

# Atomic Pair Distribution Function (PDF) Analysis

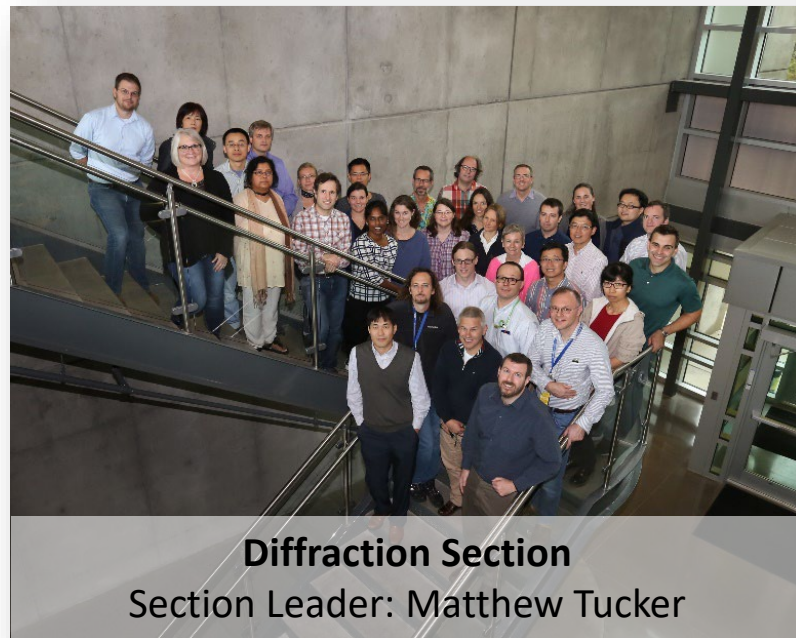
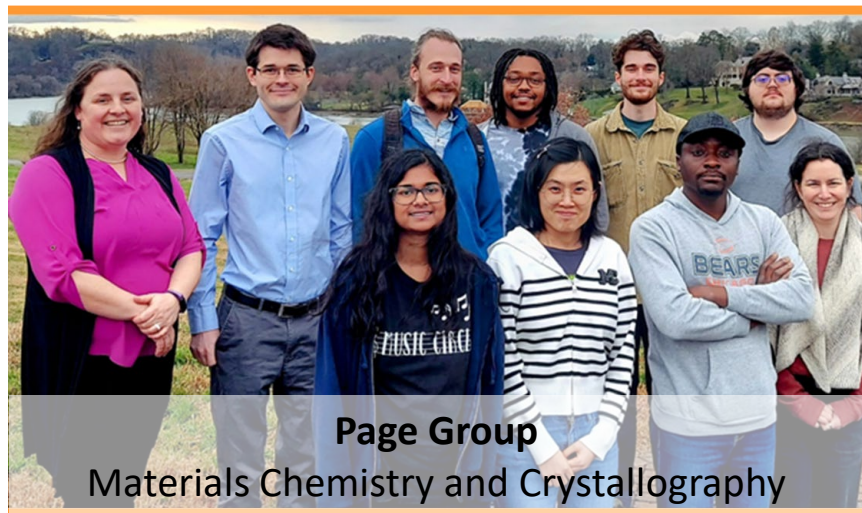
Katharine Page

Materials Science and Engineering Department  
& Oak Ridge National Laboratory



THE UNIVERSITY OF  
TENNESSEE  
KNOXVILLE

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# Outline

## Part 1:

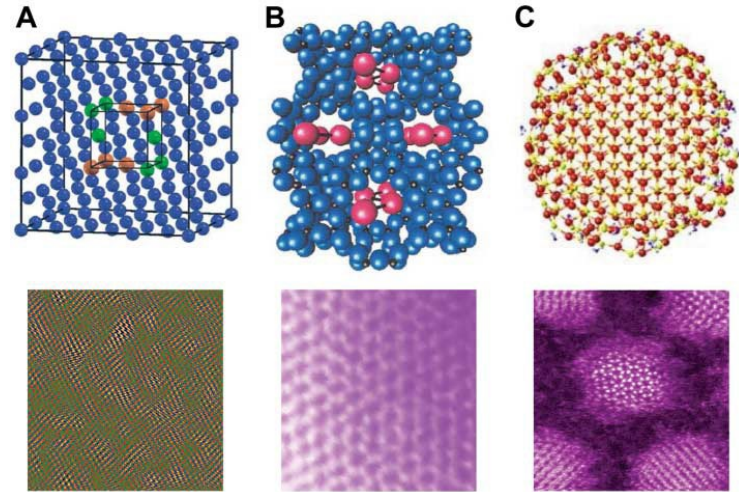
- The Pair Distribution Function (PDF)
- Applications
  - Local Distortions
  - Chemical Short-Range Order
  - Nanomaterial Structure
  - Amorphous Structure

## Part 2:

- Experimental Considerations
- Modeling a PDF
- Extension Areas

# What is a *local structure*?

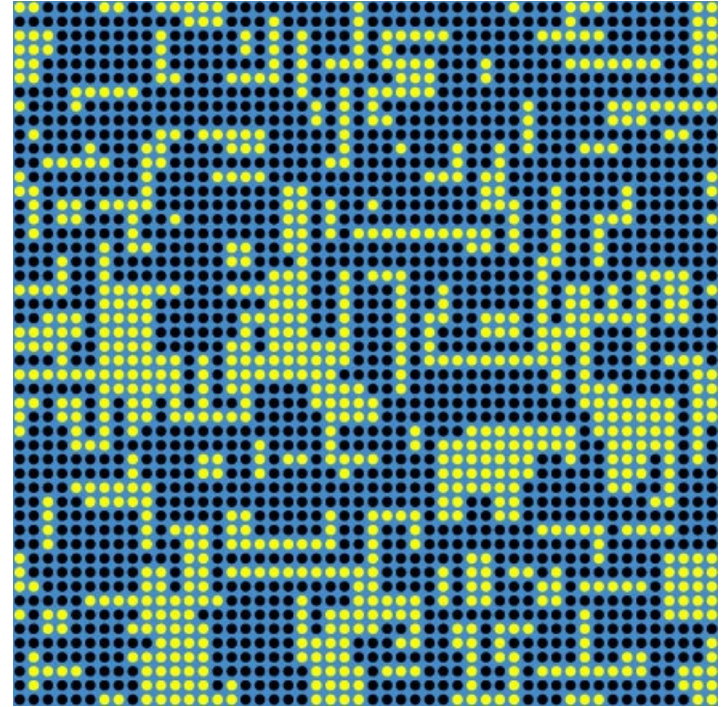
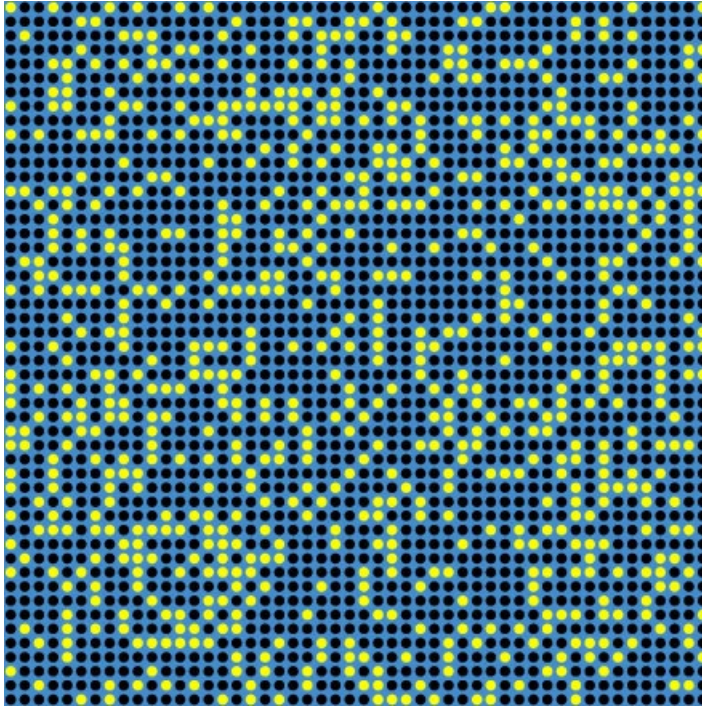
- **Disordered materials:** The interesting properties are often governed by the defects or local structure
- **Non crystalline materials:** Amorphous solids, liquids, glasses and polymers
- **Nanostructures:** Well defined local structure, but long-range order limited to nanometers lengthscales (poorly defined Bragg peaks)



S.J.L. Billinge and I. Levin, **The Problem with Determining Atomic Structure at the Nanoscale**, *Science* **316**, 561 (2007).

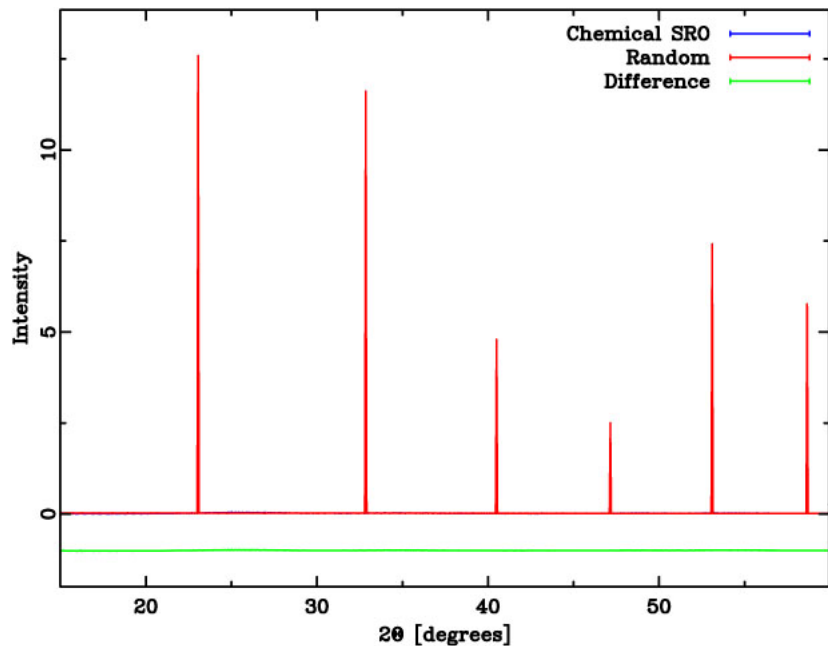
D. A. Keen and A. L. Goodwin, **The crystallography of correlated disorder**, *Nature* **521**, 303–309 (2015).

# What is *total* scattering?

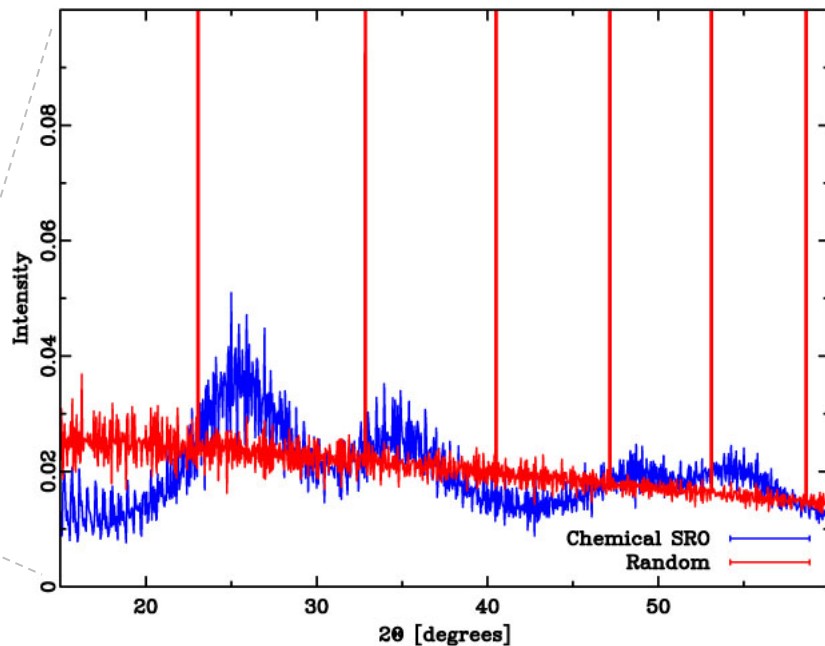


Cross section of 50x50x50 unit cell model crystal consisting of 70% blue atoms and 30% *vacancies*.

# Bragg Scattering and CSRO

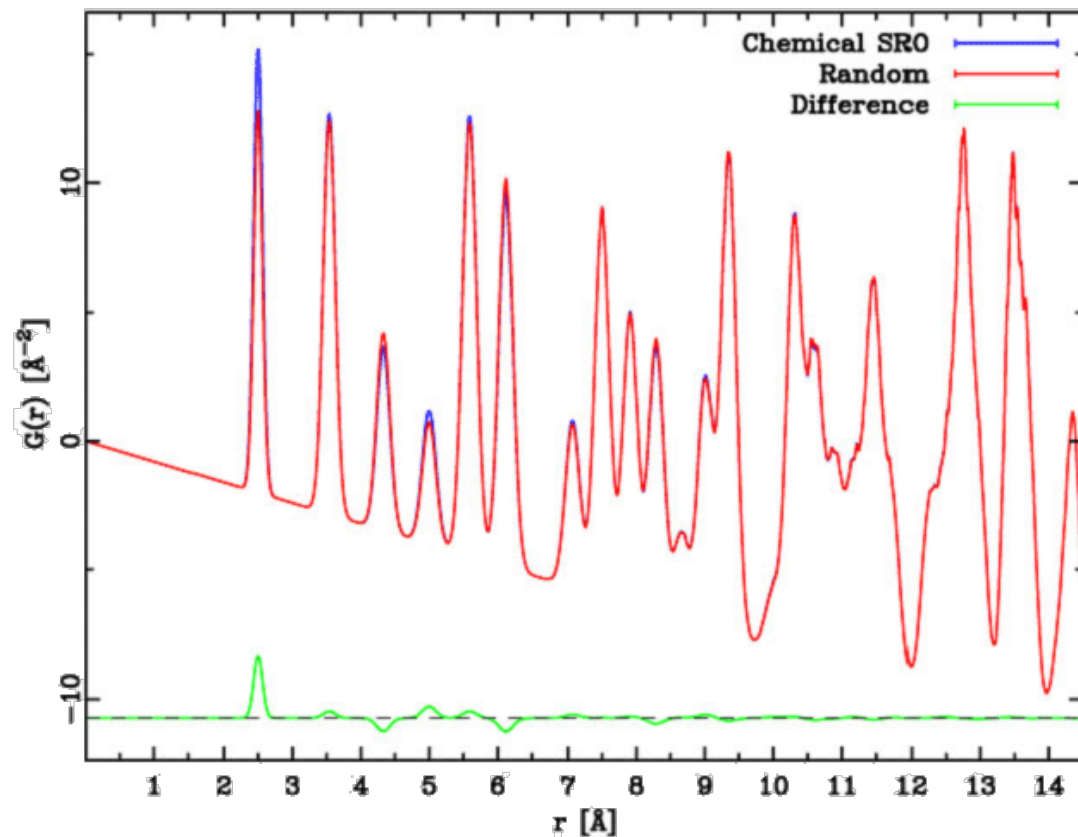


**Bragg scattering:** Information about the *average* structure, *e.g.* average positions, displacement parameters and occupancies



**Diffuse scattering:** Information “underneath the Bragg peaks,” arising from disordered structure

# The Pair Distribution Function



The PDF is the **Sine-Fourier transform** of the **total scattering** (Bragg and diffuse) diffraction pattern

The PDF is sensitive to the **nature** and **length-scale** of CSRO, often key to physical properties

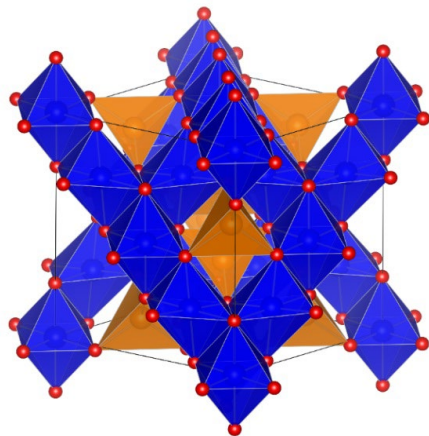
Interested in learning more?

Apply to attend the 5<sup>th</sup> Annual School on US Total Scattering Analysis

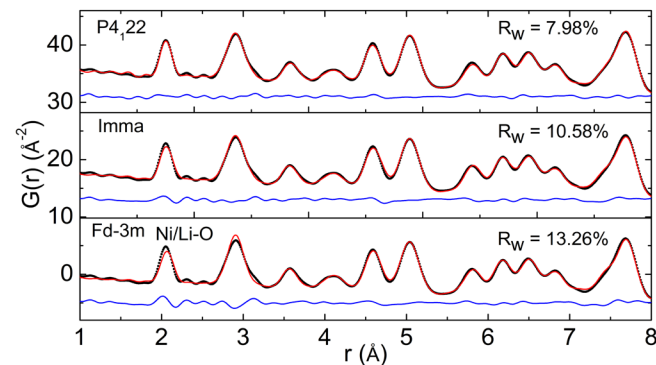
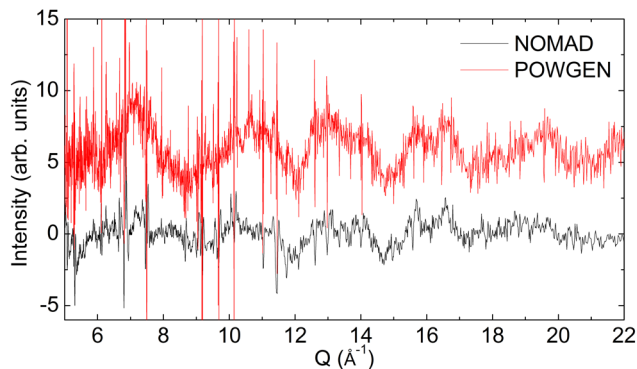
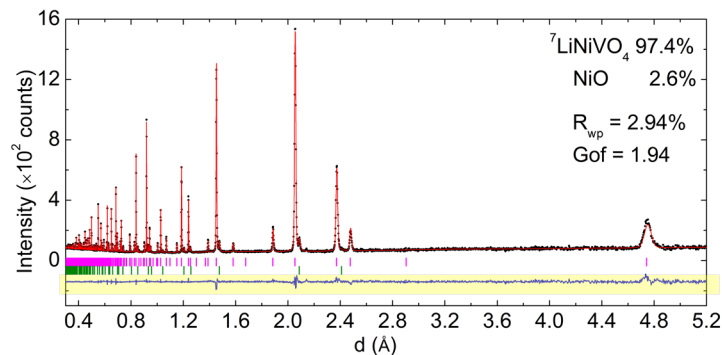
<http://conference.sns.gov/e/VirtualTS-School/>

# B-site cation ordering in inverse spinel oxides: $\text{LiNiVO}_4$

(V)[LiNi]O<sub>4</sub>  
S.G. *Fd-3m*

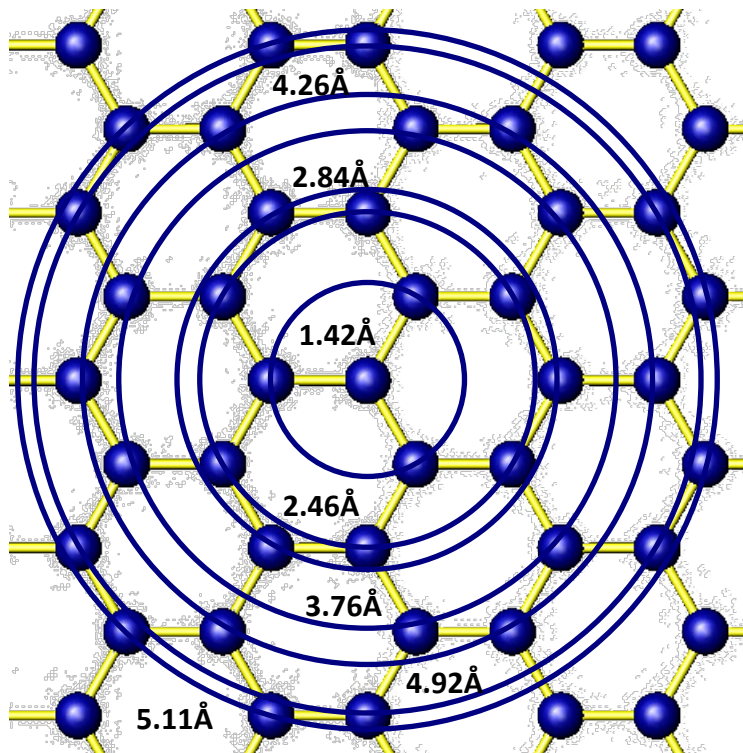


Neutron diffraction data from POWGEN, SNS

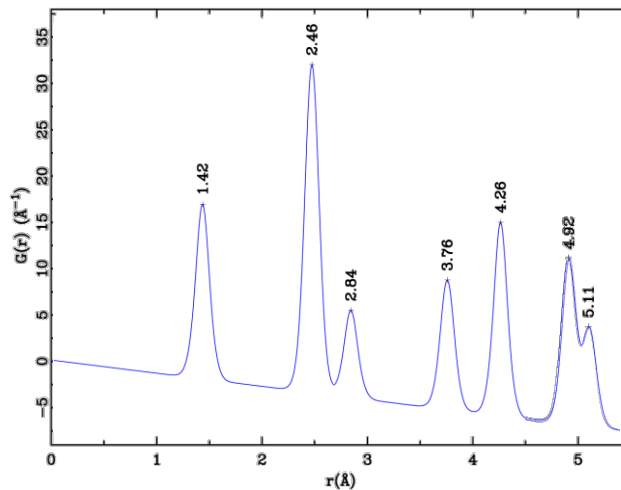




# What is a PDF?



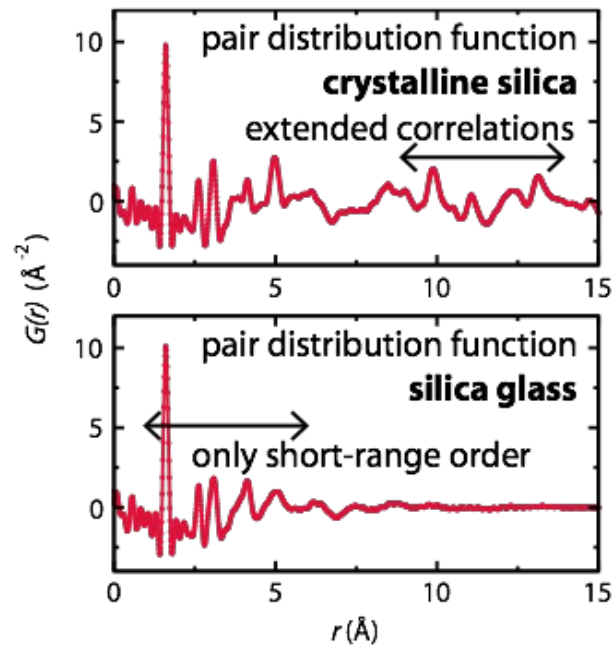
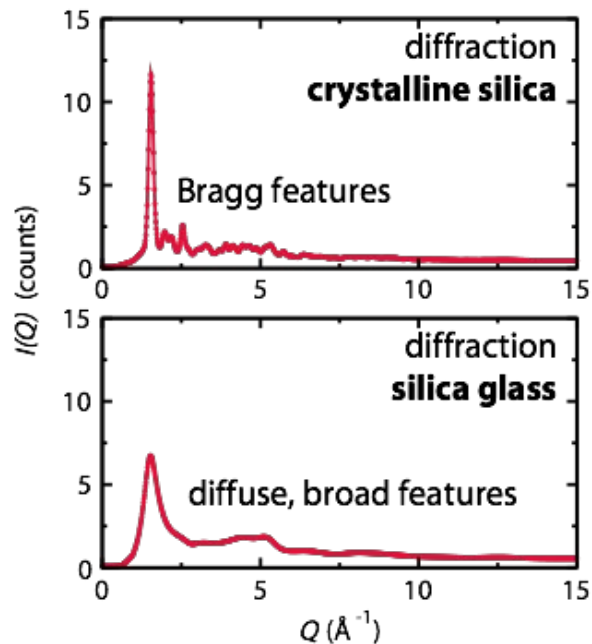
The **Pair Distribution Function (PDF)** gives the probability of finding an atom at a distance “ $r$ ” from a given atom.



# Pair Distribution Function

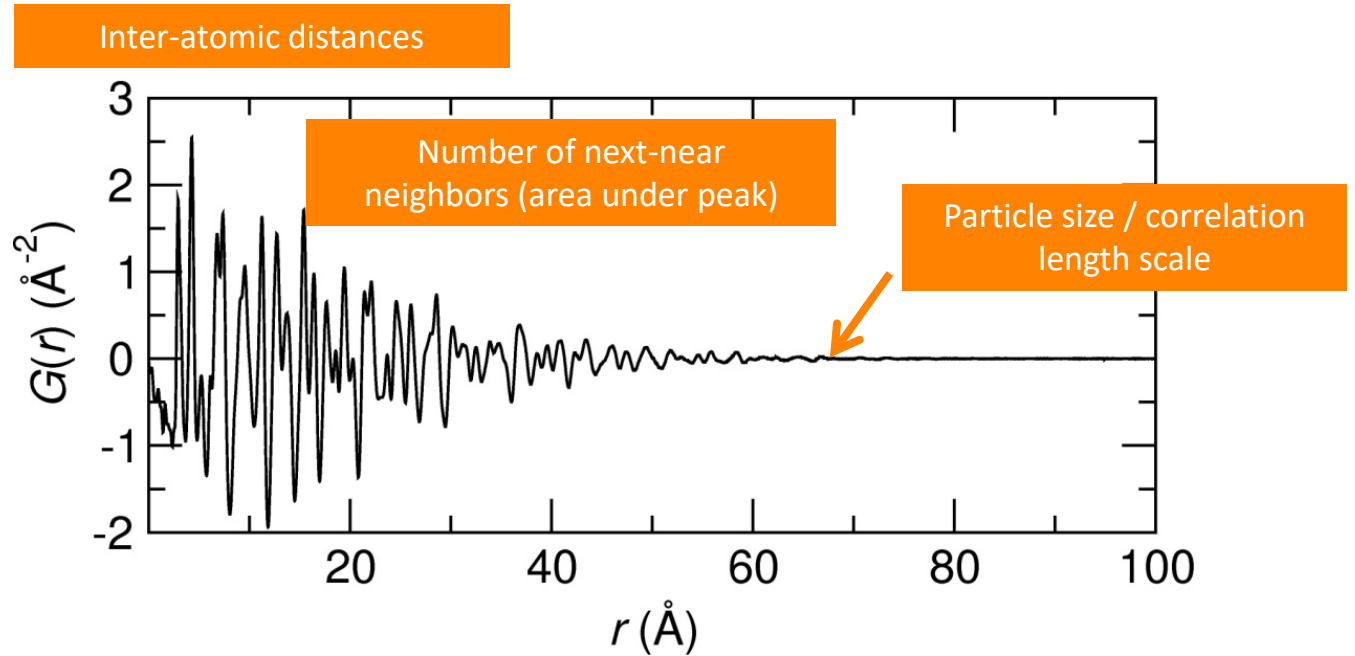
Sine-Fourier transform of **all** scattered neutron/X-ray intensity (crystalline and amorphous)

→ *Experimental, ensemble, real-space, atom-atom histogram*



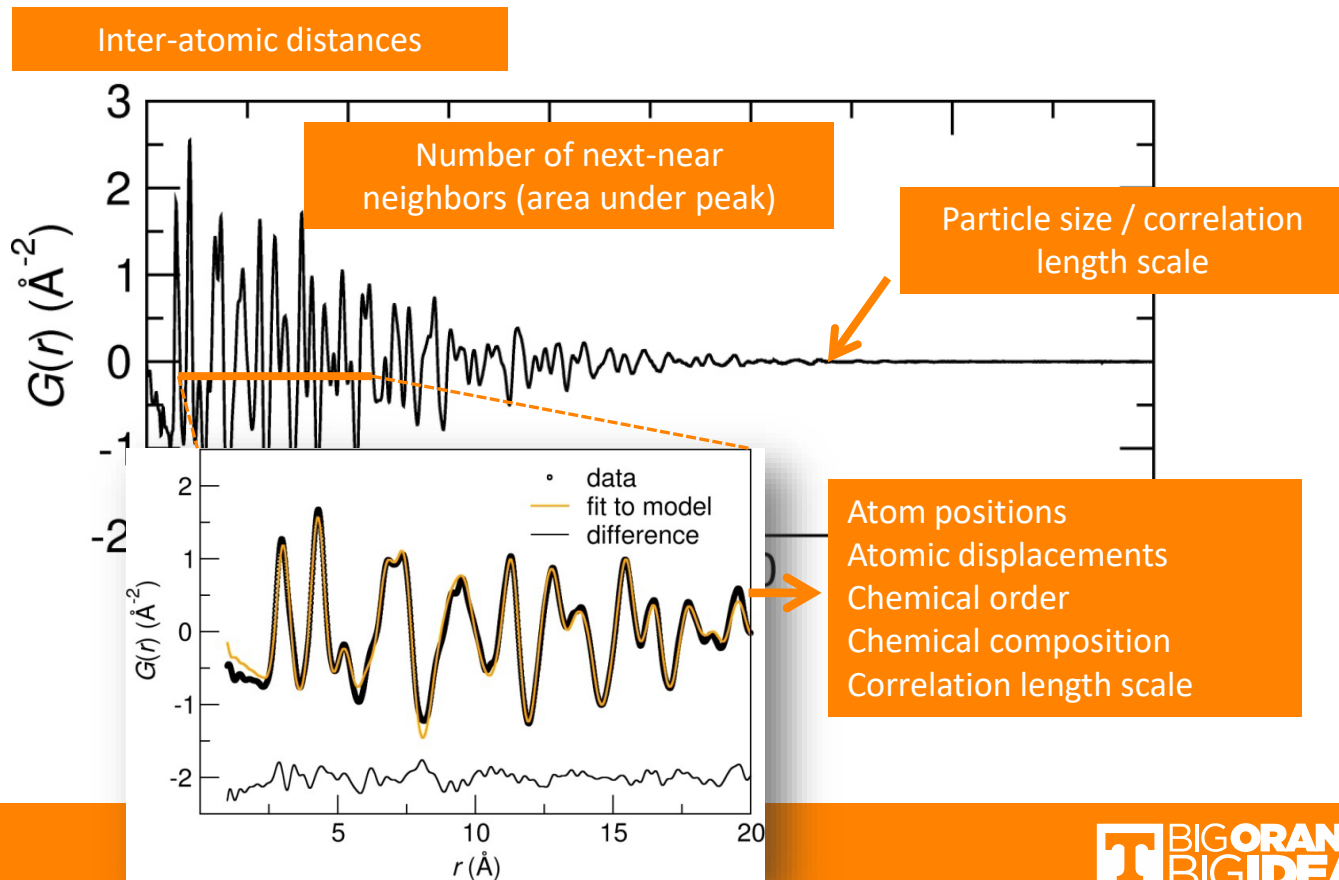
# Pair Distribution Function

**PDF analysis** → Local atomic structure for disordered crystalline materials, nanomaterials, and amorphous materials

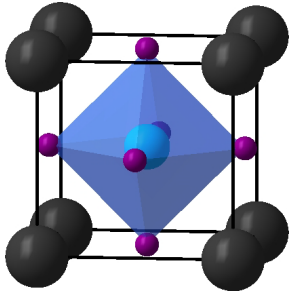


# Pair Distribution Function

**Quantitative analysis:** fitting a model to the data over specific ranges

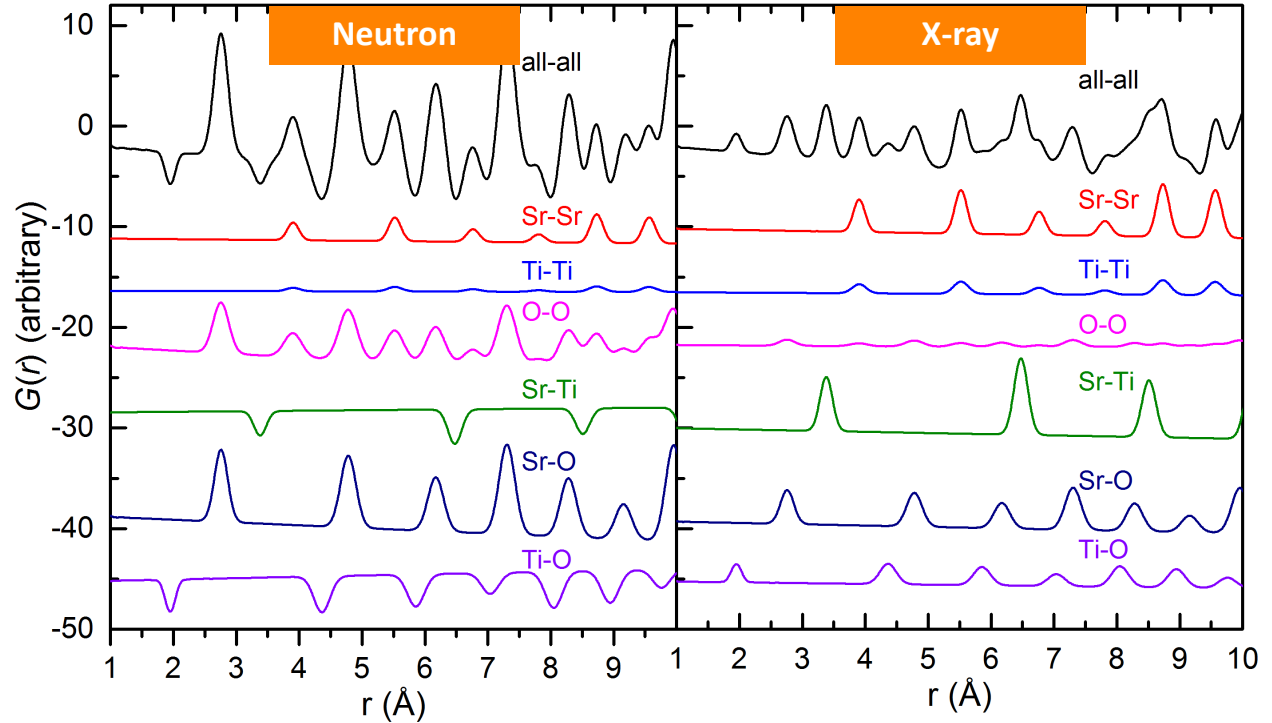


# Partial PDFs



SrTiO<sub>3</sub>

$s(s+1)/2$  partial structure factors characterize a system containing  $s$  species



Neutron and X-ray PDFs are often highly complementary

# WHAT TYPES OF STUDIES CAN BE DONE WITH THE PDF TECHNIQUE?

Local Distortions

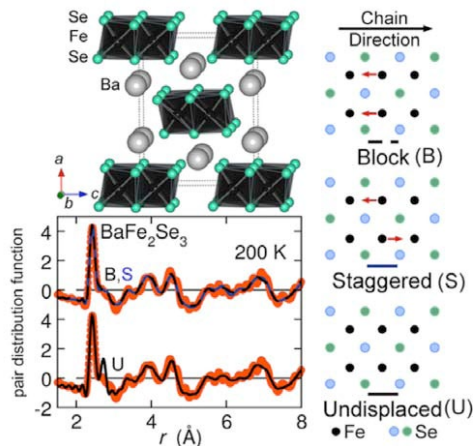
Chemical Short-Range Ordering

Nanostructures

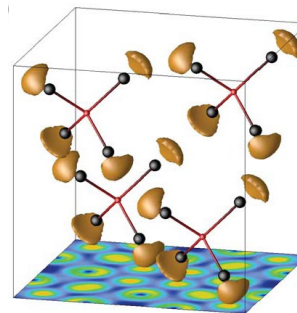
Amorphous Structures

# Local distortions *via* PDF

- Local dipoles
- Local Jahn-Teller distortions
- Frustrated lattices
- Orbital ordering
- etc.*

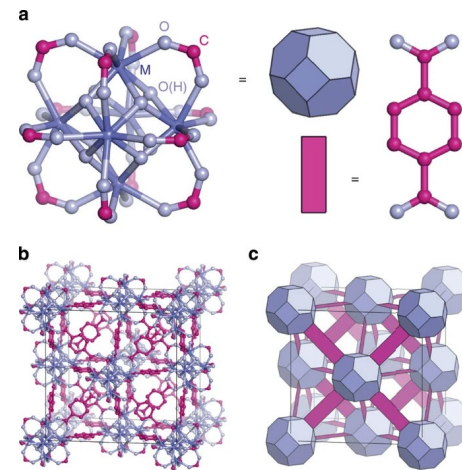


D. Louca, *et al.*,  
Suppression of  
superconductivity in Fe  
pnictides by annealing; a  
reverse effect to pressure,  
*Phys. Rev. B* **84**, 054522  
(2011).



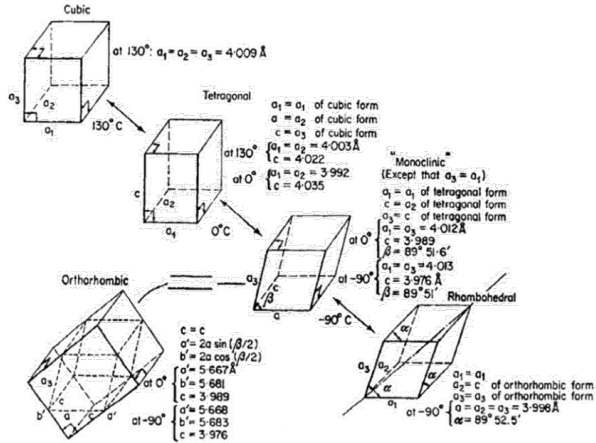
D. P. Shoemaker, *et al.*,  
Reverse Monte Carlo  
neutron scattering study of  
the 'ordered-ice' oxide  
pyrochlore Pb<sub>2</sub>Ru<sub>2</sub>O<sub>6.5</sub>, *J.  
Phys.: Condens. Matter* **23**  
(2011).

M. J. Cliffe, *et al.*,  
Correlated defect  
nanoregions in a metal-  
organic framework,  
*Nature Communications*  
**5**, (2014).



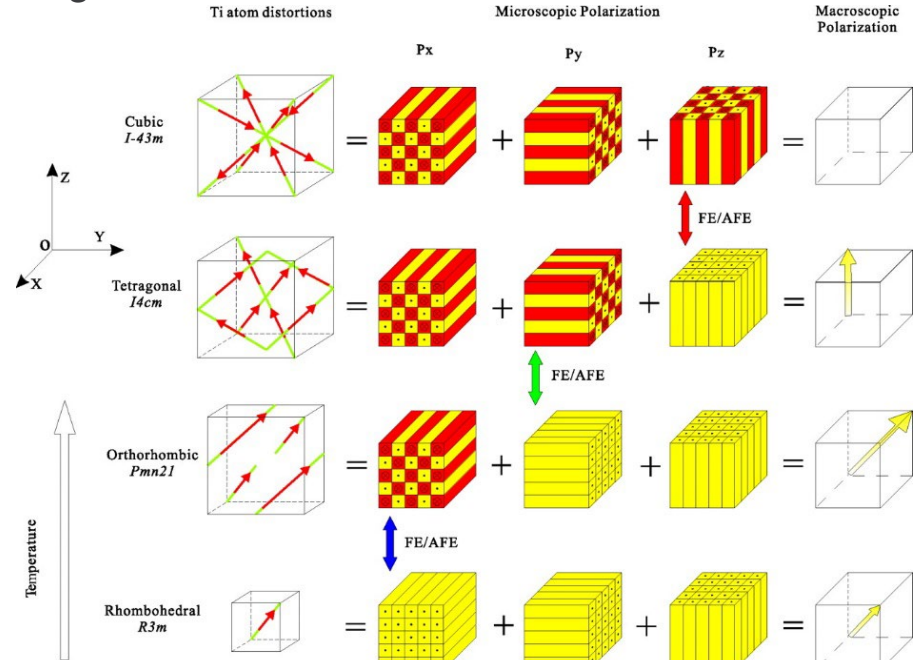
# Example: Local structure in BaTiO<sub>3</sub>

## Crystallographic Phase Transitions



Jaffe, Cook, and Jaffe, *Piezoelectric ceramics*, Academic Press, 1971.

Long-range: cubic  $\rightarrow$  tetragonal  $\rightarrow$  orthorhombic  $\rightarrow$  rhombohedral



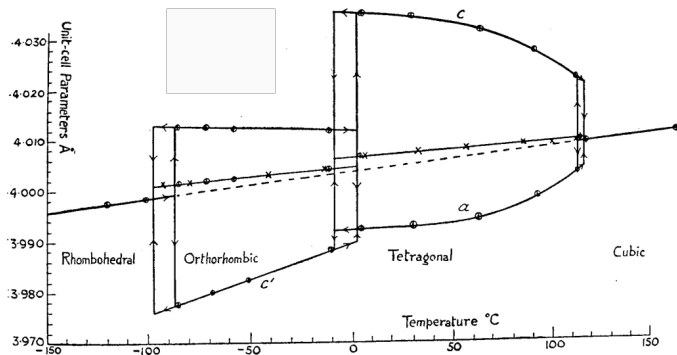
**Locally, Ti<sup>4+</sup> displacements are always along [111] directions (octahedral faces)  $\rightarrow$  Results in 3 short and 3 long Ti-O bonds**

Zhang, Cagin, and Goddard, The ferroelectric and cubic phases in BaTiO<sub>3</sub> ferroelectrics are also antiferroelectric, *PNAS*, **103**, 14695-14700 (2006).

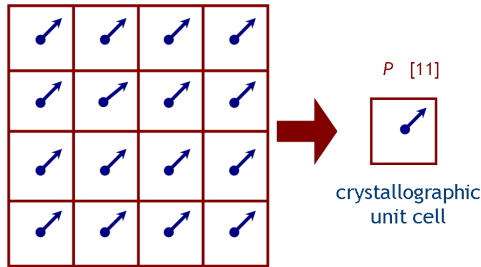


# Example: Local structure in BaTiO<sub>3</sub>

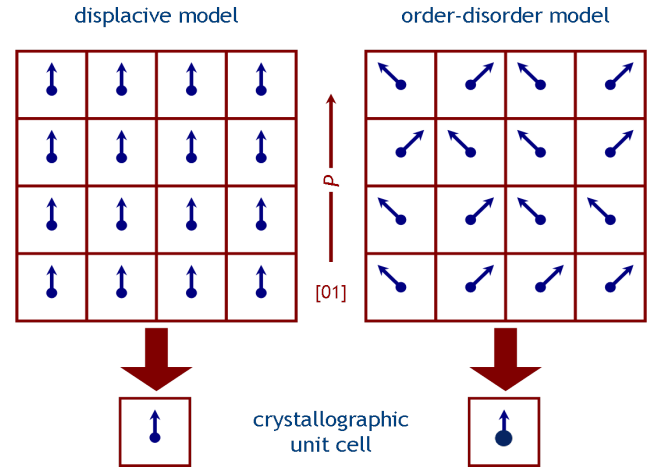
BaTiO<sub>3</sub>: Ferroelectric oxide, a rhombohedral (*R3m*) ground state and a room temperature tetragonal (*P4mm*) structure



A 2D model where local and average motifs are the same



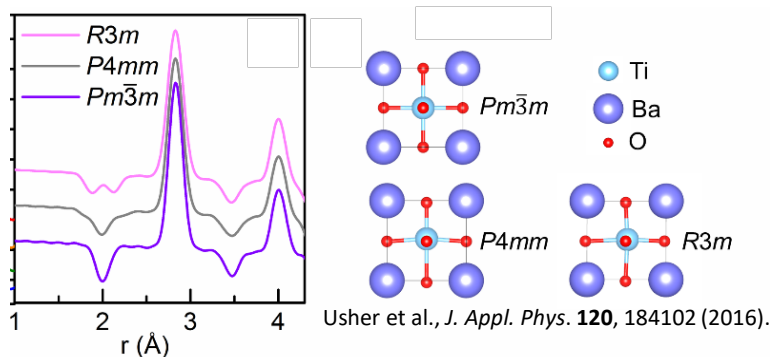
2D models with distinct local motifs but similar "average" motifs



BaTiO<sub>3</sub> displays order-disorder phenomena: room temperature local structure known to have rhombohedral-like pair-pair correlations

# Neutron PDF for BaTiO<sub>3</sub>

## Calculated BaTiO<sub>3</sub> PDFs

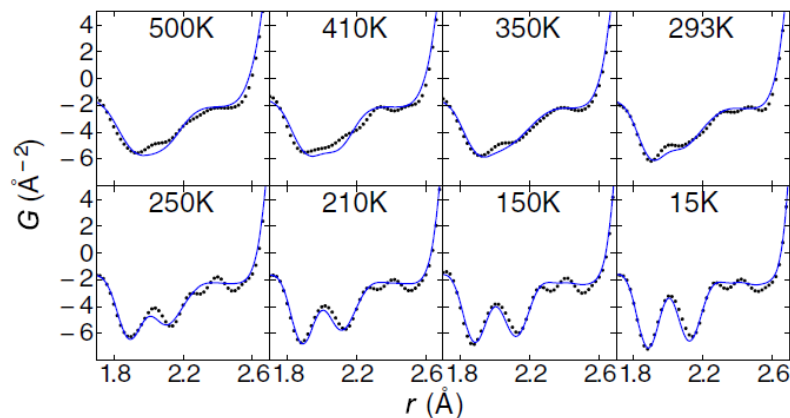


## Experimental BaTiO<sub>3</sub> PDFs

M. S. Senn, D. A. Keen, T. C. A. Lucas, J. A. Hriljac, and A. L. Goodwin, **Emergence of Long-Range Order in BaTiO<sub>3</sub> from Local Symmetry-Breaking Distortions**, *Phys. Rev. Lett.* **116**, 207602 (2016).

K. Page et al., *Chem. Mater.* **22**, 4386–4391 (2010).  
K. Page, et al., *Phys. Rev. Lett.* **101**, 205502 (2008).

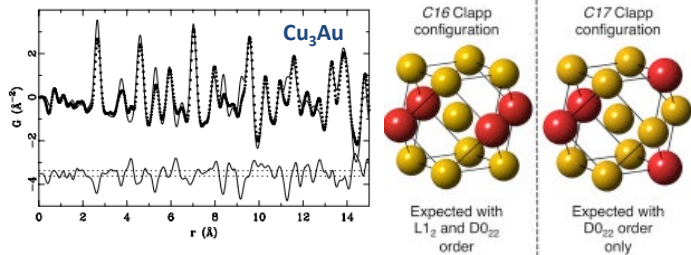
- Neutron PDF is sensitive to Ti-O correlations
- At room temperature, BaTiO<sub>3</sub> locally has a split (*R3m* like) first Ti-O peak, displaying classic order-disorder behavior



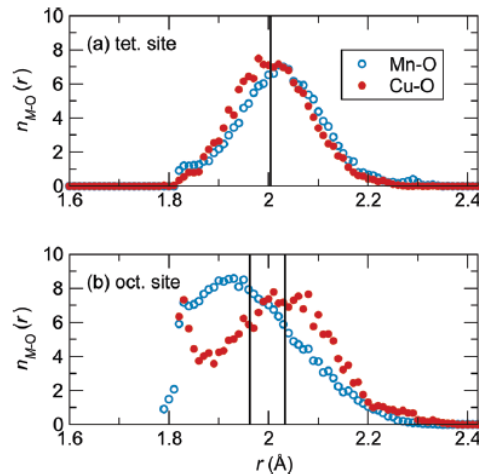
# Chemical Short-Range order *via* PDF

- Substitution effects
- Chemical clustering
- Ion-specific local environments
- Vacancy ordering

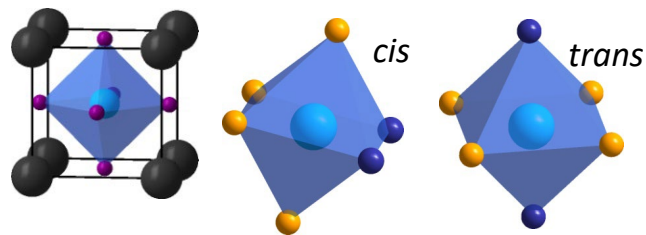
Th. Proffen, V. Petkov, S. J. L. Billinge, and T. Vogt, Chemical short range order obtained from the atomic pair distribution function, *Z. Kristallogr.* **217**, (2002) 47–50.



L.R. Owen, H.Y. Playford, H.J. Stone and M.G. Tucker, Analysis of short-range order in  $\text{Cu}_3\text{Au}$  using X-ray pair distribution functions. *Acta Materialia* (2017) 125, 15-26.



D. P. Shoemaker, J. Li, and R. Seshadri, Unraveling Atomic Positions in an Oxide Spinel with Two Jahn-Teller Ions: Local Structure Investigation of  $\text{CuMn}_2\text{O}_4$ , *J. Am. Chem. Soc.* **131**, 11450 (2009).



K. Page, *et al.*, Local atomic ordering in  $\text{BaTaO}_2\text{N}$  studied by neutron pair distribution function analysis and density functional theory, *Chem. Mater.* **19** (2007) 4037-4042.

# Example: High Voltage Spinel Cathode ${}^7\text{LiNi}_{0.5}\text{Mn}_{1.5}\text{O}_4$

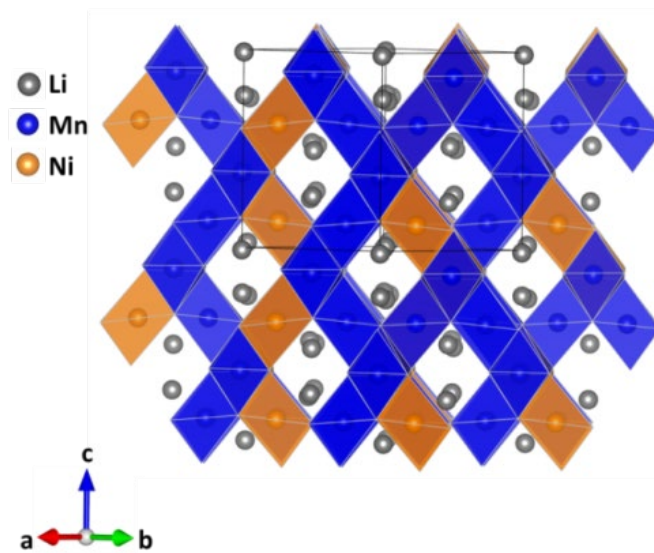
High operating voltage ( $\sim 4.7$  V versus  $\text{Li}^+/\text{Li}$ ) and facile three dimensional lithium ionic conductivity *Zhong et al., 1997; Ohzuku et al., 1999*

Two distinct polymorphs are known: Ni/Mn cation ordering strongly impacts electrochemical performance *Idemoto et al., 2003; Zhong et al., 1997*

- (1) Disordered phase (S.G.  $Fd-3m$ ), where Ni/Mn are randomly distributed at the 16d site via high temperature solid state reaction
- (2) Long-range cation ordered phase (S.G.  $P4_332$  or  $P4_132$ ) via extended post-annealing at  $700^\circ\text{C}$  to  $600^\circ\text{C}$

*Kunduraci & Amatucci, 2006; Kunduraci et al., 2006; Kim et al., 2004; Ma et al., 2010; Moorhead-Rosenberg et al., 2015*

**We studied the nature and length-scale of local cation ordering in this system and related it to electrochemical performance**



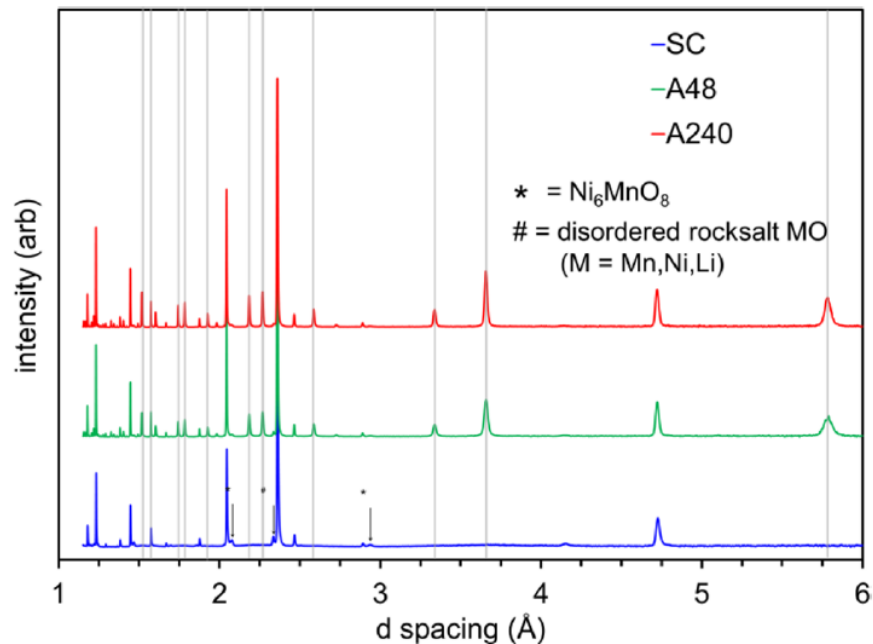
# Example: High Voltage Spinel Cathode ${}^7\text{LiNi}_{0.5}\text{Mn}_{1.5}\text{O}_4$

**Slow Cooled (SC):** 8 hours at 900°C, 1.5°C/min cooling

**Fast Cooled (FC):** 8 hours at 900°C, 5°C/min cooling

**Annealed (A48):** 48 hours at 700°C

**Annealed (A240):** 240 hours at 700°C



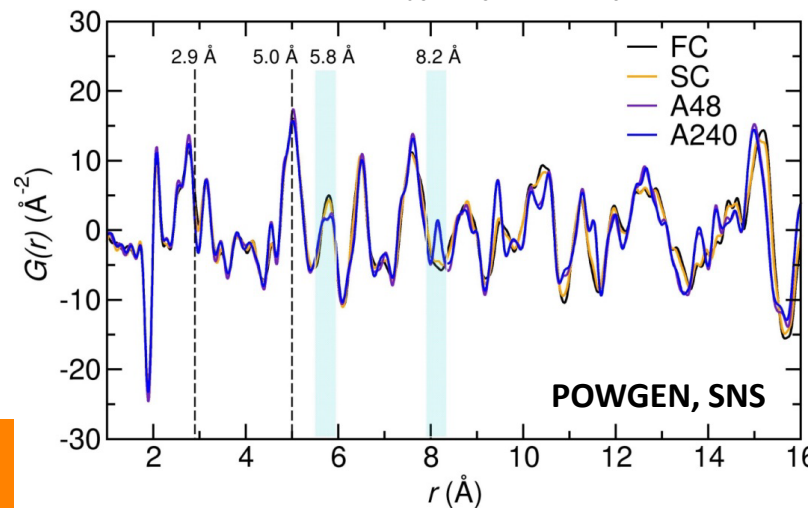
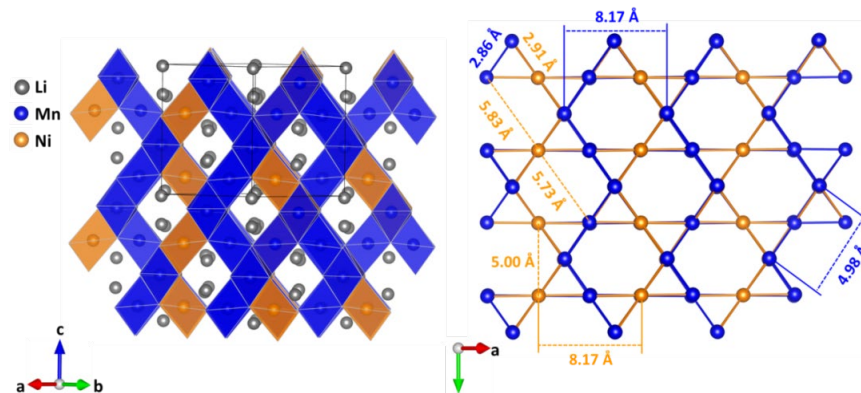
Cation ordering examined at the POWGEN Beamline, SNS: large nuclear scattering length contrast between nickel ( $b = 10.3$  fm) and manganese ( $b = -3.73$  fm)

Z. Moorhead-Rosenberg, A. Huq, J. B. Goodenough, & A. Manthiram, *Chem. Mater.* (2015) **27**, 6934-6945.

# Example: High Voltage Spinel Cathode ${}^7\text{LiNi}_{0.5}\text{Mn}_{1.5}\text{O}_4$

A lot can be observed by looking at the PDFs:

- Local atomic structures almost identical up to 5 Å (two nearest B-site neighbors)
- Sample structures diverge after that
- Annealed samples: two distinguishable sets of Ni/Mn pairs at third nearest Ni/Mn neighbor distance
- By fourth nearest Ni/Mn neighbor the samples are distinct

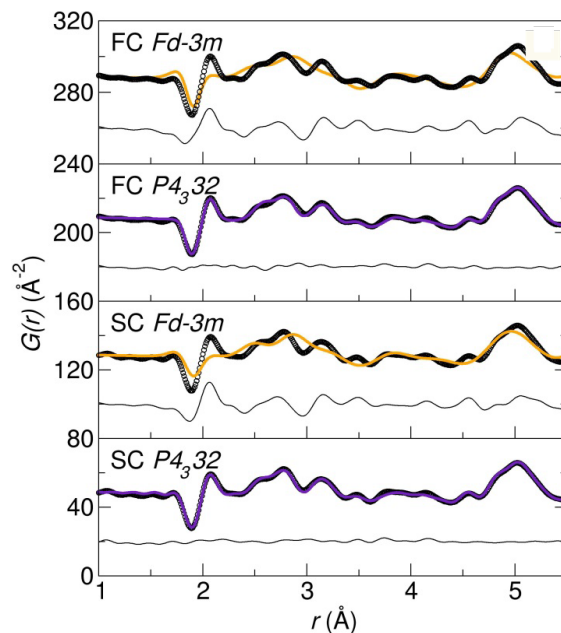


Liu J., Huq A., Moorhead-Rosenberg Z., Manthiram A., Page K., **Nanoscale Ni/Mn Ordering in the High Voltage Spinel Cathode  $\text{LiNi}_{0.5}\text{Mn}_{1.5}\text{O}_4$** , *Chemistry of Materials*, 28, (2016) 6817–6821.

# Example: High Voltage Spinel Cathode ${}^7\text{LiNi}_{0.5}\text{Mn}_{1.5}\text{O}_4$

Additional information from modeling the local structure

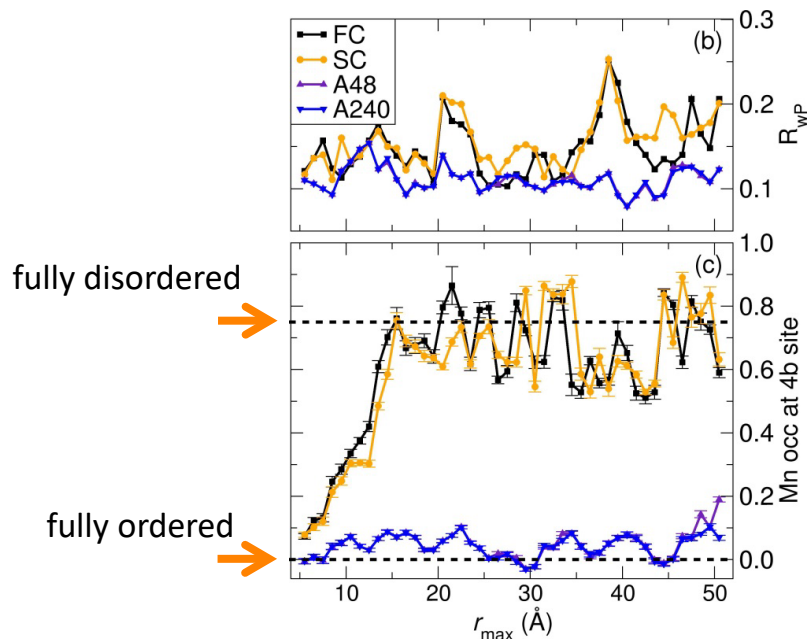
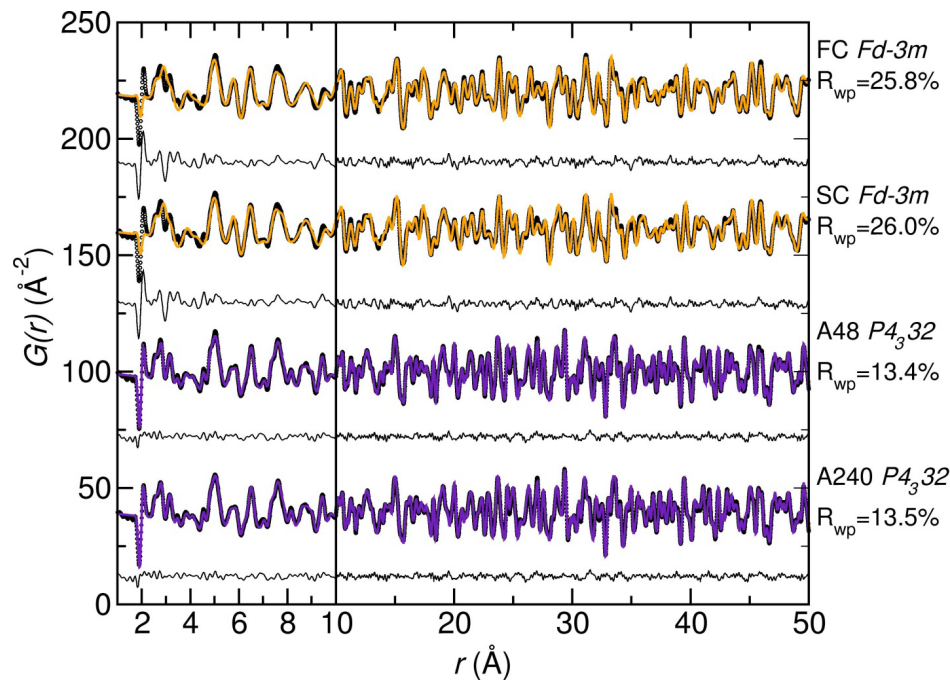
- Over 1 to 5 Å range the ordered Mn/Ni models ( $P4_332$ ) provide much better fits for local PDF profiles in all samples
- **Ni/Mn are locally well-ordered in the long-range “disordered” samples**
- **Up to what length scale?**



J. Liu, A. Huq, Z. Moorhead-Rosenberg, A. Manthiram, and K. Page, **Nanoscale Ni/Mn ordering in the high voltage spinel cathode  $\text{LiNi}_{0.5}\text{Mn}_{1.5}\text{O}_4$** , *Chemistry of Materials*, 28, 19, 6817–6821, 2016.

# Example: High Voltage Spinel Cathode ${}^7\text{LiNi}_{0.5}\text{Mn}_{1.5}\text{O}_4$

15 Å correlation length scale for SRO

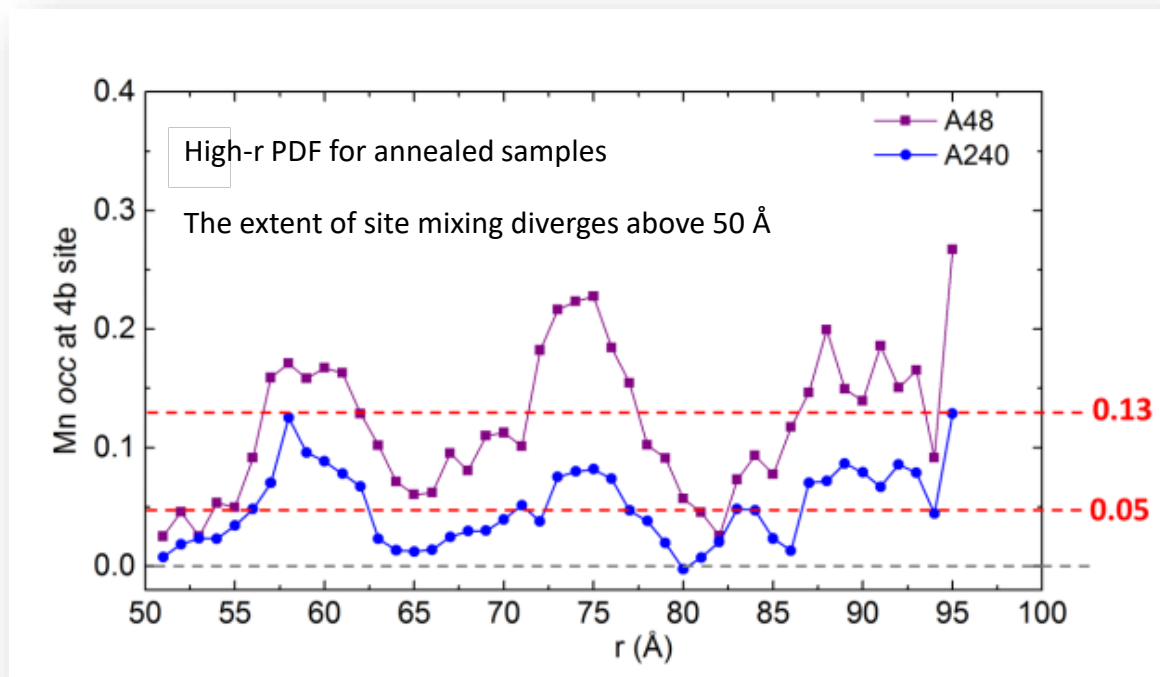


- 5% site mixing in the A48 and A240 patterns throughout the entire range
- FC and SC samples are nearly fully disordered at pair distances beyond 15.5 Å



# Example: High Voltage Spinel Cathode ${}^7\text{LiNi}_{0.5}\text{Mn}_{1.5}\text{O}_4$

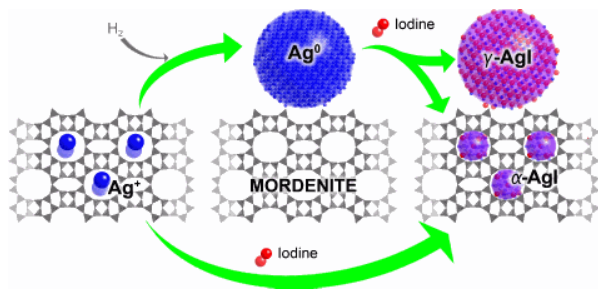
Fit the PDFs within a 4.5 Å “box” in 1 Å steps (a “box-car” refinement)



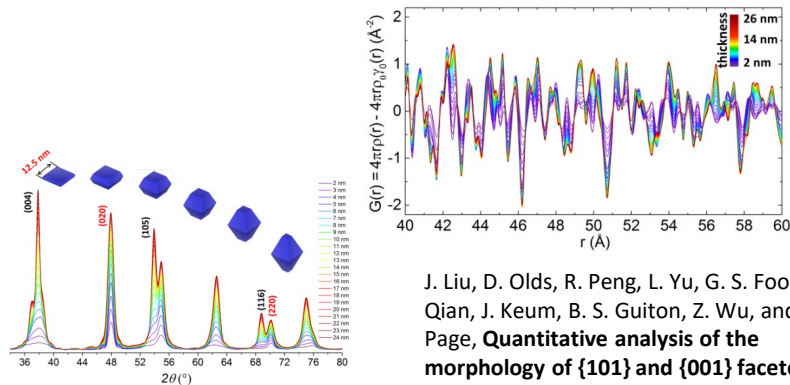
*Spinel cathode materials are distinguished by their unique correlation length scales for chemical short range ordering*

# Nanomaterial structure *via* PDF

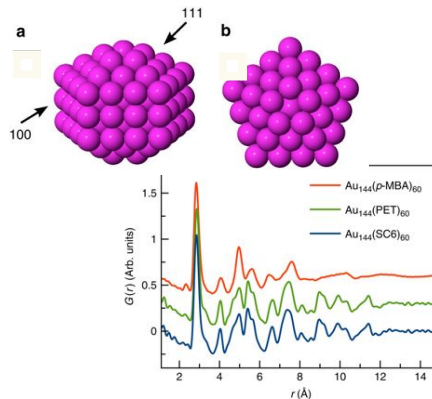
- Finite size/shape effects
- Surface/Interface structure
- Nanostructure polymorphs
- Growth and transformation



K. W. Chapman, P. J. Chupas, and T. M. Nenoff, **Radioactive Iodine Capture in Silver-Containing Mordenites through Nanoscale Silver Iodide Formation**, *J. Am. Chem. Soc.* 132, 8897 (2010).



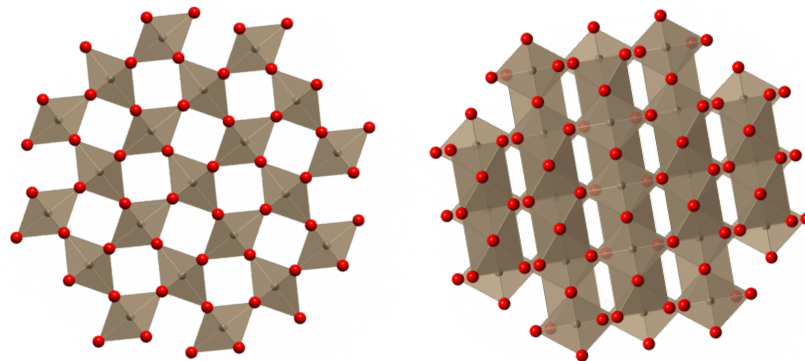
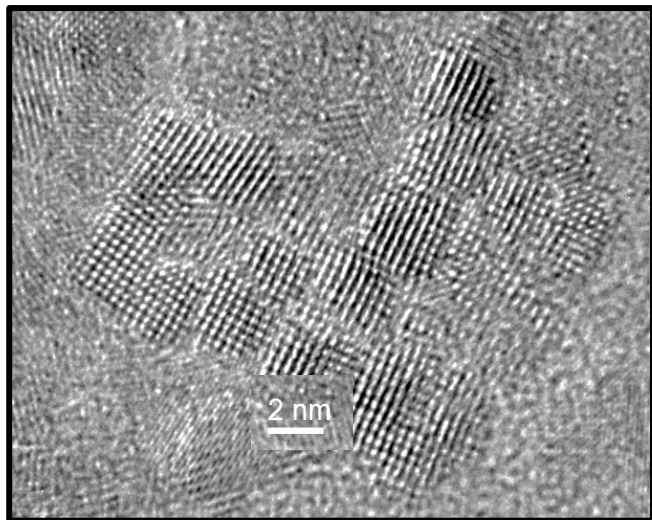
J. Liu, D. Olds, R. Peng, L. Yu, G. S. Foo, S. Qian, J. Keum, B. S. Gupton, Z. Wu, and K. Page, **Quantitative analysis of the morphology of {101} and {001} faceted anatase TiO<sub>2</sub> nanocrystals**, *Chem. Mater.* 29, 5591–5604 (2017).



K. M. O. Jensen, P. Juhas, M. A. Tofanelli, C. L. Heinecke, G. Vaughan, and C. J. Ackerson, **Polymorphism in magic-sized Au<sub>144</sub>(SR)<sub>60</sub> clusters**, *Nature Communications* 7, 11859 (2016).

# Example: SnO<sub>2</sub> Nanocrystals

~2 nm SnO<sub>2</sub> (cassiterite) nanocrystals capped with H<sub>2</sub>O/OH or D<sub>2</sub>O/OD groups



H.-W. Wang, D. J. Wesolowski, T. Proffen, L. Vlcek, W. Wang, L. F. Allard, A. I. Kolesnikov, M. Feygenson, L. M. Anovitz, and R. L. Paul, **Structure and stability of SnO<sub>2</sub> nanocrystals and surface-bound water species**, *J. Am. Chem. Soc.*, 135, 6885-6895, 2013.

TGA suggests 2 steps dehydration.

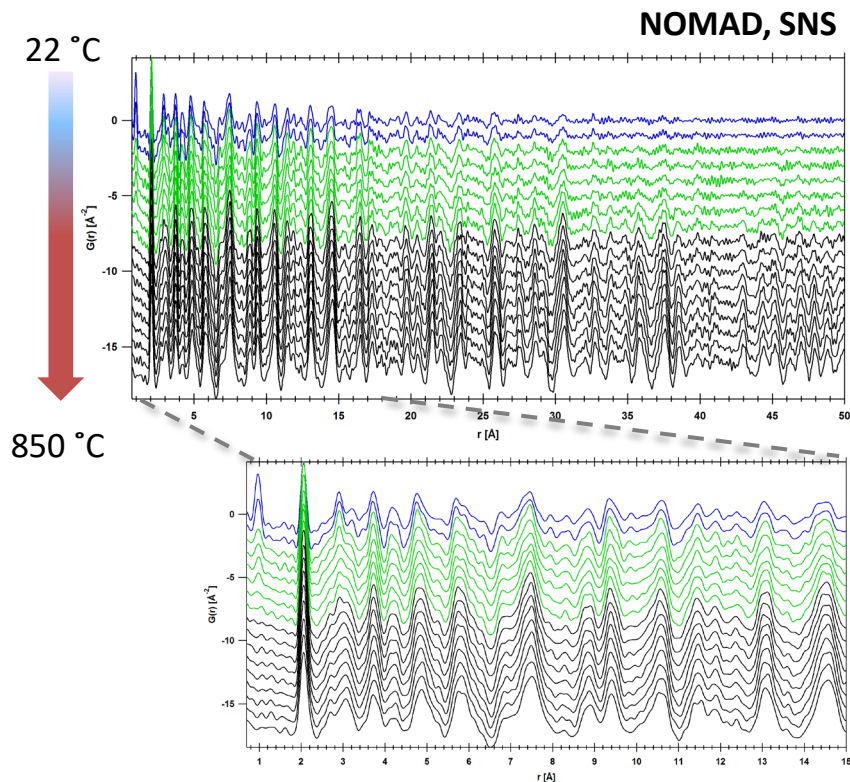
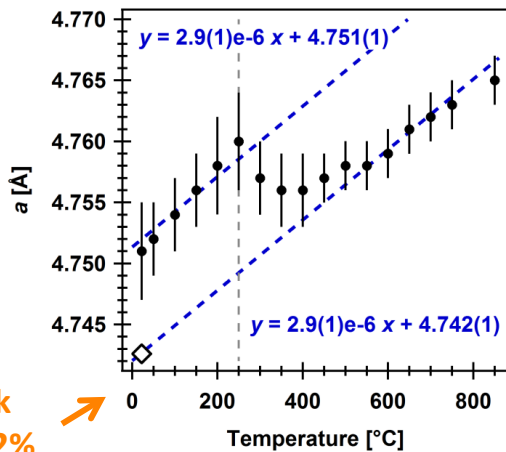
How many layers of water are at the surface?

How is water bonded to surfaces?

What are the dynamics of dehydration?

# Example: SnO<sub>2</sub> Nanocrystals

- 22 to 50 °C: L<sub>1</sub>+L<sub>2</sub>+L<sub>3</sub>,
- 50 to 350 °C: L<sub>1</sub>+L<sub>2</sub>
- 400 to 850 °C: SnO<sub>2</sub> grain growth

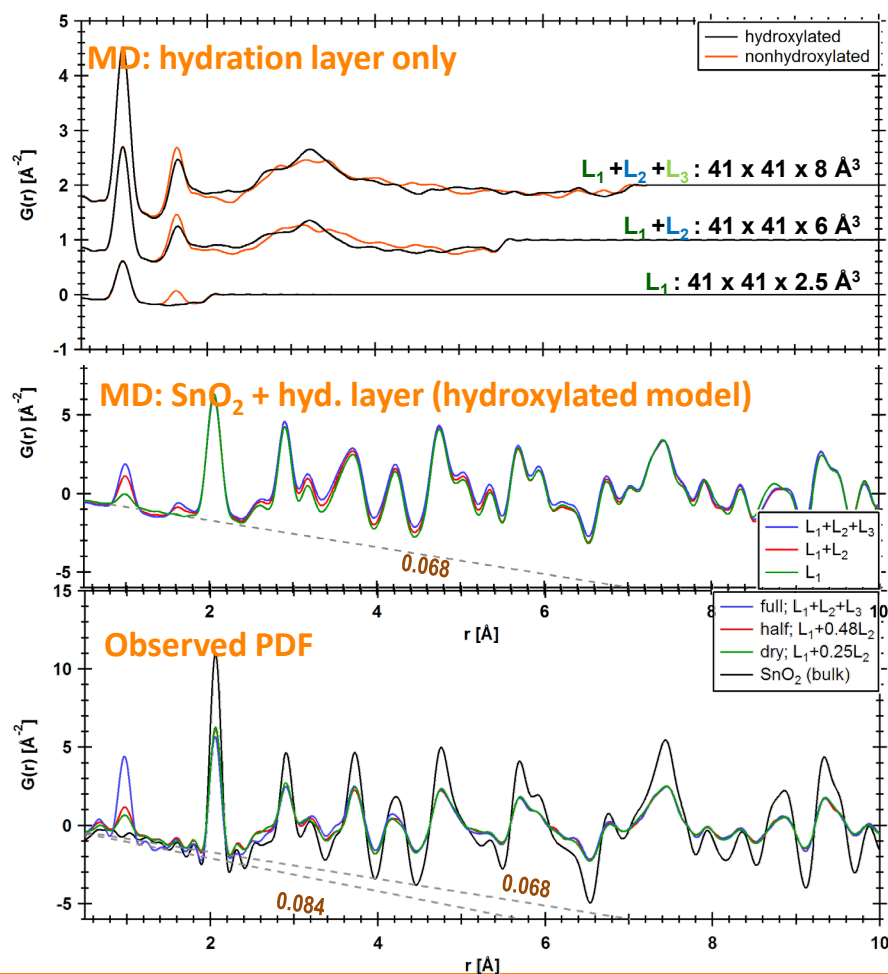
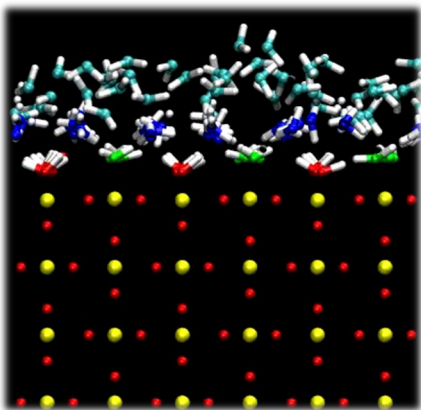


*In situ* dehydration answers these questions and indicates that water plays a key role in stabilizing the nanocrystals.

# MD and PDF

Data is compared to Molecular Dynamics Simulation PDFs for nonhydroxylated and hydroxylated models:

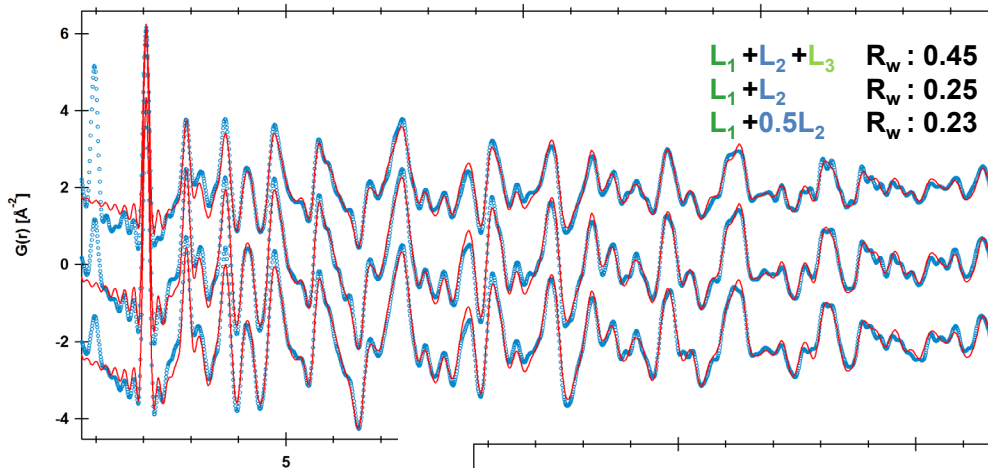
Box size:  $41 \times 41 \times 23 \text{ \AA}^3$ ; 2592 atoms; # density =  $0.068 \text{ \AA}^{-3}$ ;  $U_{\text{iso}} = 0.003 \text{ \AA}^2$



# Example: SnO<sub>2</sub> Nanocrystals

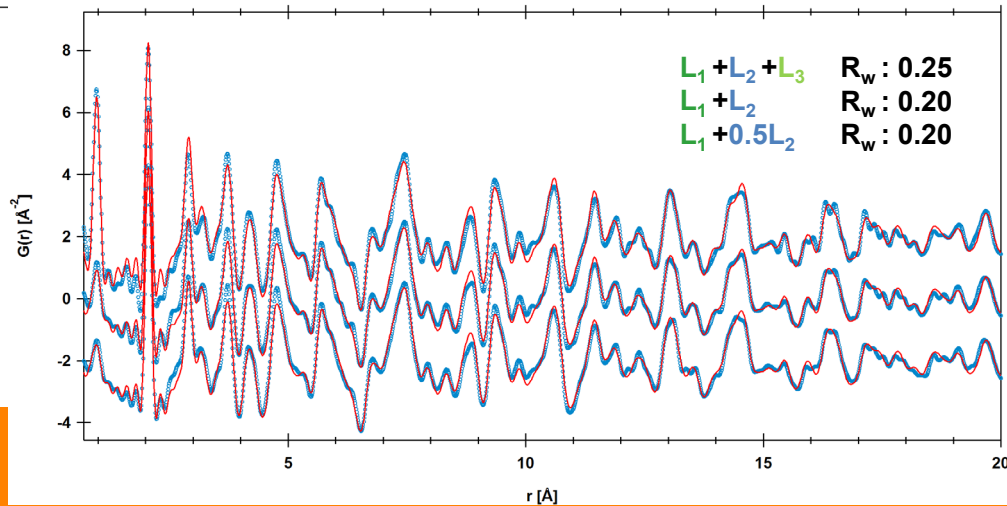
## Single phase model:

SnO<sub>2</sub> bulk structure,  
refined particle  
size = ~47 Å

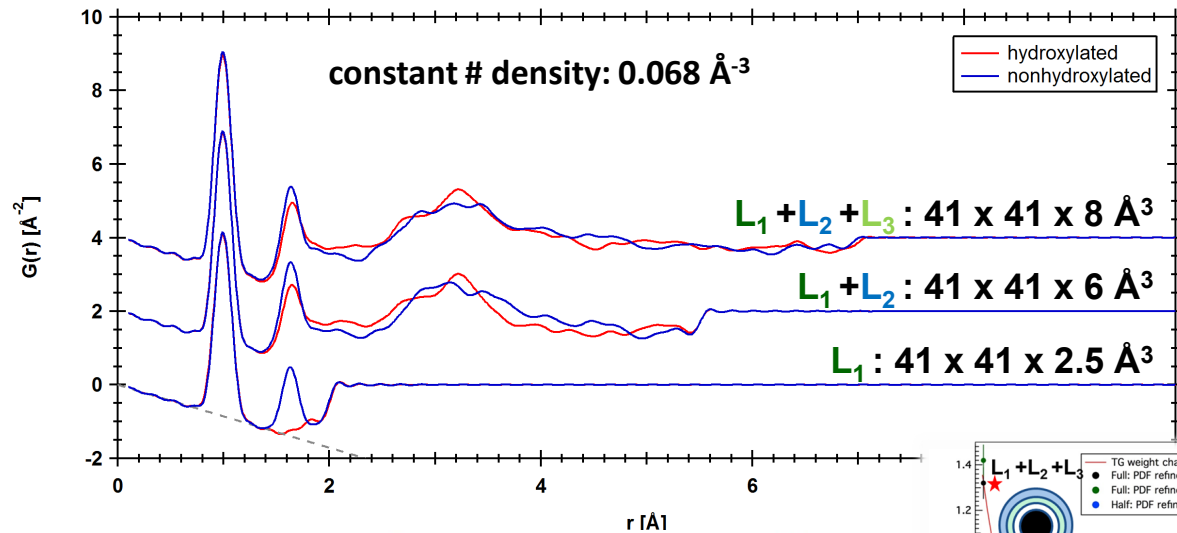


## Two phase model:

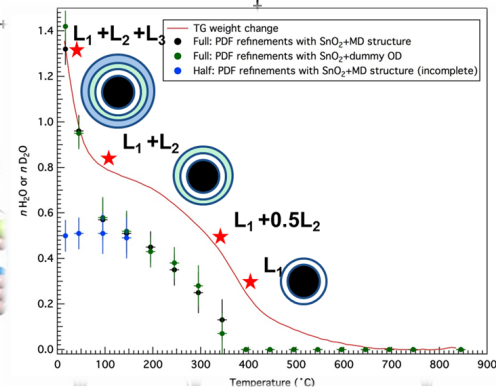
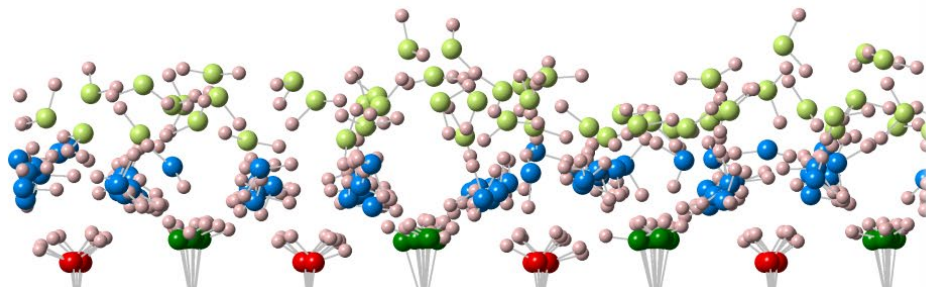
SnO<sub>2</sub> bulk + layered  
MD water structure



# Example: SnO<sub>2</sub> Nanocrystals

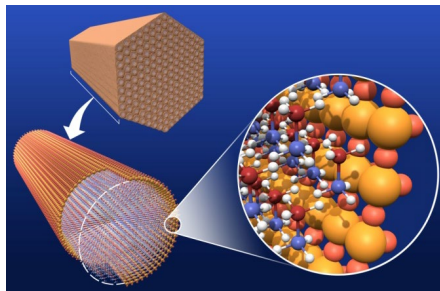


H.-W. Wang, D. J. Wesolowski, T. Proffen, L. Vlcek, W. Wang, L. F. Allard, A. I. Kolesnikov, M. Feygenson, L. M. Anovitz, and R. L. Paul, **Structure and stability of SnO<sub>2</sub> nanocrystals and surface-bound water species**, *J. Am. Chem. Soc.*, 135, 6885-6895, 2013.



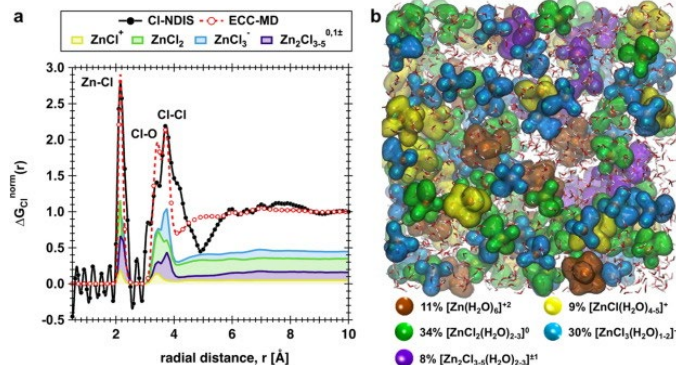
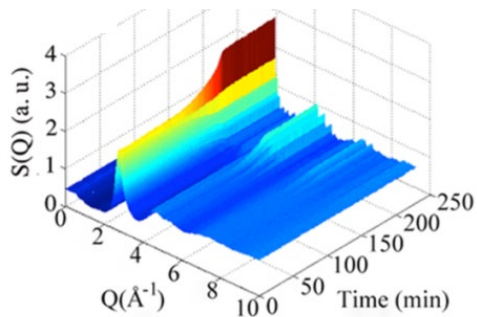
# Amorphous structures *via* PDF

- Glasses
- Liquids
- Concretes
- Adsorbed/absorbed gasses
- *etc.*



H. Kim, T. Proffen, P. J. Chupas, A. Karkamkar, N. J. Hess, and T. Autrey, **Determination of structure and phase transition of light element nanocomposites in mesoporous silica: case study of  $\text{NH}_3\text{BH}_3$  in MCM-41**, *J. Am. Chem. Soc.* 131, 13749-13755 (2009).

S. Lan, X. Wei, J. Zhou, Z. Lu, X. Wu, M. Feyngenson, J. Neuefeind, X. Wang, **In situ study of crystallization kinetics in ternary bulk metallic glass alloys with different glass forming abilities**, *Applied Physics Letters*, 105, 201906 (2014).



N. Rampal, H.-W. Wang; D. Biriukov, A. B. Brady, J. C Neuefeind, M. Predota, A. J. Stack, **Local molecular environment drives speciation and reactivity of ion complexes in concentrated salt solution**, *J. Molec. Liq.*, 340, 116898 (2021).



# Example: solvation structure of 18 m NaOD/H aqueous solution

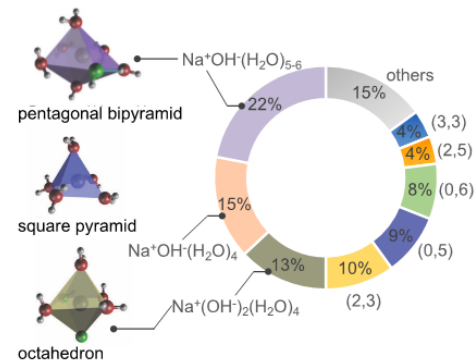
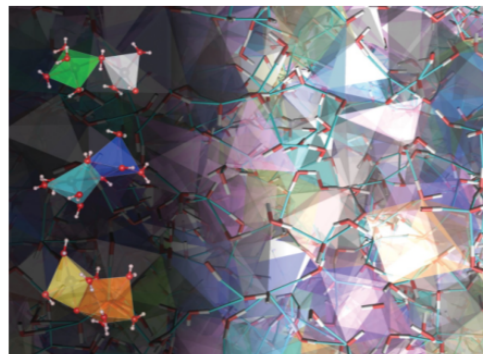
Measured X-ray and neutron RDF patterns compared to RDFs predicted by MD simulation of high-dimensional neural network potentials accentuate complementary features:

Contributions of **ion-ion** (red lines), **ion-water** (black and green lines), and **water-water** (blue lines) interactions can be deconvoluted

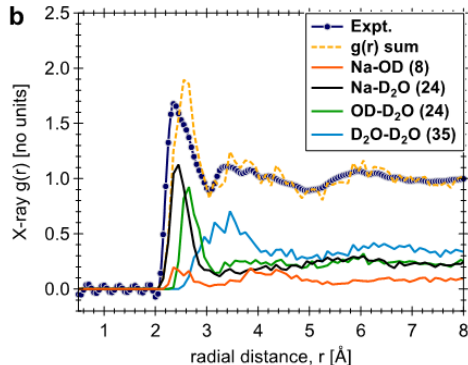
M. Hellströma and J. Behler, **Structure of aqueous NaOH solutions: insights from neural-network-based molecular dynamics simulations**, *Phys. Chem. Chem Phys.* 17 (2017) 82-96.

D. Semrouni, H.-W. Wang, S. B. Clark, C. I. Pearce, K. Page, G. Schenter, D. J. Wesolowski, A. G. Stack, and A. E. Clark, **Resolving local configurational contributions to X-ray and neutron radial distribution functions within solutions of concentrated electrolytes – a case study of concentrated NaOH**, *Phys. Chem. Chem. C* 13 (2019) 6828-6838.

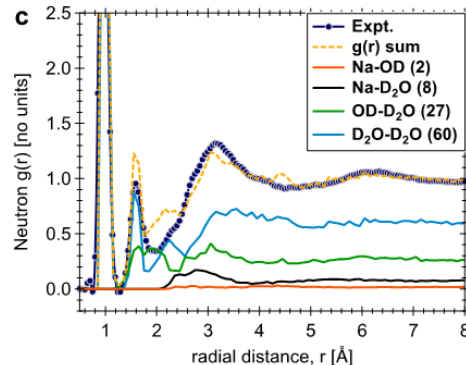
a



b

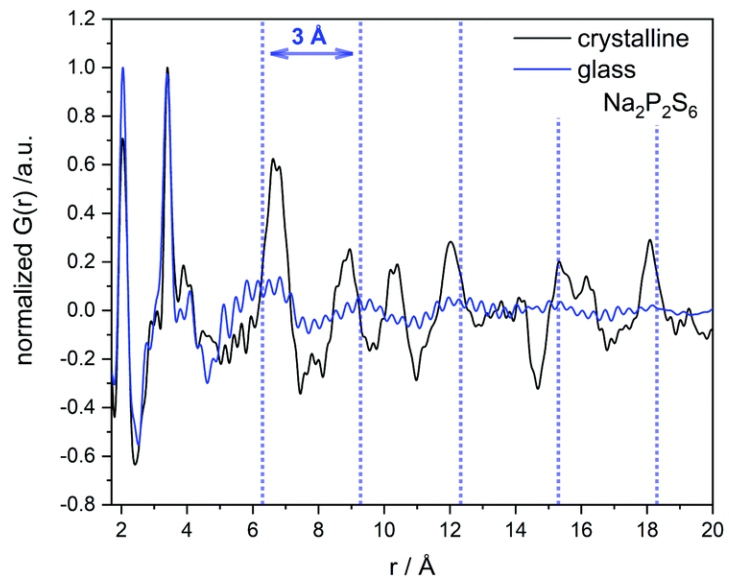


c

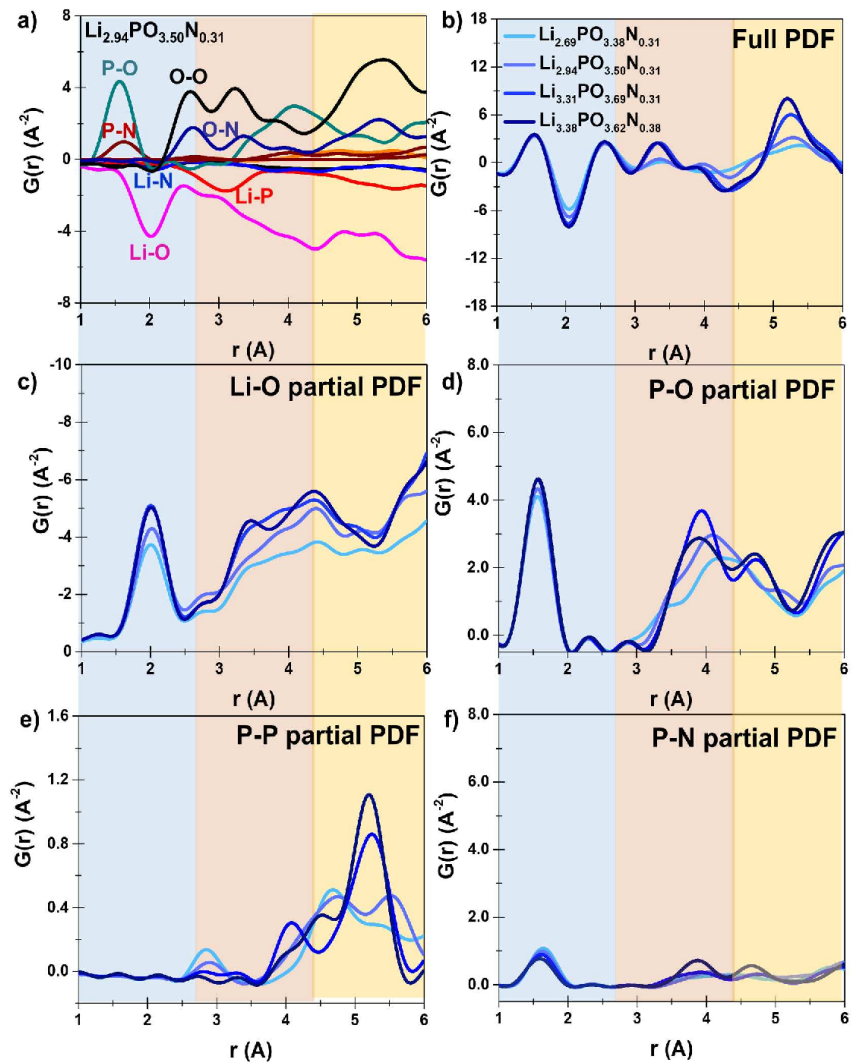


# Example: amorphous ionic conductors

High degree of Na disorder in amorphous  $\text{Na}_2\text{P}_2\text{S}_6$  is responsible for high ionic conductivity



C. Fritsch, A.-L. Hansen, S. Indris, M. Knapp, and H. Ehrenberg, **Mechanochemical synthesis of amorphous and crystalline  $\text{Na}_2\text{P}_2\text{S}_6$  – elucidation of local structural changes by X-ray total scattering and NMR**, *Dalton Trans.*, 49 (2020) 1668-1673.



# Questions?



U.S. DEPARTMENT OF  
**ENERGY**

Office of  
Science



# Outline

## Part 1:

- The Pair Distribution Function (PDF)
- Applications
  - Local Distortions
  - Chemical Short-Range Order
  - Nanomaterial Structure
  - Amorphous Structure

## Part 2:

- Experimental Considerations
- Modeling a PDF
- Extension Areas
- Summary

# A FEW EXPERIMENTAL CONSIDERATIONS

Measurements and corrections

Resolution and range effects

Instruments

# Total Scattering Structure Function

Structure function, determined from the scattering intensity/differential cross section:

coherent scattering  
intensity (corrected)

scattering length (neutrons) or atomic  
form factor (x-rays)

$$S(Q) = \frac{I_{coh}(Q) - \sum c_i |b_i|^2}{\left| \sum c_i b_i \right|^2} + 1 \quad Q = \frac{4\pi \sin \theta}{\lambda}$$

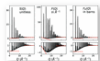
*Corrected for:* Container & background scattering, self-absorption, etc.

*Normalized by:* Incident flux, number of atoms, square of the scattering length/form factor

For unambiguous derivation of this derivation and relationship to other forms:

TEACHING AND EDUCATION

*J. Appl. Cryst.* (2021), 54, 317–332  
<https://doi.org/10.1107/S1600576720015630>  
Cited by 1



Illustrated formalisms for total scattering data: a guide for new practitioners

P. F. Peterson<sup>1</sup>, D. Olds, M. T. McDonnell<sup>2</sup> and K. Page<sup>3</sup>

The total scattering method is the simultaneous study of both the real- and reciprocal-space representations of Rietveld refinement provides insight into the average structure of the material, pair distribution function (PDF). Generically speaking, a PDF is generated by Fourier transforming the total measured reciprocal-space diffraction transformation employed and, by consequence, the resultant appearance and weighting of the real-space representation continues to grow, these subtle differences in nomenclature and data representation have led to the derivation of many of these different forms of the PDF and the transformations required to bridge between the appropriate choice of PDF in their own research are presented. This contribution aims to benefit people starting

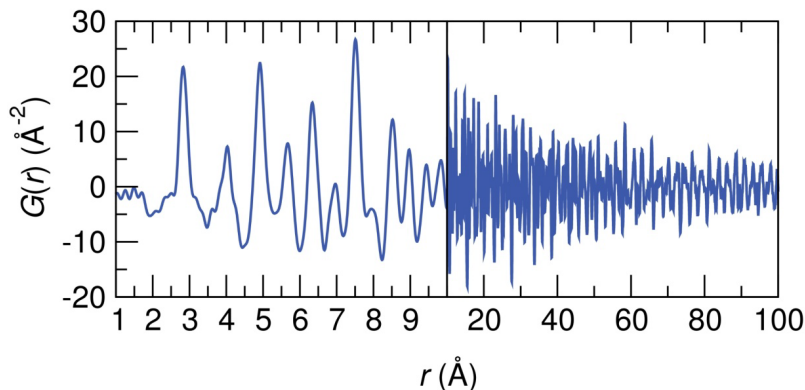
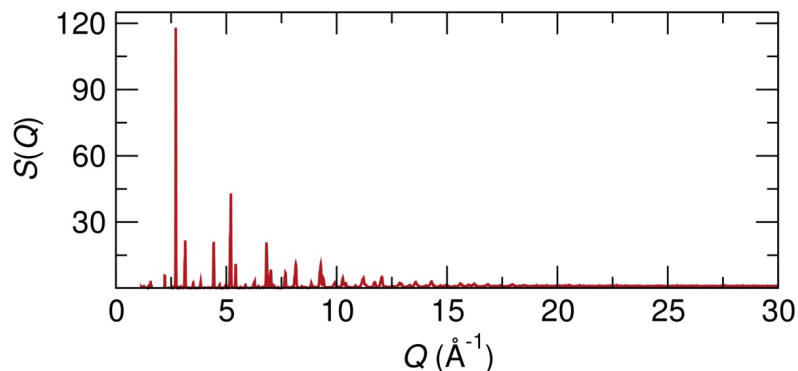
Keywords: total scattering; pair distribution function.

[Read article](#) [Similar articles](#)

C. Farrow and S. J. L. Billinge, *Acta Cryst.* (2009) A65, 232–239.  
D. A. Keen, *J. Appl. Cryst.* 34 (2001) 172–177.

# The Experimental PDF

The Sine Fourier transform of the total (Bragg and diffuse) scattering



The total scattering structure factor:  $S(Q)$

$$S(Q) = \frac{I_{coh}(Q) - \sum c_i |b_i|^2}{|\sum c_i b_i|^2} + 1$$



Sine Fourier transform

The Pair Distribution Function (PDF):  $G(r)$

$$G(r) = \frac{2}{\pi} \int_{Q_{min}}^{Q_{max}} Q[S(Q) - 1] \sin(Qr) dQ$$

# Obtaining High Quality PDFs

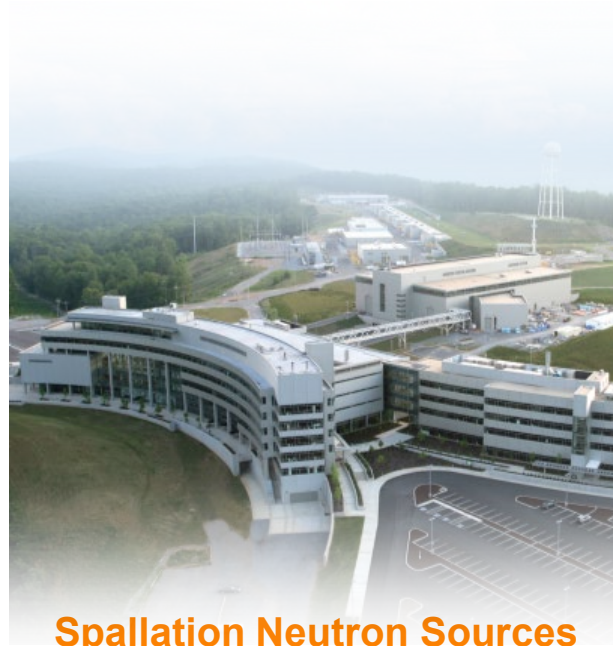
- (1) High maximum momentum transfer ( $Q_{\max}$ )
- (2) Good Q-resolution,  $dQ$
- (3) Good counting statistics
- (4) Low (and stable) instrument background

An ideal measurement would have no contribution from the instrument resolution

For PDF: a wide  $Q$  range and high flux is balanced with resolution

**Synchrotron sources**  
(high energy X-rays)

or



**Spallation Neutron Sources**  
(reactor neutron energies are too low)

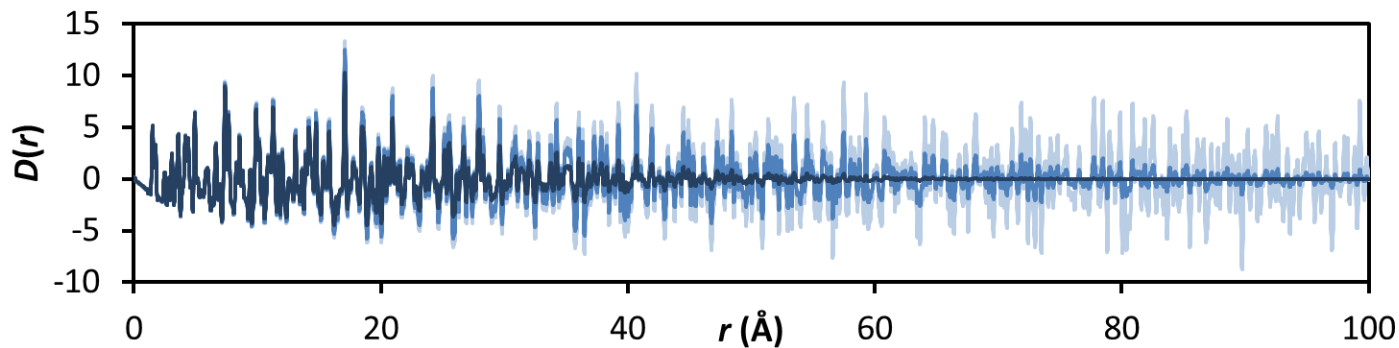
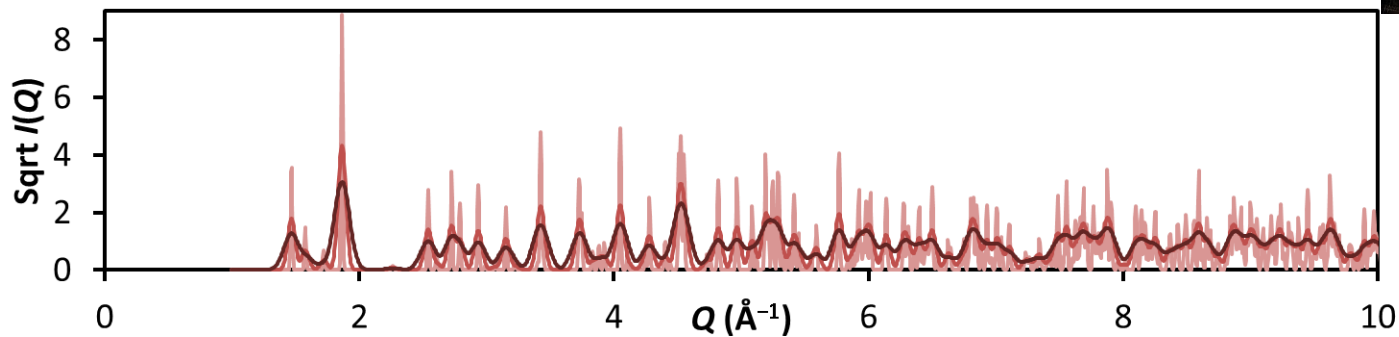


# Resolution Effect

Courtesy of  
Phil Chater,  
Diamond Light  
Source

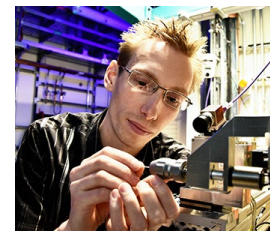


Reciprocal space: Peak width,  $dQ$



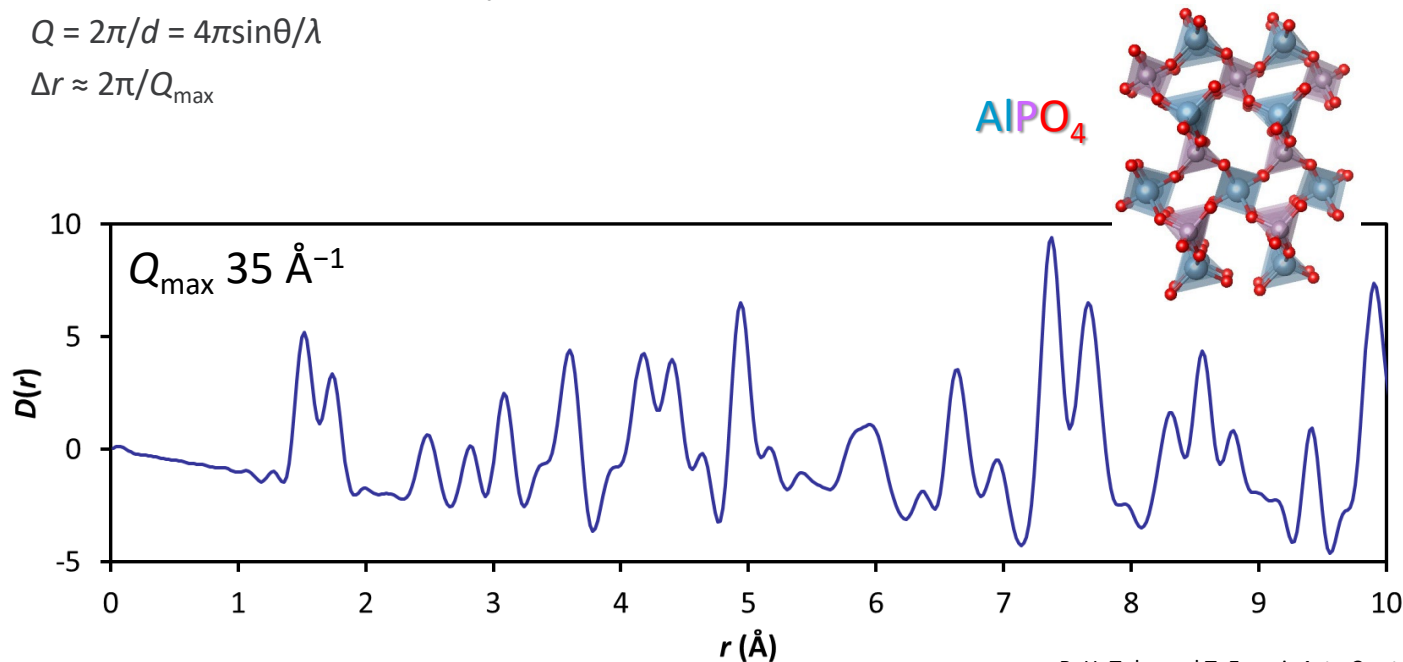
# $Q_{\max}$ Effect

Courtesy of  
Phil Chater,  
Diamond Light  
Source



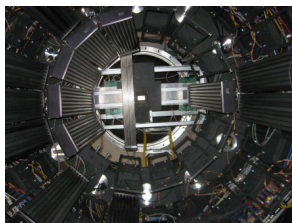
$\Delta r$  resolution of a PDF is dominated by  $Q_{\max}$

- $Q = 2\pi/d = 4\pi\sin\theta/\lambda$
- $\Delta r \approx 2\pi/Q_{\max}$

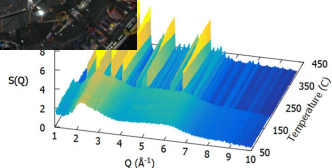


B. H. Toby and T. Egami, *Acta Cryst. A*, **48** 336 (1992).

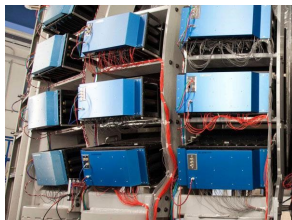
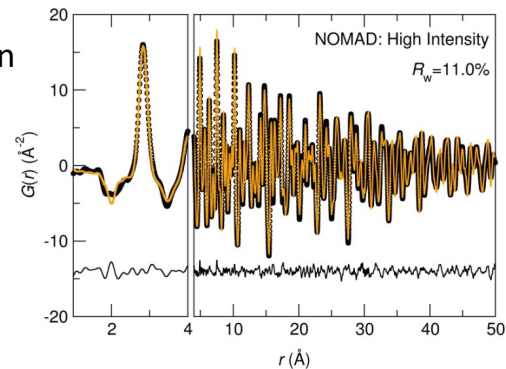
# TOF Diffraction and Total Scattering at SNS



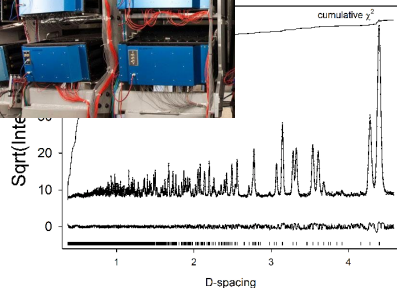
Typical **NOMAD** data can be collected for **30 - 100 mg** of sample in a 3 mm quartz capillary in **~15 minutes to 1 hour**



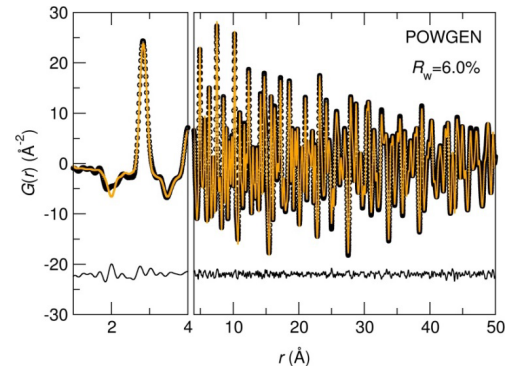
*high intensity diffraction and PDF for small samples and in situ studies on amorphous, nanostructured, and crystalline materials*



Typical **POWGEN** data can be collected for **~3 - 10 g** of sample in a 6 mm vanadium canister in **~3 hours**

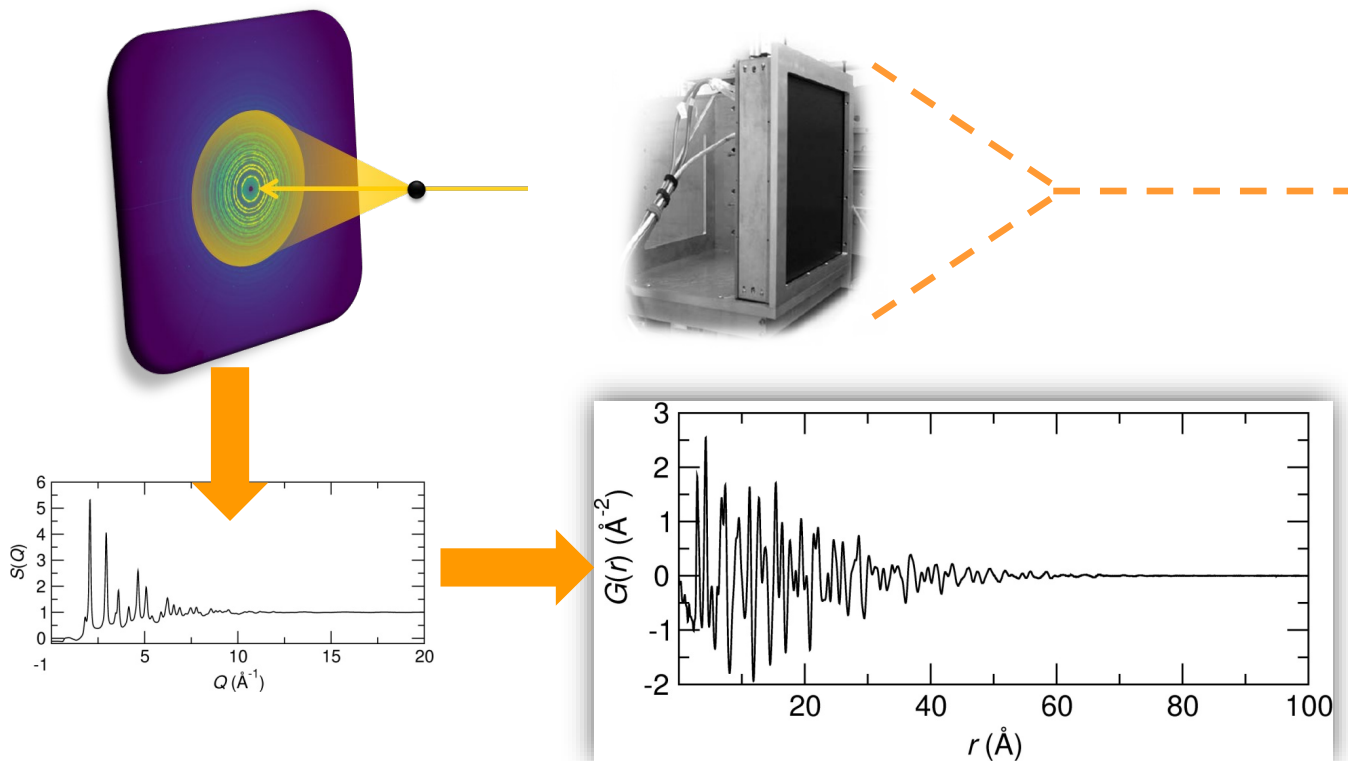


*high resolution diffraction and PDF of crystalline materials*



**Mail-in programs available on both instruments**

# Synchrotron Total Scattering: 2D Amorphous Si Detector



Examples of  
Dedicated User  
Programs in the US:

11-ID-B at APS

PDF at NSLS-II

**10 mg sample can be  
measured in seconds  
to fractions of a  
second!**

P. J. Chupas, K. W. Chapman, P. L. Lee, **Applications of an amorphous silicon-based area detector for high resolution, high sensitivity and fast time-resolved pair distribution function measurements**, *J. Appl. Crystallogr.* 40, 463, 2007. <http://dx.doi.org/10.1107/S0021889807007856>

# MODELING A PDF

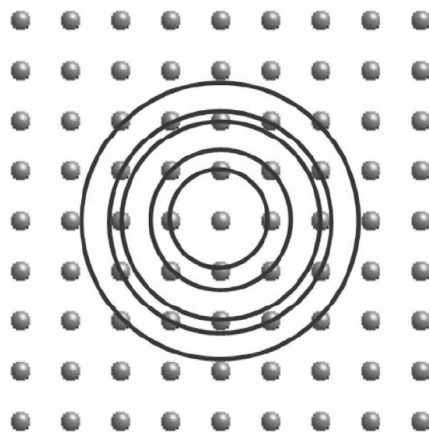
Calculating a PDF from a model

Available software

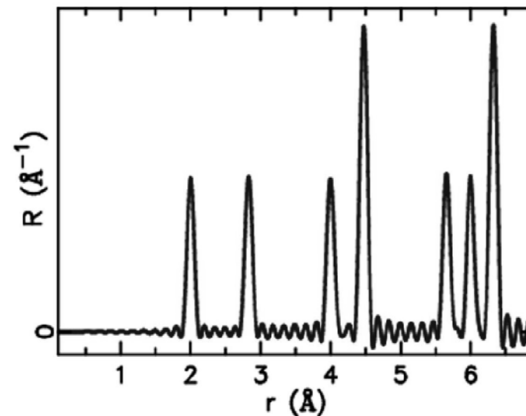
Combined methods

# Pair Distribution Function

Based on the *radial distribution function* (RDF):



S.J.L Billinge, *Z. Kristallogr. Suppl.*,26,17 (2007)



Atomic PDF (PDFFIT notation):

$$G(r) = 4\pi r [\rho(r) - \rho_0]$$

atomic form factors  
(Z for x-rays, b for neutrons)

sum over all atoms

$$G(r) = \sum_{ij} \left[ \frac{b_i b_j}{\langle b \rangle^2} \delta(r - r_{ij}) \right] - 4\pi r \rho_0$$

distance between i and j atoms

average density

# Calculating a PDF from a Model

## Calculating a PDF from an atomistic model

$$G(r) = \sum_{ij} \left[ \frac{b_i b_j}{\langle b \rangle^2} \delta(r - r_{ij}) \right] - 4\pi r \rho_0$$

## Peak Width

Small model: convolution of  $\delta(r - r_{ij})$  with distribution function (*PDFgui & TOPAS v6*)

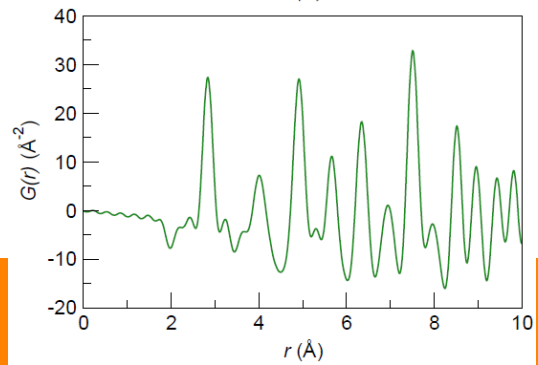
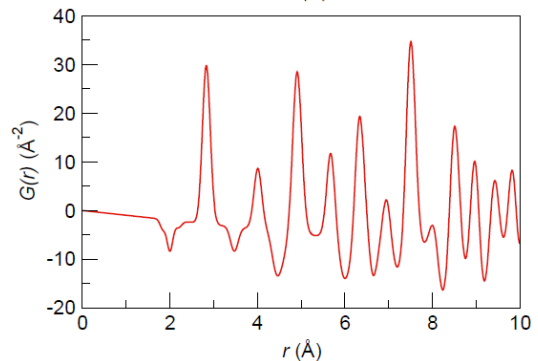
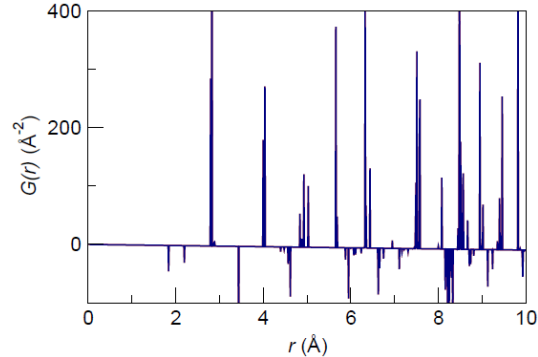
Large model: ensemble average of actual displacements (*RMCprofile*)

## Termination ripples + instrumental dampening

Multiplication with step function in reciprocal space gives **convolution** with

$\sin(Q_{\max} r)/r$  in real space

...



# Atomic PDF Modeling

## Small Models: Least Squares Refinement

Up to several hundred atoms

'Rietveld'-type parameters: *lattice parameters, atomic positions, displacement parameters, etc.*

Refinements as function of  $r$ -range

## Large Model: Reverse Monte Carlo

20000 + atoms

Fit X-ray and neutron  $F(Q)$ ,  $G(r)$ , Bragg profile, now EXAFS

Constraints utilized

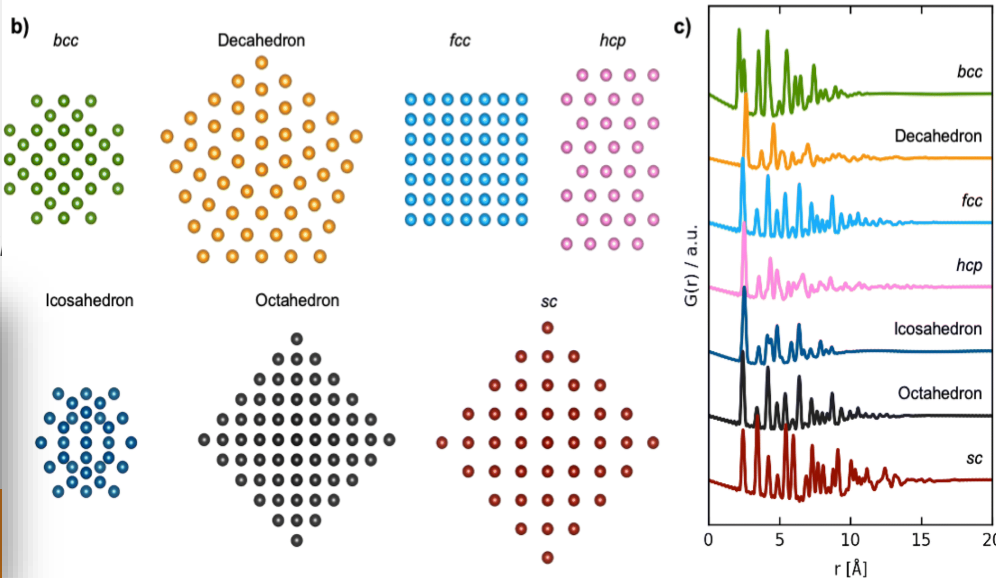
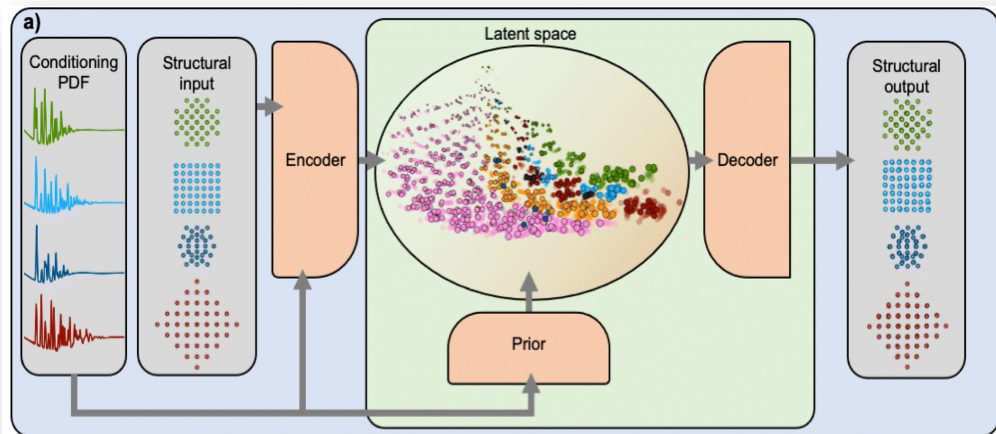
Static 3-D model of the structure (a snap-shot)

## Multi-level / Complex Modeling

Refine higher level parameters (not each atom)

Nanoparticle example: *diameter, layer spacing, stacking fault probability*

Choose minimization scheme



*ab initio*, f  
Density Fu  
Molecular  
Artificial In

Digital  
Discovery



PAPER

View Article Online  
View Journal | View Issue

Check for updates

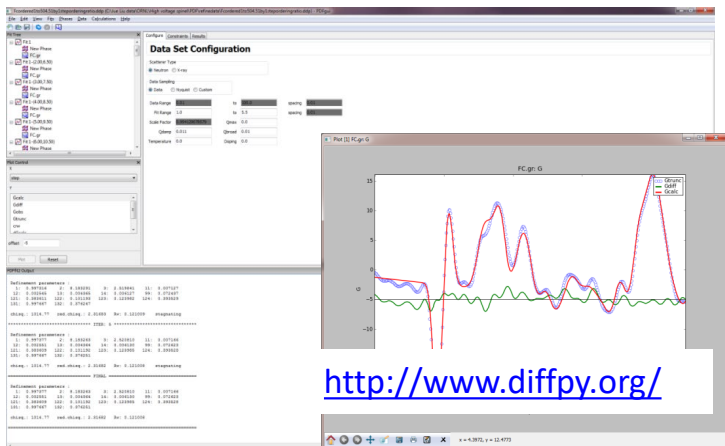
**DeepStruc: towards structure solution from pair distribution function data using deep generative models†**

Emil T. S. Kjær,<sup>1</sup> Andy S. Anker,<sup>2</sup> Marcus N. Weng,<sup>3</sup> Simon J. L. Billinge,<sup>1,2,3</sup> Raghavendra Selvan<sup>4,5</sup> and Kirsten M. Ø. Jensen<sup>1,6</sup>

Cite this: *Digital Discovery*, 2023, 2, 69



# Small Box: Brief Software Comparison



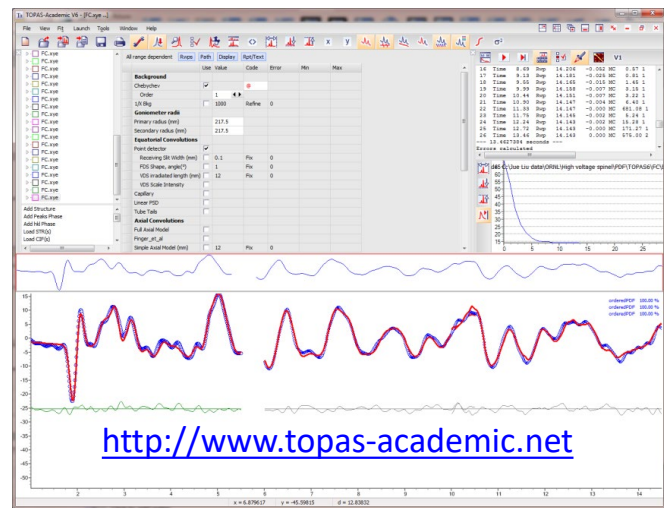
## TOPAS PDF

- + Fast and flexible
- + Fit Bragg and PDF together
- Steeper learning curve

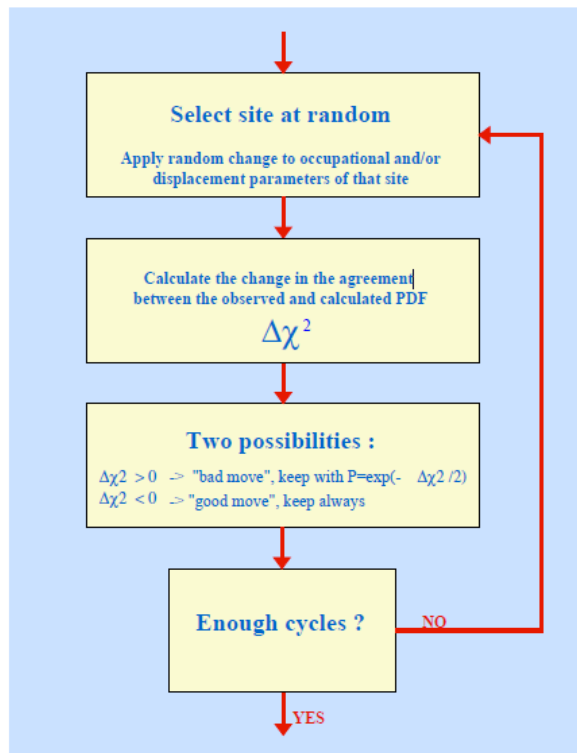
## PDFgui

- + Open Source and Free
- + GUI is Simple and User-friendly
- Slower refinement, especially for high- $Q$

Check out *diffpy-cmi* for a python language version



# Large Box: Reverse Monte Carlo



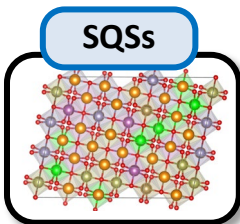
## RMCprofile

- Atomic configurations ~600 to 20000+ atoms
- Fit both X-ray and neutron  $F(Q)$
- Fit  $G(r)$
- Fit Bragg profile
- Fit EXAFS
- Polyhedral restraints
- Coordination constraints
- Closest approach constraints
- **Produce a static 3-D model of the structure (a snap-shot in time)**
- [http://www.rmcpfile.org/Main\\_Page](http://www.rmcpfile.org/Main_Page)

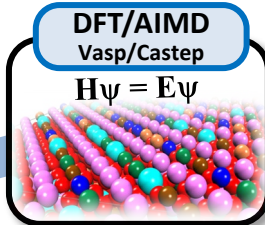
Also check out **FullRMC**

- <https://bachiraoun.github.io/fullrmc/>

Special quasirandom structure (SQSs) to optimize cation disorder in solid solution materials



DFT calculations to calculate the ground-state electronic structure using VASP/MS-Castep



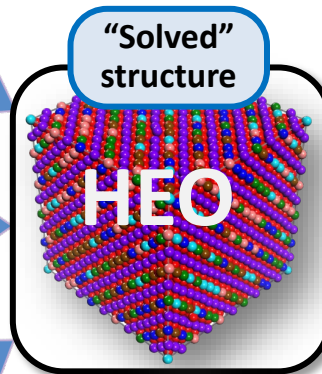
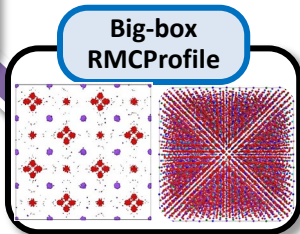
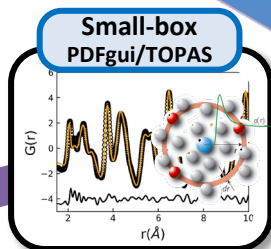
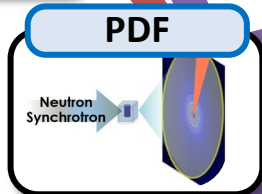
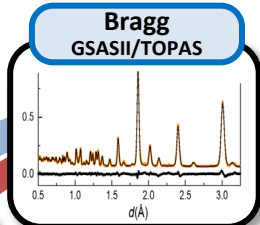
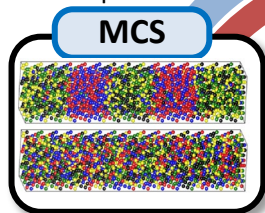
**Probing the Local Site Disorder and Distortion in Pyrochlore High-Entropy Oxides**

Bo Jiang, Craig A. Bridges,\* Raymond R. Unocic, Krishna Chaitanya Pitike, Valentino R. Cooper, Yuanpeng Zhang, De-Ye Lin, and Katharine Page\*

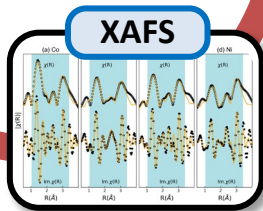
Cite This: *J. Am. Chem. Soc.* 2021, 143, 4193–4204

Read Online

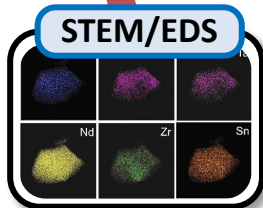
Metropolis Monte Carlo simulations (MCS) utilized to estimate cation disorder and predict secondary phases



Pair distribution function PDF data analyzed by small-box modeling using PDFgui/TOPAS and by large-box Reverse Monte Carlo (RMC) modeling

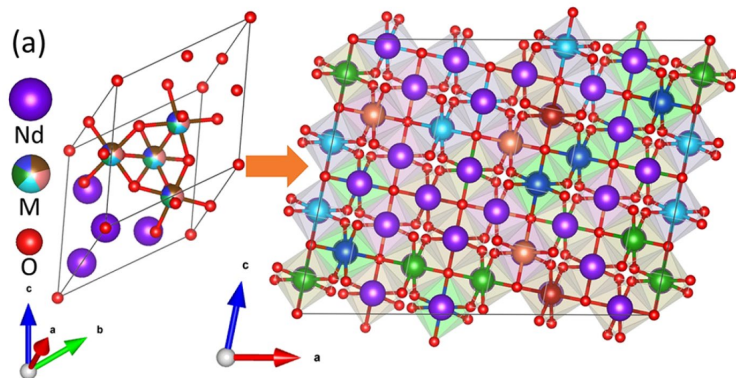


EXAFS analysis to constrain local chemical environment

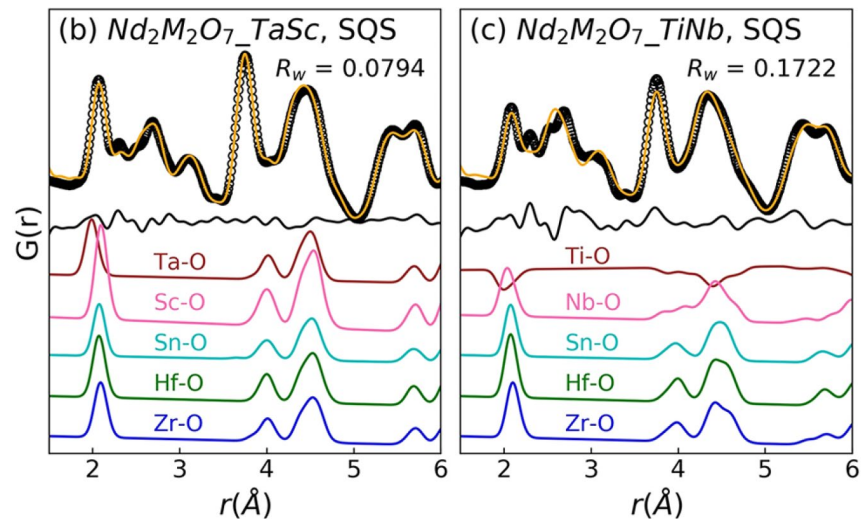
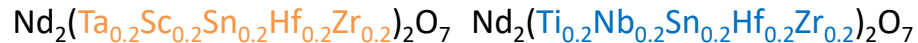


# Small-box PDF fitting using DFT-relaxed SQS supercell

The Special Quasirandom Structures (SQS) approach allows one to design periodic supercells representative of a real disordered state and has been shown to successfully reproduce electronic and thermodynamic properties in disordered alloys combined with DFT calculations



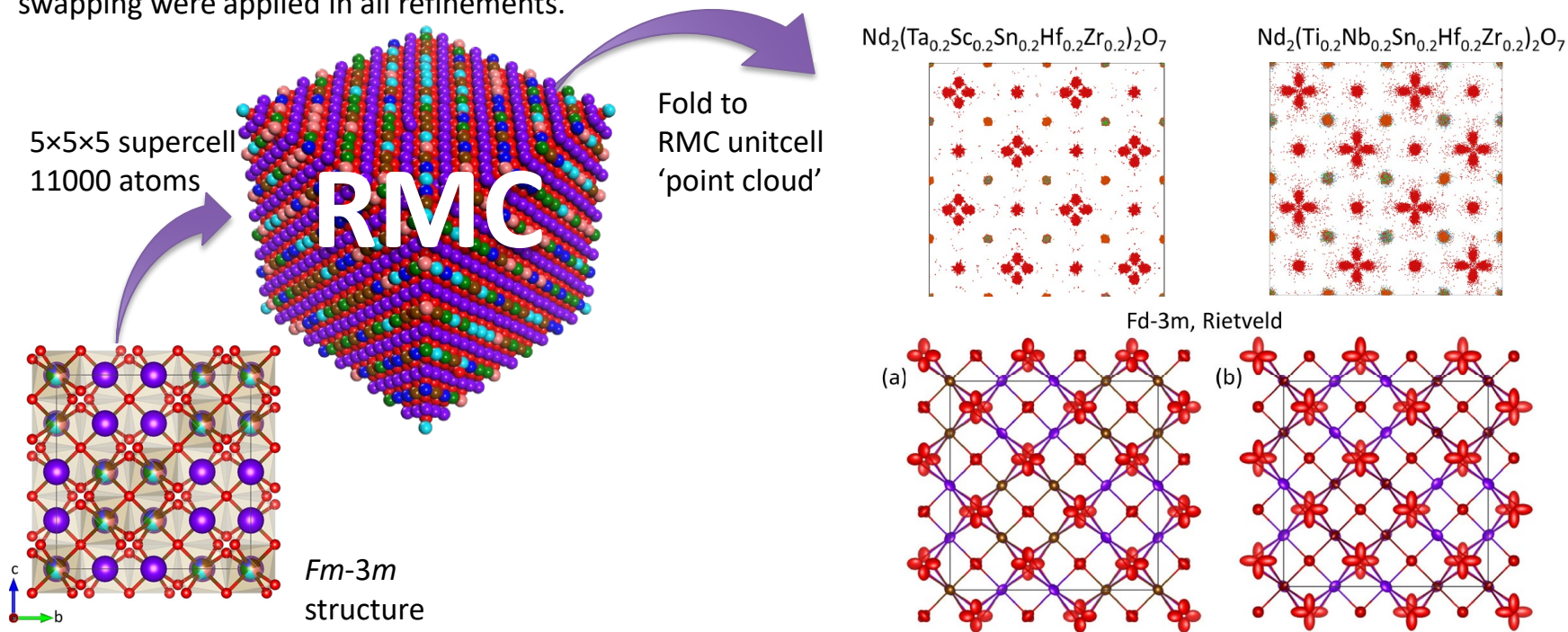
Primitive unit cell and Special Quasirandom Structures (SQS) supercell



Total and decomposed partial PDFs from individual M-O pair-pair correlations

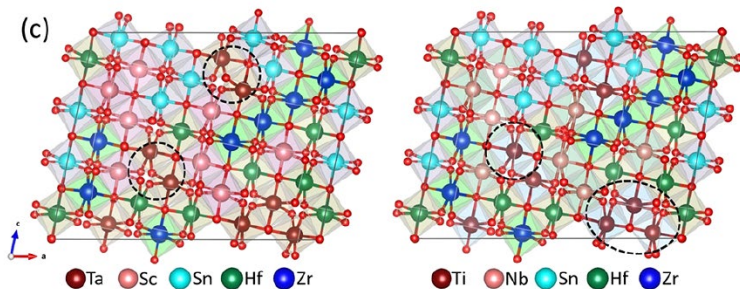
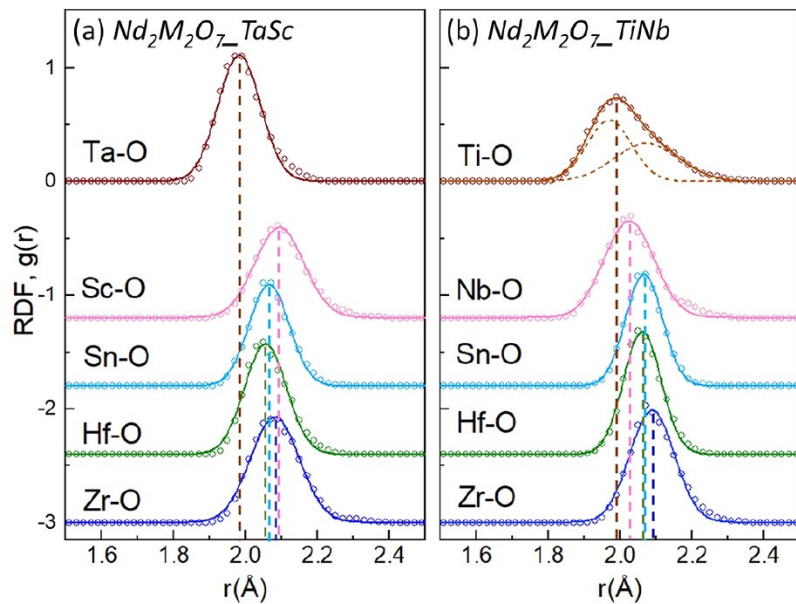
# “Big-box” RMC fitting consistent with disordered M cations

Reverse Monte Carlo (RMC) fits were performed to identify the short-range cation ordering, obtained by fitting PDF  $G(r)$ ,  $F(Q)$ , and the neutron diffraction patterns simultaneously. Bond valence sum (BVS) restrictions and atom swapping were applied in all refinements.

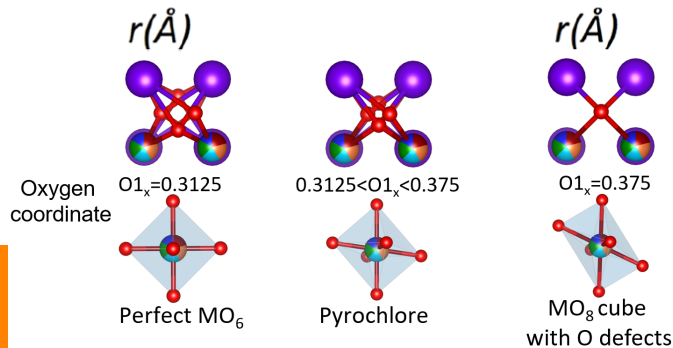
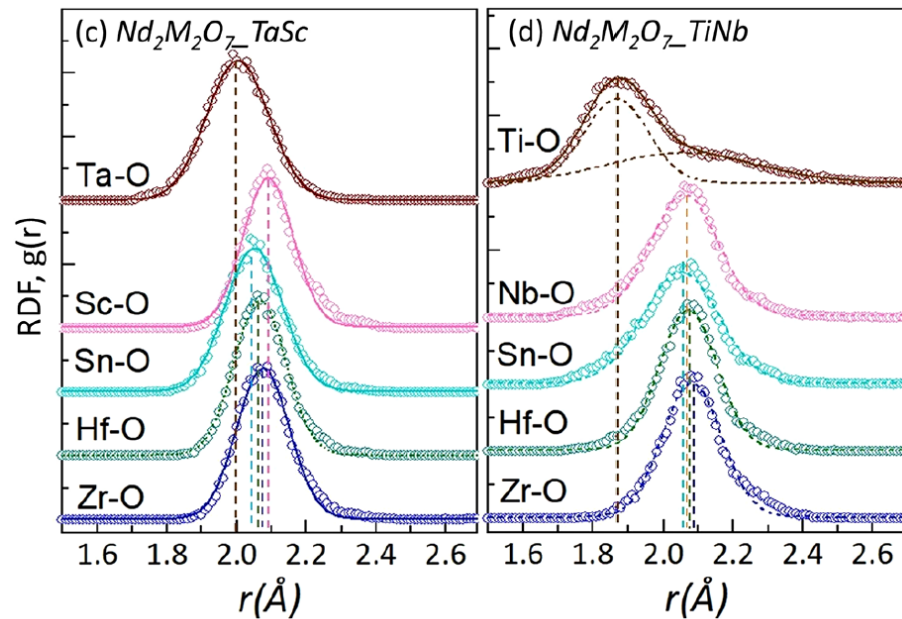


# Nearest-neighbor M-O peaks

## SQS



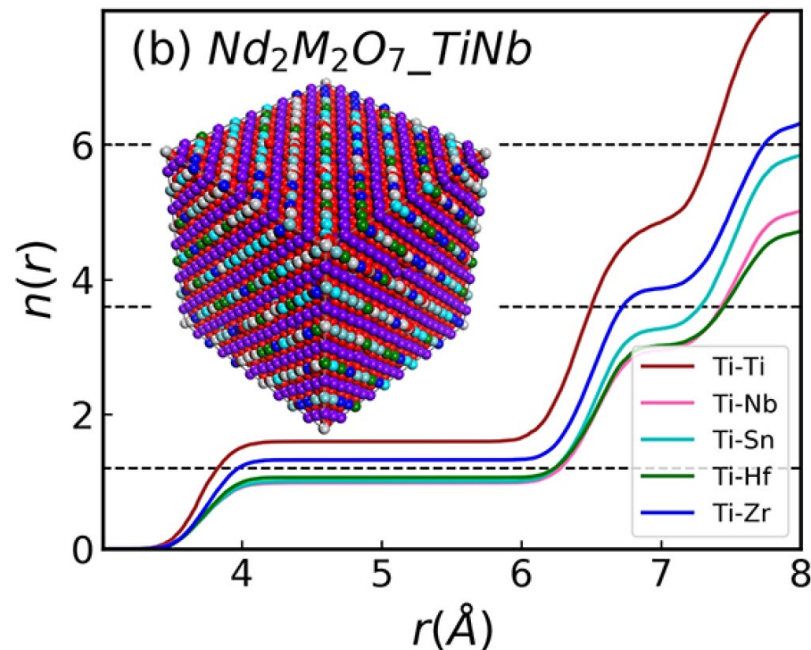
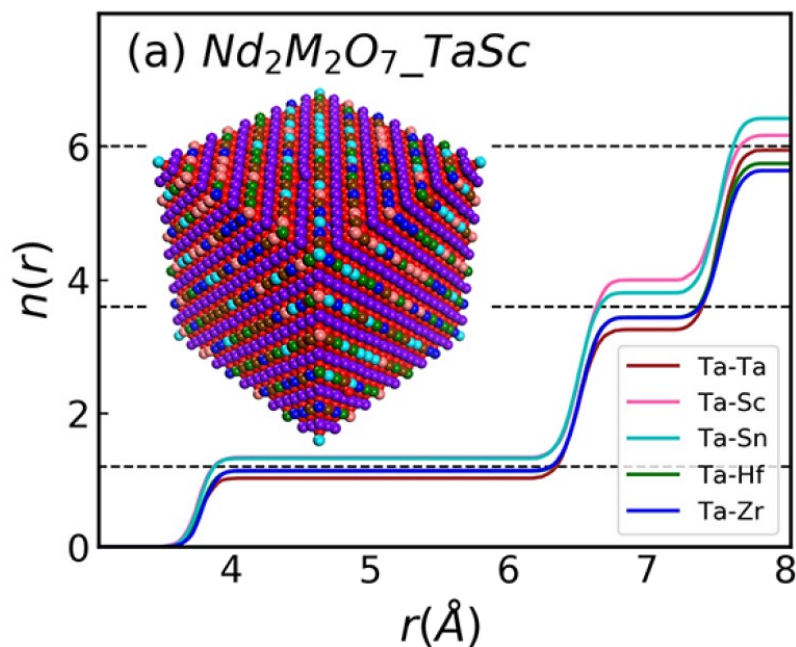
## RMC



# Neighbor correlations $n(r)$ by RMC

The  $n_{ij}(r)$  is defined as the mean number of atoms  $i$  surrounding a central atom  $j$ :

$$n_{ij}(r) = \int_{r_2}^{r_1} 4\pi r^2 2c_j \rho_0 g_{ij}(r) dr$$



# A FEW EXTENSION AREAS

Magnetic PDF

Thin-Film PDF

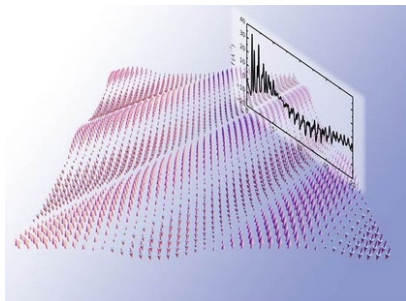
Dynamic PDF

3D PDF

Sample Environments

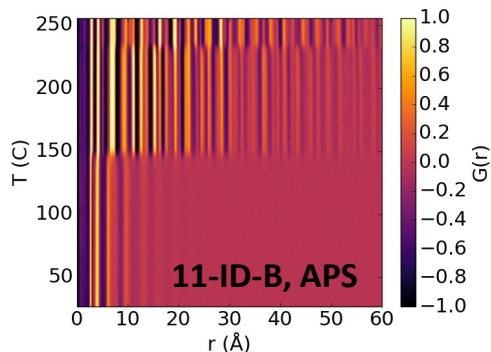


# Magnetic PDF: mPDF



Direct access to long-range and short-range magnetic correlations in real space: **spin-stripe correlations in cuprate superconductors, spin fluctuations in frustrated magnetic systems, etc.**

# Thin Film PDF: tfPDF



**1  $\mu\text{m}$   $\text{GeSb}_2\text{Te}_4$  films deposited on kapton, thermally annealed in situ under flowing He**

K. Page, J. K. Baldwin, Th. Proffen, unpublished.



advances

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**Magnetic pair distribution function analysis of local magnetic correlations**

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ARTICLE

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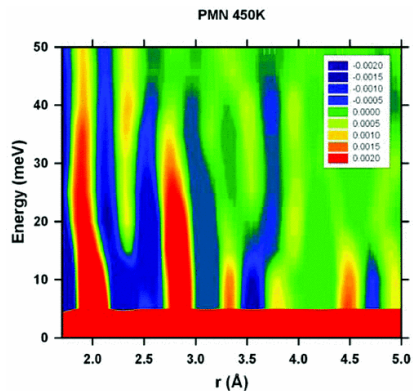
OPEN

Emergent order in the kagome Ising magnet  $\text{Dy}_3\text{Mg}_2\text{Sb}_3\text{O}_{14}$

Joseph A.M. Paddison<sup>1,2</sup>, Harapan S. Ong<sup>1</sup>, James O. Hamp<sup>1</sup>, Paromita Mukherjee<sup>1</sup>, Xiaojian Bai<sup>2</sup>, Matthew G. Tucker<sup>3,4</sup>, Nicholas P. Butch<sup>5</sup>, Claudio Castellano<sup>1</sup>, Martin Mourigal<sup>2</sup> & S.E. Dutton<sup>1</sup>

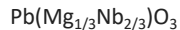
K. M. Ø. Jensen, A. B. Blichfeld, S. R. Bauers, S. R. Wood, E. Dooryhée, D. C. Johnson, B. B. Iversen, and S. J. L. Billinge, **Demonstration of thin film pair distribution function analysis (tfPDF) for the study of local structure in amorphous and crystalline thin films**, *IUCrJ*, 2 (2015) 481-489.

# Dynamic PDF: DyPDF



T. Egami and W. Dmowski, **Dynamic pair-density function method for neutron and X-ray inelastic scattering**, *Z. Kristallogr.* 227, 233–237 (2012).

W. Dmowski, S. B. Vakhrushev, I.-K. Jeong, M. P. Hehlen, F. Trouw, T. Egami, **Local Lattice Dynamics and the Origin of the Relaxor Ferroelectric Behavior**, *Phys. Rev. Lett.* 100, 137602 (2008).



## Optimizing the dynamic pair distribution function method for inelastic neutron spectrometry

[Kody A. Acosta](#), [Helen C. Walker](#) & [Alllyson M. Fry-Petit](#)

*Nature Reviews Physics* 5, 236–249 (2023) | [Cite this article](#)

### ARTICLE

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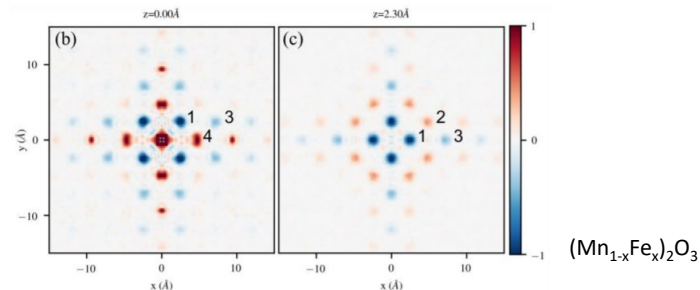
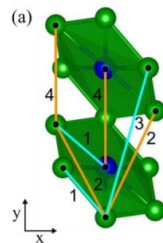
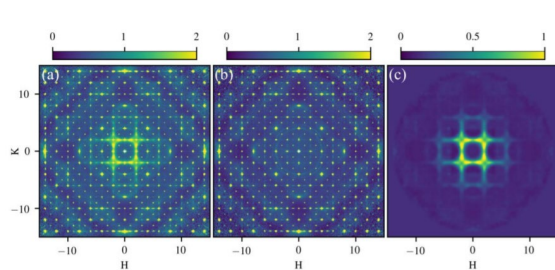
DOI: 10.1038/nrnphys12294 OPEN

## Observation of dynamic atom-atom correlation in liquid helium in real space

W. Dmowski<sup>1,2</sup>, S.O. Diallo<sup>3</sup>, K. Lokshin<sup>1,2</sup>, G. Ehlers<sup>3</sup>, G. Ferri<sup>4</sup>, J. Boronat<sup>4</sup> & T. Egami<sup>1,2,3,5</sup>

# 3D - PDF

T. Weber and A. Simonov, **The three-dimensional pair distribution function analysis of disordered single crystals: basic concepts**, *Z. Kristallogr.* 227, 238–247 (2012).



N. Roth, A. F. May, F. Ye, B. C. Chakoumakos, and B. B. Iversen, **Model-free reconstruction of magnetic correlations in frustrated magnets**, *IUCrJ*, 5, 410–416 (2018).

# When Should You Pursue PDF Studies of a Crystalline Material?

- ✓ You have modeled everything you can in reciprocal space
- ✓ You suspect the local structure may differ from the long-range structure

## Why Would You Suspect a Distinct Local Structure?

Maybe...

- ✓ You find signatures of disorder through complementary methods
- ✓ An average structure model fails to explain observed material properties
- ✓ A theoretical study proposes an alternate structure to the one globally observed
- ✓ Lots of experience with a materials family or structural archetype

# Some Resources and Programs

## Data Collection

- Neutron: <http://neutronsources.org>
- X-ray: <http://www.lightsources.org>

## Data Extraction

- PDFgetN: <http://pdfgetn.sourceforge.net>
- PDFgetX2/X3: <http://www.pa.msu.edu/cmp/billinge-group/programs/PDFgetX2/>  
<http://www.diffpy.org/products/pdfgetx3.html>
- Gudrun: <http://disordmat.moonfruit.com/>
- ADDIE: ADvanced Diffraction Environment, ORNL

## Data Modeling

- PDFgui, Diffpy: <http://www.diffpy.org/>
- Topas Academic: <http://www.topas-academic.net>
- RMCprofile: <http://www.isis.rl.ac.uk/RMC>
- DISCUS/DIFFEV: <http://discus.sourceforge.net>
- EPSR: <http://disordmat.moonfruit.com/>

# References & Reviews

S.J.L. Billinge and I. Levin, The Problem with Determining Atomic Structure at the Nanoscale, *Science* 316, 561 (2007).

<http://dx.doi.org/10.1126/science.1135080>

T. Egami and S. J. L. Billinge, *Underneath the Bragg peaks: structural analysis of complex materials*, Pergamon Press Elsevier, Oxford, England, 2003.

D. A. Keen, Derivation of commonly used functions for the pair distribution function technique *J. Appl. Cryst.* 34 (2001) 172-177. <http://dx.doi.org/10.1107/S0021889800019993>

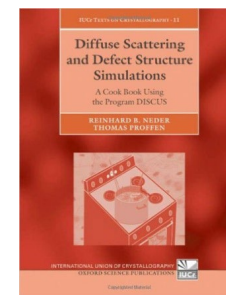
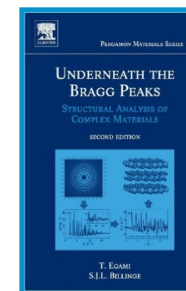
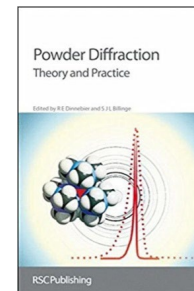
R. Neder and Th. Proffen, *Diffuse Scattering and Defect Structure Simulation*, Oxford University Press, 2008.

M. G. Tucker, M. T. Dove, and D. A. Keen, Application of the reverse Monte Carlo method to crystalline materials, *J. Appl. Cryst.* 34, 630-638 (2001). <http://dx.doi.org/10.1107/S002188980100930X>

D. A. Keen and A. L. Goodwin, The crystallography of correlated disorder, *Nature* 521, 303–309, 2015.  
<http://dx.doi.org/10.1038/nature14453>

H. Y. Playford, L. R. Owen, I. Levin, and M. G. Tucker, New insights into complex materials using Reverse Monte Carlo modeling, *Annual Review of Materials Research*, 44, 429-449, 2014. <http://dx.doi.org/10.1146/annurev-matsci-071312-121712>

D. Olds, C. N. Saunders, M. Peters, T. Proffen, J. N. Neuefeind, and K. Page, Precise implications on real-space PDF modeling from effects intrinsic to modern time of flight neutron diffractometers, *Acta Cryst.* A74 (2018).  
<https://doi.org/10.1107/S2053273318003224>



# Try Diffraction/PDF Mail-in Programs for Users!

## Mail-in Neutron Program (NOMAD and POWGEN, SNS)

- NOMAD: Up to five samples or temperatures, ~30 - 100 mg of sample in a 3 mm quartz capillary in ~1 hour (in standard mode) <https://neutrons.ornl.gov/nomad/mail-in>
- POWGEN: Up to five samples or temperatures, ~3 - 10 g of sample in a 6 mm vanadium canister in ~3 hours: <https://neutrons.ornl.gov/powgen/mail-in>
- Opportunities on most weeks during the run cycle

## Mail-in X-ray Program (11-ID-B, APS)

- Less than a second to seconds per measurement on ~ 10 mg or sample!
- Mail-in is offered for standard measurements (powders/solids in capillaries at ambient temperatures)
- Submit rapid access mail-in proposal: [https://wiki-ext.aps.anl.gov/srsmailin/index.php/SRS\\_mail-in](https://wiki-ext.aps.anl.gov/srsmailin/index.php/SRS_mail-in)

# Try Total Scattering Analysis Online Video Library!

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## 4th US School on Total Scattering Analysis: October/November 2021

October 20

[Introduction to Total Scattering](#): Thomas Proffen, Oak Ridge National Laboratory

[Big surprises from the small box- PDF endeavors in nanostructured materials](#): Emil Bozin, Brookhaven National Laboratory

[RMCPProfile as a data-fusion framework for determining nanoscale atomic order](#): Igor Levin, National Institute of Science and Technology

[Building complex and decorated nanoparticles with DISCUS](#): Reinhard Neder, University Erlangen Germany

October 22

[Fourier Transforms are Not Magic- How We Make Your PDF](#): Daniel Olds, Brookhaven National Laboratory

[X-ray Total Scattering Instrumentation](#): Milinda Abeykoon, Brookhaven National Laboratory

[X-ray Total Scattering Data Reduction](#): Milinda Abeykoon, Brookhaven National Laboratory

[Neutron Total Scattering Instruments and Uses](#): Katharine Page, University of Tennessee and Oak Ridge National Laboratory

[Data Reduction for Neutron Total Scattering](#): Yuanpeng Zhang, Oak Ridge National Laboratory

October 27

[Recent and upcoming developments in PDF analysis](#): Simon Billinge, Brookhaven National Laboratory

October 29

[Pair distribution function analysis of battery materials](#): Phoebe Allan, U

November 3

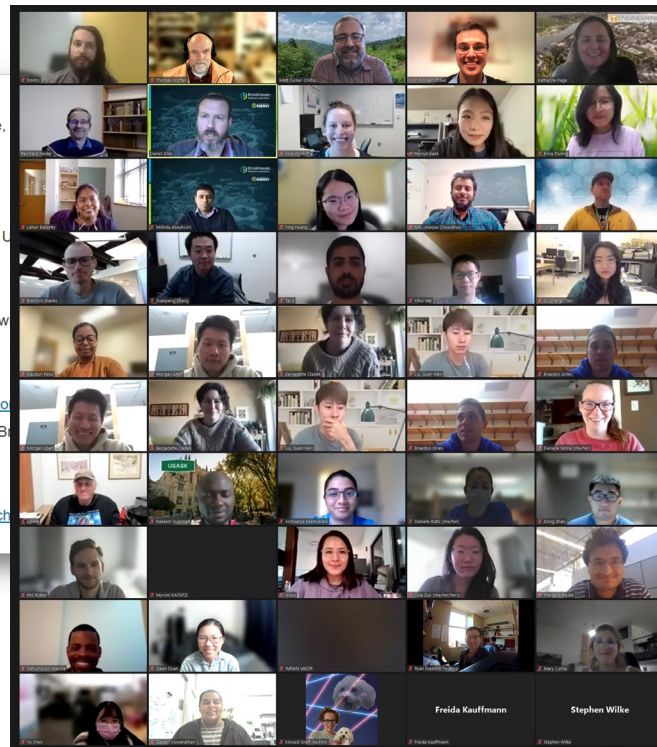
[Disorder and diffuse scattering in materials chemistry](#): Andrew Goodwin

November 5

[Of Spins and Pseudospins- Magnetic PDF as a powerful probe of short correlations](#): Ben Frandsen, Department of Physics and Astronomy, B

November 10

[Pushing insight from laboratory PDF data and why we still need synchrotron](#): Institute of Crystallography, RWTH Aachen University, Germany



**Stay tuned for announcements about our 7<sup>th</sup> annual school!**

# Summary

**Atomic PDF from total (Bragg and diffuse) scattering data gives access to:**

- Amorphous and nanomaterial structure
- Departure from long range (average structure)
  - Displacements
  - Chemical short-range order
  - Interstitials/vacancies
- Correlation length scale of features (size)
- Structure  $\Leftrightarrow$  property relationships

**Use multiple data sets (e.g. x-ray and neutron data, diffraction and PDF) to characterize complex materials**

**Dedicated and high-resolution instruments offer many advantages**



Questions?

[kpage10@utk.edu](mailto:kpage10@utk.edu)  
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NXS Lecture - Katharine Page:  
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