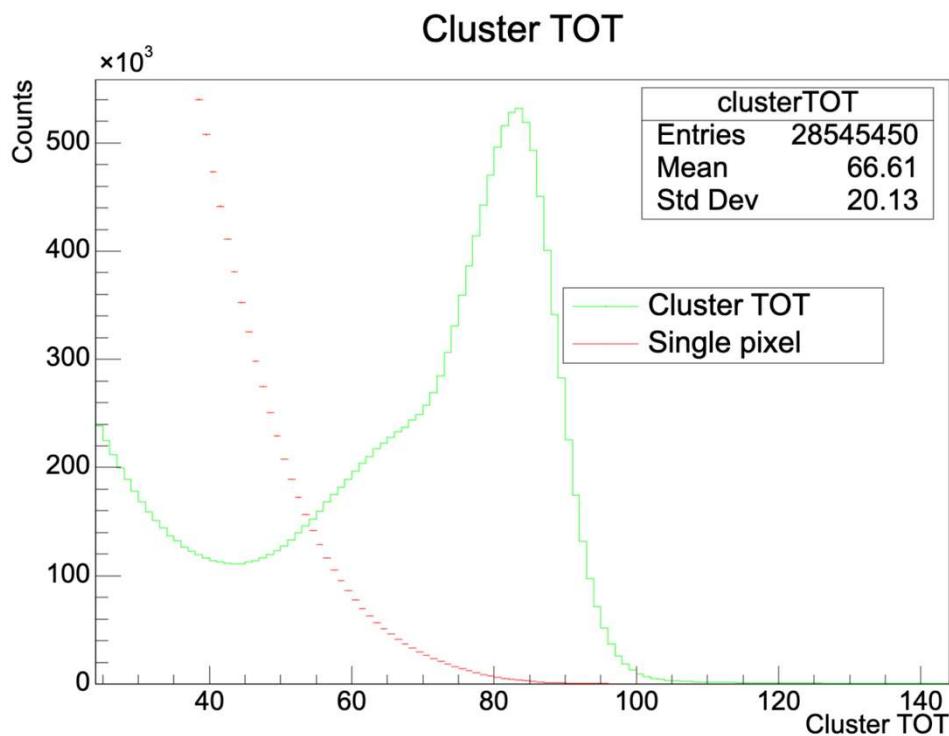
# Electrons hit multiple pixels



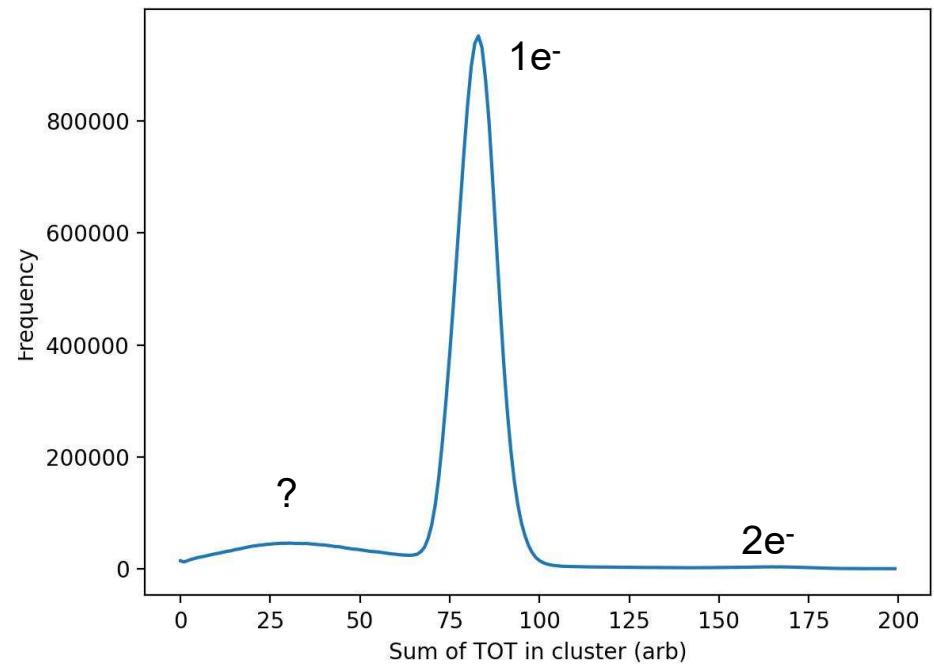
How to separate/cluster events?

Open slide master to edit

# Clustering algorithms

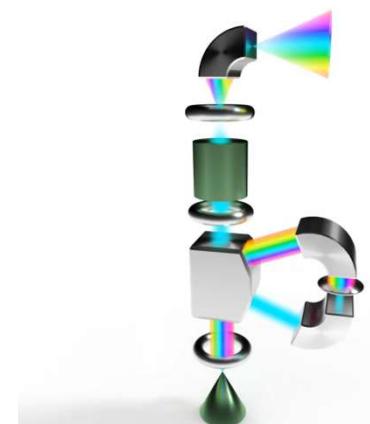
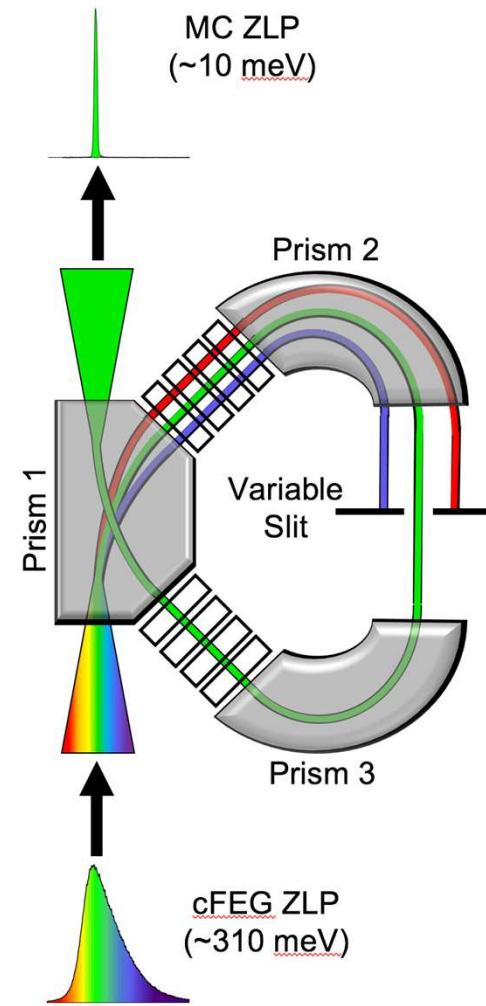
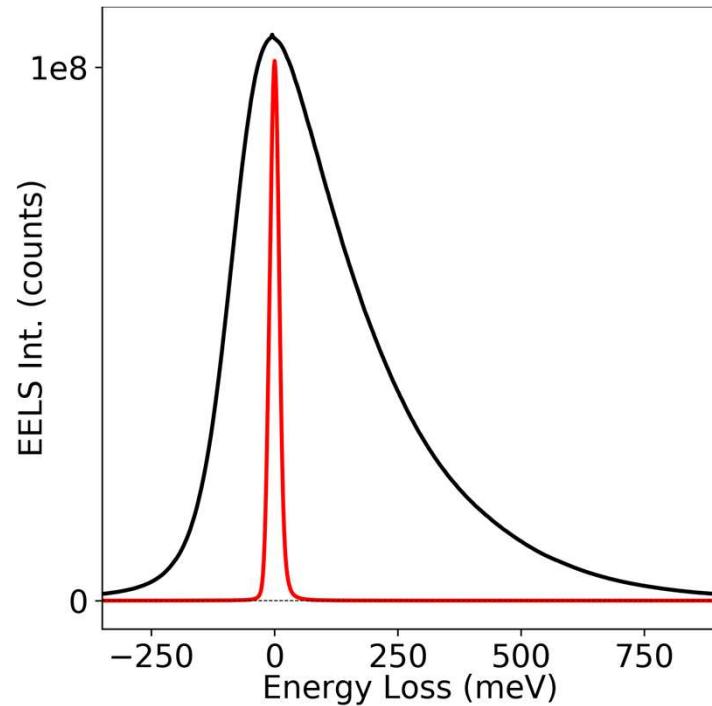


Separate clusters by time and position



Alternative handling for overlapping clusters

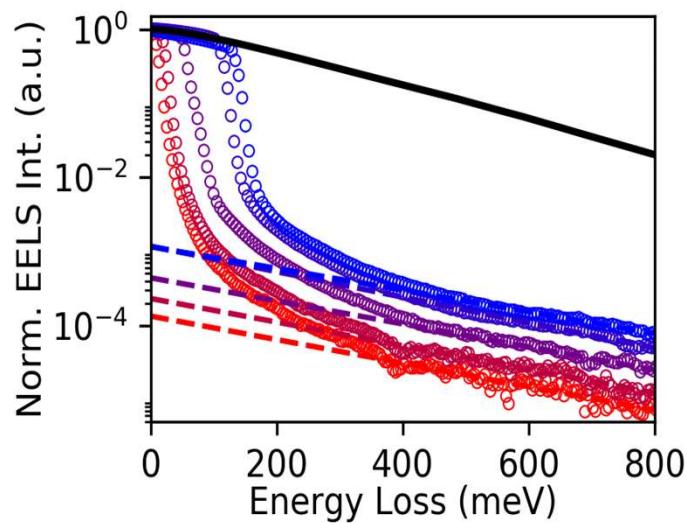
# How else could the microscope be improved?



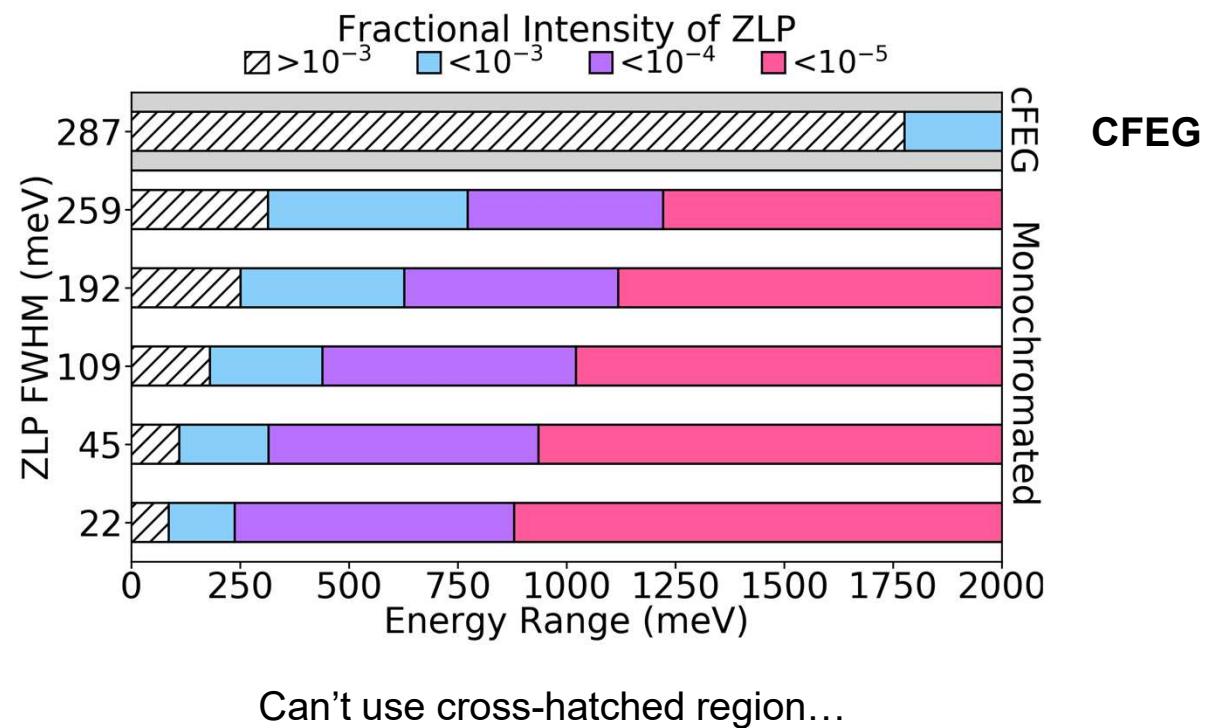
Krivanek et al (2014)  
Hachtel et al (2018)

Open slide master to edit

## Reduced background in the infrared



3+ order of magnitude  
reduction in IR background



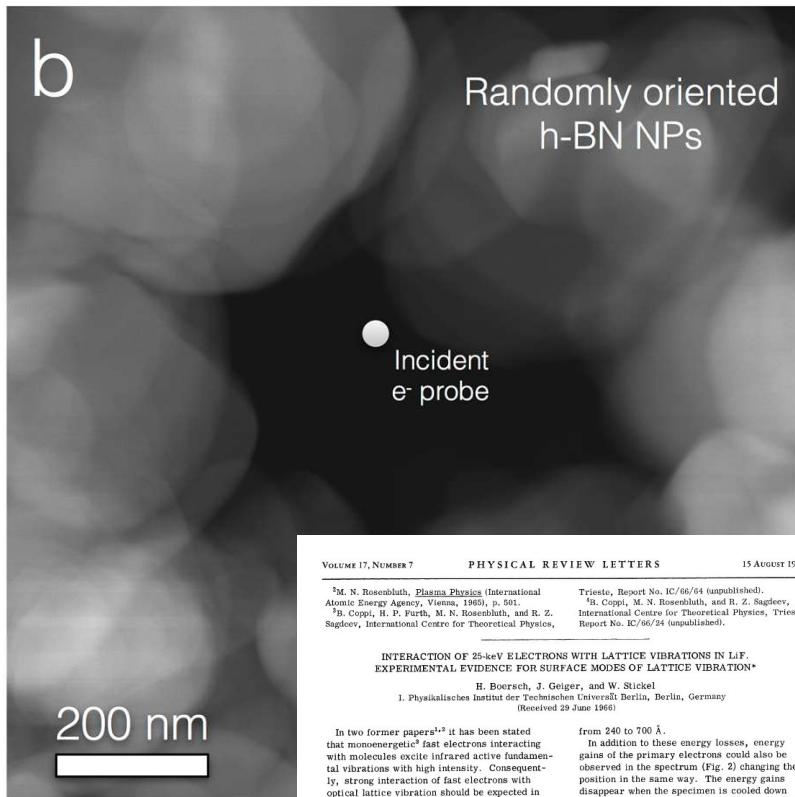
Can't use cross-hatched region...

Zhou & Idrobo (2017), Hachtel *et al.* (2018)

Open slide master to edit

# Infra-red Phonon Spectroscopy in the Electron Microscope

Z-contrast Image



VOLUME 17, NUMBER 7 PHYSICAL REVIEW LETTERS 15 AUGUST 1966

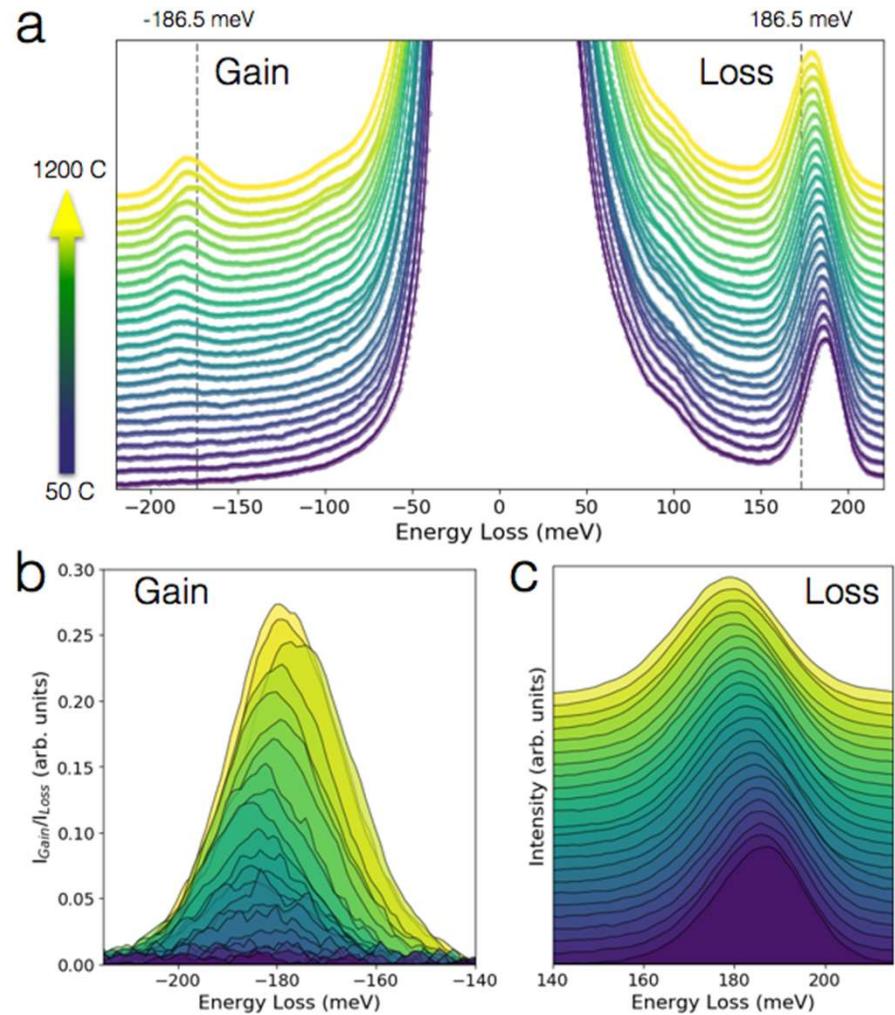
<sup>a</sup>M. N. Rosenbluth, *Plasma Physics* (International Atomic Energy Agency, Vienna, 1965), p. 501.  
<sup>b</sup>B. Coppi, H. P. Furth, M. N. Rosenbluth, and R. Z. Sagdeev, International Centre for Theoretical Physics, Trieste, Report No. IC/66/24 (unpublished).

INTERACTION OF 25-keV ELECTRONS WITH LATTICE VIBRATIONS IN LiF.  
EXPERIMENTAL EVIDENCE FOR SURFACE MODES OF LATTICE VIBRATION\*

H. Boersch, J. Geiger, and W. Stückel  
1. Physikalisches Institut der Technischen Universität Berlin, Berlin, Germany  
(Received 29 June 1966)

In two former papers<sup>1,2</sup> it has been stated that monomeric<sup>3</sup> fast electrons interacting with molecules excite infrared active fundamental lattice vibrations of the molecule. Consequently, strong interaction of fast electrons with optical lattice vibration should be expected in alkali-halide crystals. In these solids, however, as is well known, electromagnetic wave excite transverse vibrations  $\omega_T$  of the lattice, whereas a charged particle excites the longitudinal modes  $\omega_L$ . The maximum of light absorption and the most probable energy loss appear at different energies.

from 240 to 700 Å.  
In addition to these energy losses, energy gains due to energy electrons could also be observed in the spectrum (Fig. 2) changing their position in the same way. The energy gains disappear when the specimen is cooled down to the temperature of liquid air. Since processes leading to energy loss and energy gain have equal probabilities, the intensity ratio of energy gain and energy loss is proportional to the occupation probability of the state, which is a function of the temperature of the specimen.

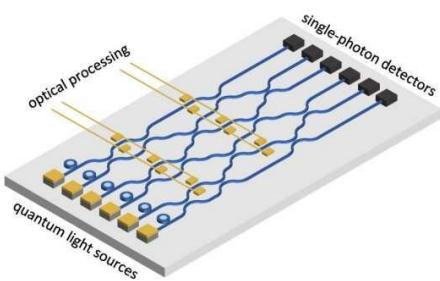


Principle of detailed balance  
Unlike plasmons – no calibration needed

Open slide master to edit

# Single photons are ideal quanta for realizing quantum computing and networks

## Quantum computing

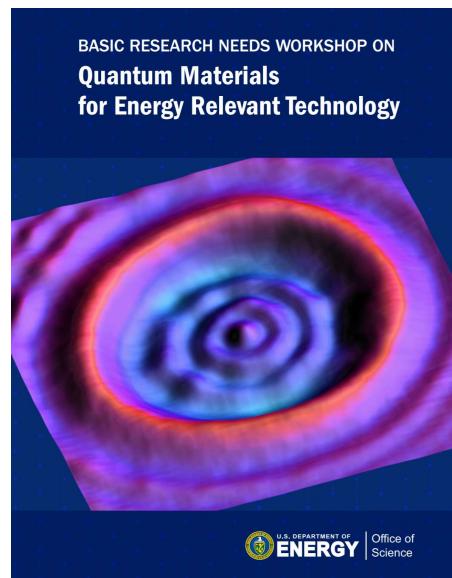


<https://phys.org/news/2019-10-quantum-photonics.html>

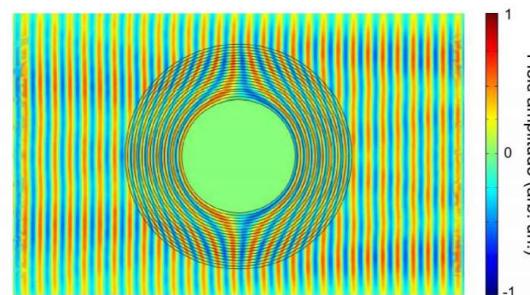
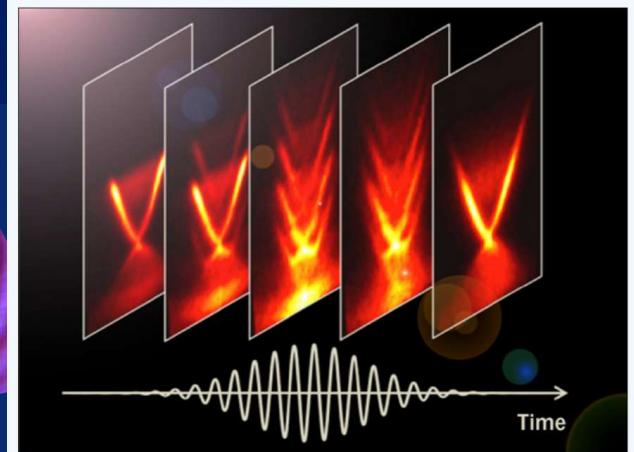
## Quantum network



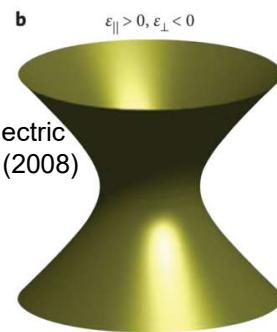
<https://projectqsydney.com/quantum-teleportation-paving-the-way-for-a-quantum-internet/>



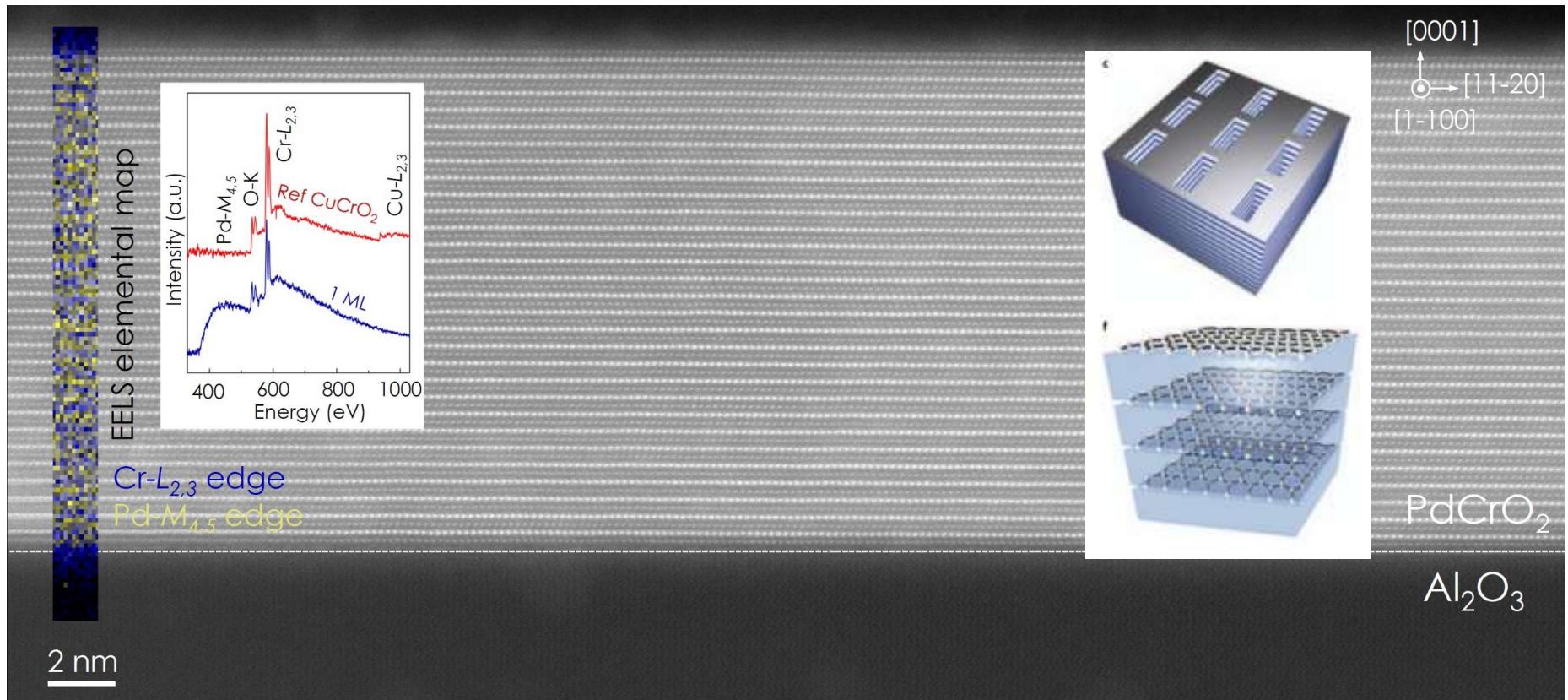
Light-Matter or electron-matter interactions:



“Invisibility Cloak”:  
Infrared cloaking based on the electric  
response of split ring resonators (2008)  
OPTICS EXPRESS 9191



# Atomic Scale Hyperbolic Metamaterials STEM EELS for composition and growth quality



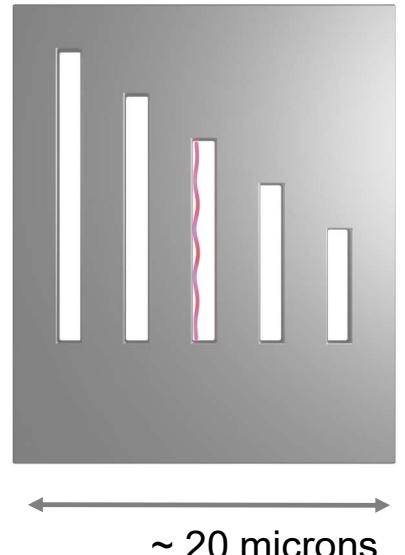
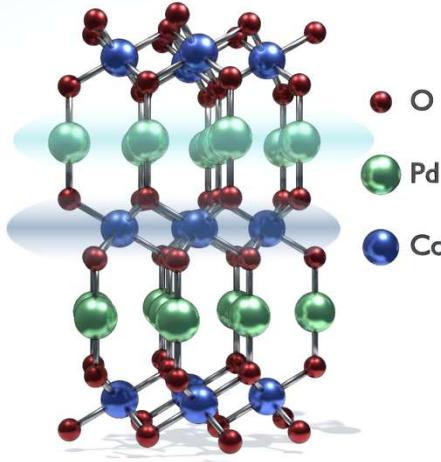
Buffer layer (CuCrO<sub>2</sub>) essential for single phase growth

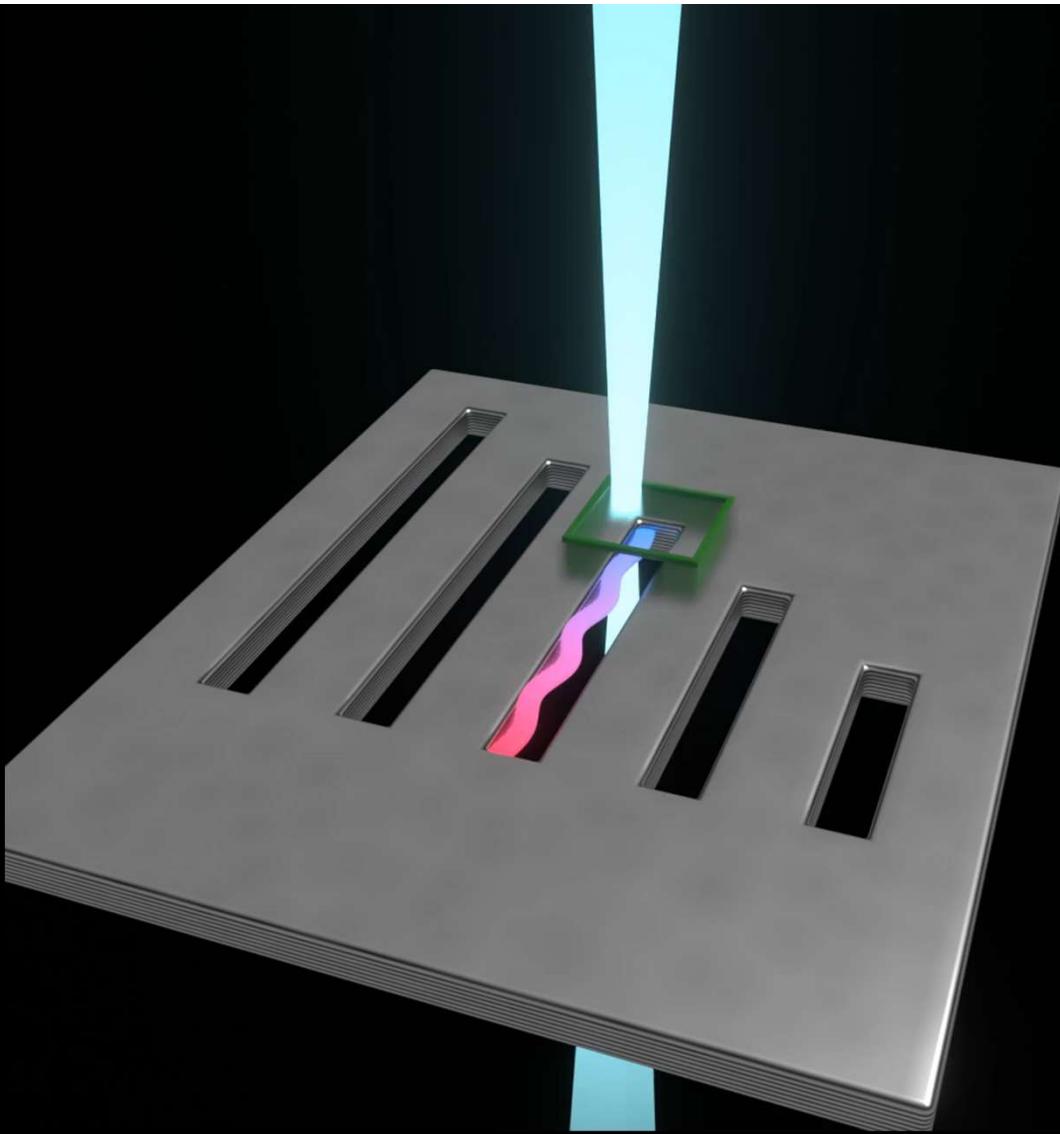
J.M. Ok *et al.* APL Materials 8 (5), 051104 (2020)

Open slide master to edit

# Experimental challenges:

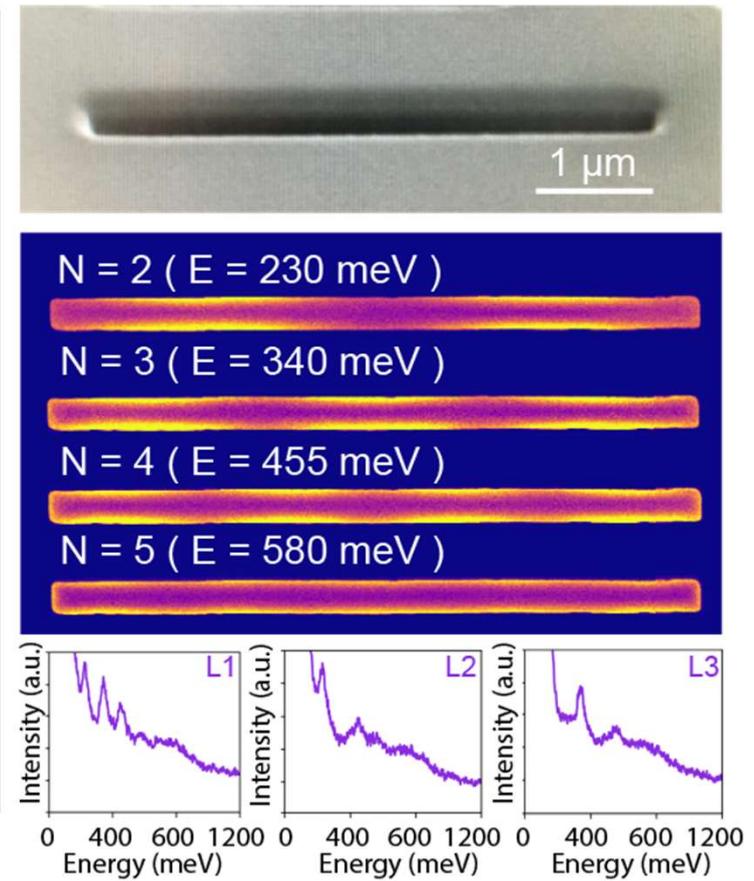
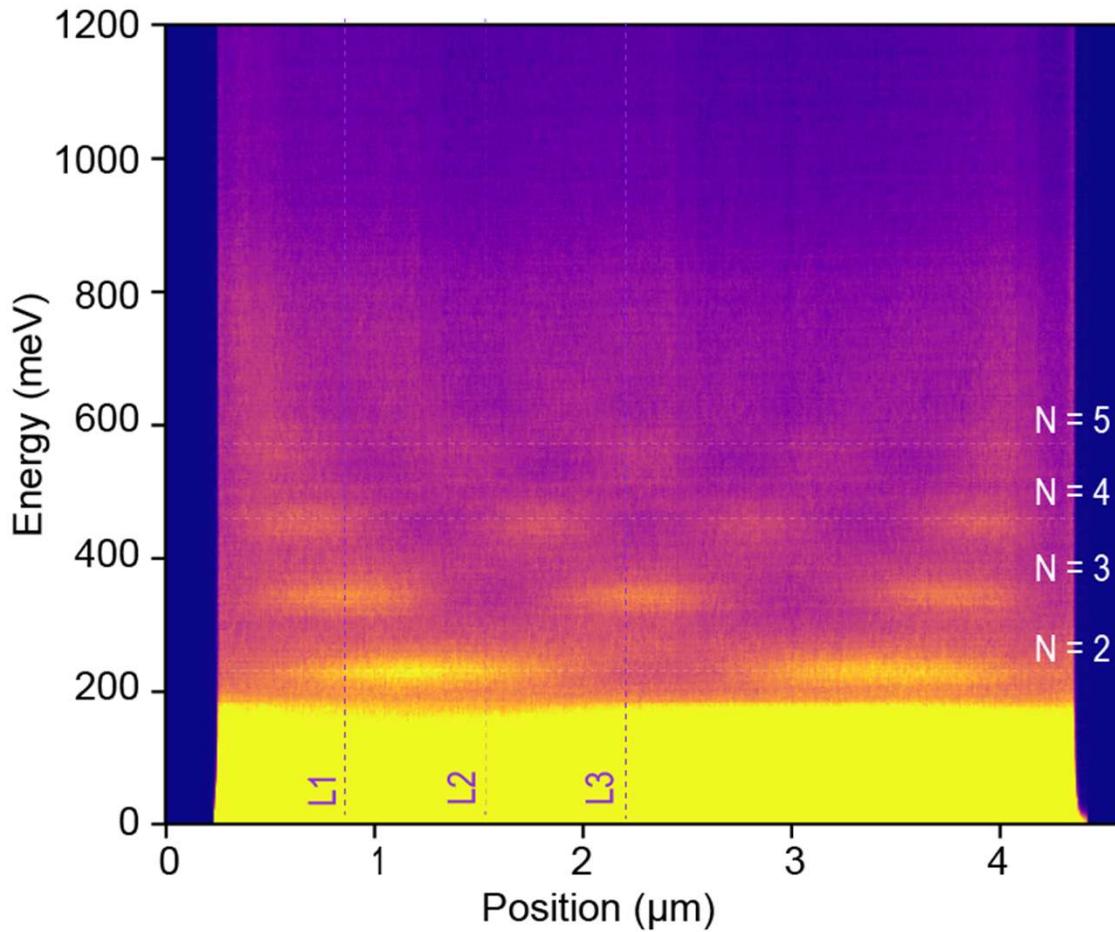
- Want ~ 20 meV energy resolution
  - **MAC-STEM**
- Want ~ 10 nm spatial resolution
- Want ~ 20 micron Field of view
  - Limit ~ 0.5 micron (without distortion)
- Long and repetitive acquisition
  - Automated scripting and tiling
  - AI/ML for analysis?



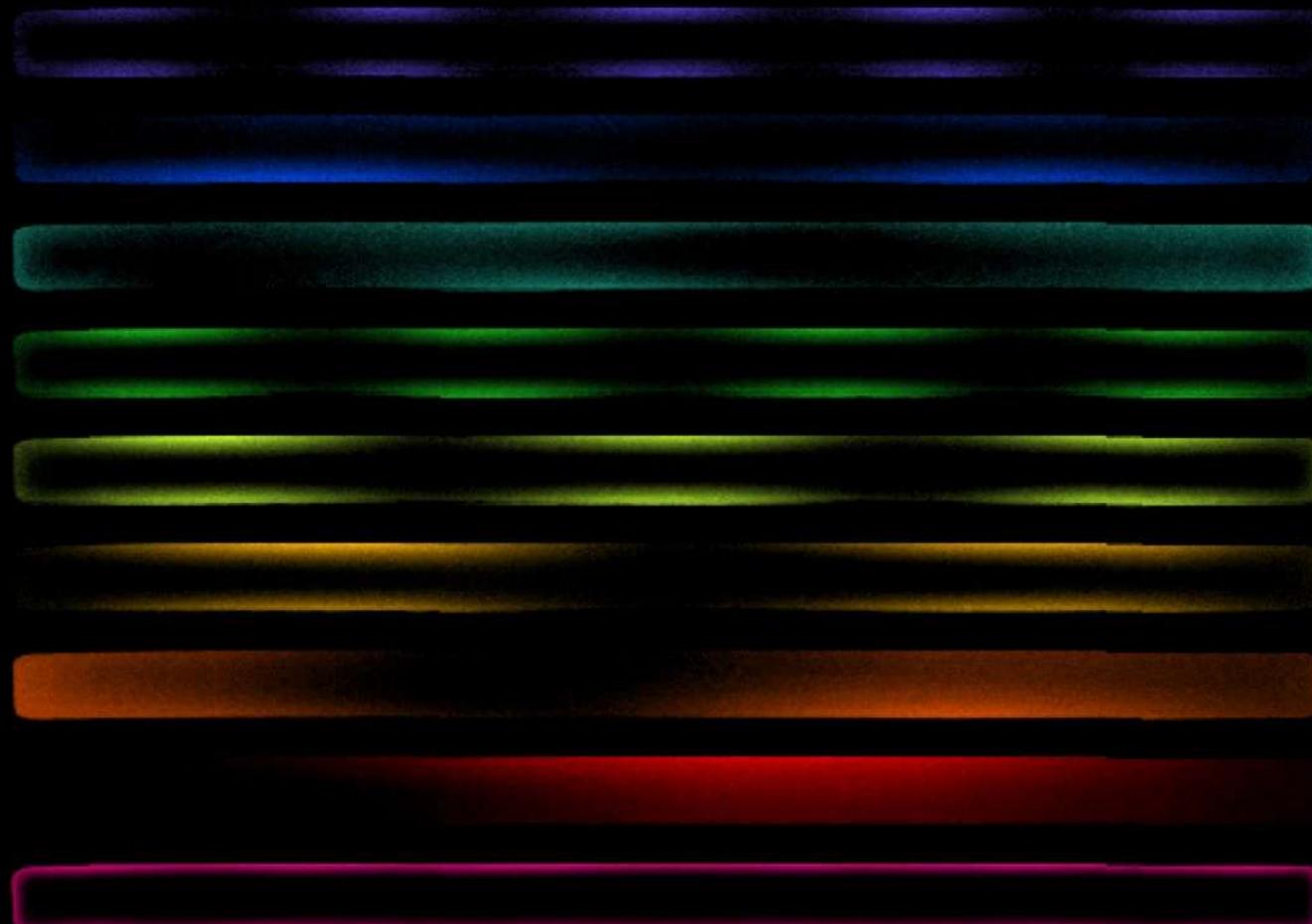


Open slide master to edit

# Plasmonic Response



## Non negative matrix factorization – Spatial map

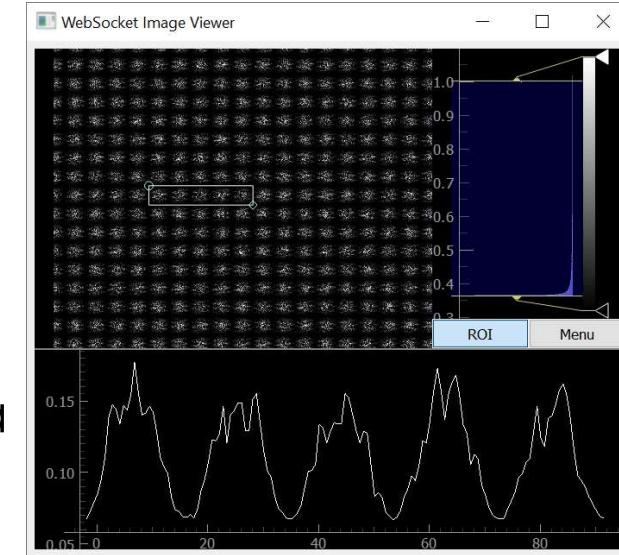


4 micron slot

Open slide master to edit

# Obvious Areas for AI/ML/AE in (S)TEM

- Set up the microscope
  - Corrector, Monochromator tuning
  - Find your atom!
  - Keep the microscope focused at the same area
  - General Automation
- How representative is that little area?
  - Scan a whole sample / many samples
- Better data stream at high speeds
  - Tag each electron instead of keeping 4D stack
- Image / sample reconstructions and analysis
- Move many atoms
- Physics simulations – What are the properties?



# Center for Nanophase Materials Sciences

## A DOE User Facility for Creating, Characterizing, and Understanding Nanomaterials

Providing **free access to staff expertise and equipment** if intent is to publish results.

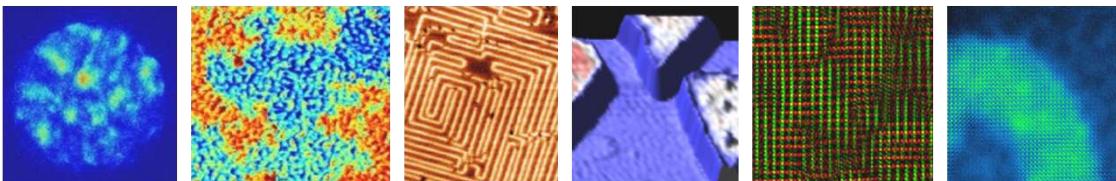
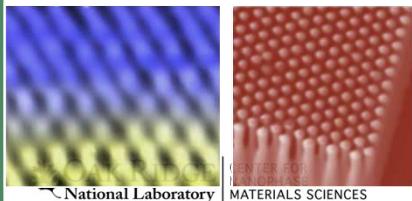
### Proposals:

- Simple, two-page narrative
- Two general calls per year
- Short-term projects accepted continuously
- Joint proposals with neutron sources (SNS, HFIR)

### Research areas:

- **Synthesis** – Soft matter (precision synthesis, selective deuteration), 2D materials, hybrid structures, epitaxial oxides
- **Nanofabrication** – Direct-write (3D) fabrication, e-beam lithography, multiscale fluidics, 10,000 sq. ft. cleanroom
- **Advanced Microscopy** – AFM, STM, aberration-corrected and *in situ* TEM/STEM, He-ion microscopy, atom-probe tomography
- **Chemical Imaging** – Multiple approaches based on mass spectrometry or optical spectroscopies
- **Functional Characterization** – Laser spectroscopy, transport, magnetism, electromechanical phenomena
- **Theory/Modeling, Data Analytics** – Including interactions and co-development with leadership-class, high-performance computing
- **Gateway to Neutron Sciences** – deuterated materials, sample environments, multimodal measurements

[cnms.ornl.gov](http://cnms.ornl.gov)



Open slide master to edit

# Follow our YouTube channel for updates



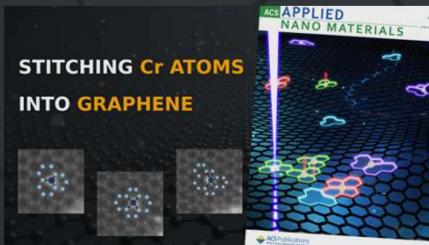
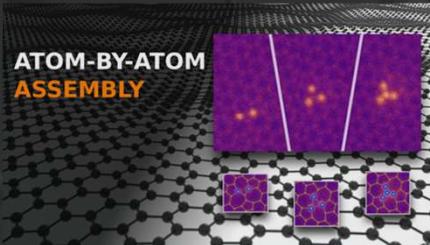
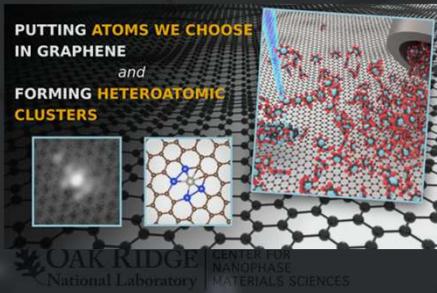
- YouTube: <https://www.youtube.com/@theatomlab>

SHORT (5 min) paper summaries

Conference talks



Linked in: <https://www.linkedin.com/in/ondrejdyck/>



## TheAtomLab

Open slide master to edit

