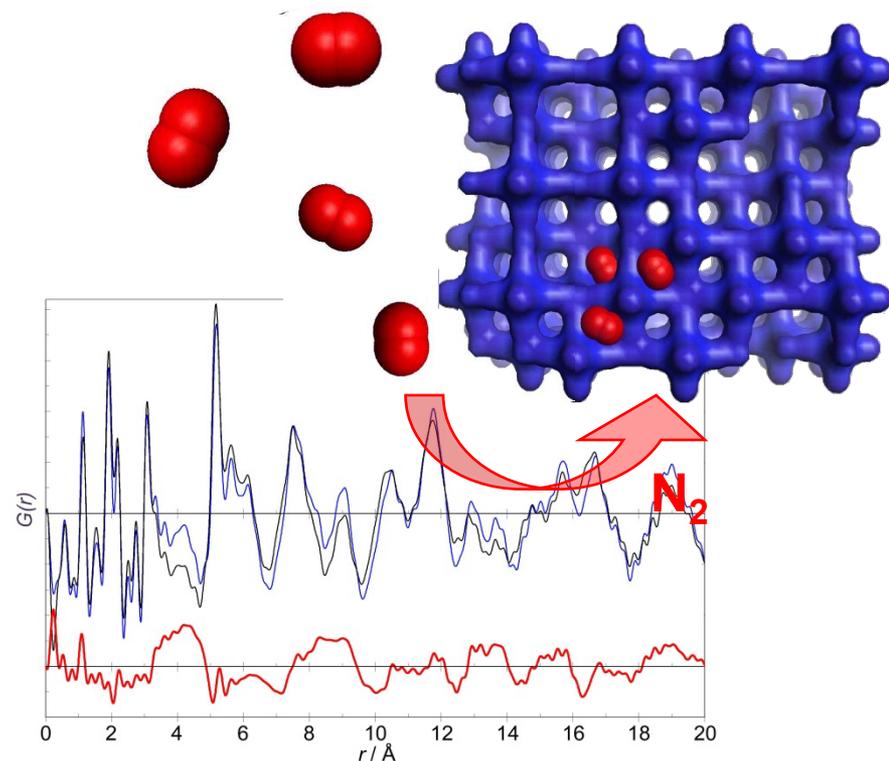


# In situ & Operando Measurements *From Atoms to Applications*

Karena W. Chapman

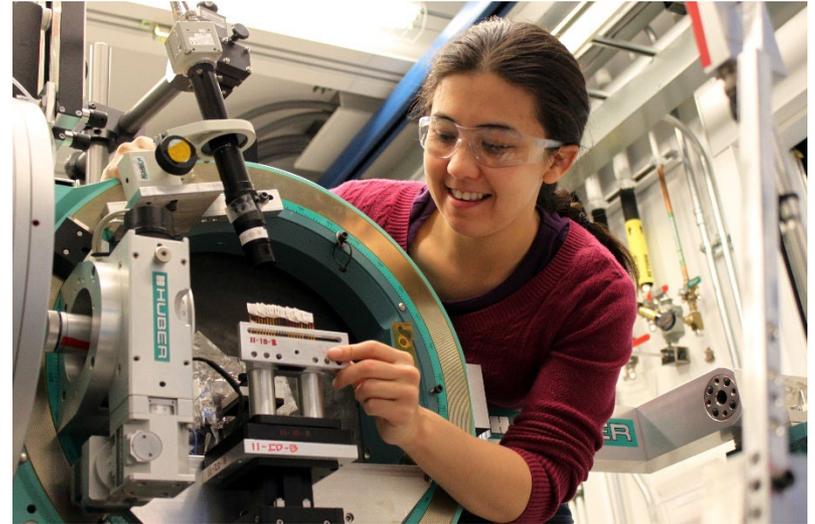
*Joseph Lauher and Frank W. Fowler  
Endowed Chair in Materials Chemistry  
Department of Chemistry,  
Stony Brook University*



**Stony Brook University**

# My Bio. My Bias

- Chemist
  - Energy problem solver
  - High energy X-ray scatterer
  - PDF-fangirl
  - In-situ/operando experimentalist
  - Retired beamline scientist
- 
- Contact me: [karena.chapman@stonybrook.edu](mailto:karena.chapman@stonybrook.edu)

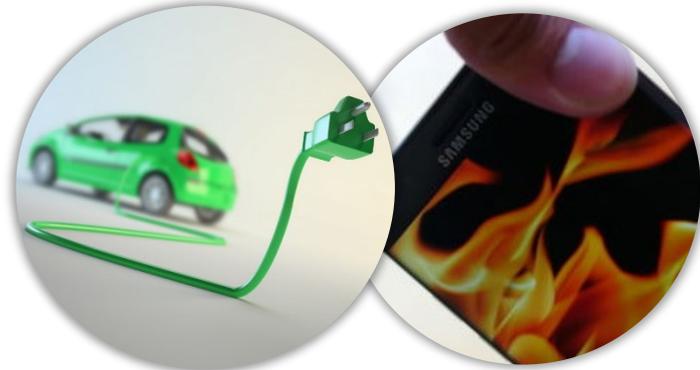


- Feedback form →



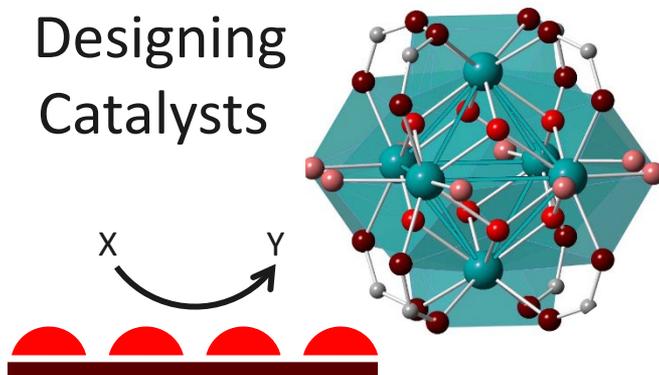
# A focus on functional energy materials

## Energy Storage

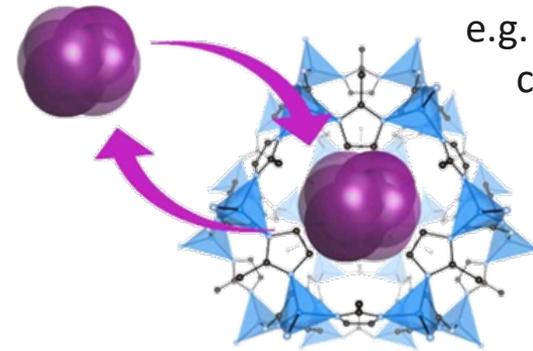


Optimize Function &  
Mitigate Failure

## Designing Catalysts

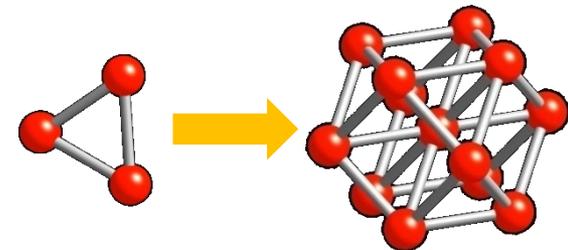


## Sorption & Separations



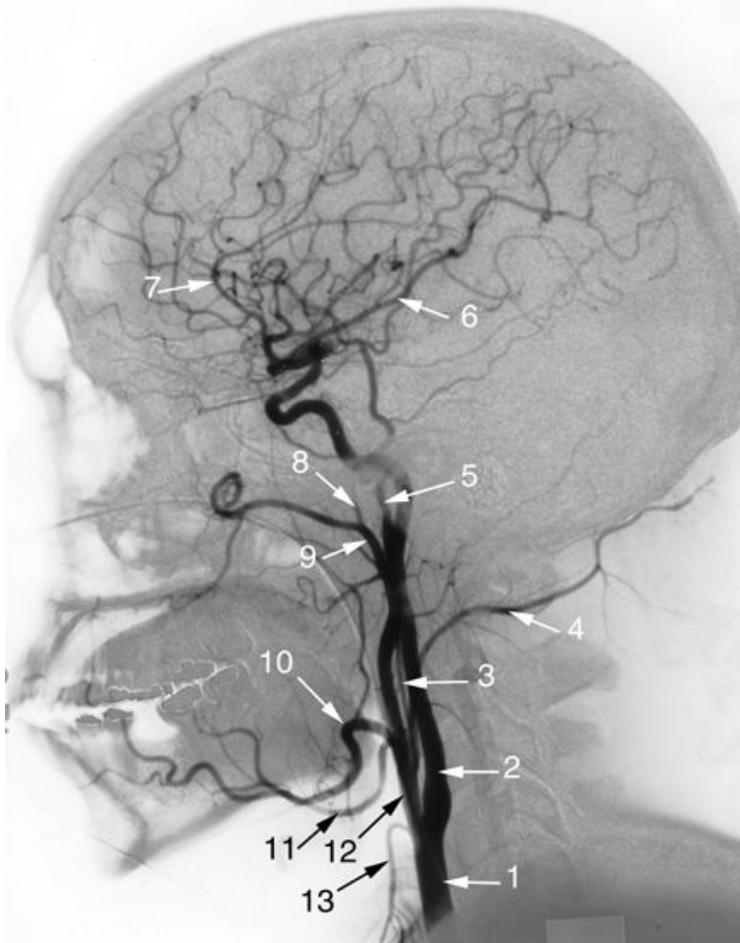
e.g. for nuclear waste  
capture, carbon  
sequestration

## Materials Discovery, Nucleation & Growth



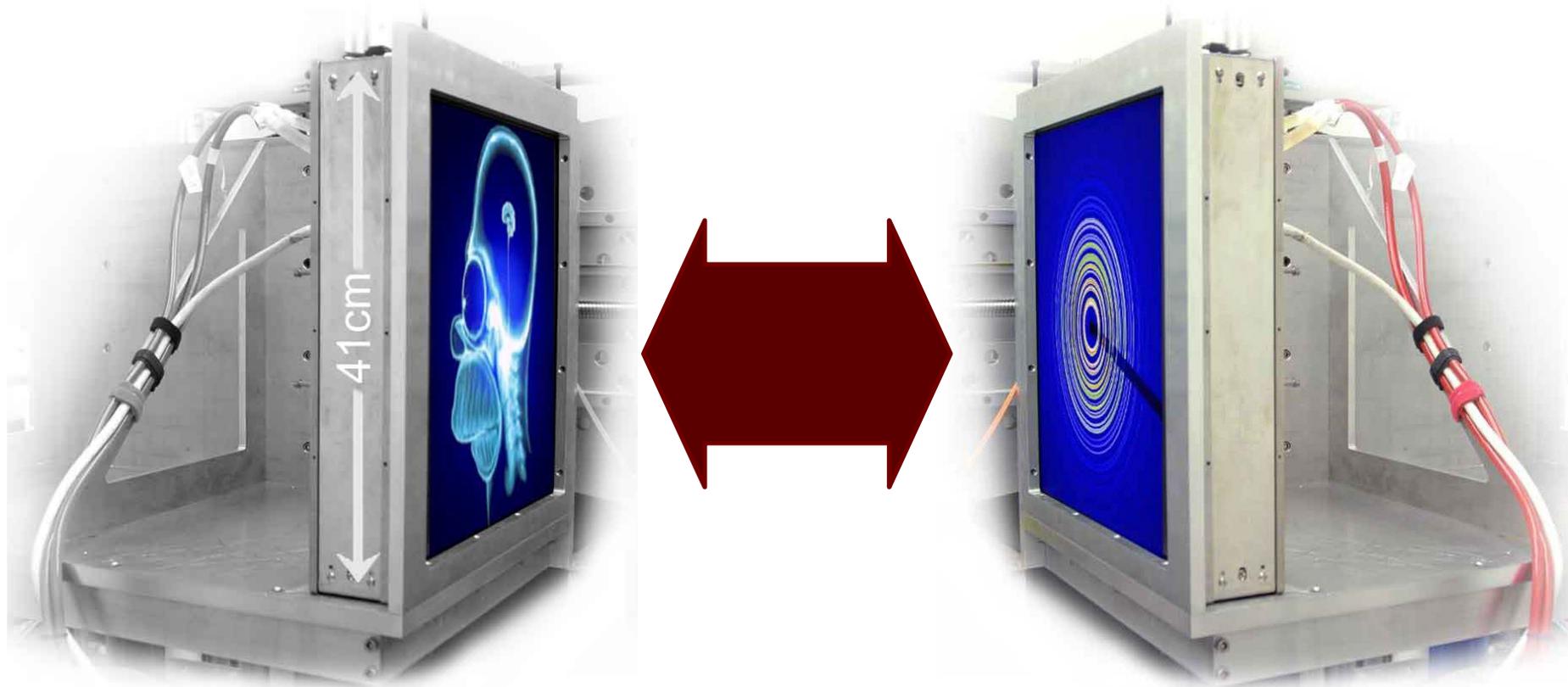
Control structure  
& chemistry

# X-rays illuminate structure & function

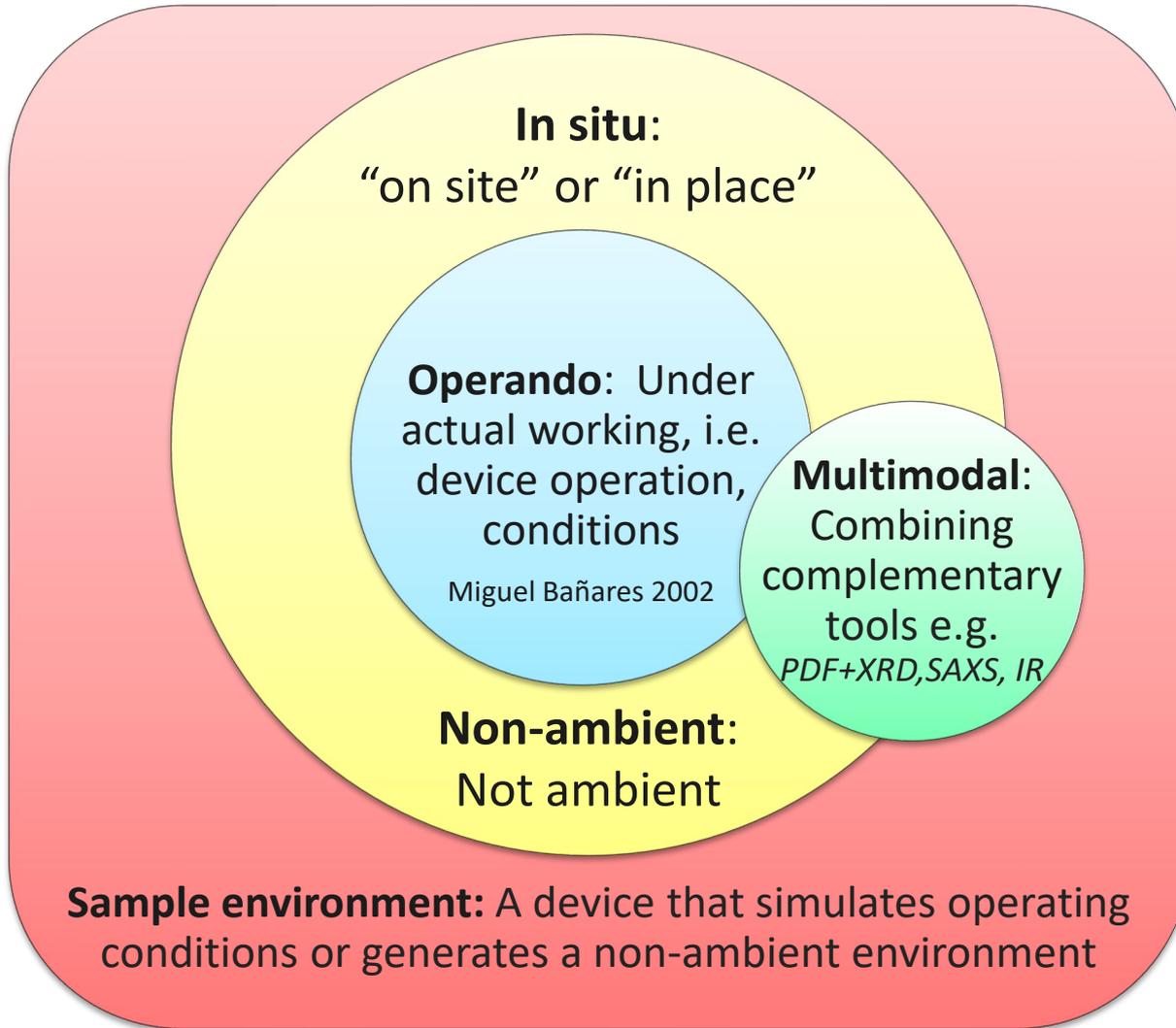


X-rays can penetrate working systems without damage, to allow us to probe their function or understand failures

# Illuminating structure & function



# Some Definitions

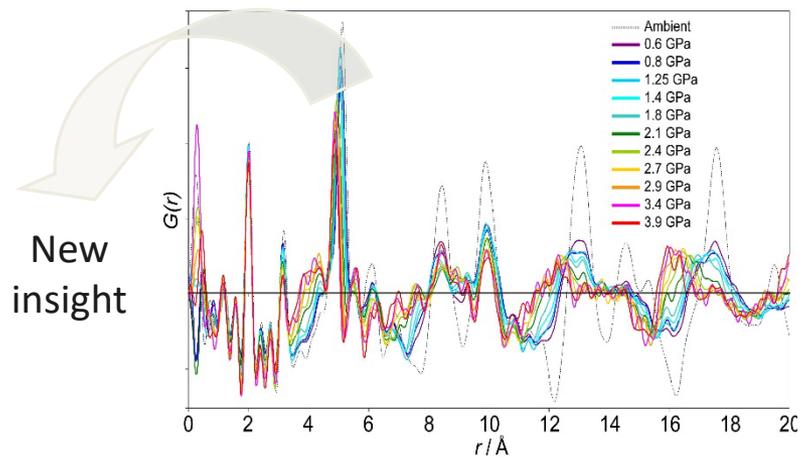
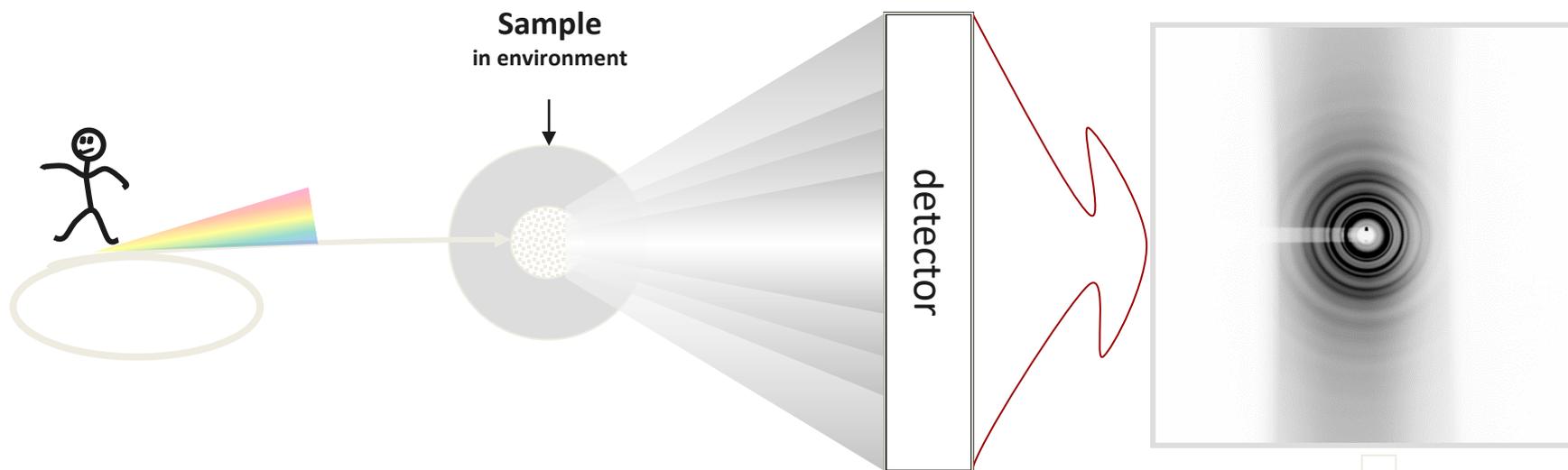


vs

**ex situ:**  
“off site”  
or recovered

IUPAC Project 2021-009-2-500 : to clarify Latin terms used to describe the characterization of materials made under non-ambient conditions, materials within systems, and of materials during change

# Diverse possibilities



**Environmental /In situ**

$\Delta T, \Delta P$

$\Delta B, \Delta E$



$\Delta e^-$  echem

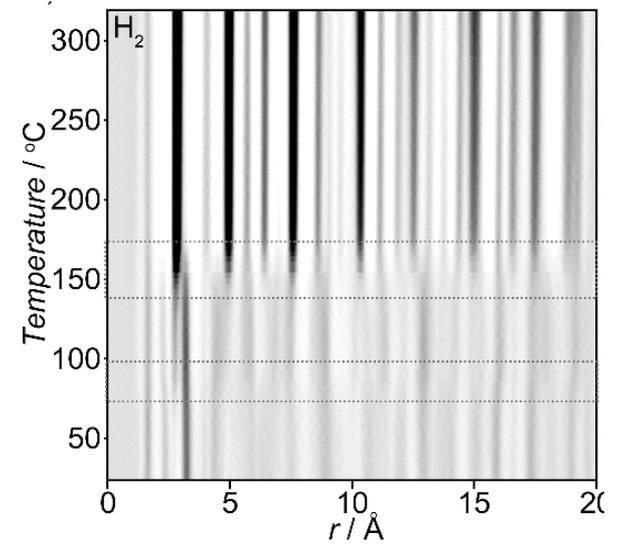
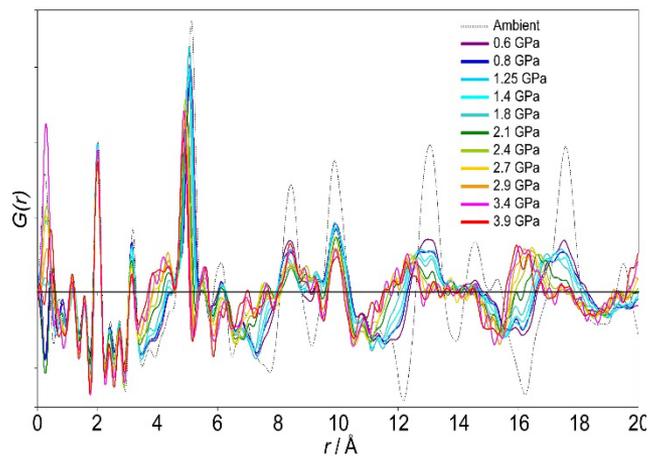
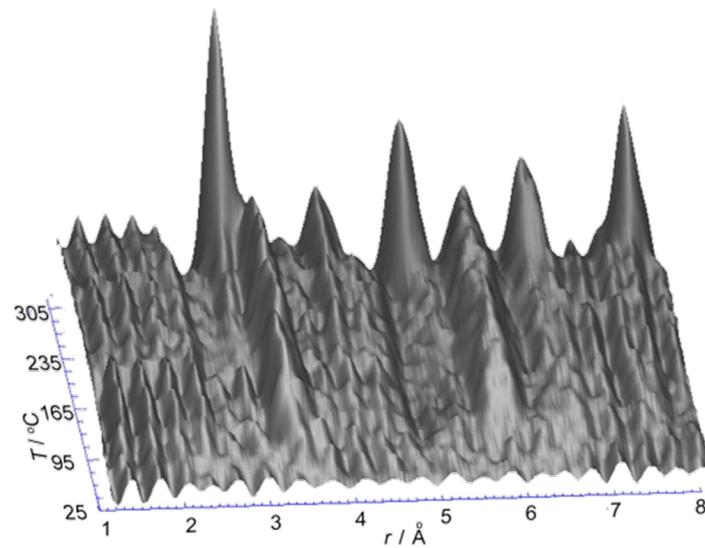
$\Delta t$  reaction

$\Delta$  ion/molecule,  $\Delta x/y$

**Functional /Operando**



# Visualizing in situ/operando data



## Why in situ/operando studies?



# Why in situ/operando?

## States that only exist in situ

- State functions, Phase transitions
- Dynamic processes, reactions, kinetics, & mechanisms
- Transient, short-lived, & non equilibrium states

## vs recovered

- More efficient data/sample
- Finer intervals
- More consistent = more sensitive

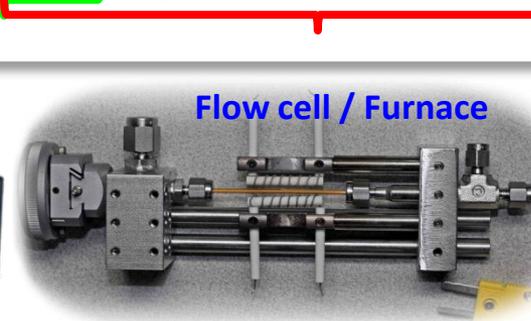
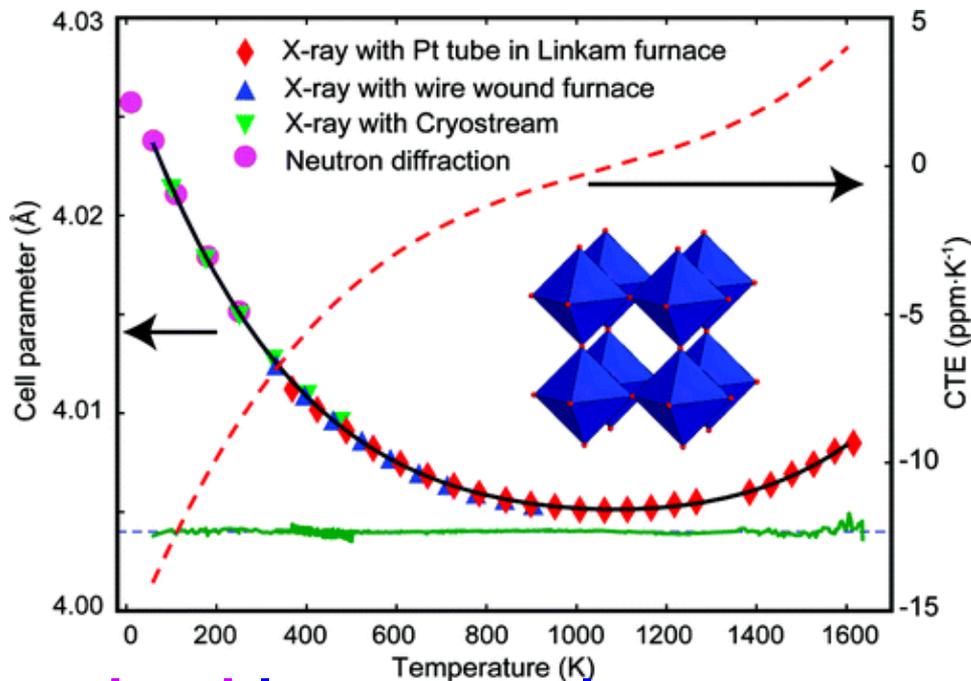
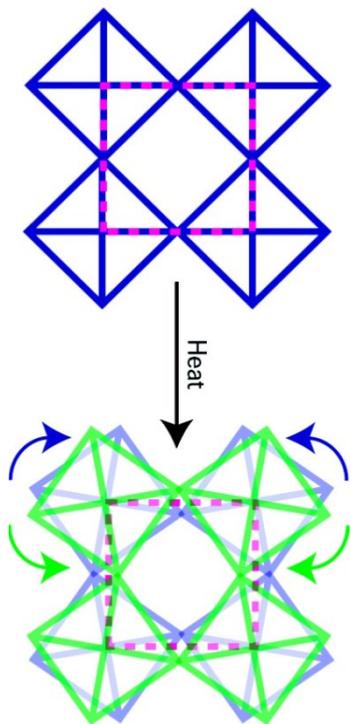
## New analysis options

- Differential methods for chemical selectivity
- Analysis of selected features
- Model-free multivariate & correlation analyses

# Example: Variable temperature

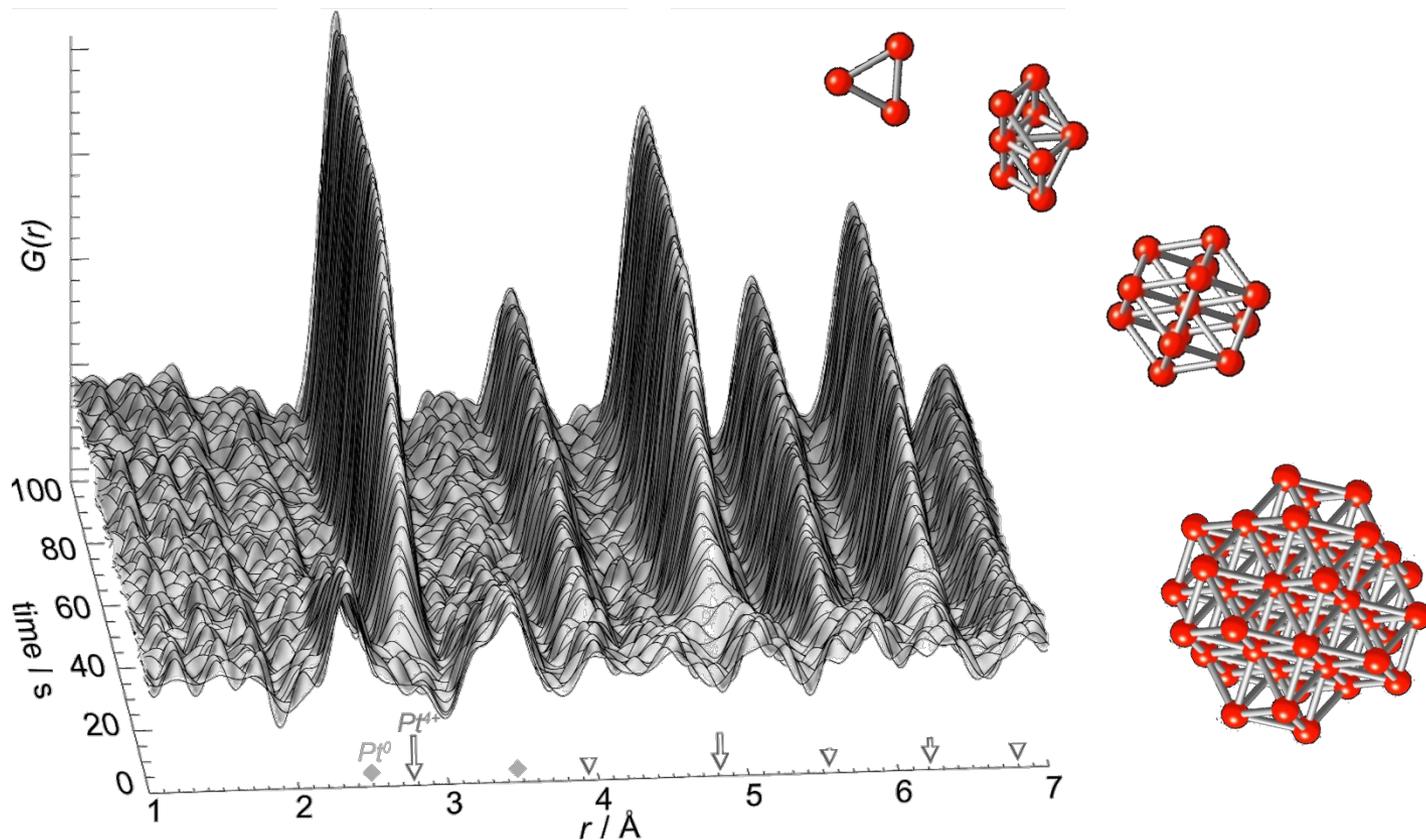
## Pronounced Negative Thermal Expansion from a Simple Structure: Cubic $\text{ScF}_3$

Angus Wilkinson *et al.* *J. Am. Chem. Soc.*, 2010, 132 (44), pp 15496–15498



# Example: Reaction kinetics & mechanism

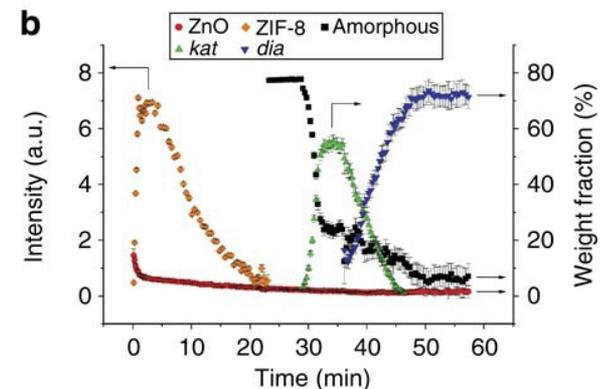
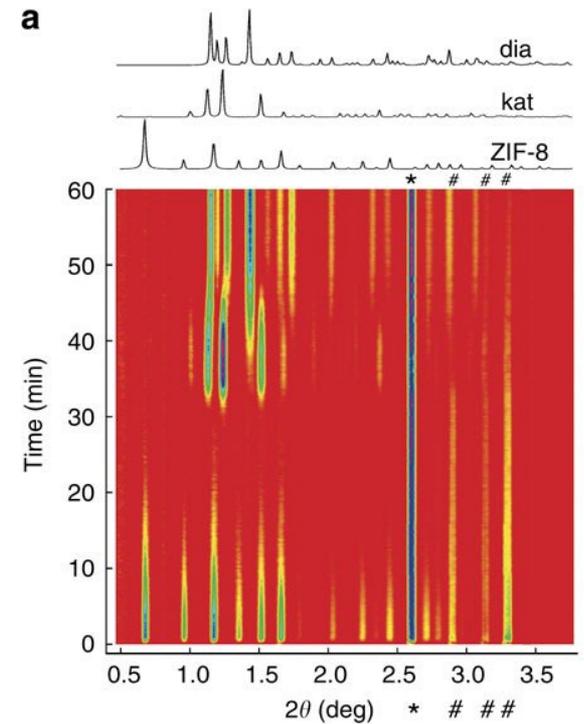
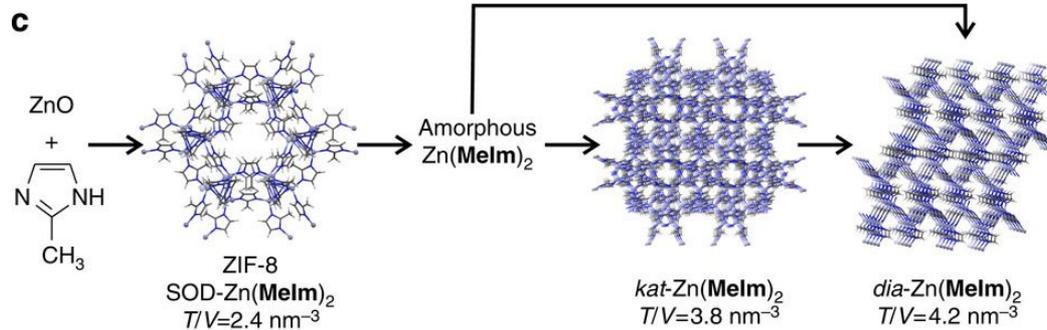
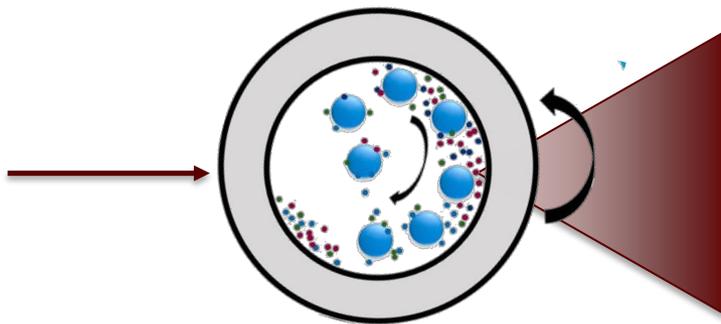
## Watching Nanoparticles Grow: The Mechanism and Kinetics for the Formation of Supported Nanoparticles



*J. Am. Chem. Soc.*, **2007**, 13822-13824.

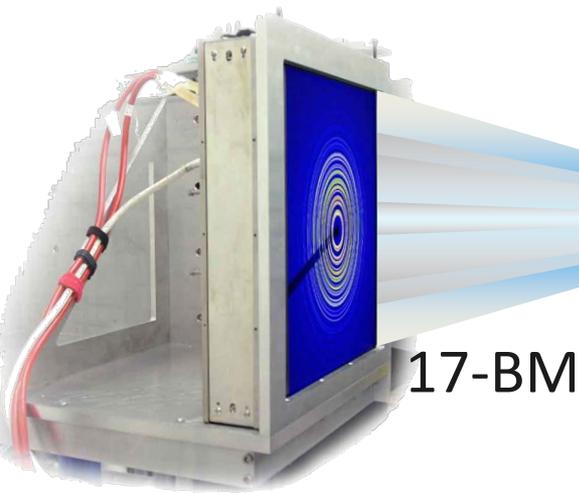
# Mechanochemical Reaction

X-ray studies during mechanochemical milling allowed a new intermediate phase to be identified

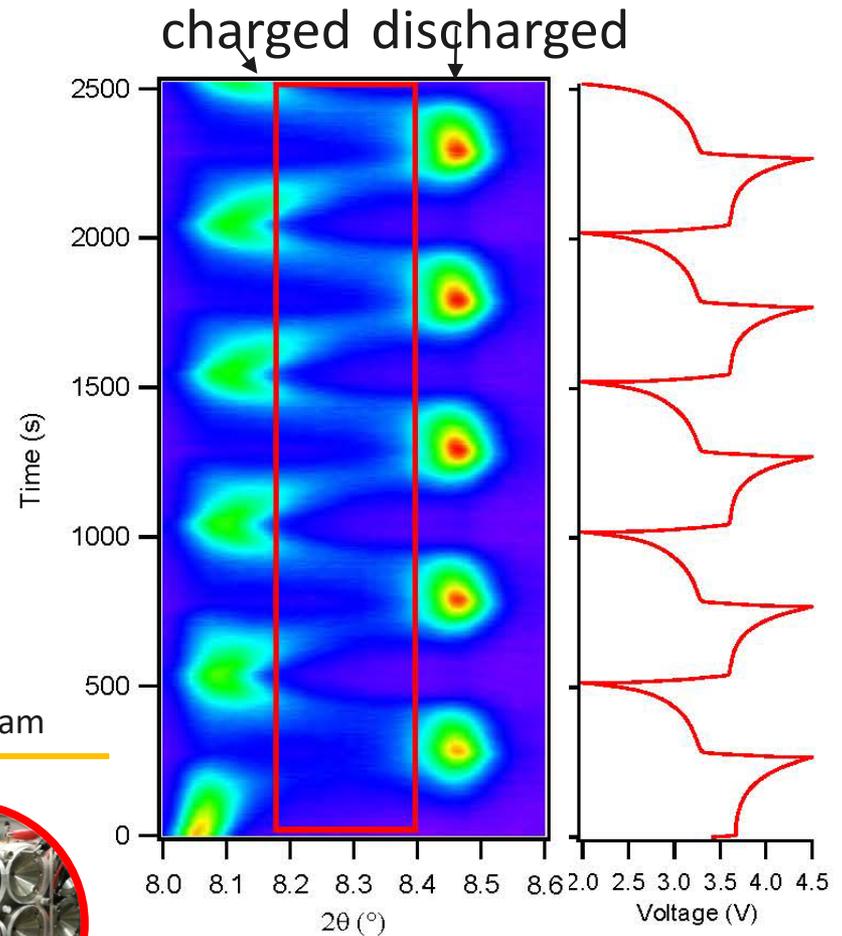


# Example: Dynamic Non-equilibrium States

Evidence for metastable intermediate phase with variable lattice dimensions – a “solid solution”



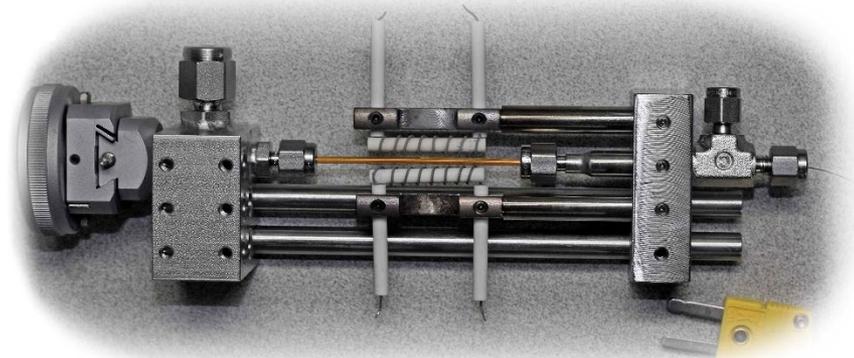
Incident X-ray beam



*Science* **2014**, *344*, 1252817

# How to *in situ*?

*Anything is possible. Not everything is easy*

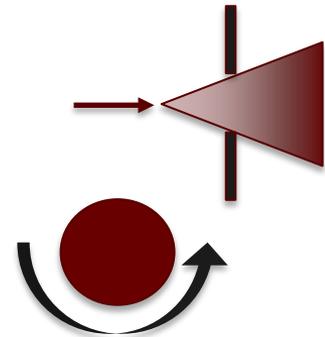


# Making it work. The X-ray/neutron perspective

*No compromises*

The measurement still needs to be possible!

- Geometry (more difficult for scattering)
  - access of the incident and scattered/transmitted beams
  - sample motion (spinning, rotations/translations etc)
  - shadowing
- Sample signal
- Cell contributions
  - To signal. Measurement background. Ideally low, reproducibly, correctable
  - Absorption
- Note for neutron TOF/energy dispersive X-ray



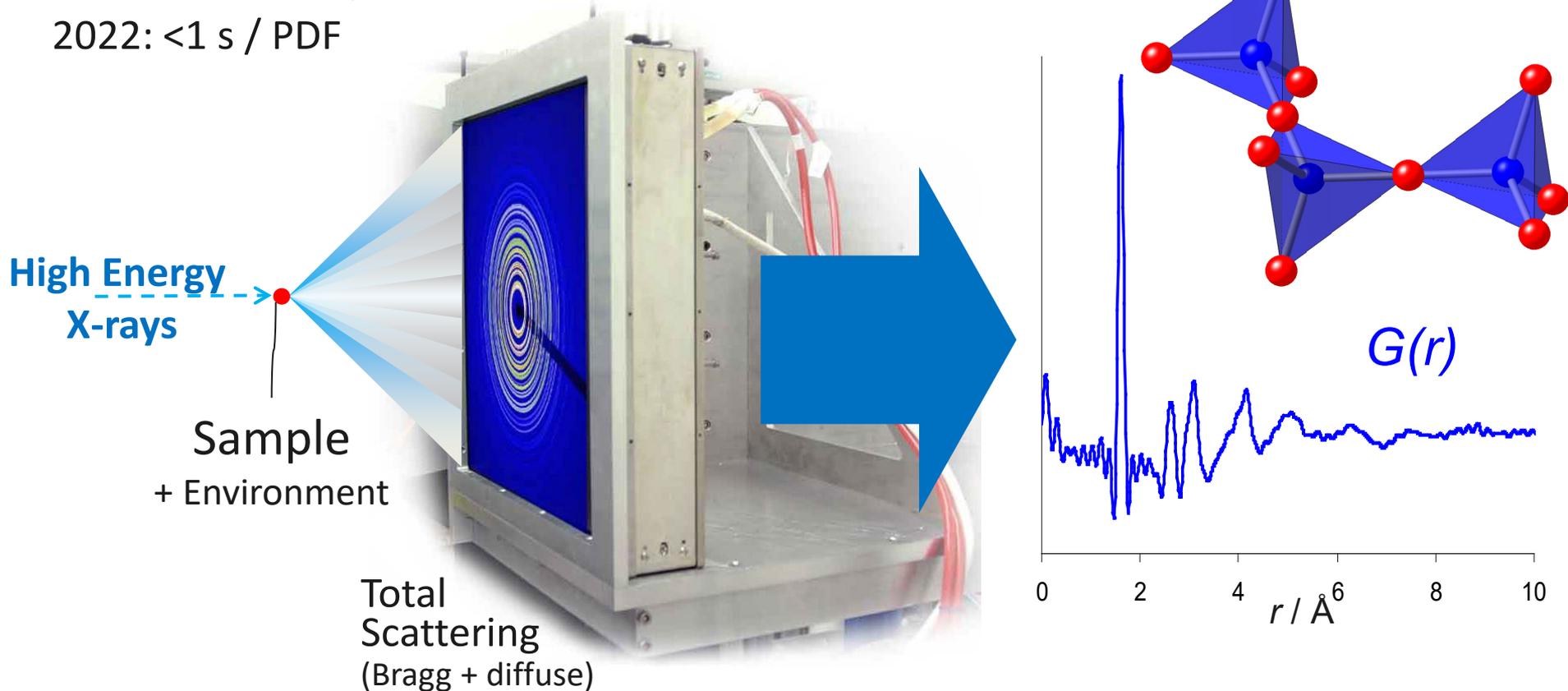
# Modern X-ray Pair Distribution Function measurements

*A specialized synchrotron powder diffraction experiment*

Rapid acquisition PDF with area detectors + high energy X-rays

2002: 12+ hours / PDF

2022: <1 s / PDF



# Modern X-ray Pair Distribution Function measurements

*A specialized synchrotron powder diffraction experiment*

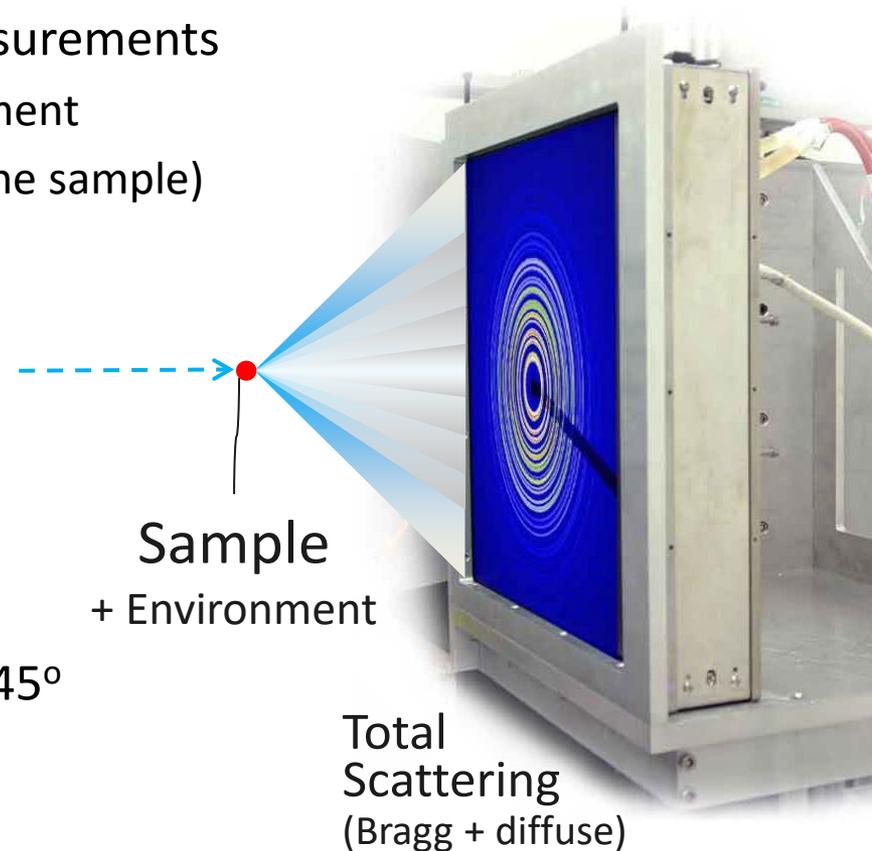
Rapid acquisition PDF with area detectors + high energy X-rays

**Total scattering** => at least 2 separate measurements

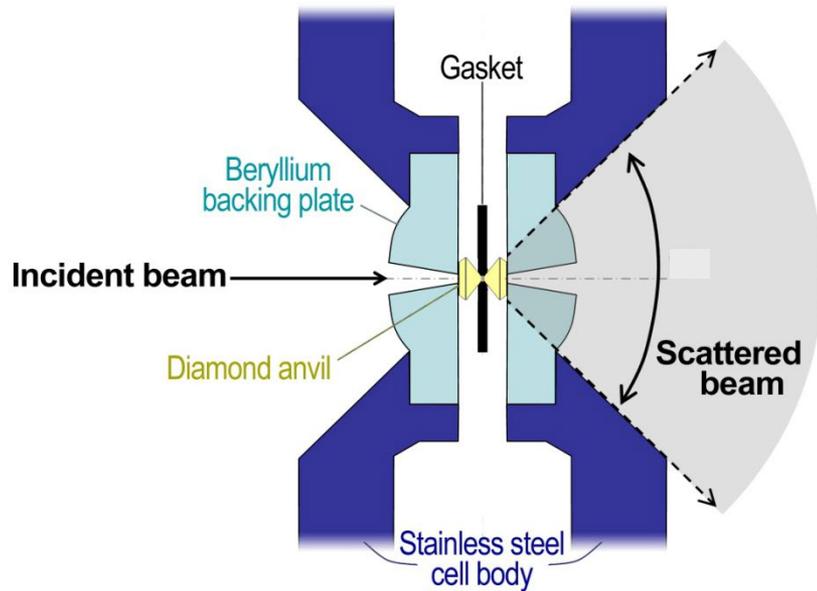
1. Sample + background/sample environment
  2. Background(s) (everything that is not the sample)
- Backgrounds must be reproducible.

**To high  $Q$**  => Wide angular access

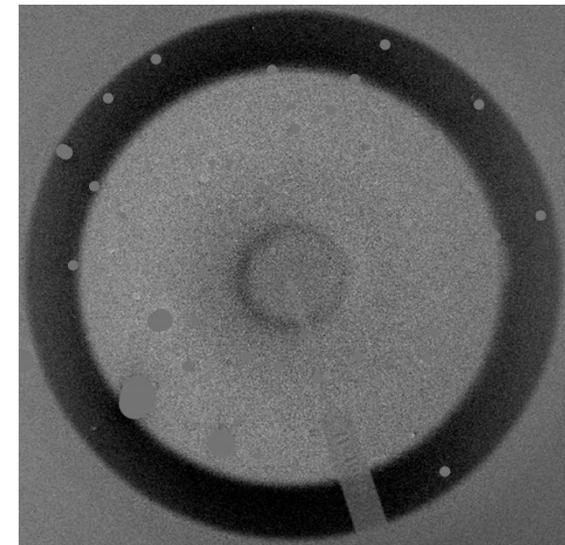
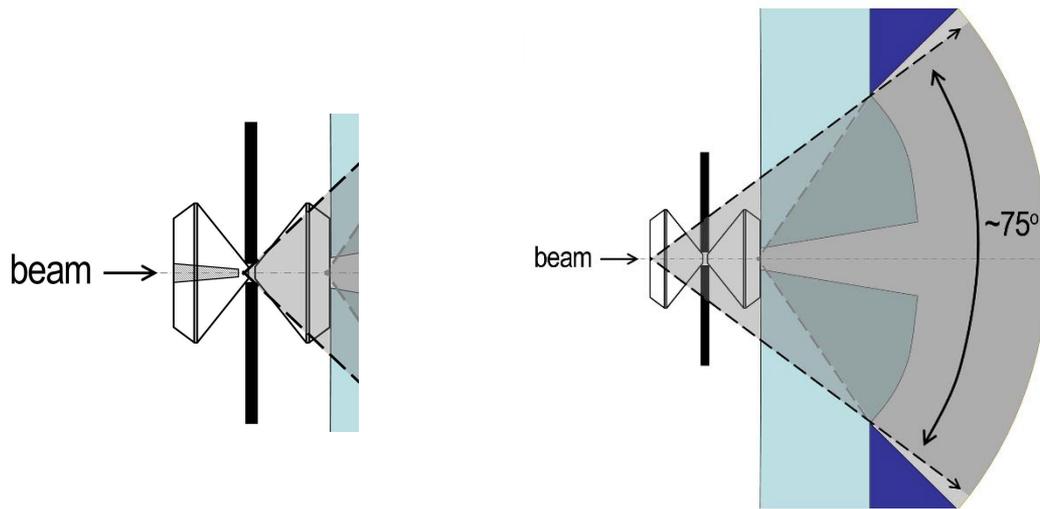
- At  $\sim 60\text{keV}$ ,  $Q_{max} \sim 20 \text{ \AA}^{-1}$   
requires that data are collected to  $\sim 40\text{-}45^\circ$



# Example: Diamond anvil cell for High Pressure

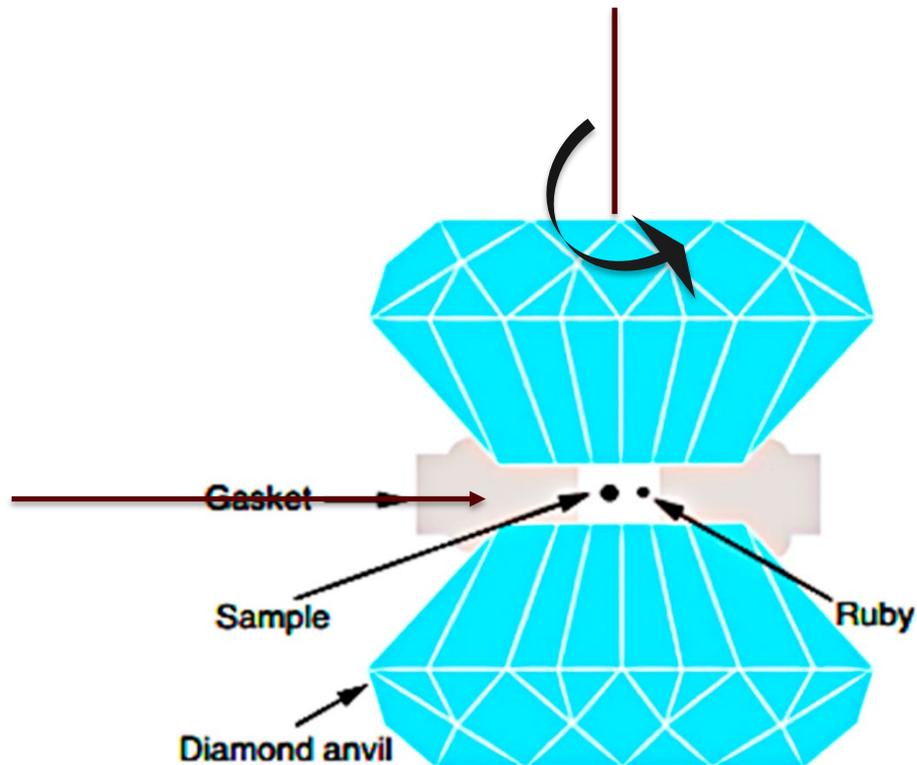


- Limited scattering aperture
- Small sample volume
- Thick “windows”
- Distortion of cell, changes the cell contribution
- Mitigate with perforated anvil

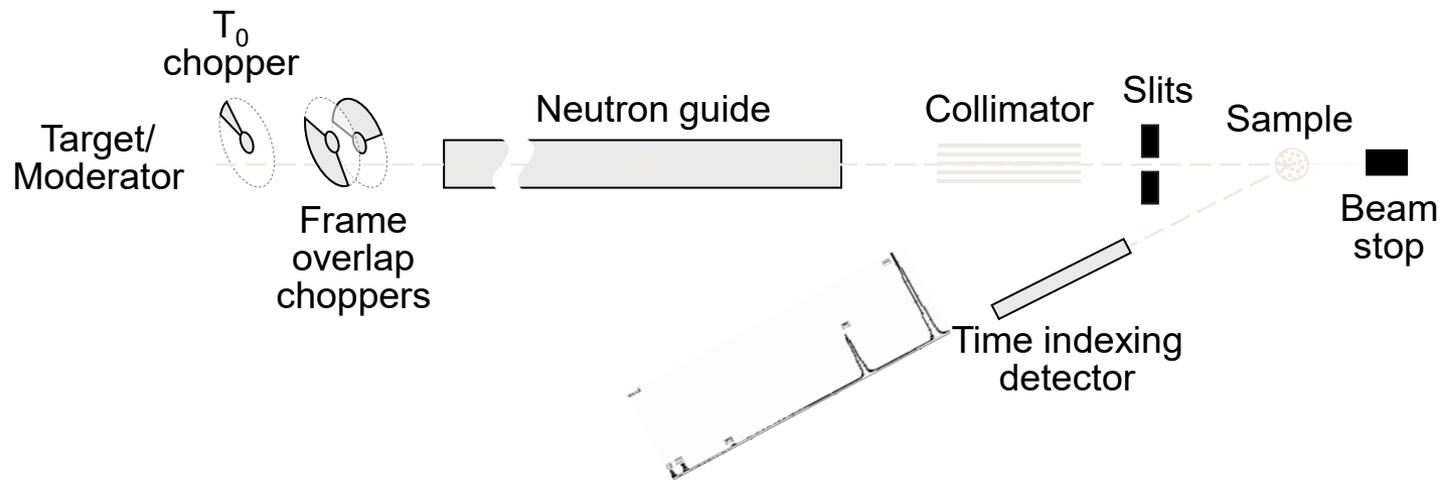


# Example: HP tomography requires rotation

- Direct beam through “transparent” gasket

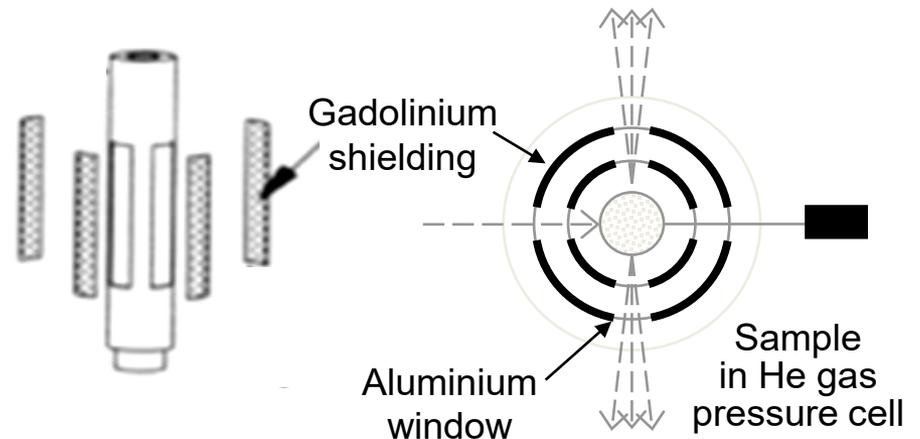


# Example: High Pressure with TOF neutrons



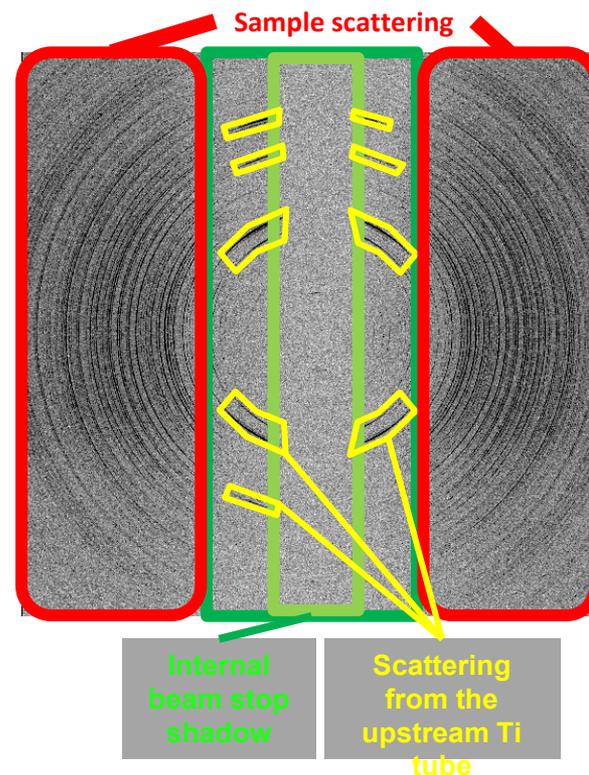
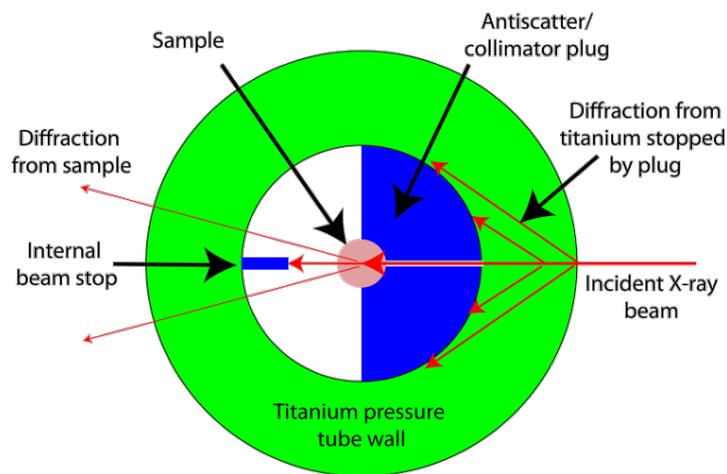
TOF neutrons or energy dispersive X-ray scattering, collect a full diffraction pattern at every position.

Only a small angle is needed



# Example: Reducing background from HP cells

## Fluid pressure cell + BRIM (Background Reducing Internal Mask)



- Fluid pressure offers extreme precision
- Large contribution from sample environment
- Reduces scattering from sample environment
- Use highly penetrating nature of high energy X-rays

# Making it work. The environment perspective

*No compromises*

The functional environment HAS to work!

- Stability/fidelity of the environment
  - Heterogeneity/uniformity
  - Beware the potential for beam induced effects
- 
- Characterize your sample environment with a known, model system, before using the environment to characterize your sample!

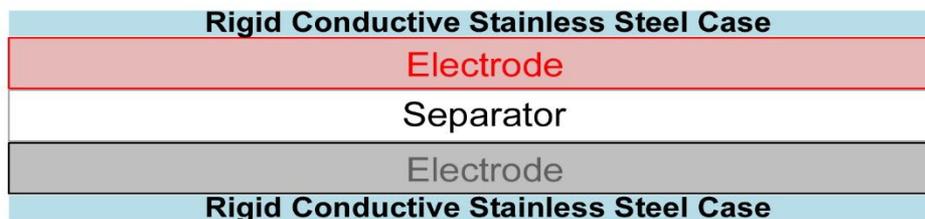
# Example: Enabling operando echem measurements



*X-ray enable a battery coin cell by adding an X-ray window*

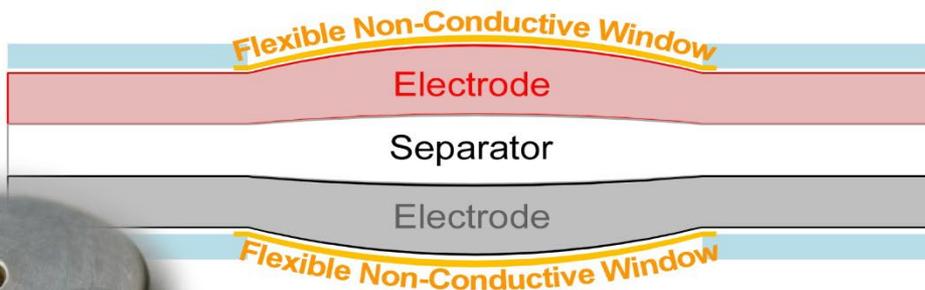
Standard coin cell

*Uniform  
pressure & conductivity*

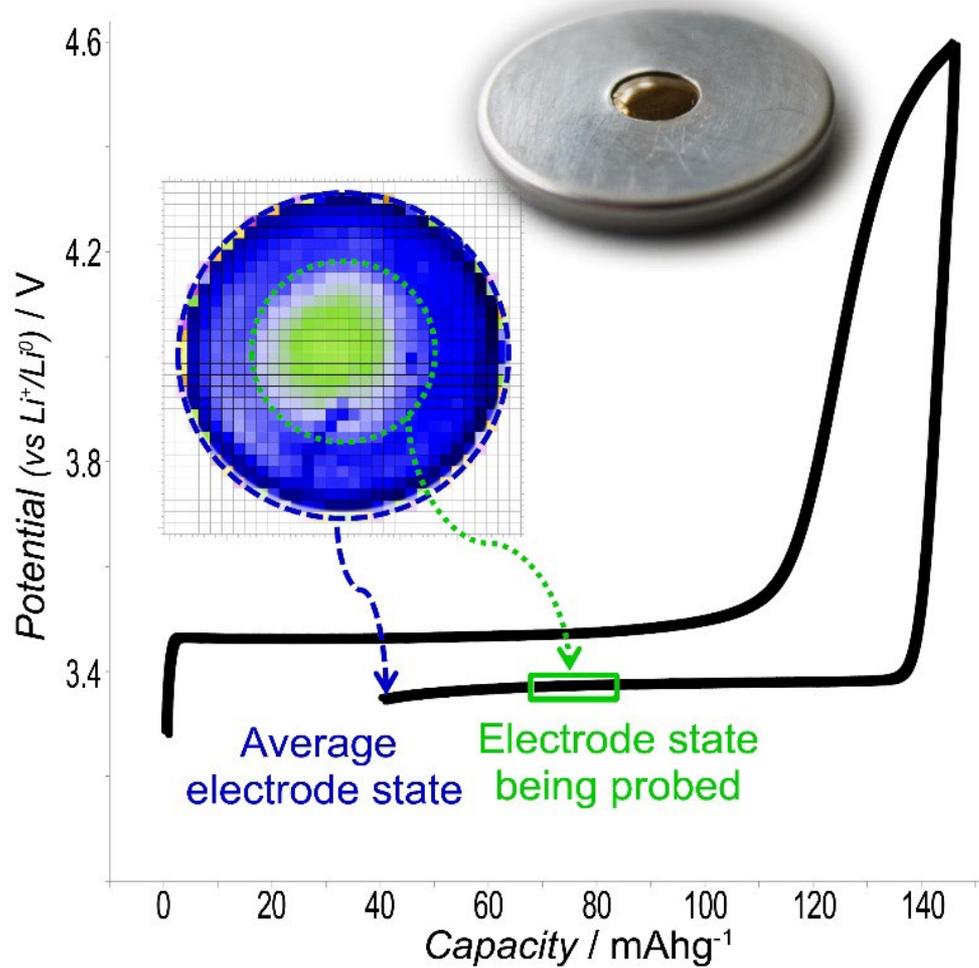


Modified coin cell

*Non-uniform  
pressure & conductivity*



# The reaction may be delayed



*On average  
the cell electrochemistry  
may be only ~1% off*

*BUT*

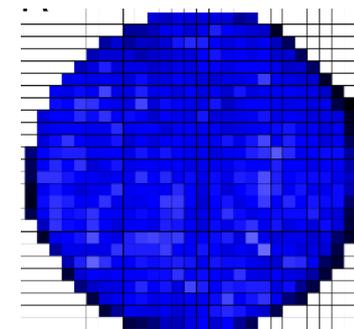
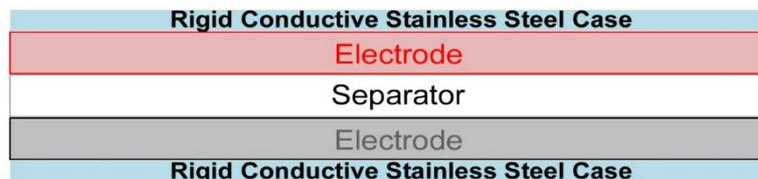
*Locally the  
electrochemistry of the  
probe volume is 20% off*

# Enabling operando echem measurements

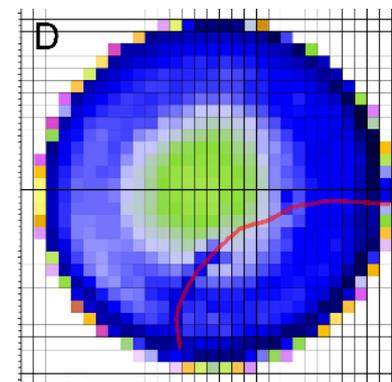
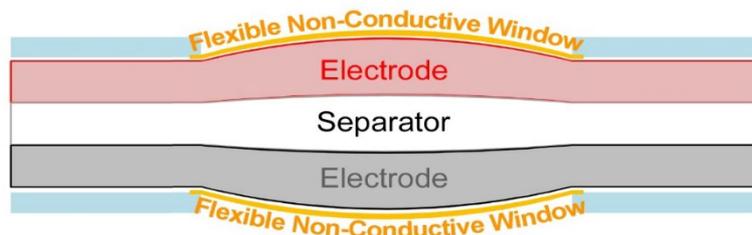
*J. Phys. Chem. Lett.* 2015 2081

*J. Appl. Cryst.*, 2012, 1261

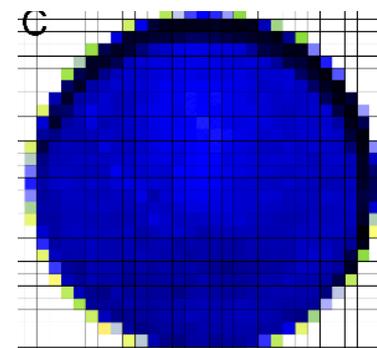
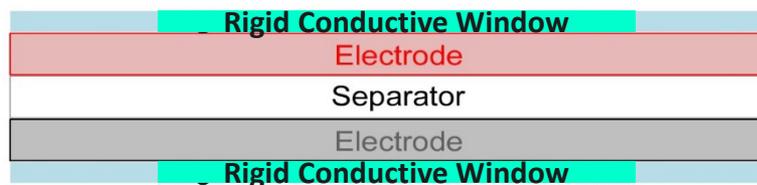
Coin Cell



Modified coin cell



AMPIX

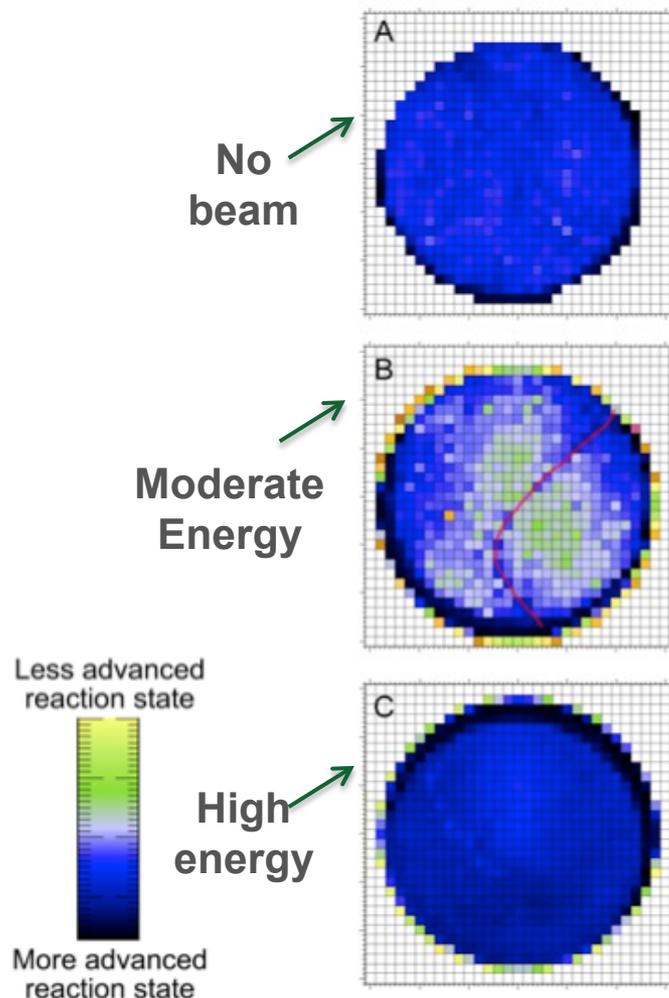


# The Operando Challenge

*Like a cat-in-a-box, experiments that observe a reaction can change the state of that reaction*



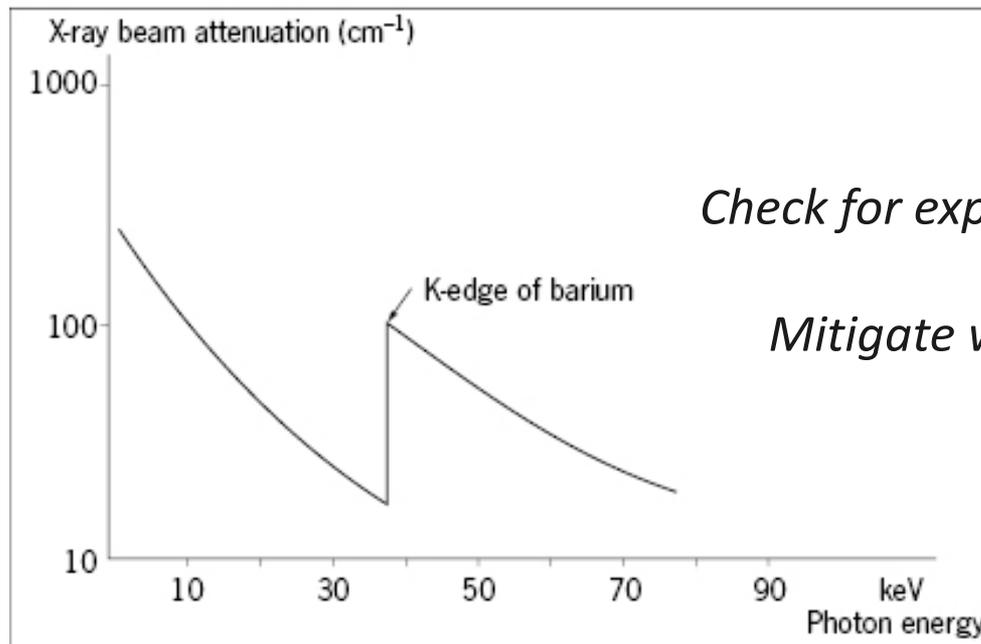
# Beam interactions: X-ray energy matters



- X-ray beam interactions (and damage) scale with absorption
- X-ray absorption is minimized at high energies BUT attains a maximum close to an absorption edge
- Beam interactions can impact operando studies using:
  - soft X-rays
  - X-ray absorption spectroscopies (i.e. EXAFS and XANES)

# Special cases: Beam effects

- Beam effects/damage scale with absorption
- Absorption is maximized at low energy and just above edge.
- Soft X-ray/XANES/EXAFS measurements can be highly sensitive
- This depends on sample composition



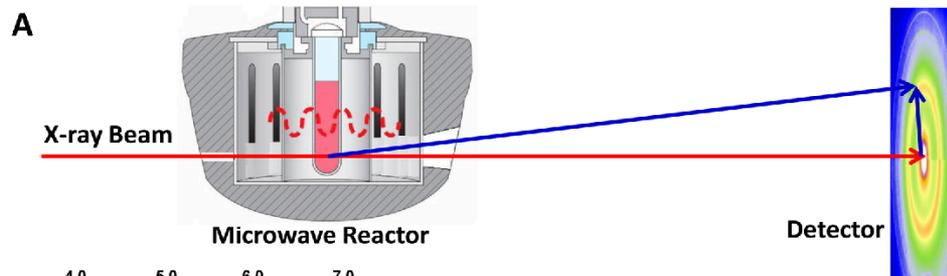
*Check for exposure dependent effects*

*Mitigate with sample rastering*

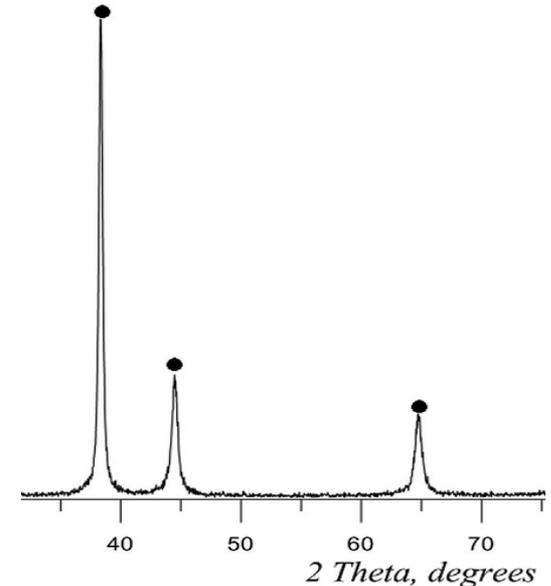
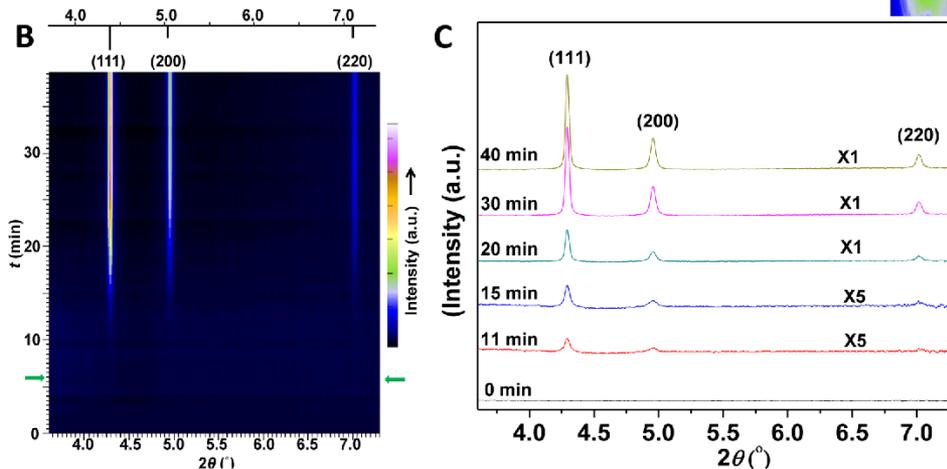


# Special cases: High Energy X-rays

- High energy X-rays are highly penetrating. I.e. absorption is low. I.e. Beam effects/damage is minimized
- Scattering is compressed in the forward direction. A smaller scattering aperture is needed to access the same d-spacing/Q-range

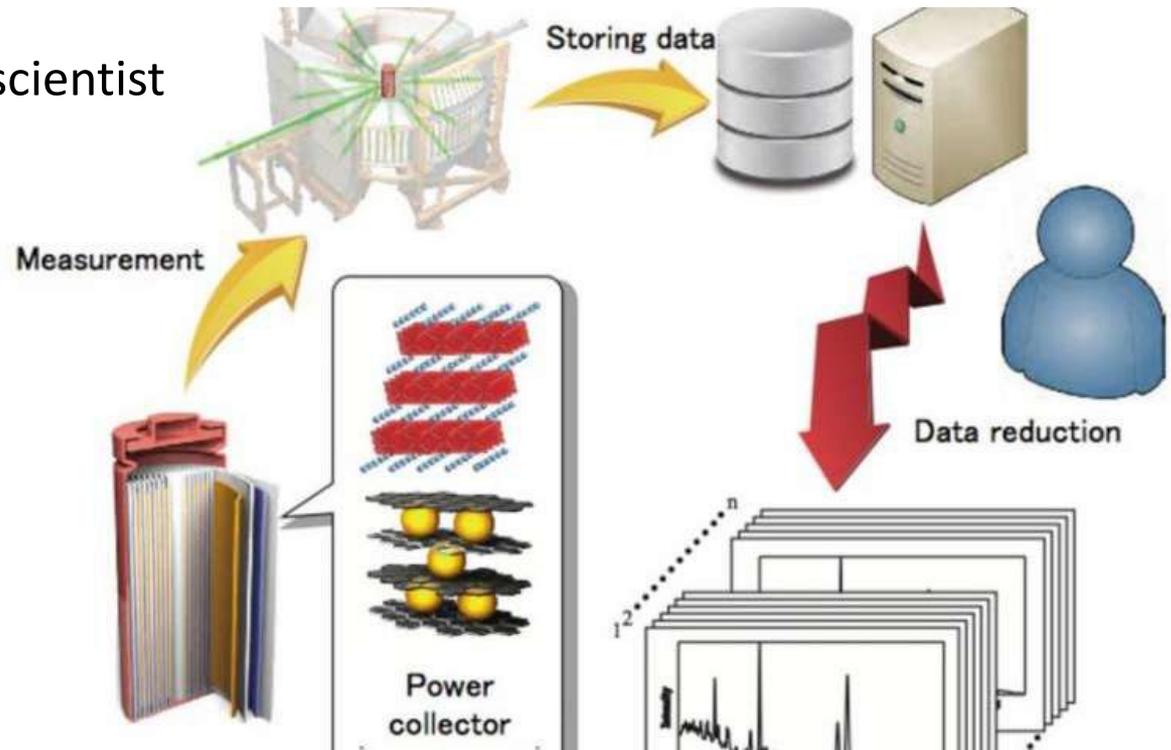


$E = 117 \text{ keV}$  vs  $8 \text{ keV}$



# Special cases: Neutrons

- Highly penetrating neutrons can probe real devices
- Larger samples - > greater safety hazards.
- More facility oversight on samples environments
- Talk to your beamline scientist



# Time resolution & time span

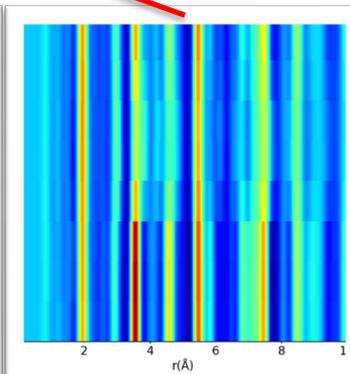
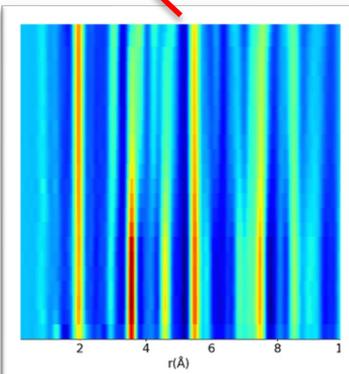
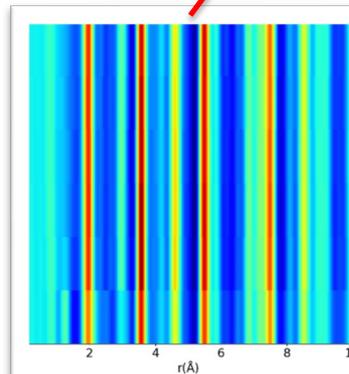
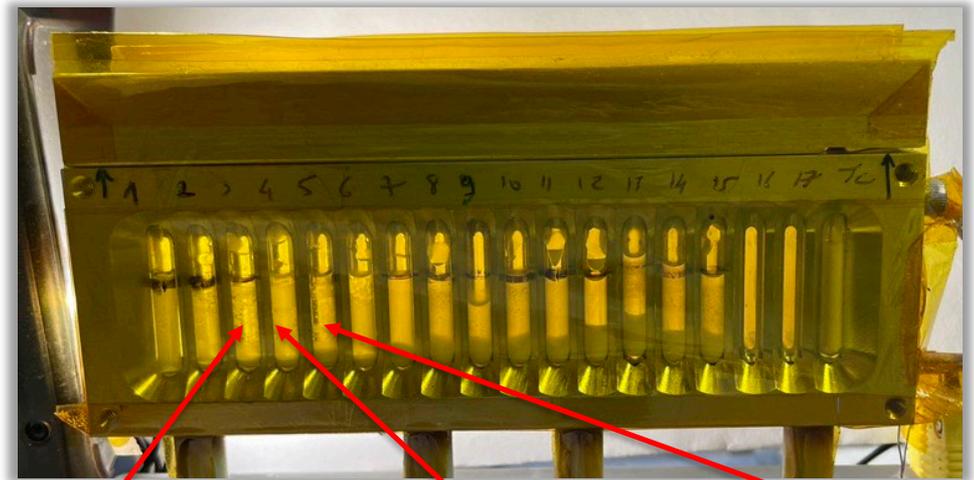
*Long duration, multiplexing, time-resolved*



# Multiplexing: Fast measurements of slow processes

Some processes (electrochemical cycling or chemical reactions) are slow (hours) relative to the measurement time (min).

Multiple cells can be arranged in an array and studied in parallel e.g. for composition/concentration dependence



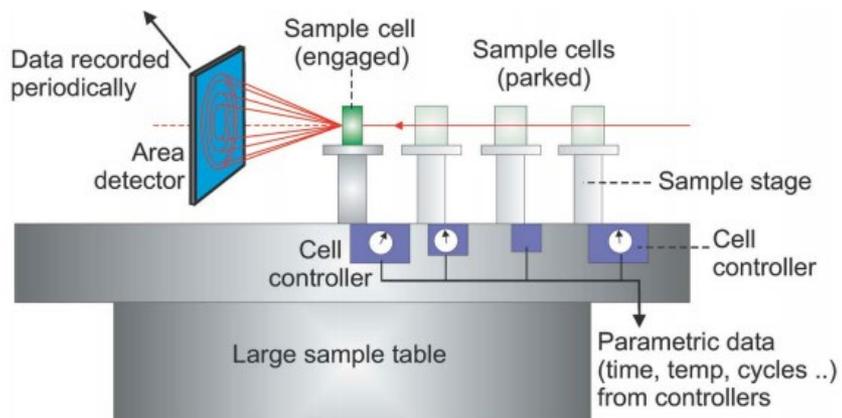
*J. Appl. Cryst.*, **2012**, 1261

*J. Appl. Cryst.* **2016**, 1665

# Possibility for Long-Duration Experiments

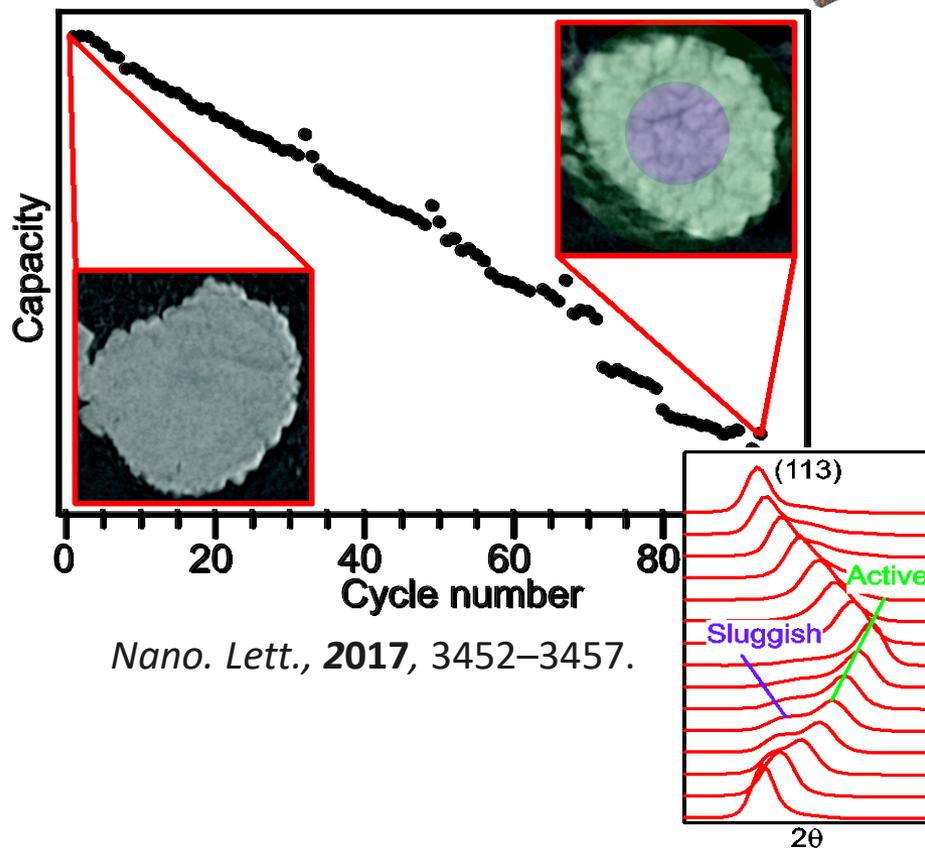
For very slow processes. E.g. Ice formation, battery degradation, corrosion

Samples probed at regular intervals over months



e.g. For XRD I11, Diamond Light Source  
*J. Appl. Cryst.* **2017** 50, 172–183

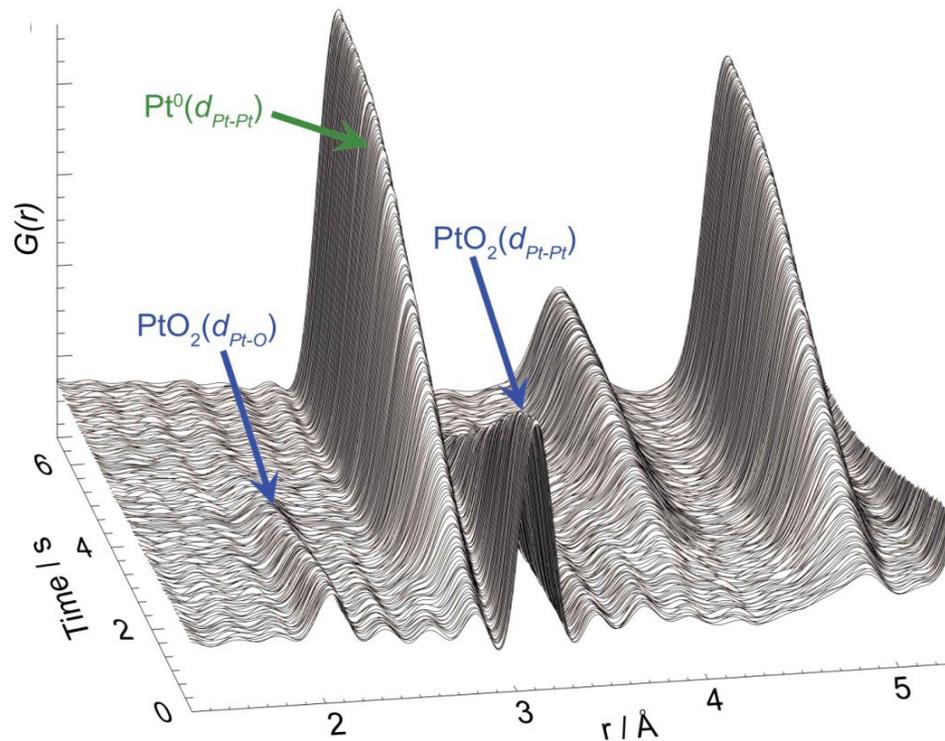
Identify intergranular fracture as the origin of capacity loss in batteries



# Following fast kinetics

Time-resolution is limited by the detector read-out rate (0.03-0.1 s)  
and the signal-to-noise (i.e. sample scattering + X-ray intensity)

The time-resolution is well matched to the rate of gas-solid reactions



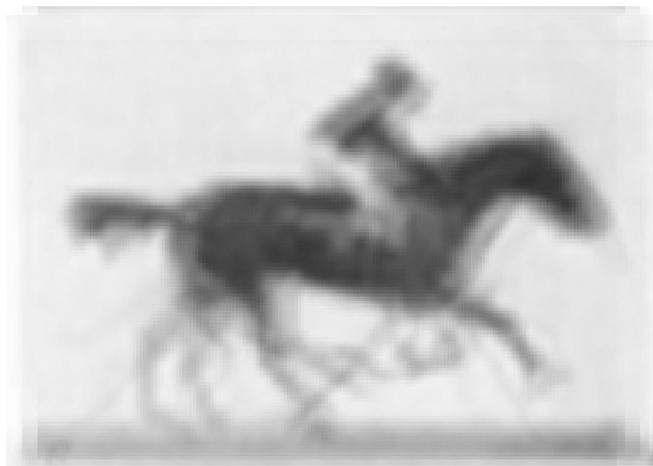
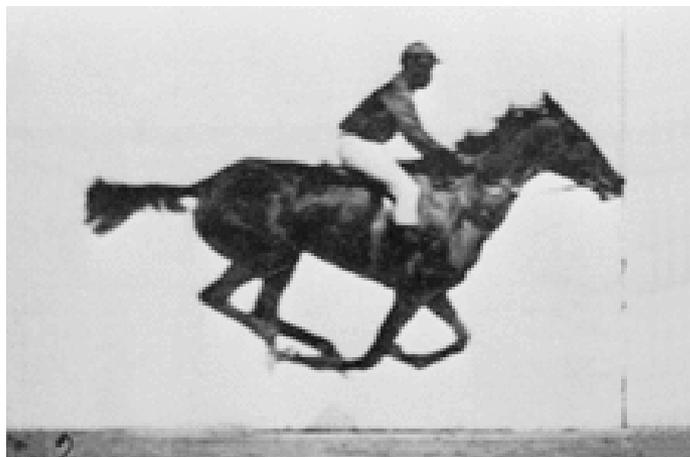
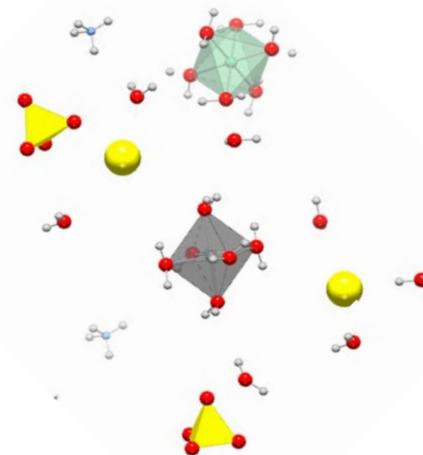
**In situ reduction:**  
 **$\text{Pt}^{\text{IV}}\text{O}_2 \rightarrow \text{Pt}^0$**

200 PDFs in 6 s  
30 Hz/30ms per point

# What if the system evolves faster than data rate?

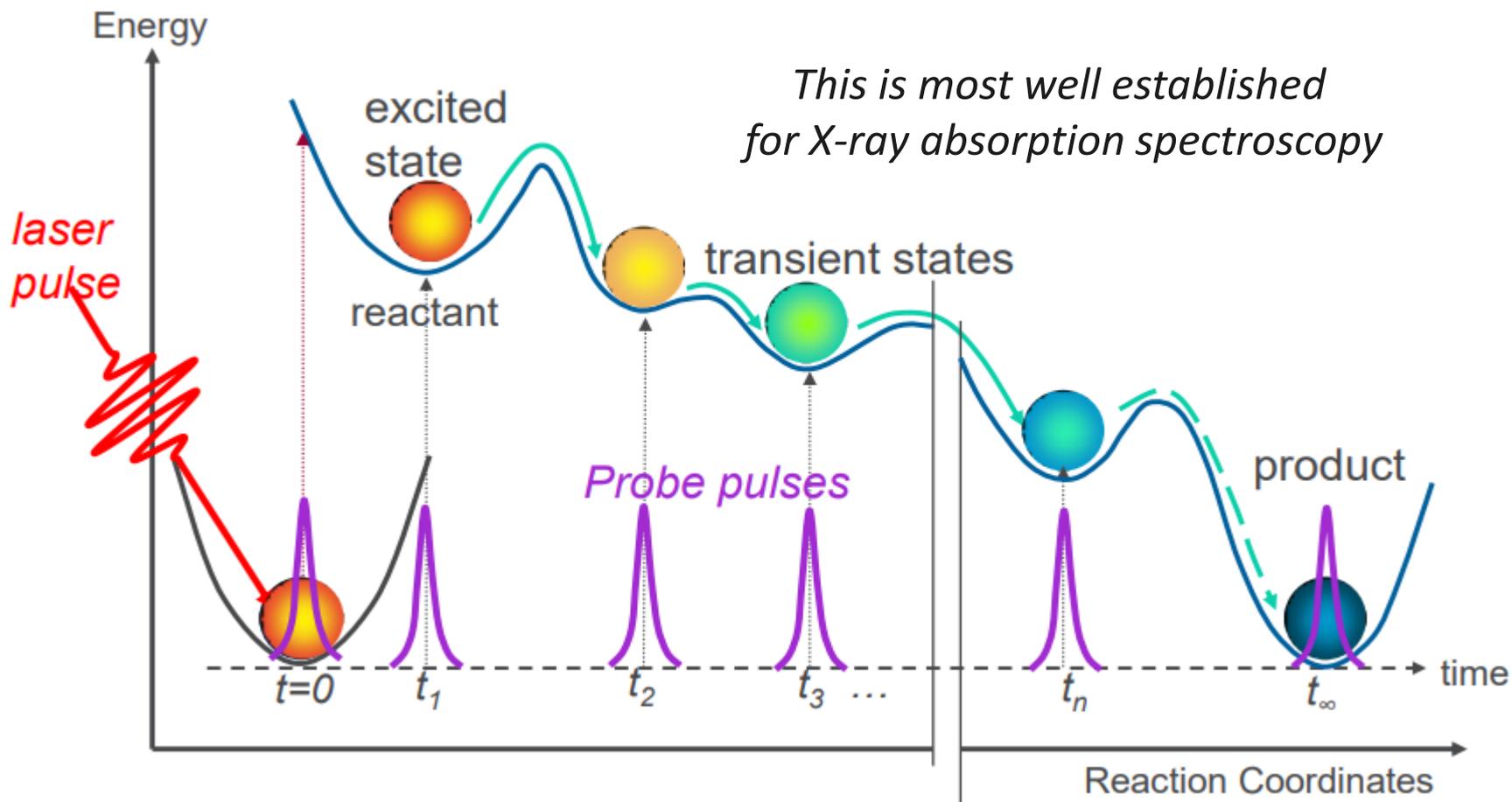
E.g. Reactions in solutions are fast(s), but measurements are signal limited and slow (min).

Short-lived states cannot be resolved as the data are a time-averaged superposition.



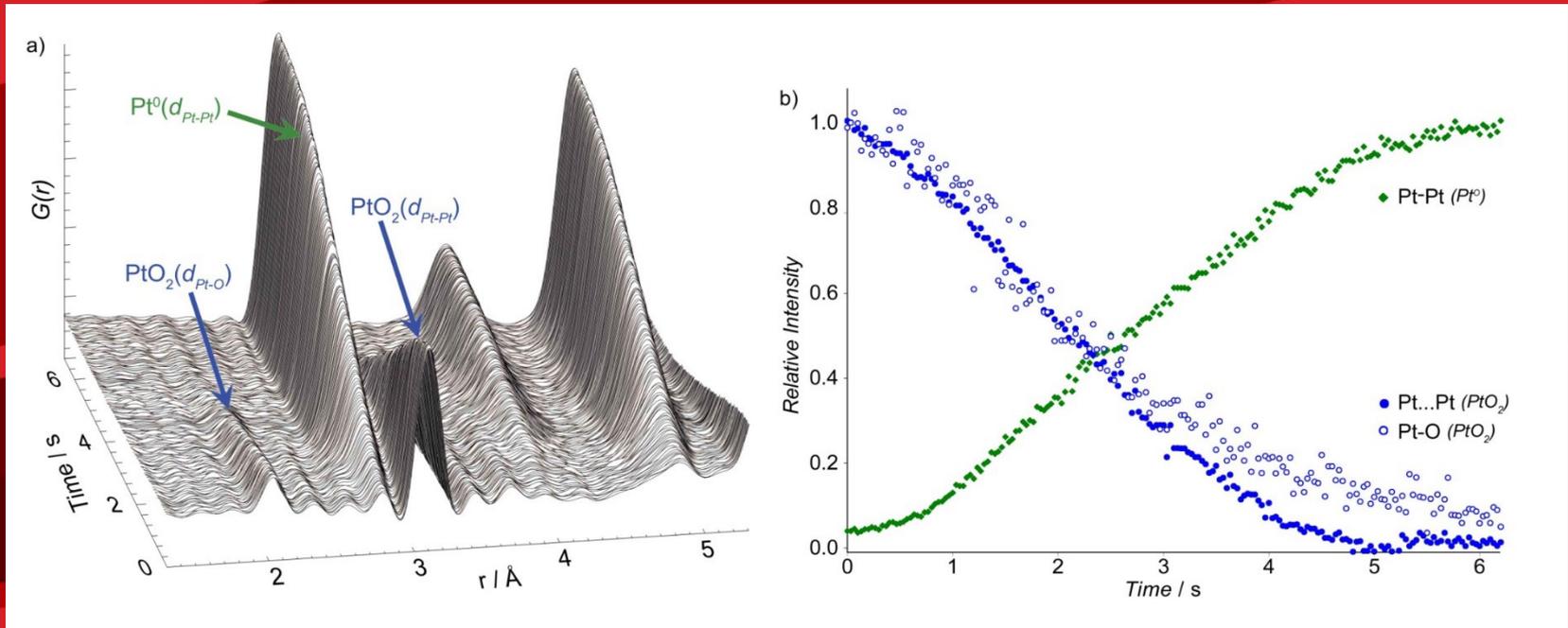
# Ultra Fast-processes: Need Pump-probe strategies

Use a pulsed source (e.g. synchrotron with timing modes, XFELs) to probe system at defined intervals after a reaction is initiated.



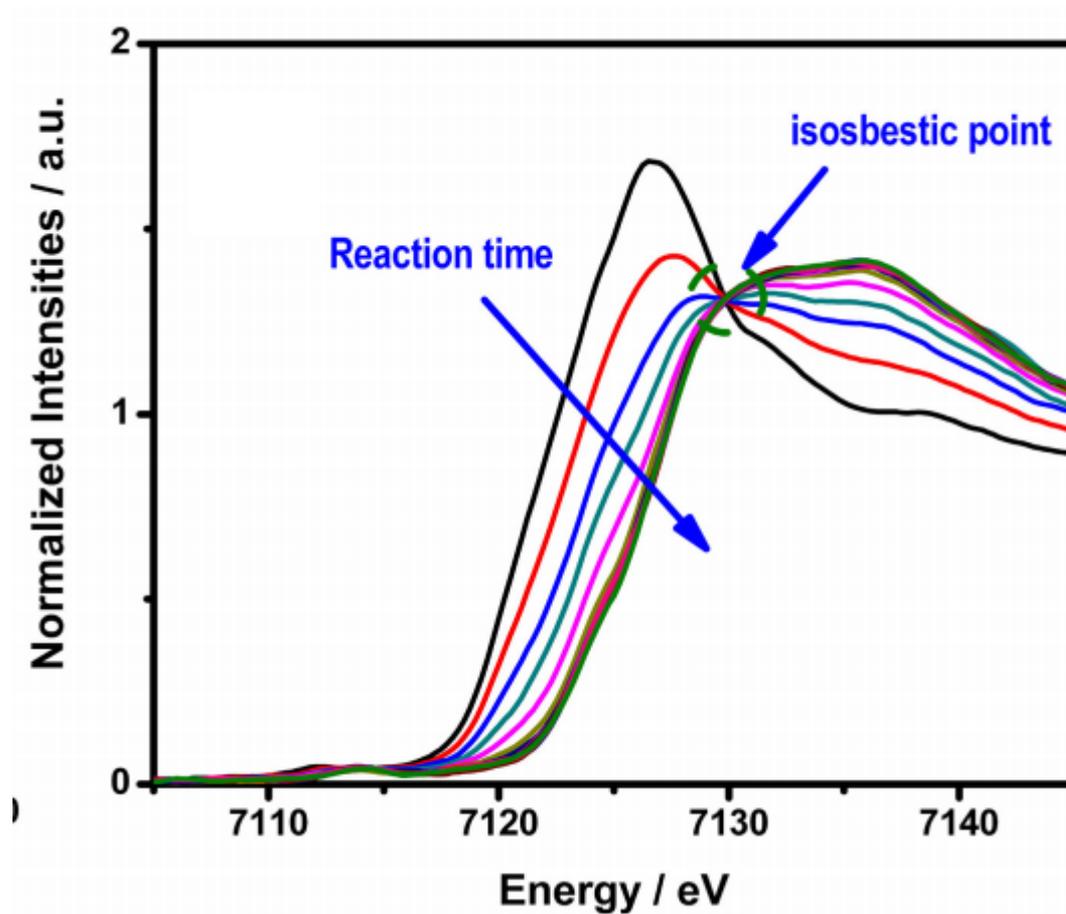
# Expanded analysis opportunities

*Correlation to variables, Parametric refinement,  
Multivariate analysis*



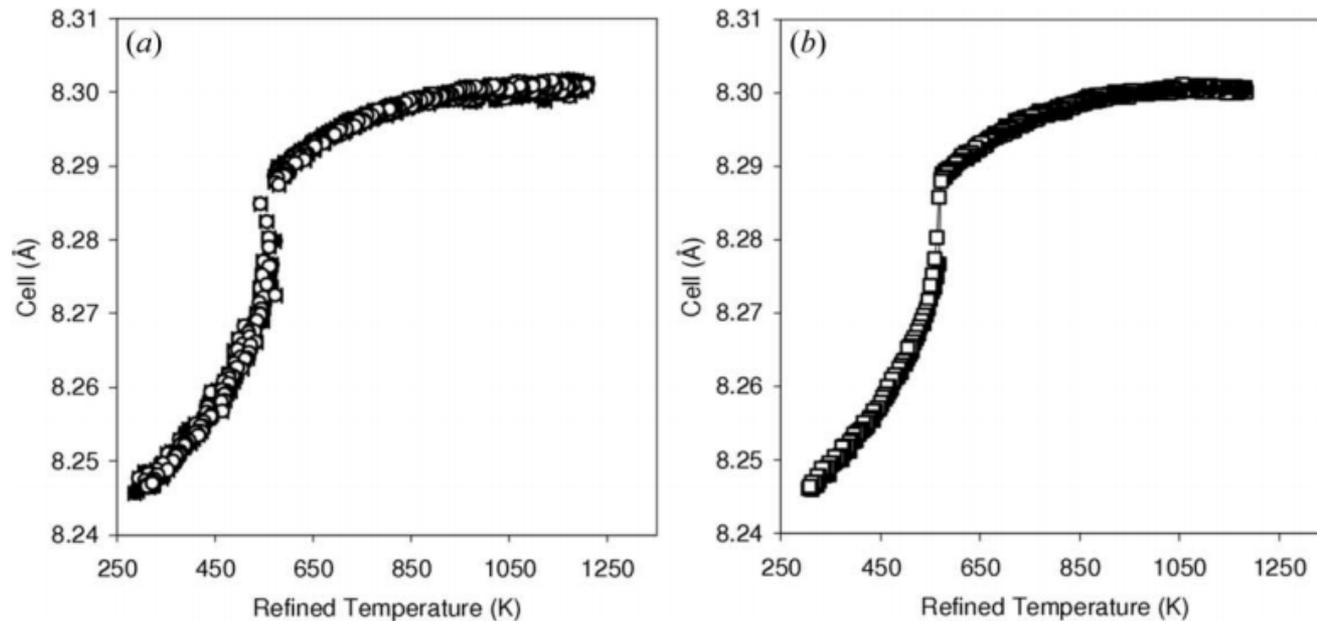
# Isosbestic points

Suggests transformation from 1 component to another. “2 phase”

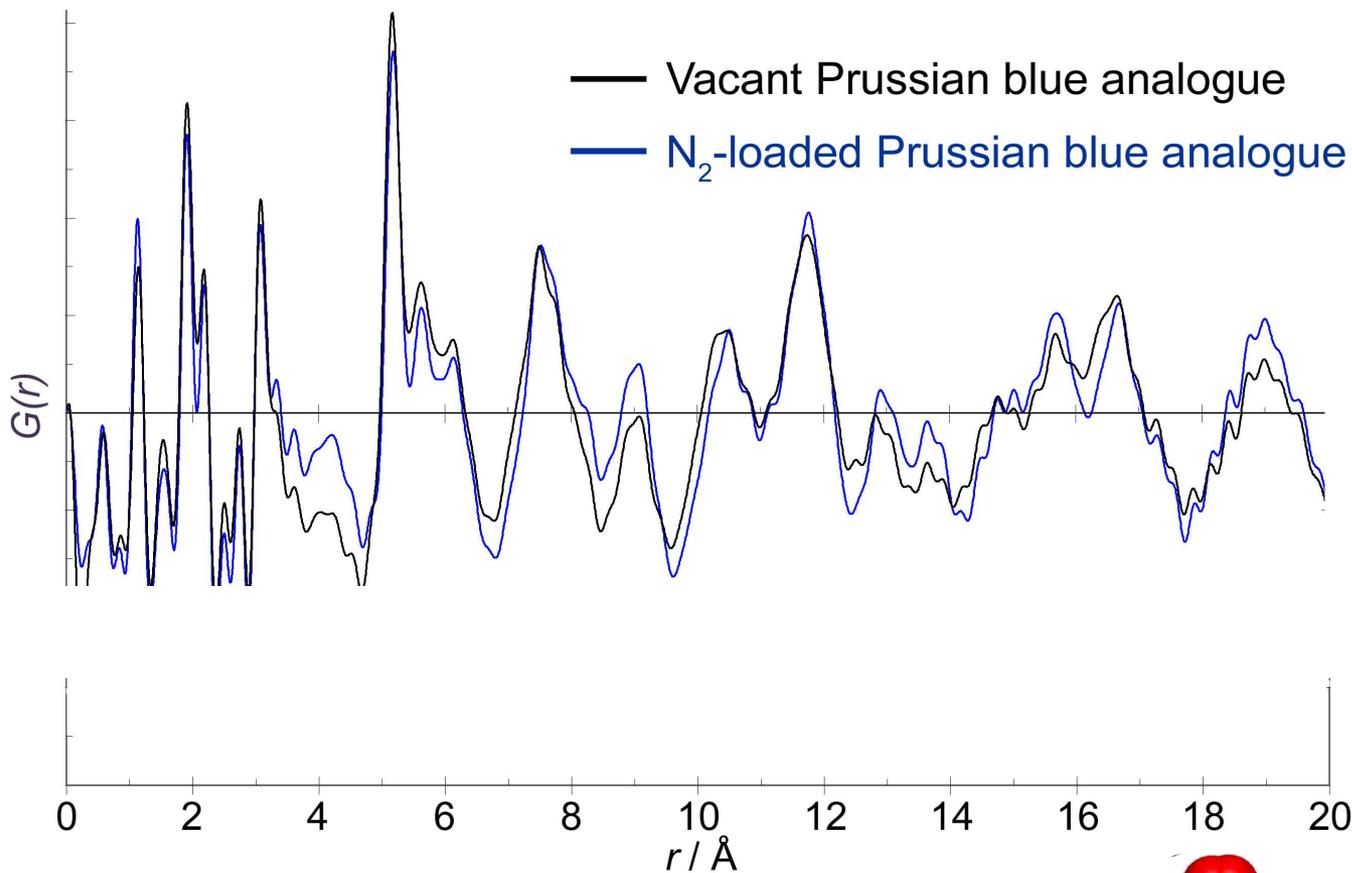
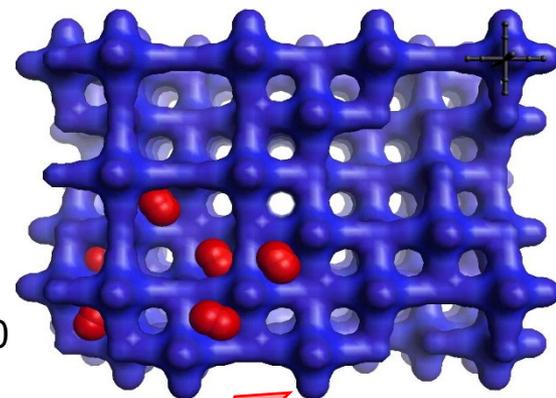
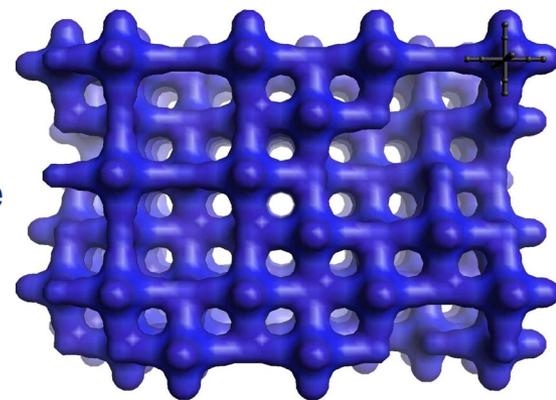


# Parametric refinement

- “Surface” refinement using correlated parameters
- E.g. The value of the lattice parameter at T1 is related to that at T2 based on the thermal expansion of the material

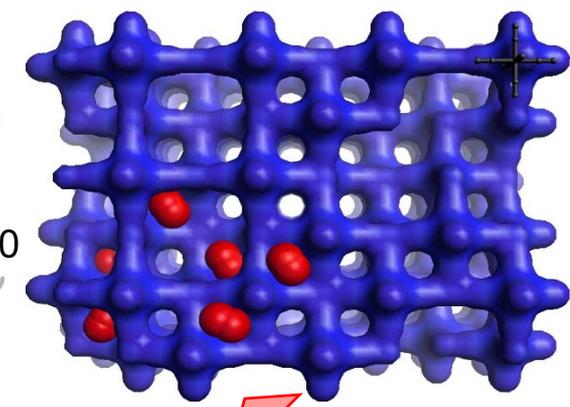
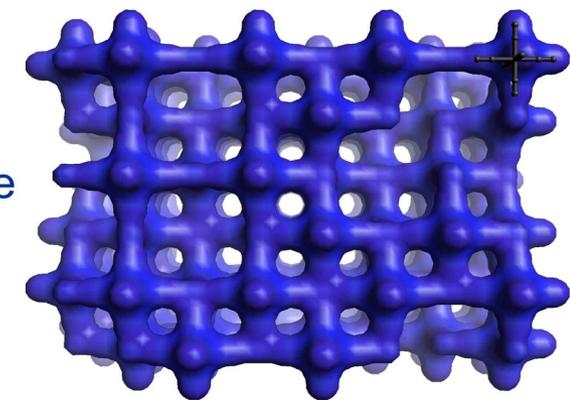
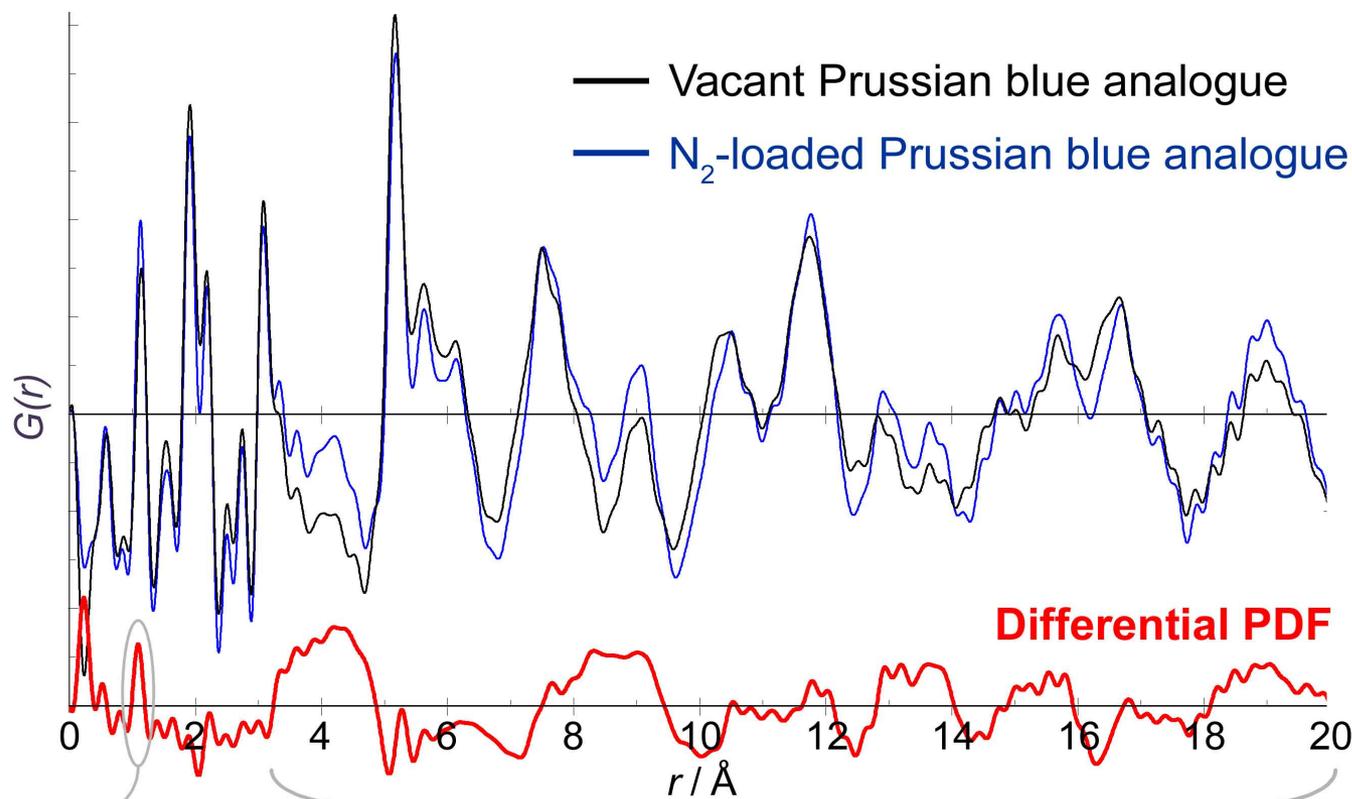


# Differential PDF to recover chemical sensitivity



# Differential PDF to recover chemical sensitivity

$$G(r)_{\text{Prussian Blue}} - G(r)_{\text{Prussian Blue+N}_2} = \text{Differential PDF}$$

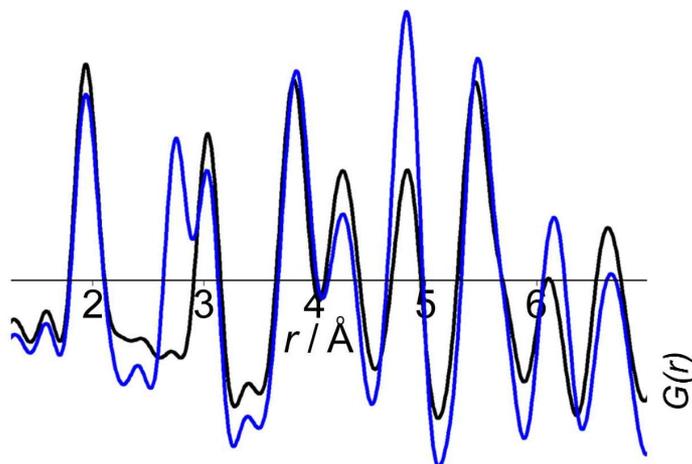
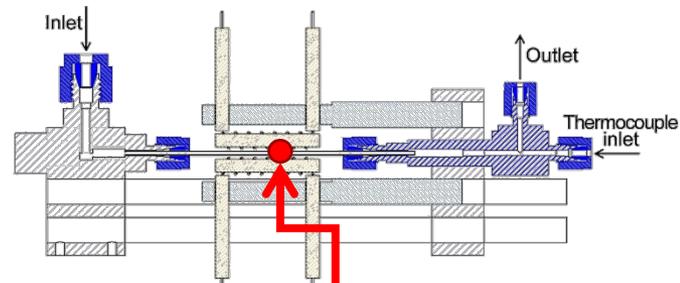


N-N distance in N<sub>2</sub>

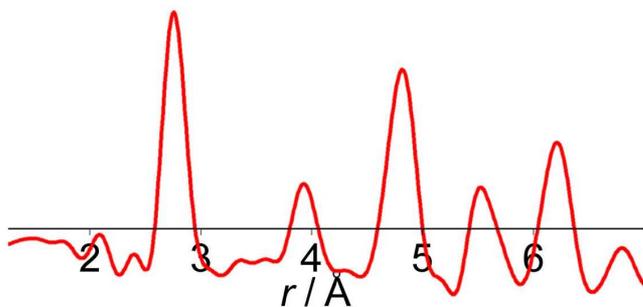
Guest-Host Correlations



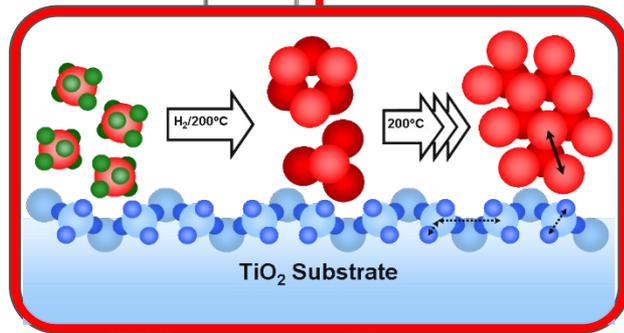
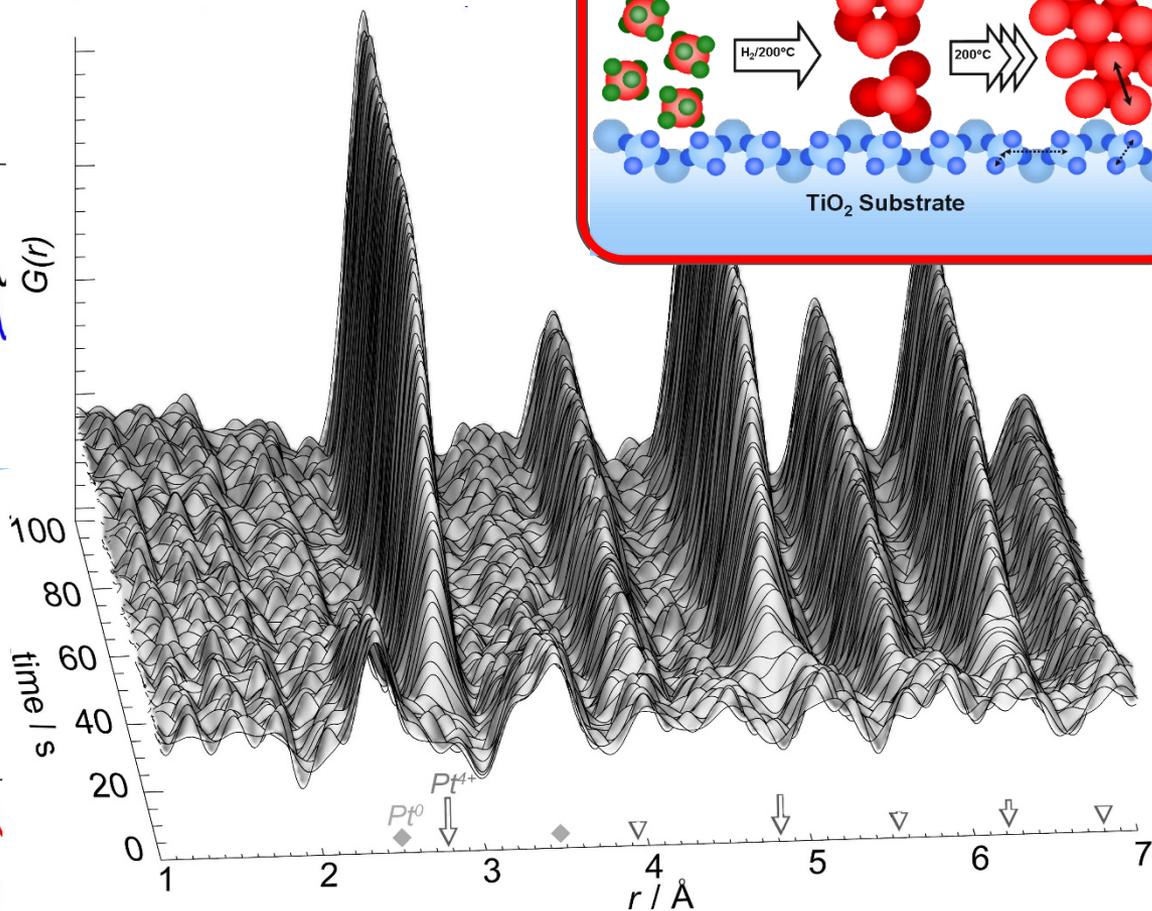
# Correlating individual features



$$G(r)_{Pt/TiO_2} - G(r)_{TiO_2}$$

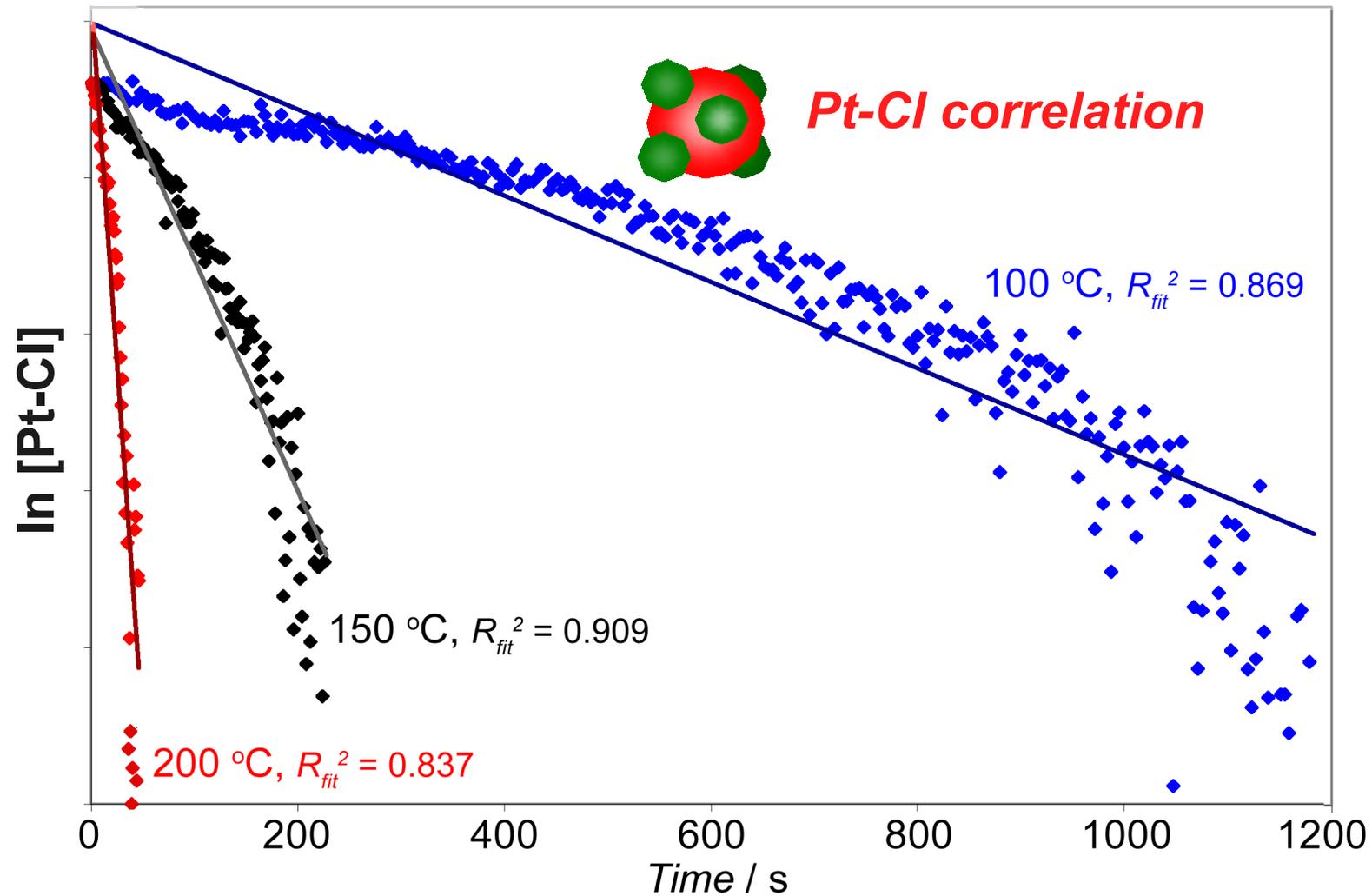


Differential PDF

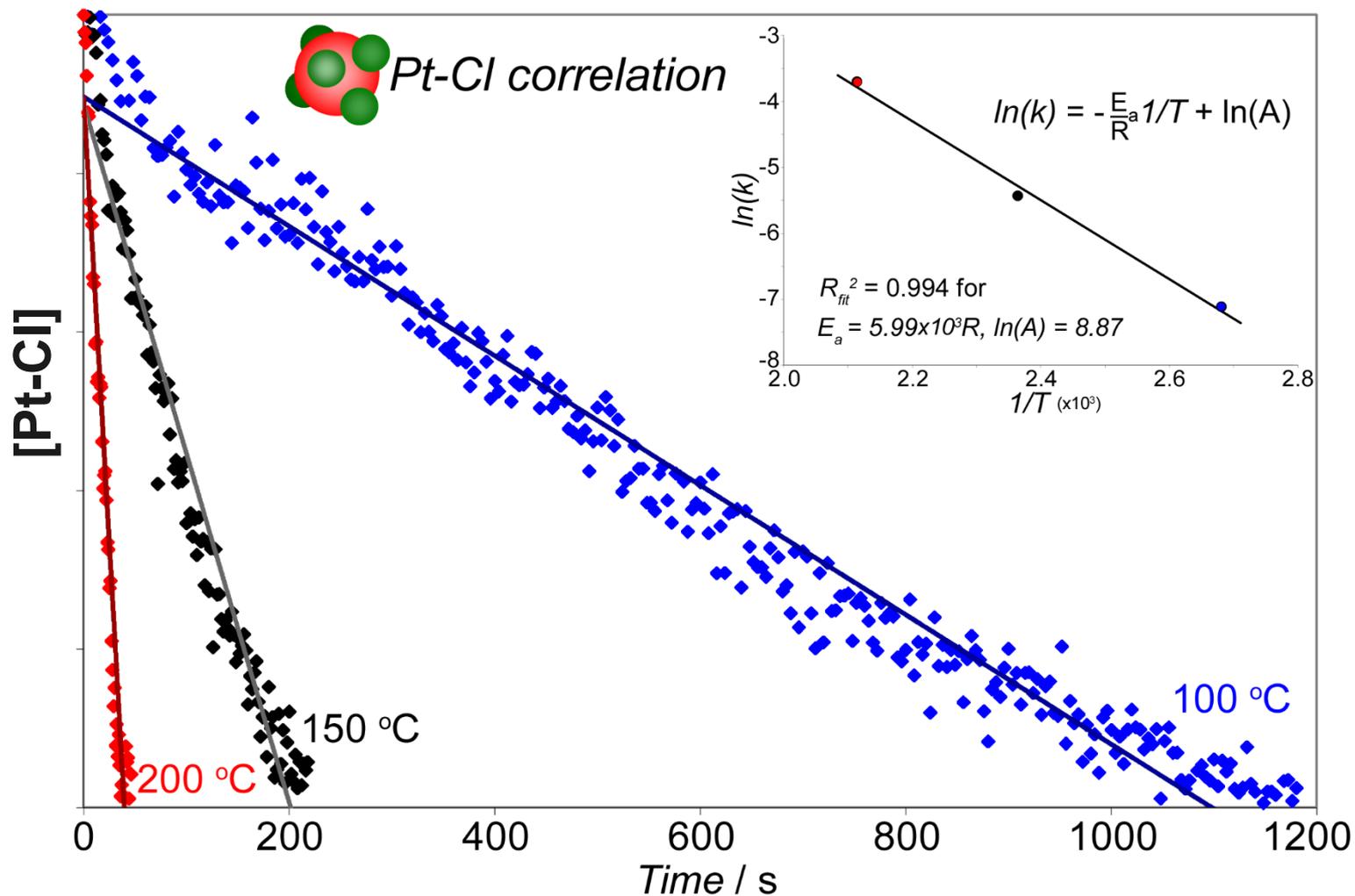


In situ reduction:  $Pt^{4+}$  on  $TiO_2 \xrightarrow{H_2} Pt^0$

# Reaction order: 1st order reduction kinetics ??

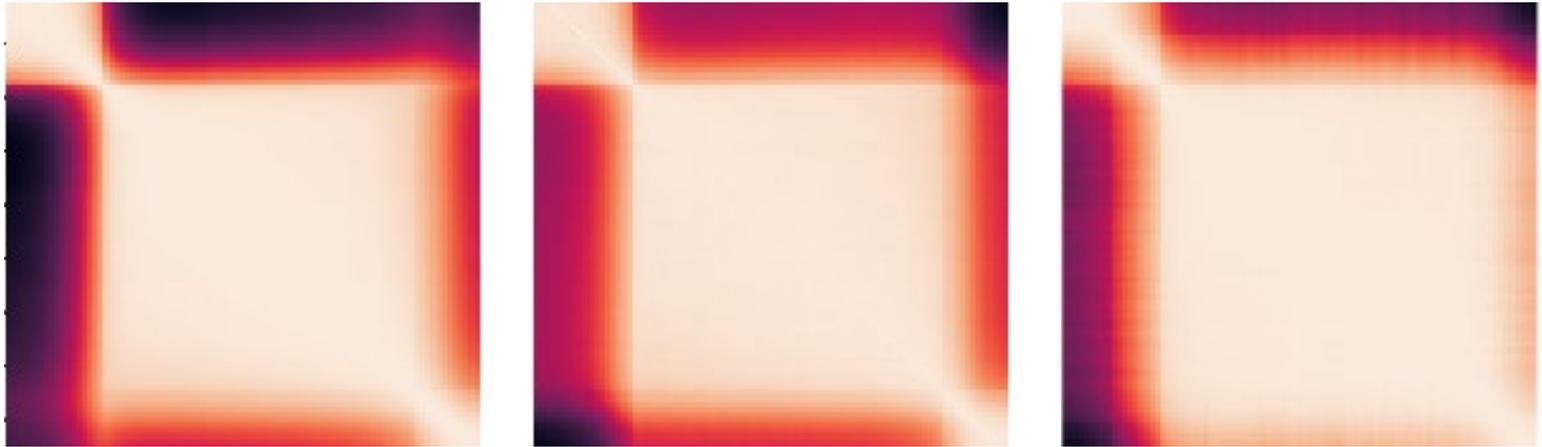


# Reaction order: 0<sup>th</sup> order reduction kinetics



## Data Science Tools

*Model & data-type agnostic analysis using blind signal separation, dimensional reduction strategies (NMF, PCA), correlation analyses*



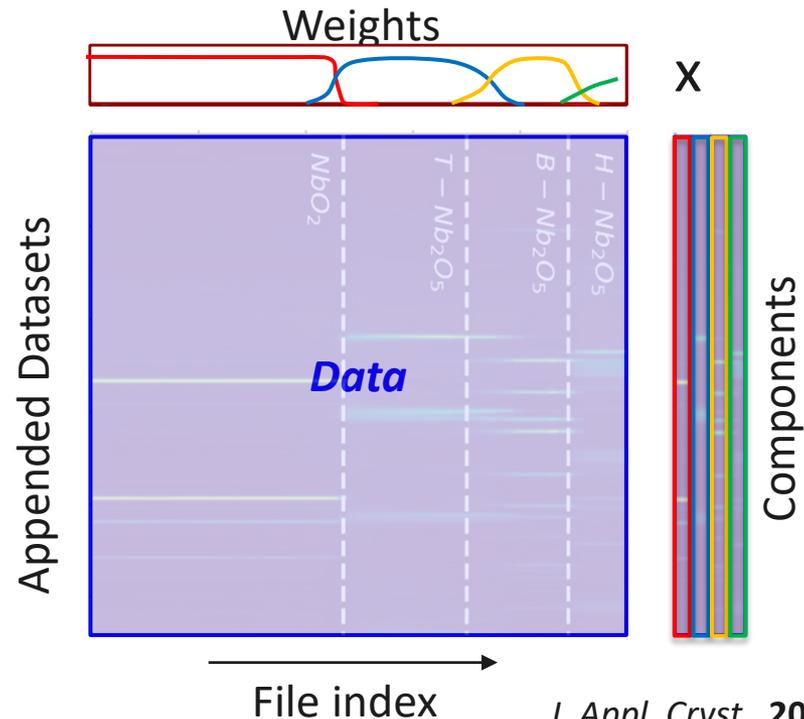
# Multivariate analysis for blind signal separation

Dimensional reduction algorithms such as Principal Component Analysis (PCA) & Non-Negative Matrix Factorization (NMF) cluster features that change together (*e.g.*)

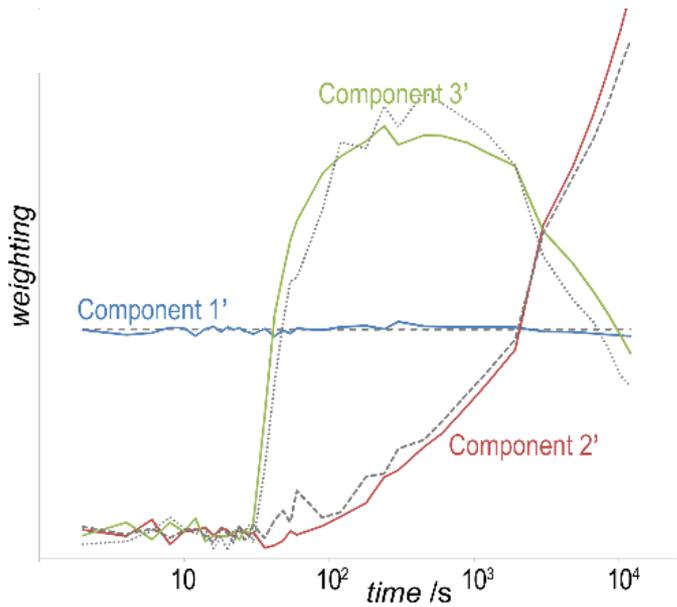
This provides model-free, data agnostic approach to separate and quantify distinct “states” or phases of the system.

$$\begin{bmatrix} W \\ \times \\ H \end{bmatrix} \approx \begin{bmatrix} V \end{bmatrix}$$

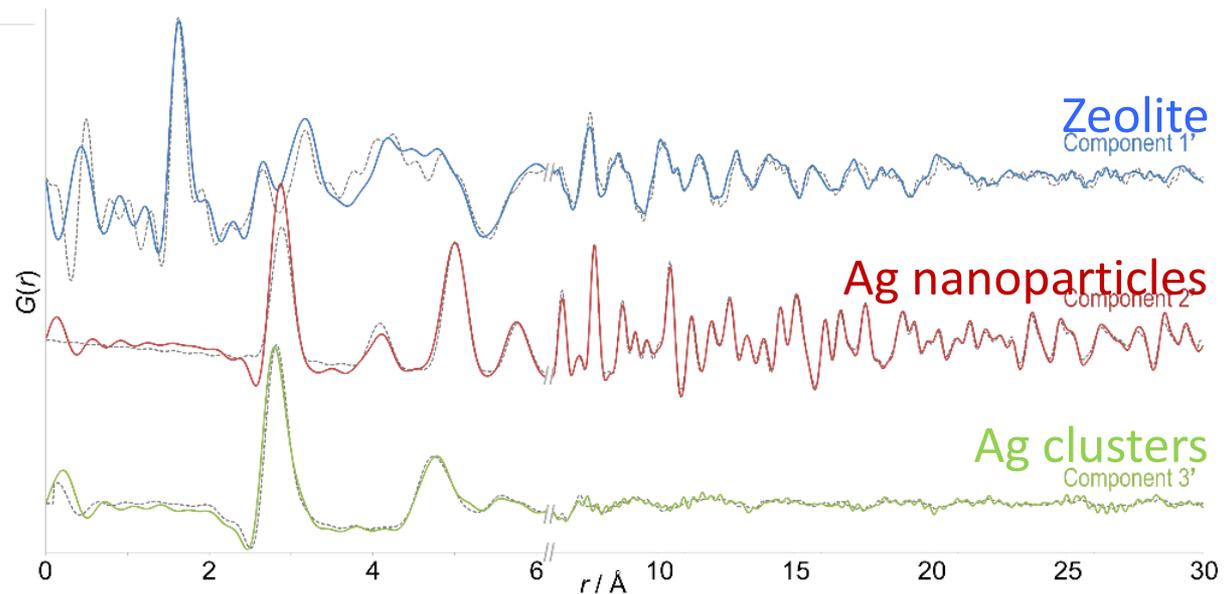
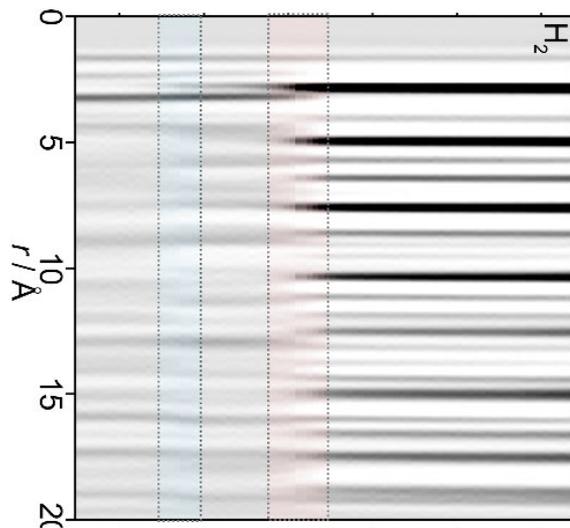
- Visualizes large complex data series in terms of a smaller number of variables
- Expresses data as a linear combination of components



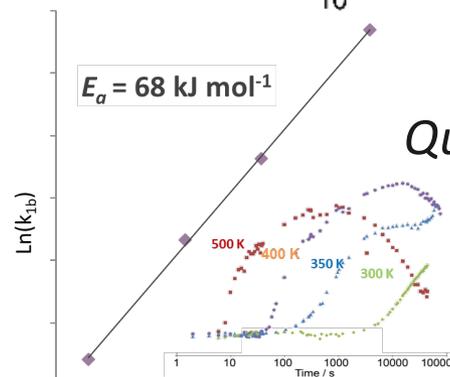
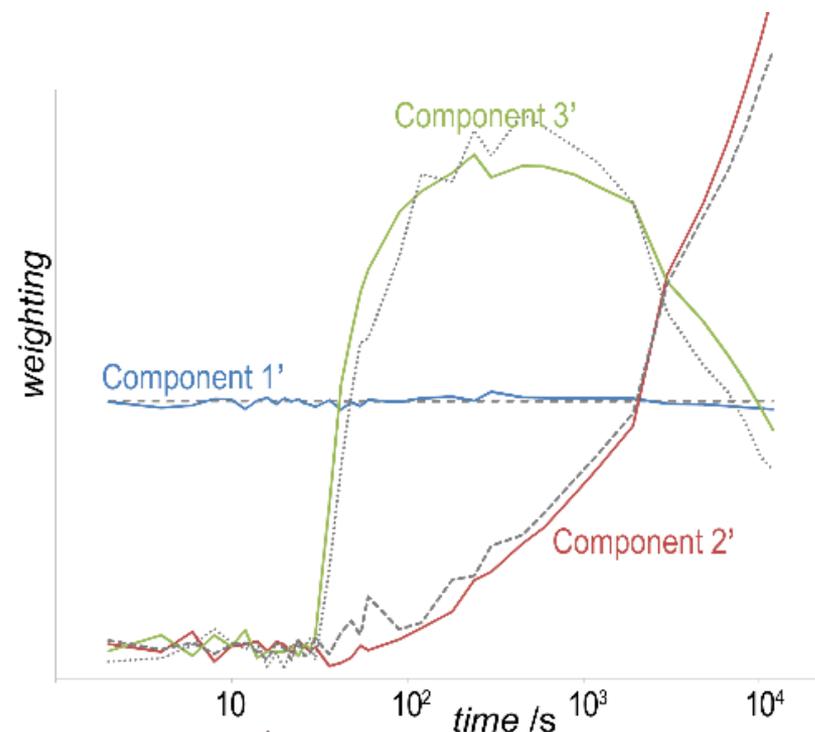
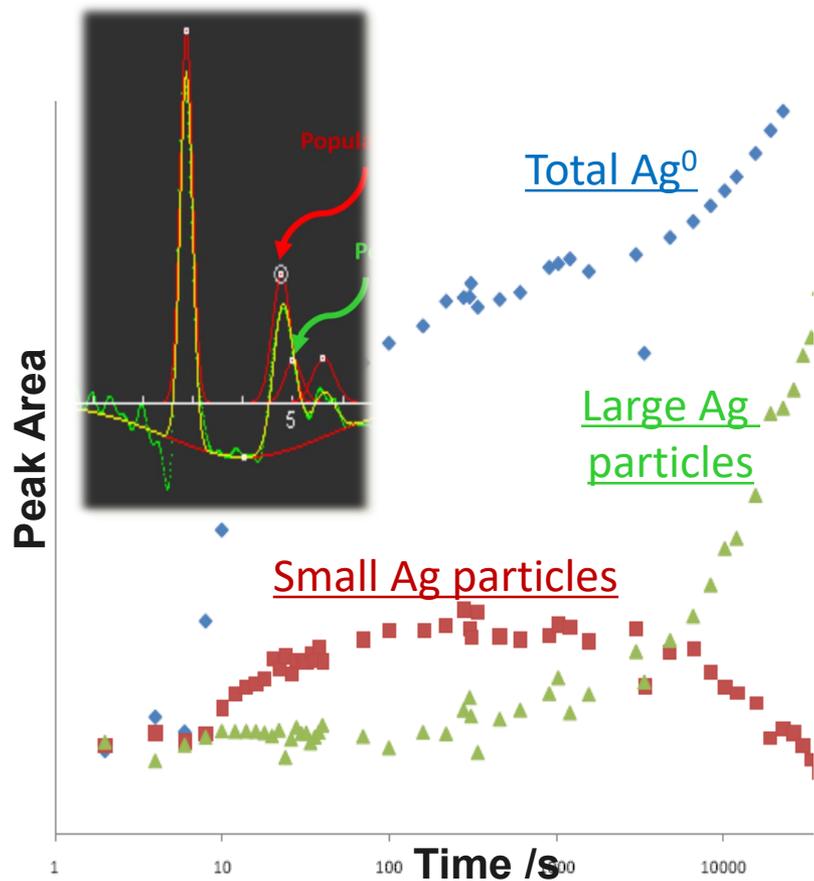
# Multivariate analysis gives recognizable components



Reconstructed components reproduce PDFs for phases and quantitative phase abundances determined through conventional analysis



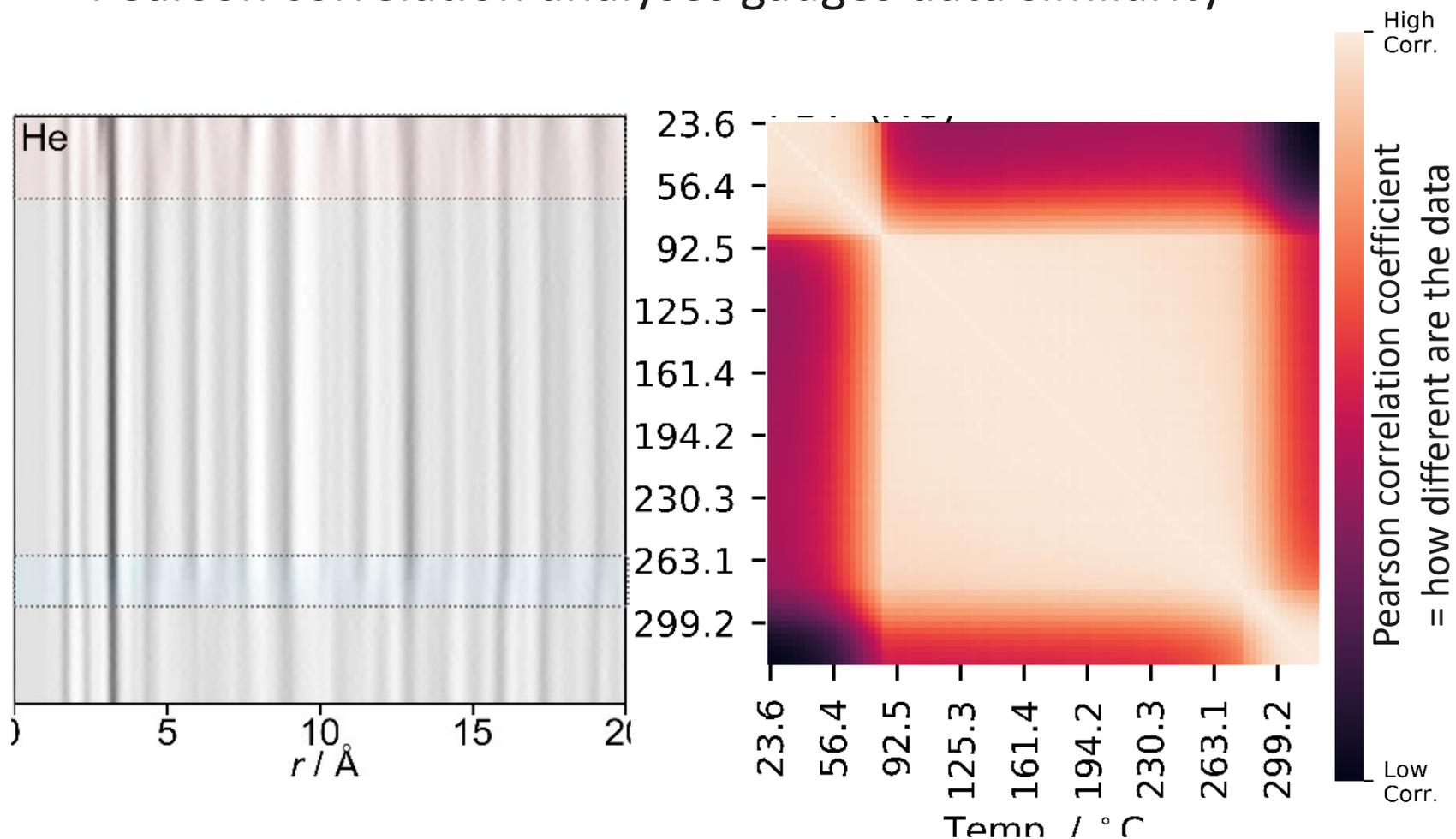
# Reaction profiles match conventional analyses



Quantify kinetic parameters  
e.g. activation energy

# Correlation analysis

Pearson correlation analyses gauges data similarity

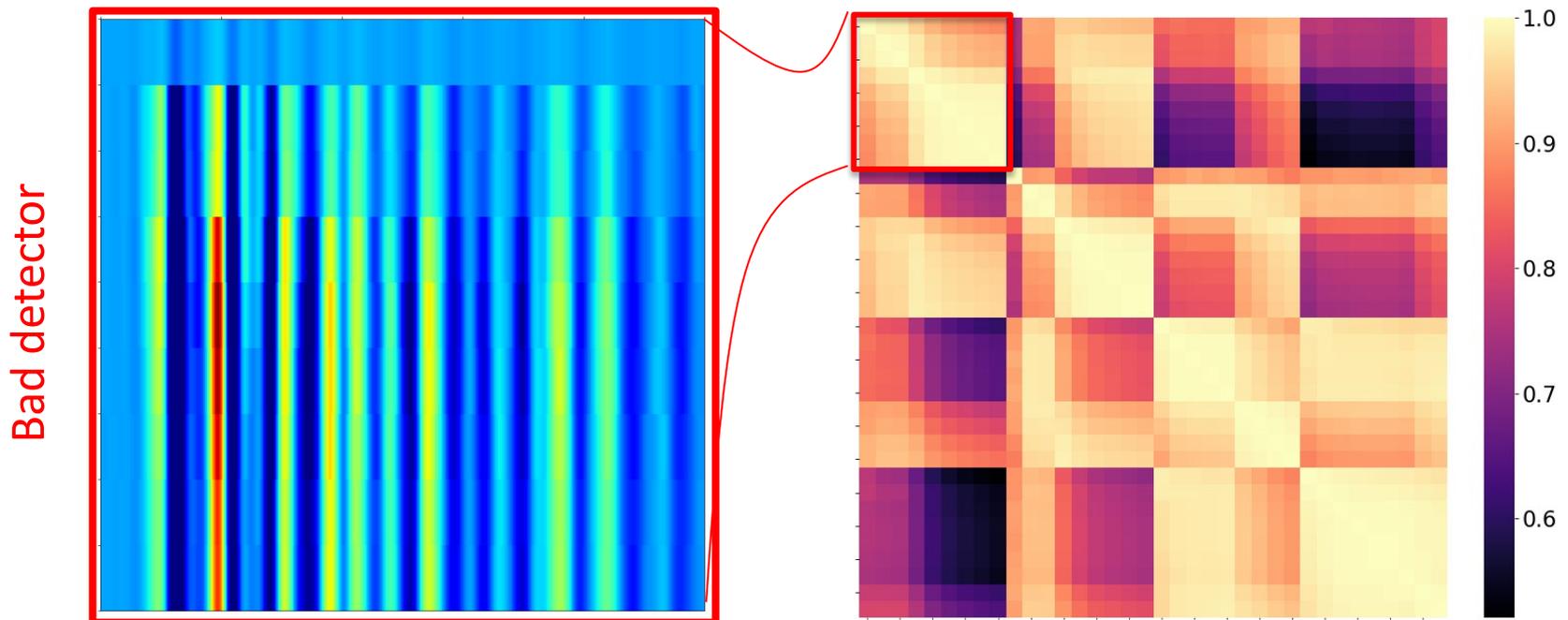




# Life support for imperfect data

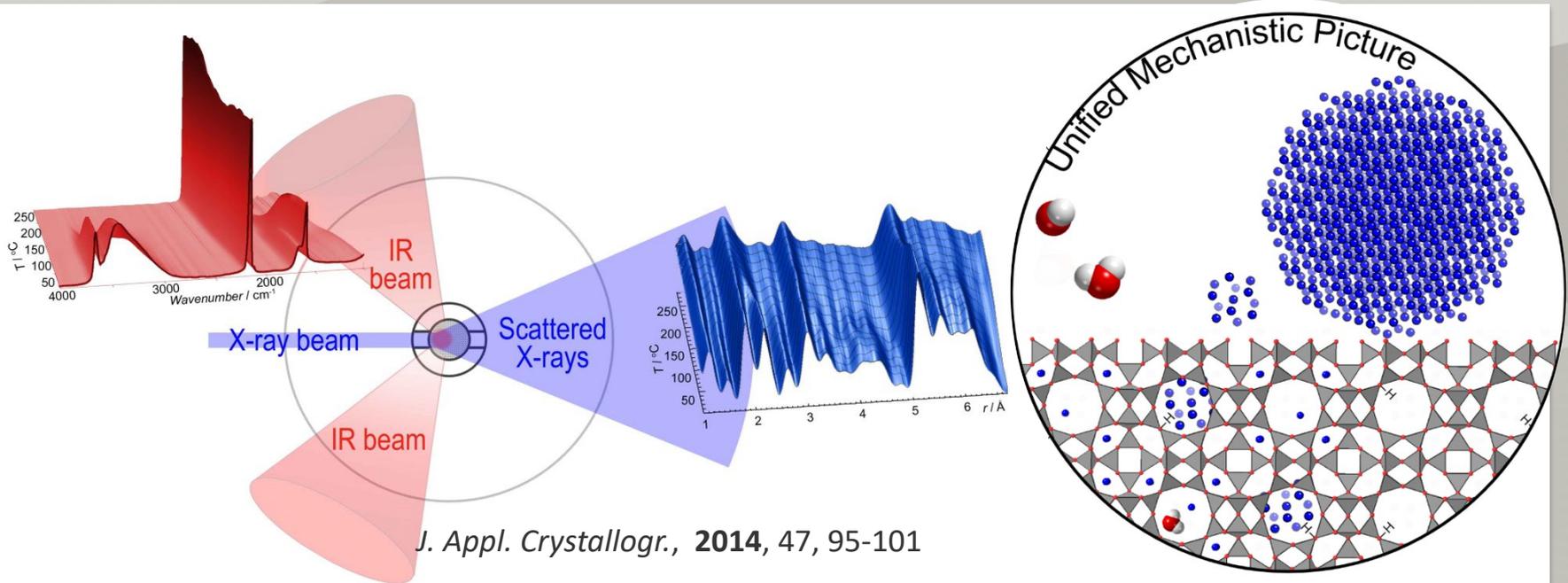
Can always using Pearson analysis to gain insights into the evolution of an in situ/operando experiment even if there are problems with the background corrections etc.

But without the constraints of a model, its up to you to interpret the output appropriately



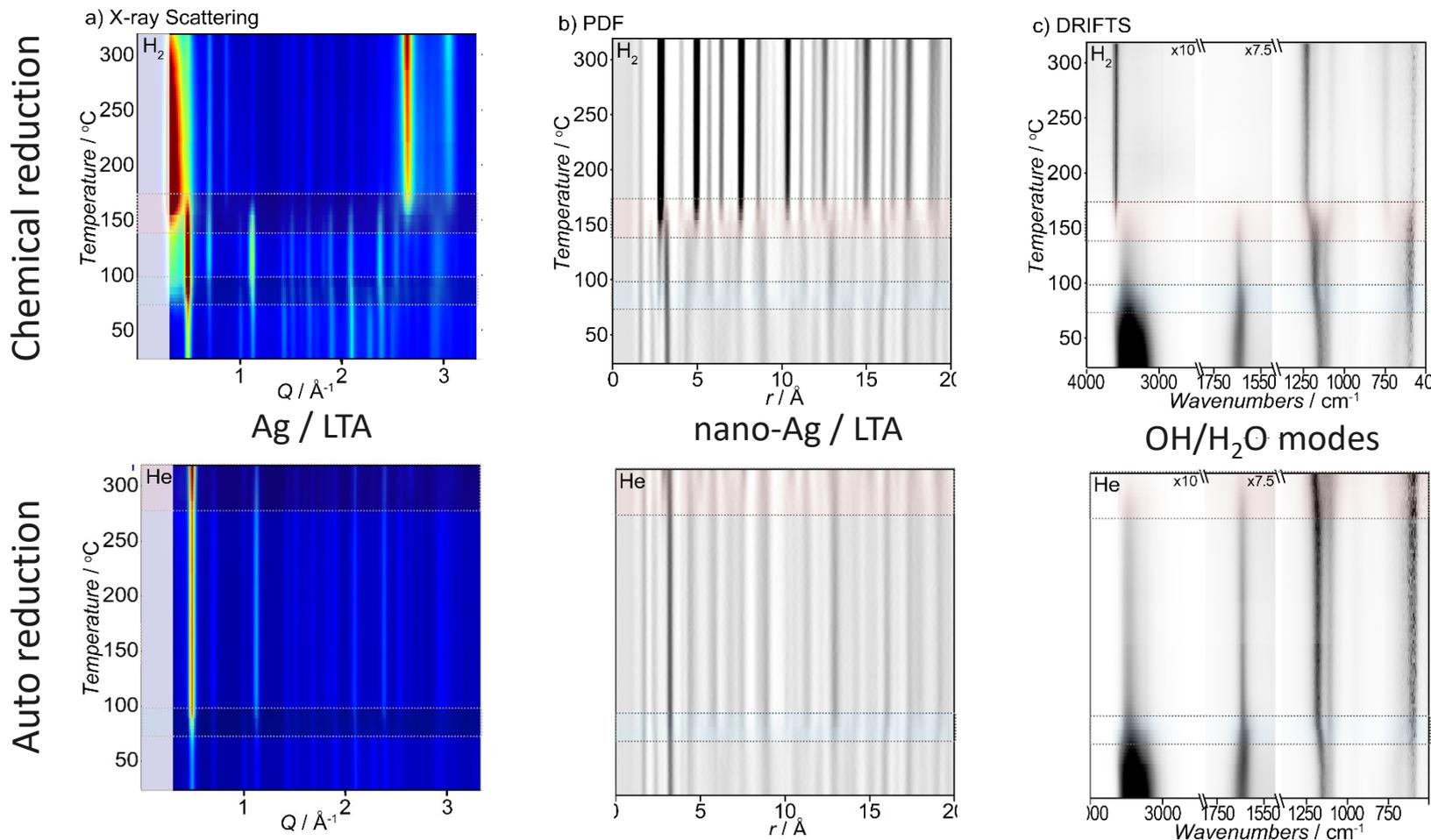
# Multimodal measurements

*Complementary insights into different aspects of the system:  
The X-ray signal is dominated by high Z species  
infra-red spectroscopy is sensitive surface species ( $H_2O/OH$ )*

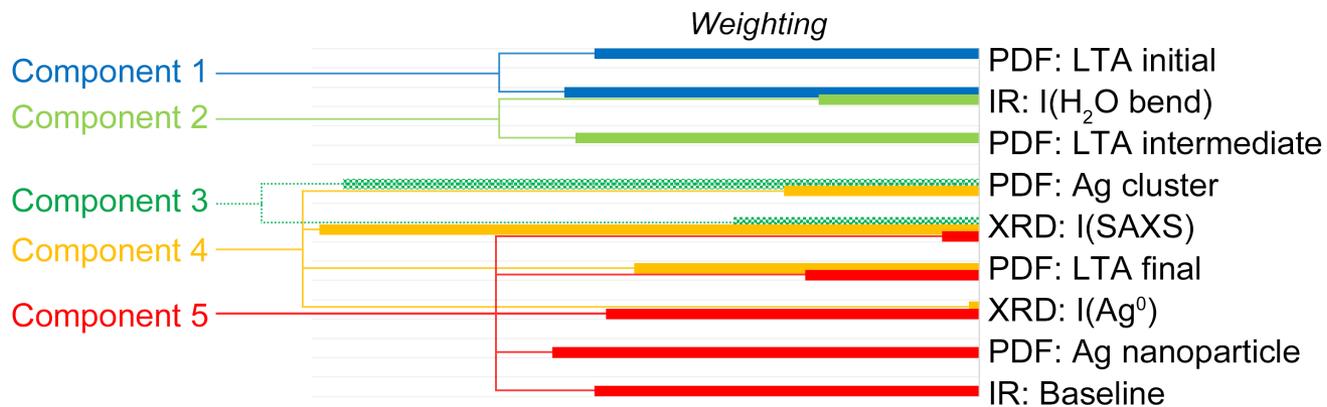
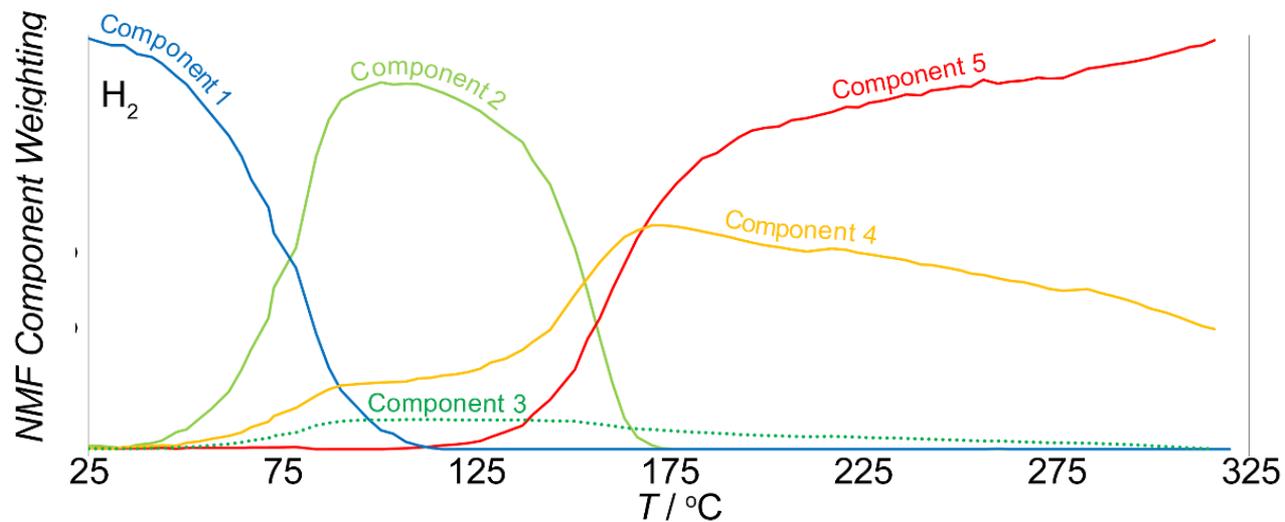


# Multimodal measurements = data overload

All the information is collected, but the volume & variety of data can be challenging to interpret

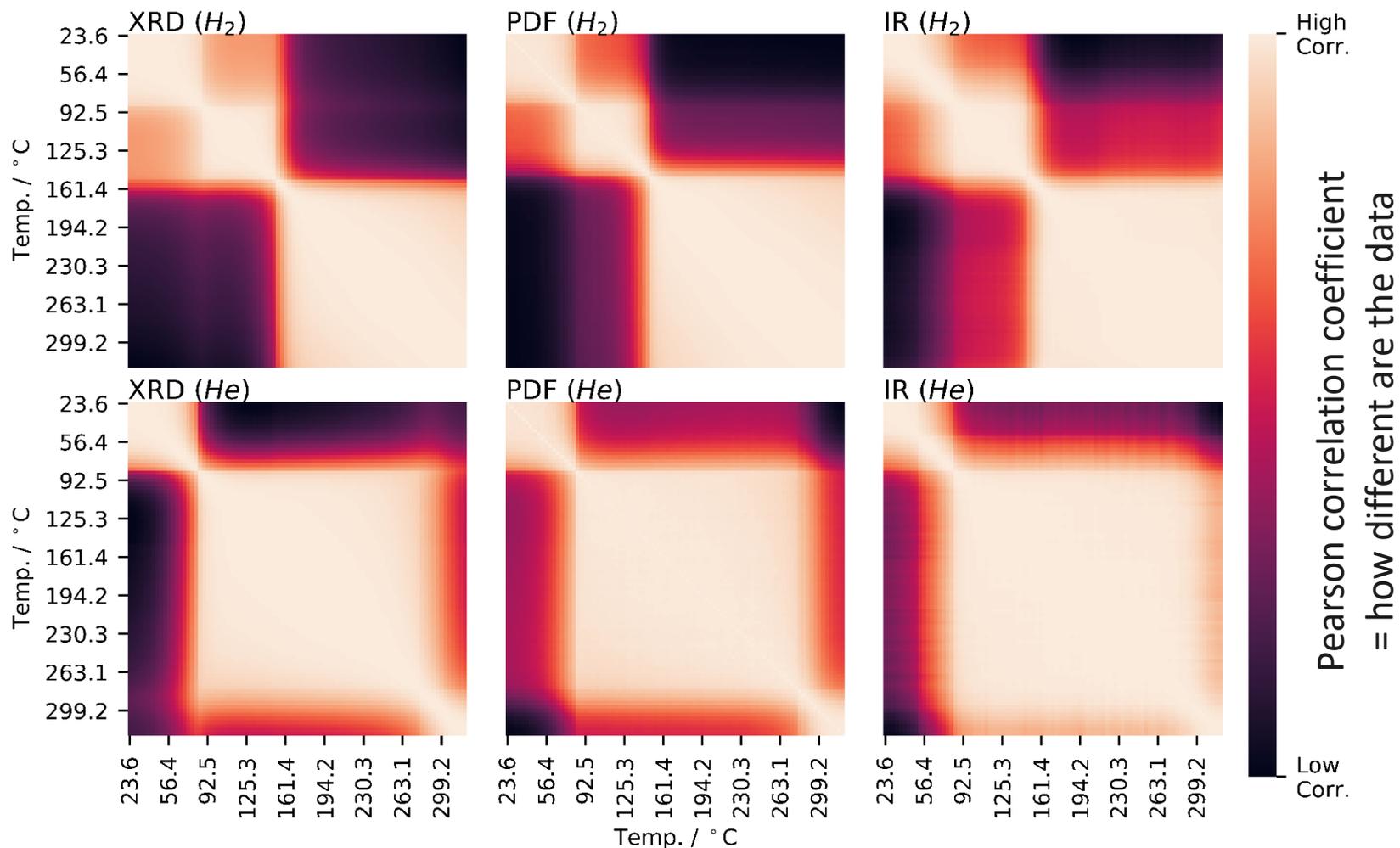


# Use NMF to describe 5 reaction states



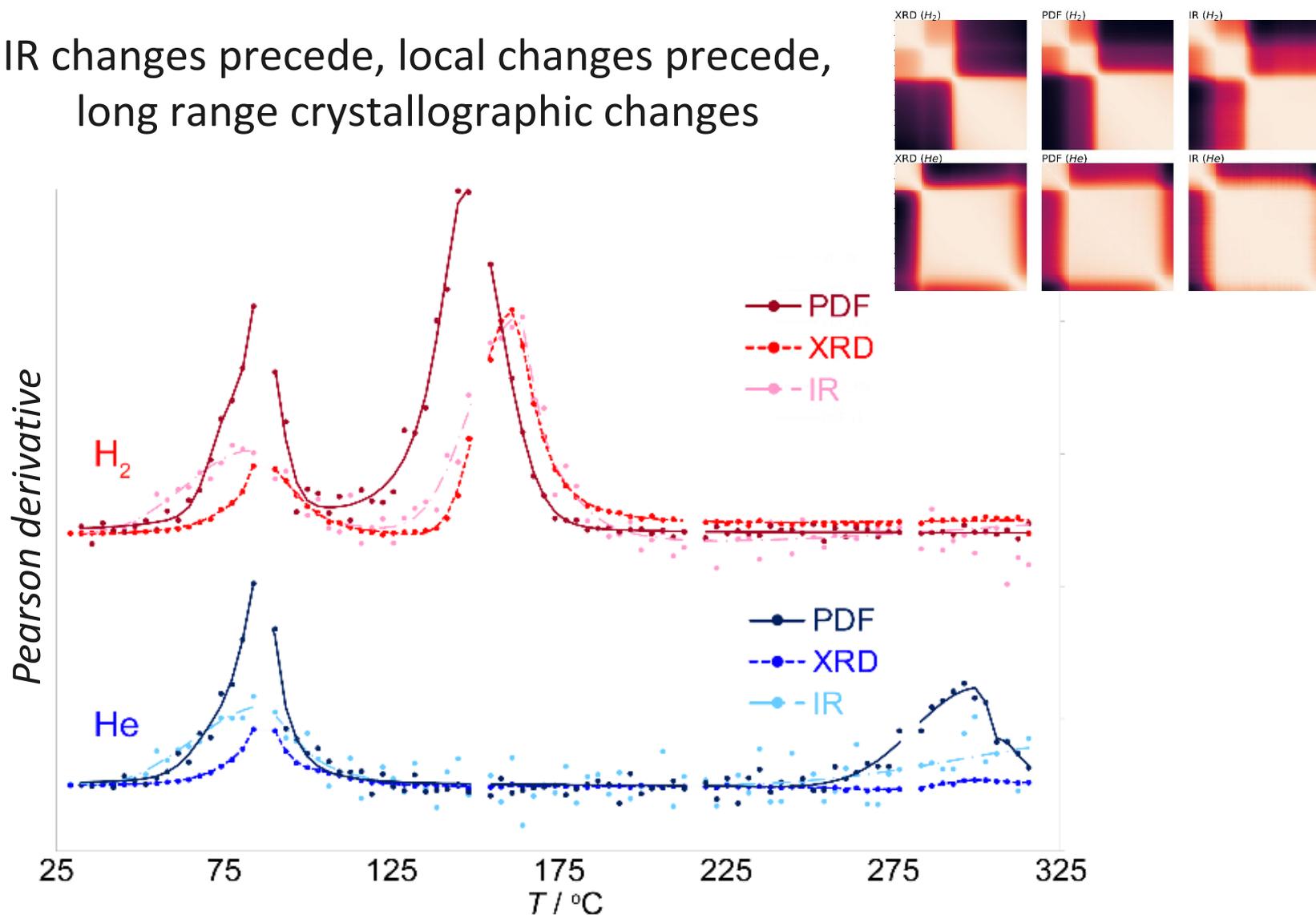
# Pearson Correlation analysis is data agnostic

The first transition is independent of atmosphere. Dehydration  
 The second transition is shifted to higher T under He



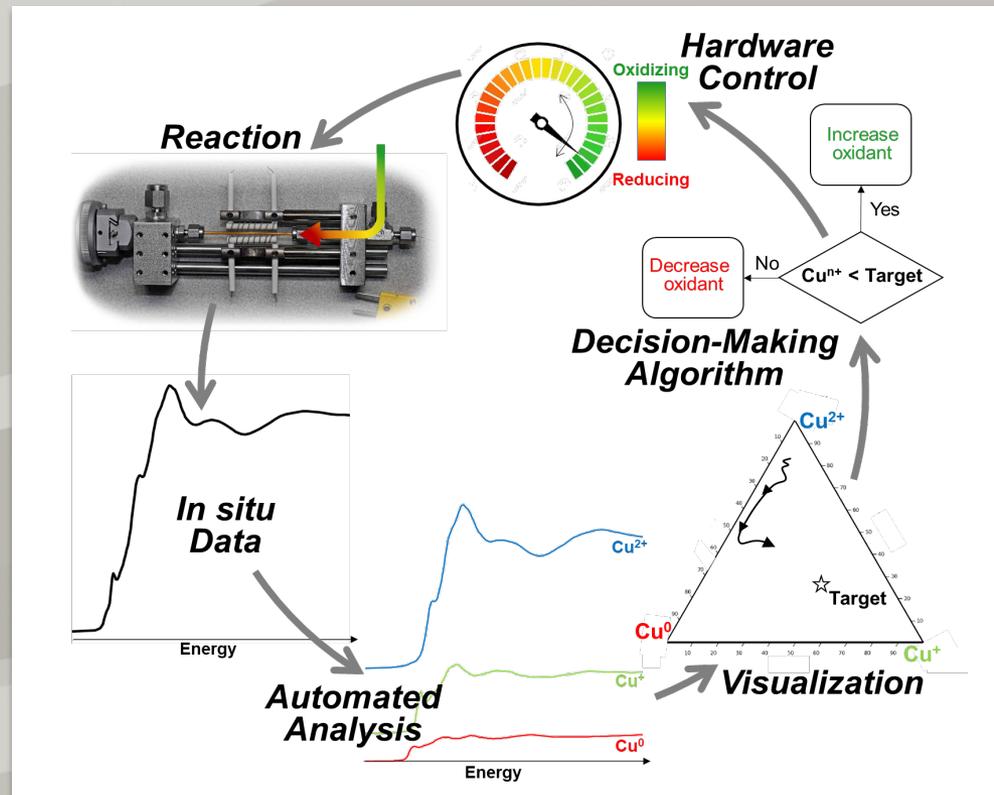
# Pearson derivative shows which changes drive process

IR changes precede, local changes precede,  
long range crystallographic changes



# Active Experiment Control

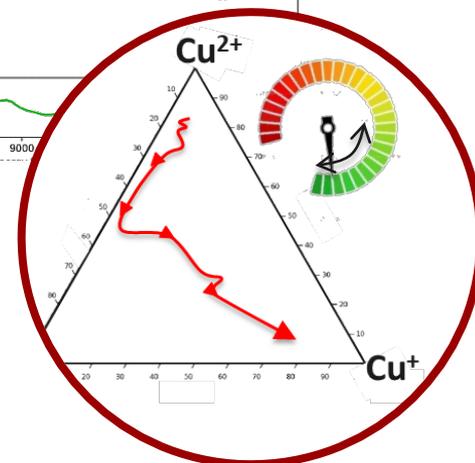
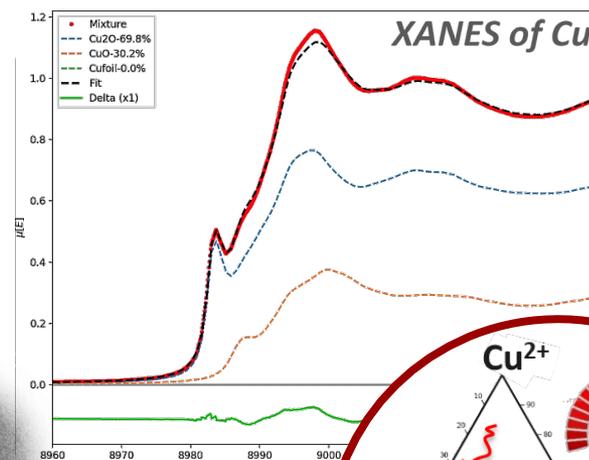
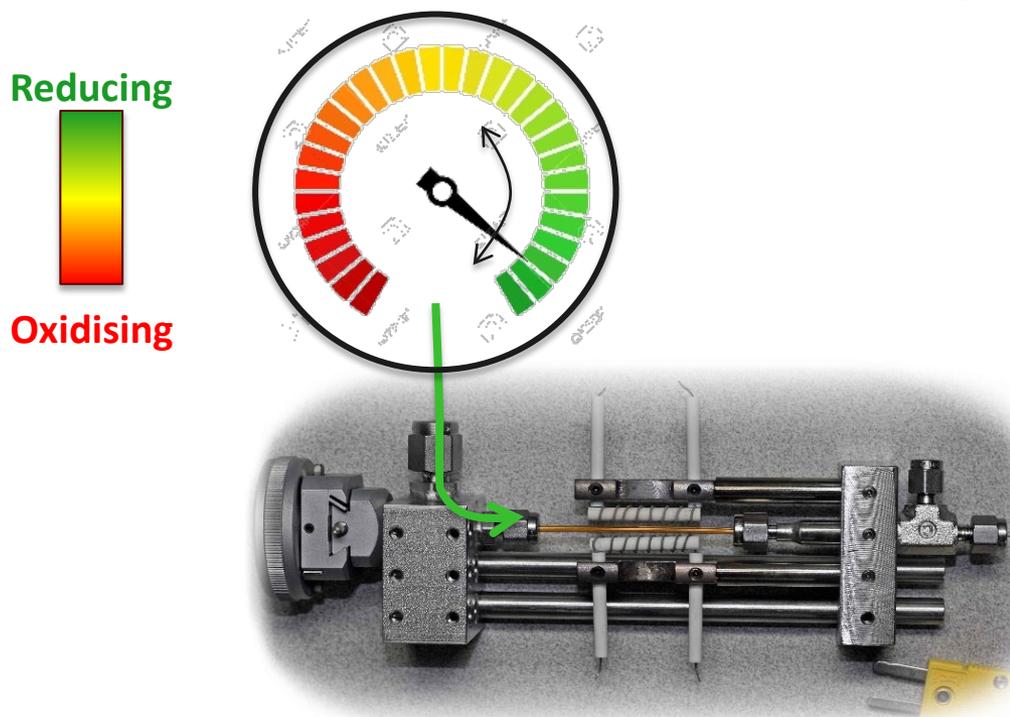
*Autonomously control sample state based on real-time feedback from in situ measurement*



# Steering reactions in real-time

We can target a specific oxidation state (and defect concentration) by evaluating the oxidation state distribution *during the reaction* and then changing the oxidising/reducing gas mix

For Cu-supported on  $\gamma\text{-Al}_2\text{O}_3$  targeting  $\text{Cu}^{1+}$



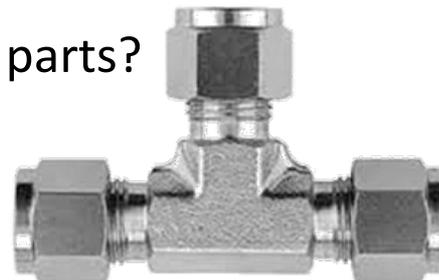
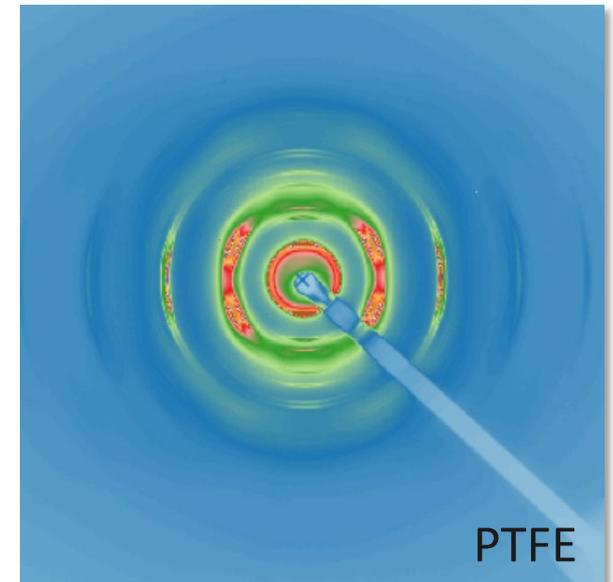
# Where do I start?

*Materials? Machining?*



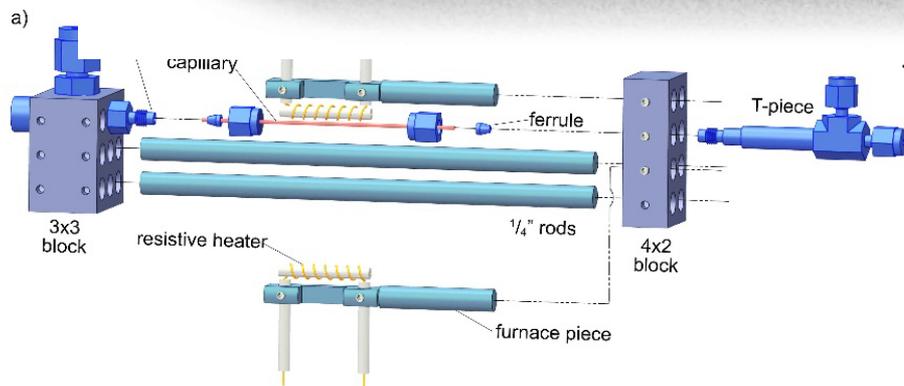
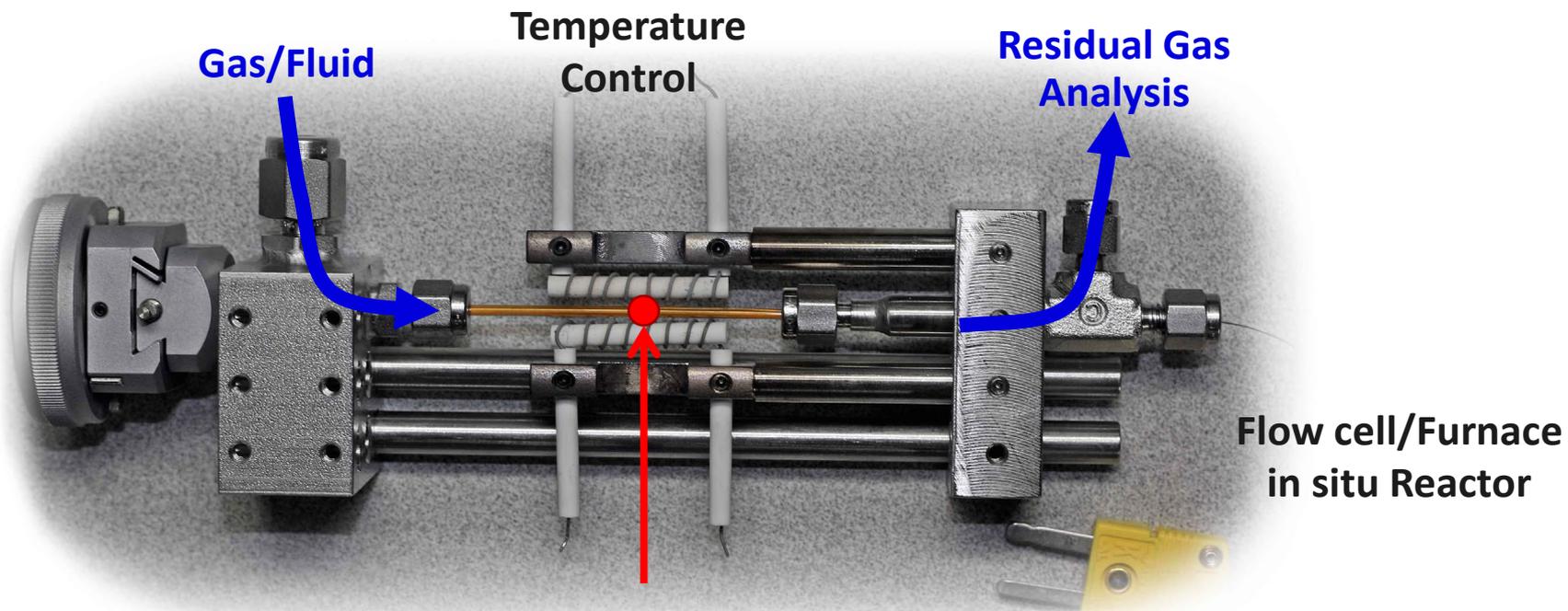
# Materials considerations

- X-ray windows/sample holder
  - **Good:** Kapton, sigradur (glassy carbon), glass
  - **Maybe:** Diamond
  - **Avoid:** PTFE, metal foils, sapphire, Si crystal
  - Consider: Rigidity, uniformity, thickness
- Chemical compatibility
  - Teflon, 316 series stainless steel,
- Thermal conductivity/stability: Al, SS, Cu?
- Electrical conductivity: Sigradur (glassy carbon)
- Can you adapt commercial parts?



# Example: The flow-cell/furnace

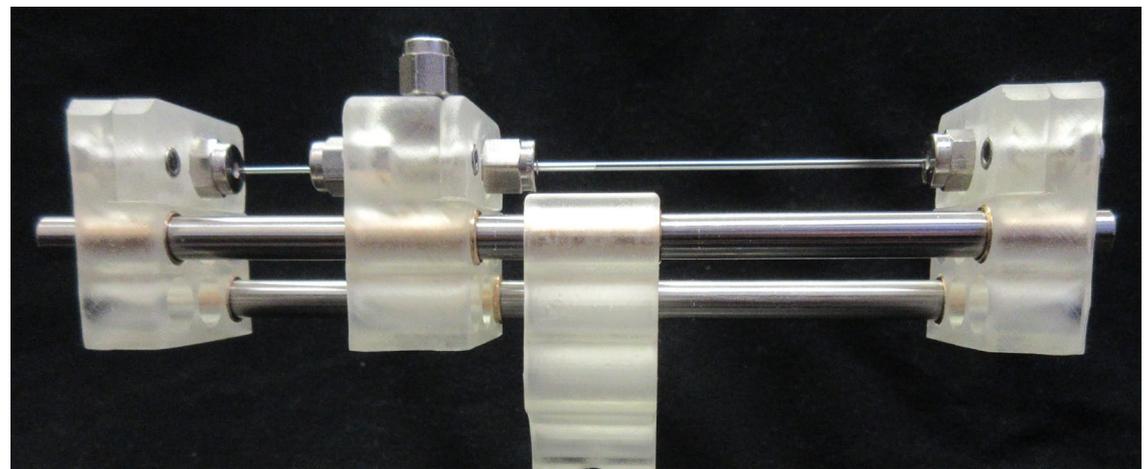
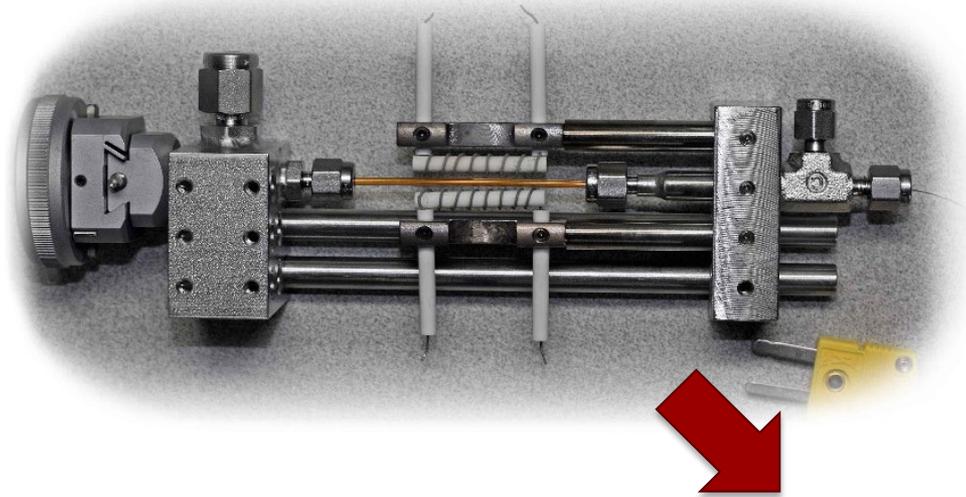
A versatile sample environment to control chemistry and temperature



*J. Appl. Crystallogr.* 2008 822



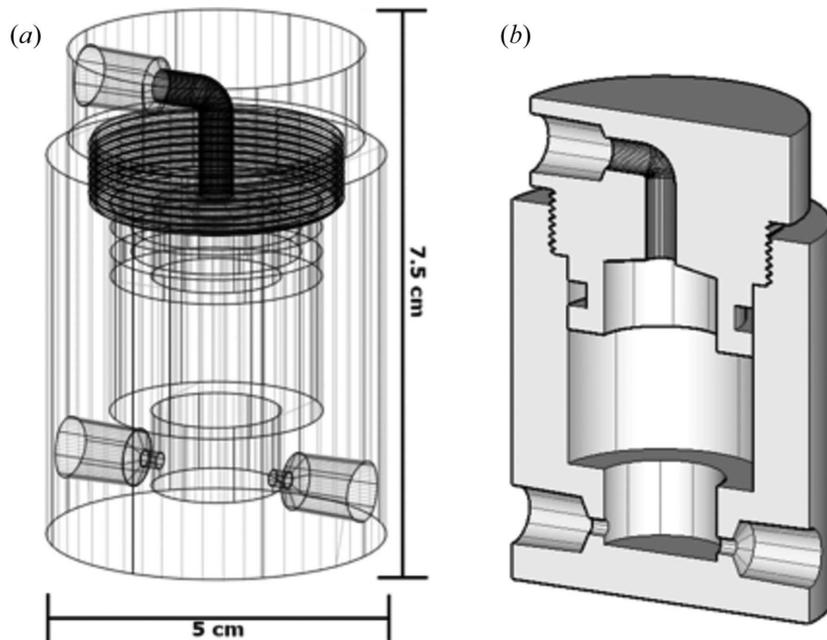
# 3D printing to adapt commercial parts



# 3D printing solutions

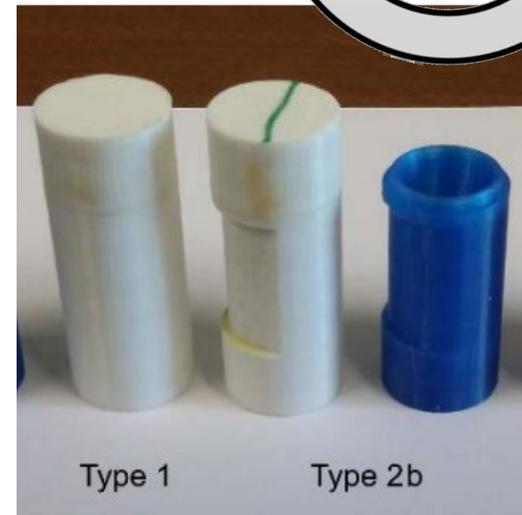
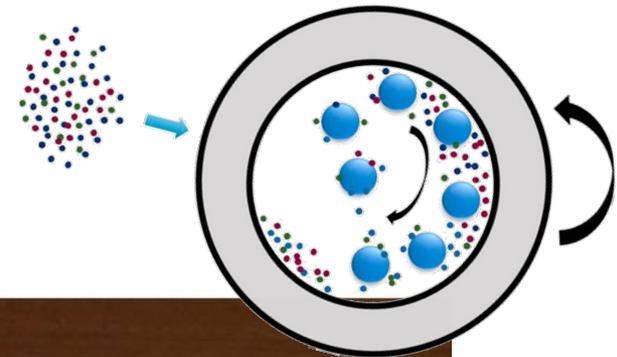
- Customized complex shapes
- Inexpensive fabrication
- Cheap aka Disposable

## *Solution Mixers*



Acta Cryst. **2019**. A75, 758-765

## *Ball milling*



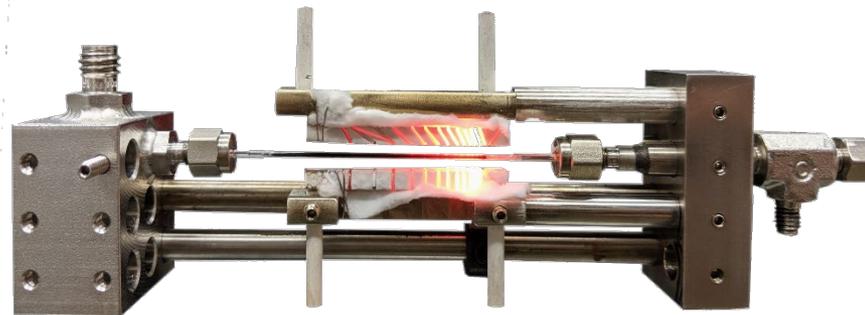
J. Appl. Cryst. **2017**. 50, 994-999



# 3D printed ceramic for high/gradient temperature

We 3D print a high temperature ceramic template to reproducibly generate a continuously varying wire density

By controlling the winding density of the heater wire, we can control the spatial distribution of temperature across the sample.

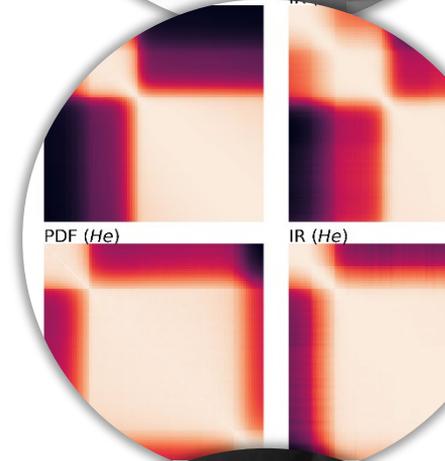
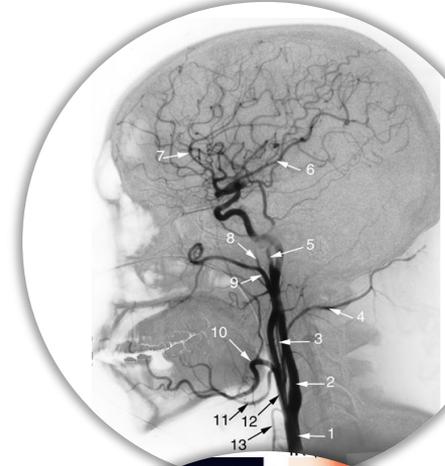


Accelerates variable temperature studies



# Summary

- In situ and operando measurements allow us to understand the relationship between structure and function/reactivity
- New opportunities for extracting insight from in situ data
- Anything is possible. Not everything is easy.
- Characterize your characterization tool with a known system BEFORE you use it to study your samples
- Need help? Ask your friendly beamline scientist or reach out: [karena.chapman@stonybrook.edu](mailto:karena.chapman@stonybrook.edu)



# Questions? Resources

- Contact me: [karena.chapman@stonybrook.edu](mailto:karena.chapman@stonybrook.edu)
- Methodology journals e.g. *Journal of Applied Crystallography.*, *J Synchrotron Radiation*
- Ask your friendly beamline scientist

