

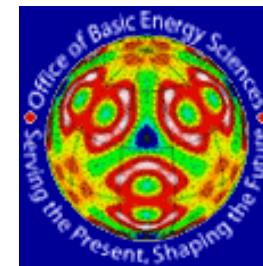
Total Scattering and PDF analysis of nanostructured materials

S.J.L. Billinge

Department of Applied Physics and Applied Mathematics

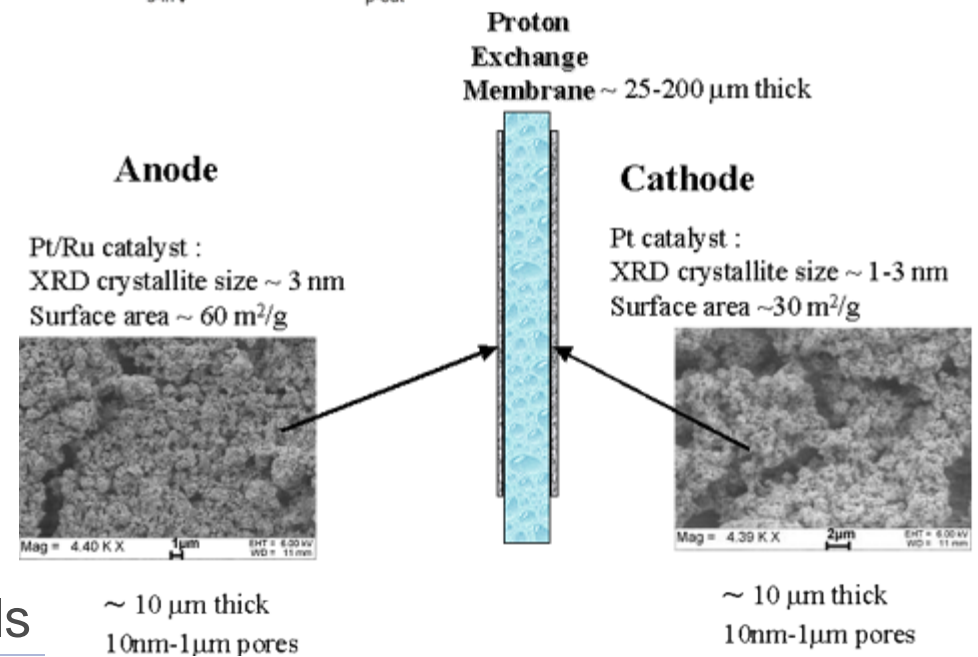
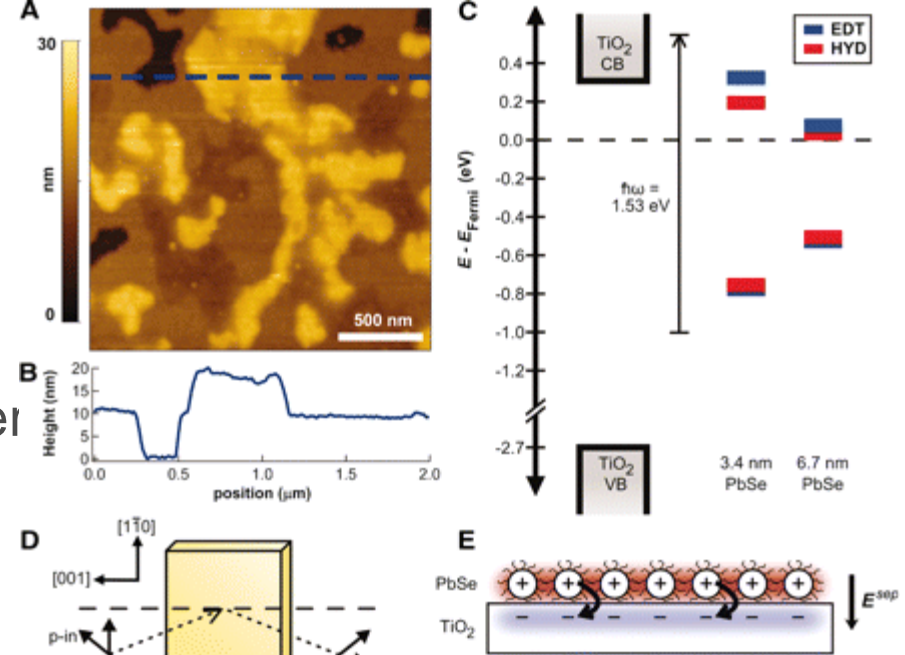
Columbia University,

CMPMS, Brookhaven National Laboratory



Complex materials

- Photovoltaics with improved efficiency
 - Nanoparticles in the light collecting layer
- High energy density batteries
 - Electrodes
 - Electrolytes
- Fuel cells for transportation applications
 - Electrodes
 - Electrolytes
 - Catalysts
 - Hydrogen storage
- Sequestration
 - Functionalized mesoporous materials

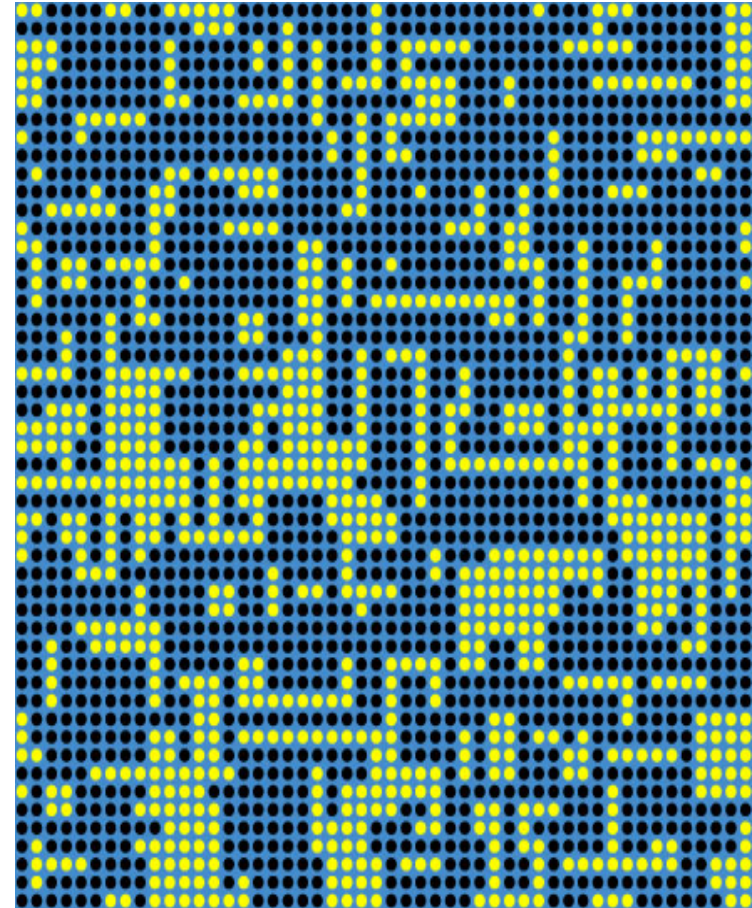
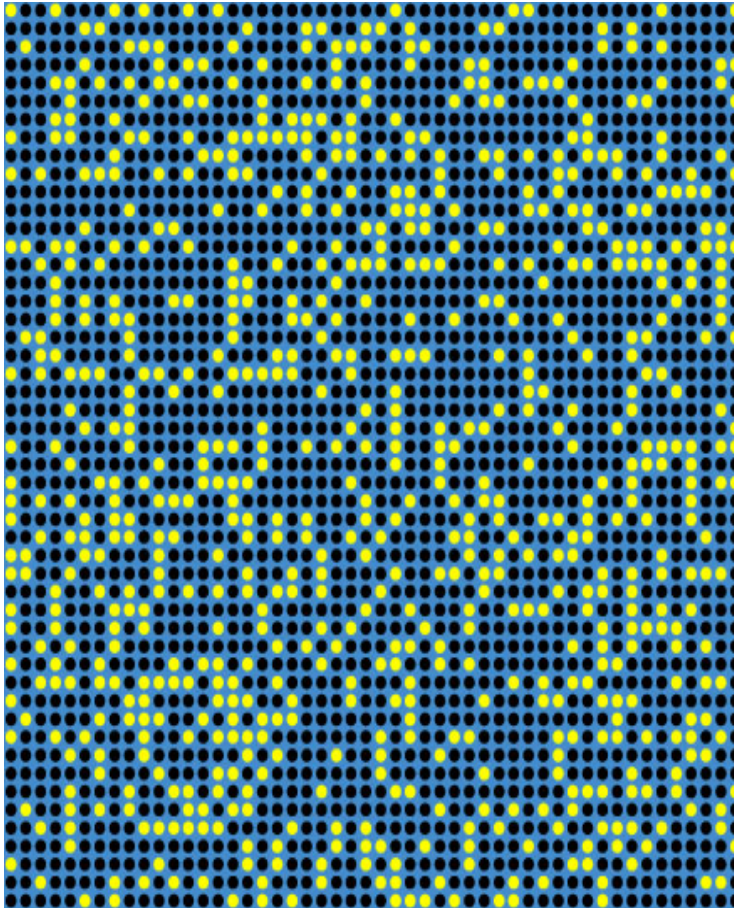


The Nanostructure Problem

- We want to engineer materials at the nanoscale
- But we can't even solve the atomic structure at the nanoscale:

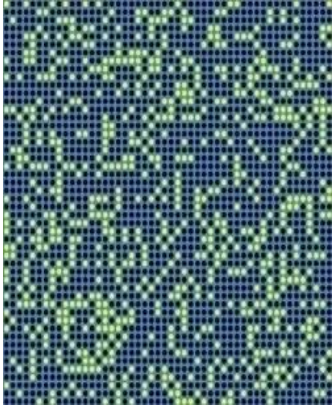
The nanostructure problem

Total scattering ?

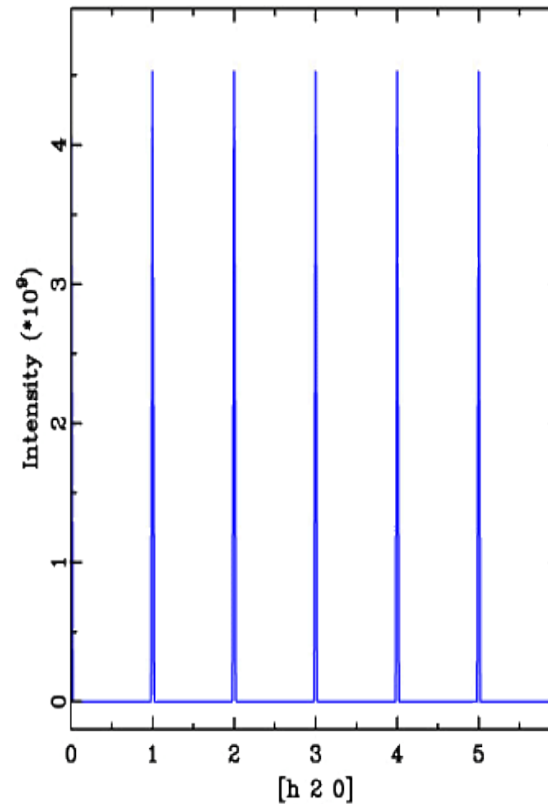
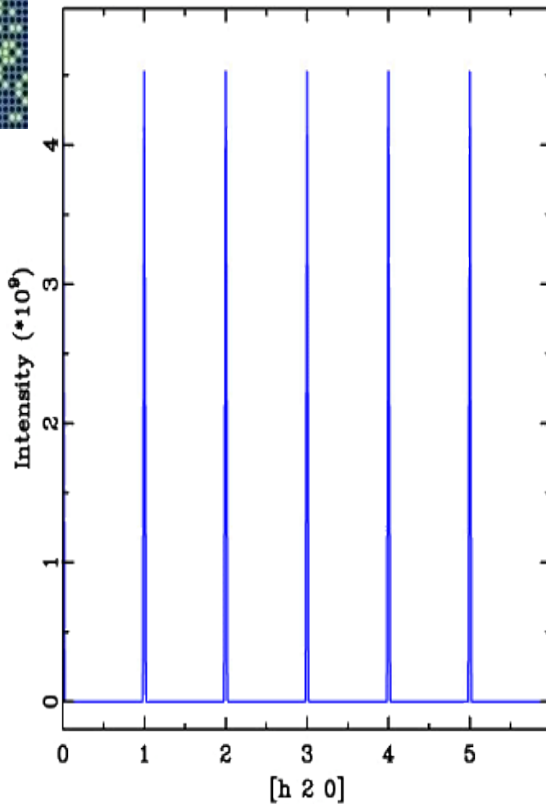
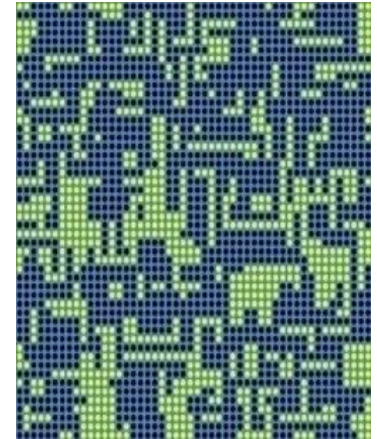


Cross section of 50x50x50 u.c. model crystal consisting of 70% black atoms and 30% vacancies !
Properties might depend on vacancy ordering !!

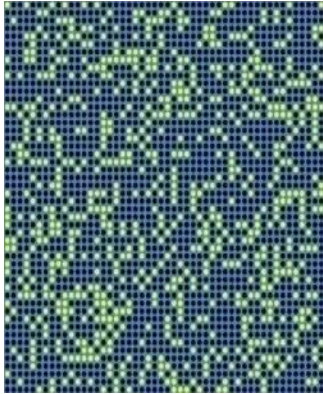
Bragg peaks are blind ..



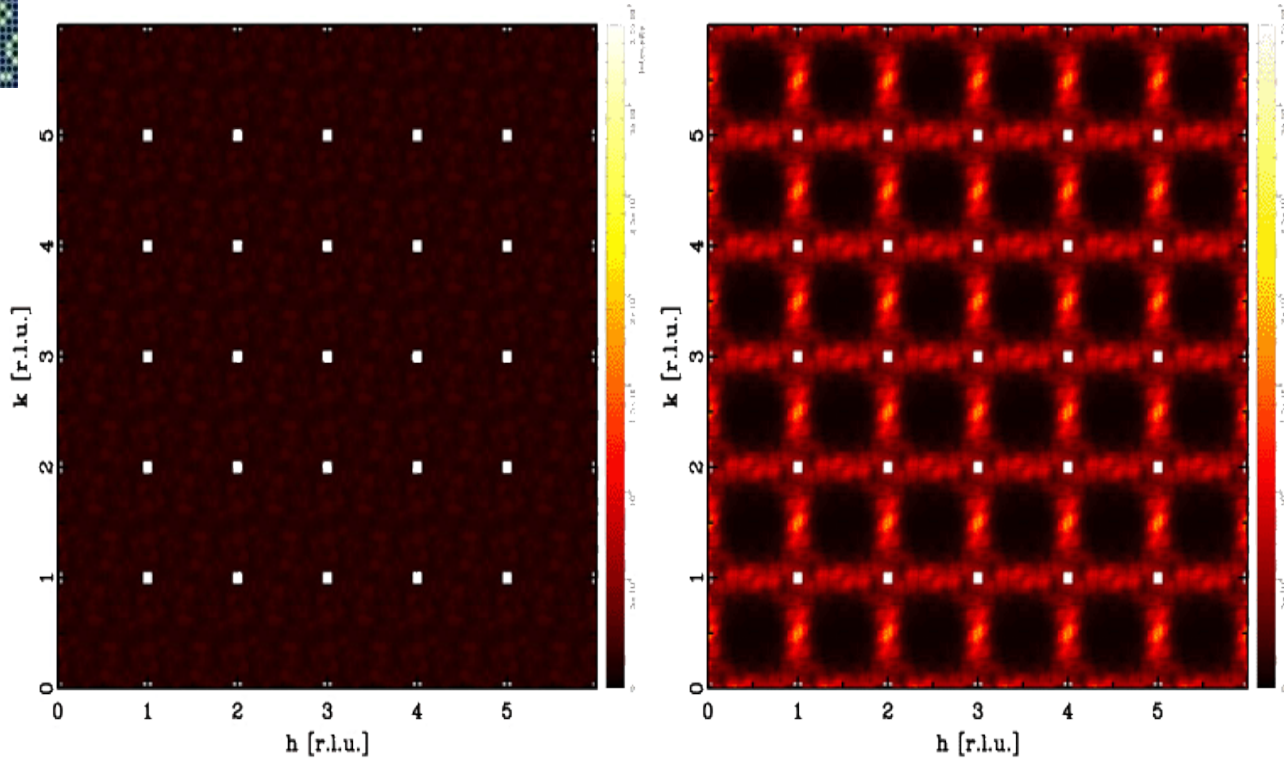
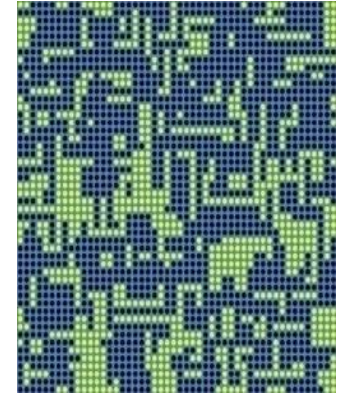
Bragg scattering: Information about the average structure, e.g. average positions, displacement parameters and occupancies.



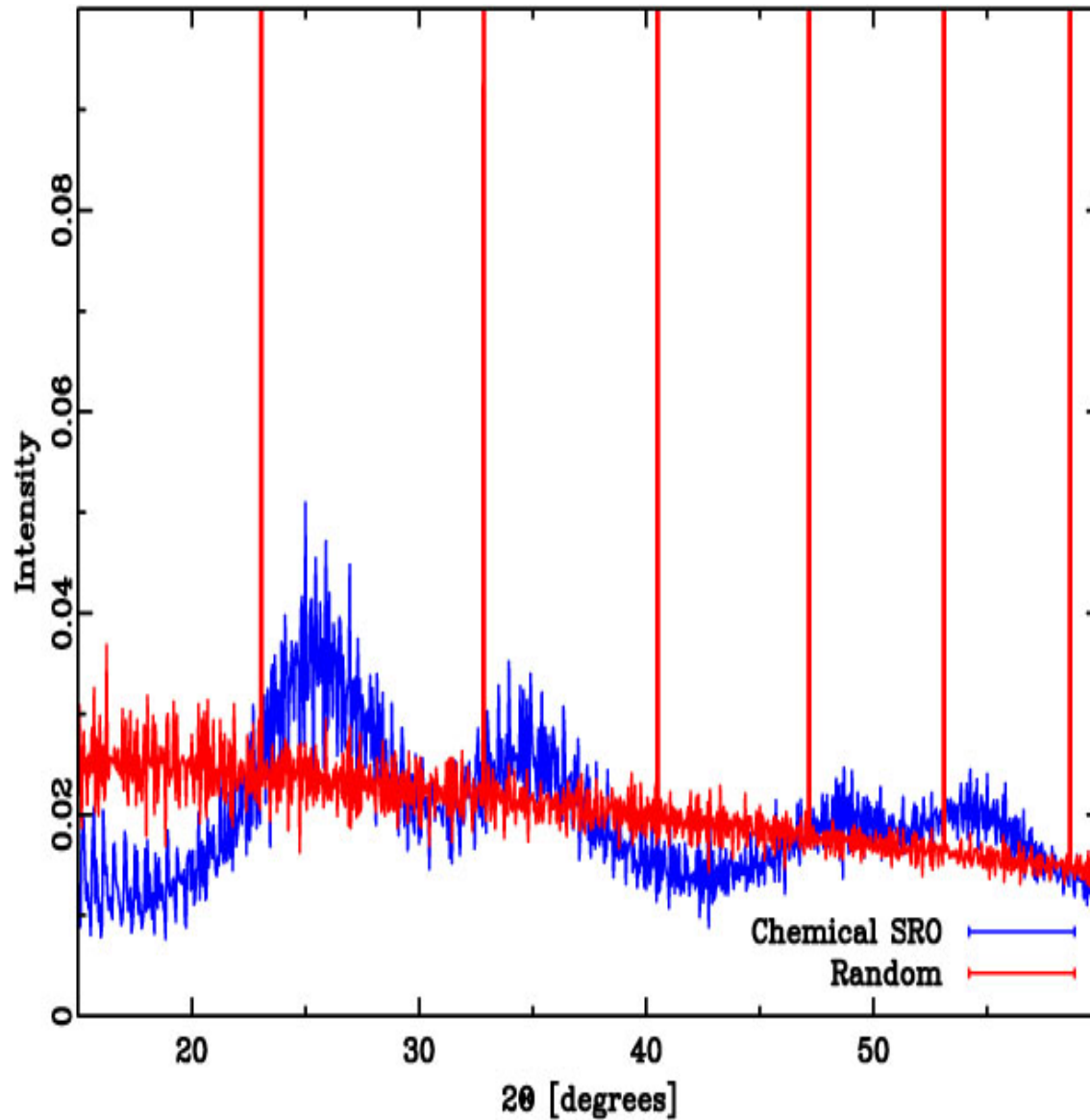
Diffuse scattering to the rescue ..



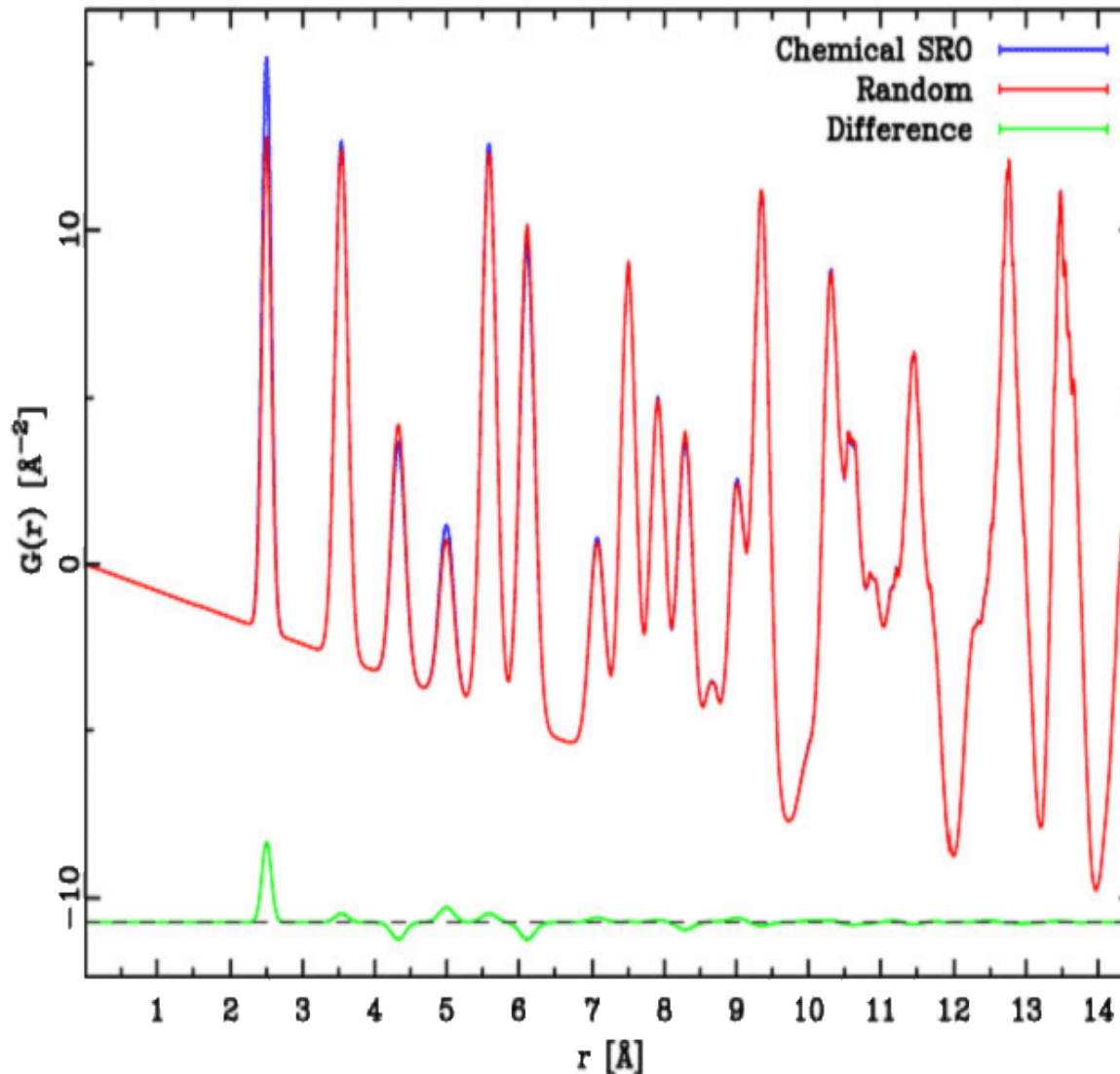
Diffuse scattering: Information about two-body correlations, i.e. chemical short-range order or local distortions.



How about powder diffraction ?



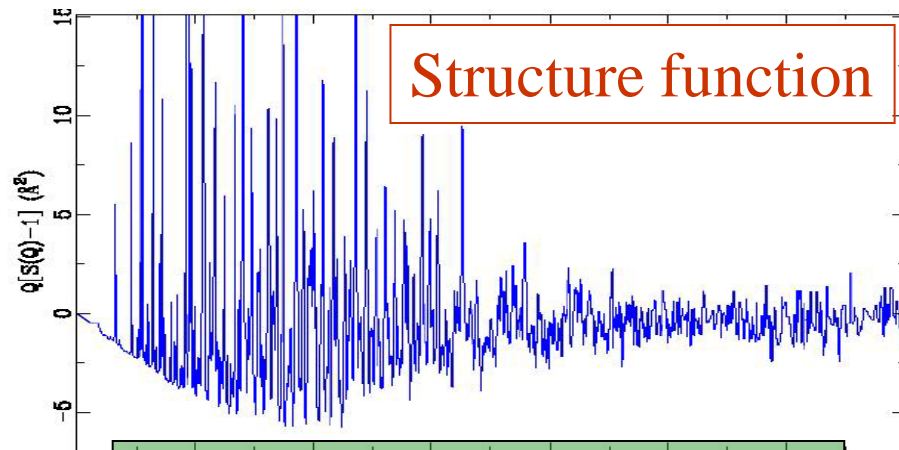
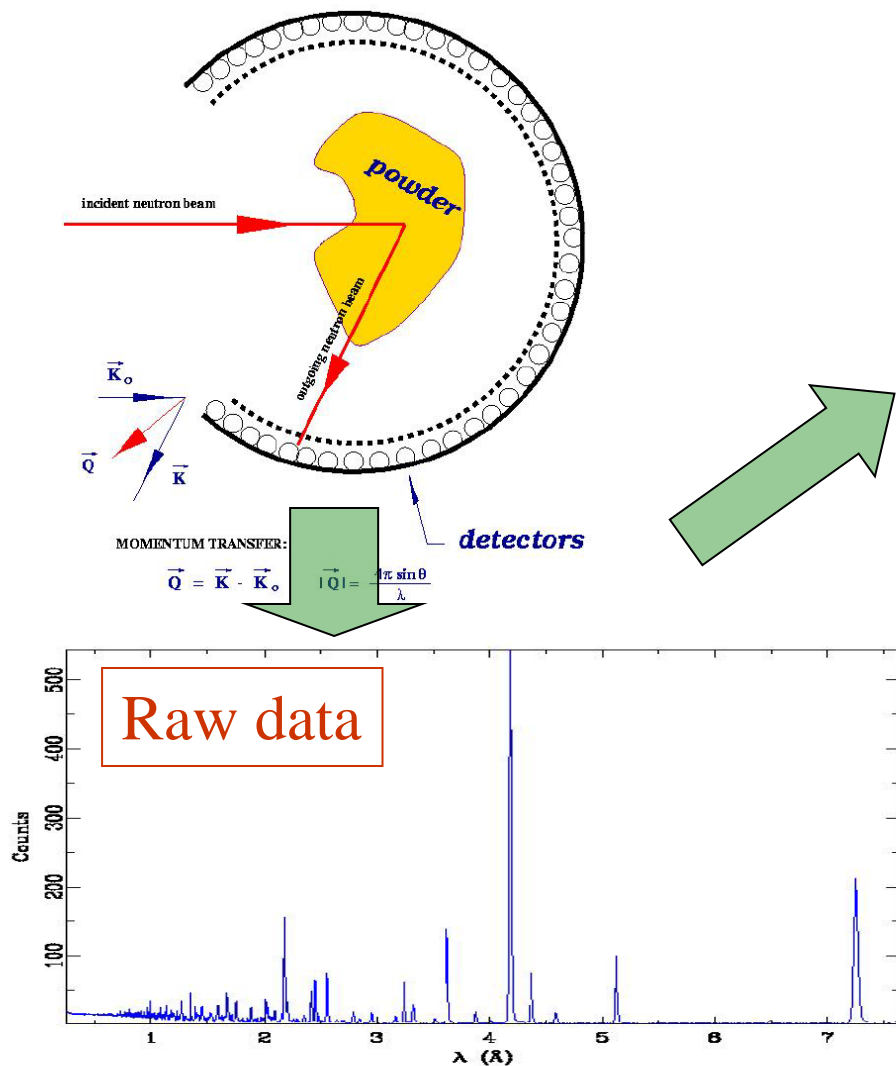
Finally the Pair Distribution Function



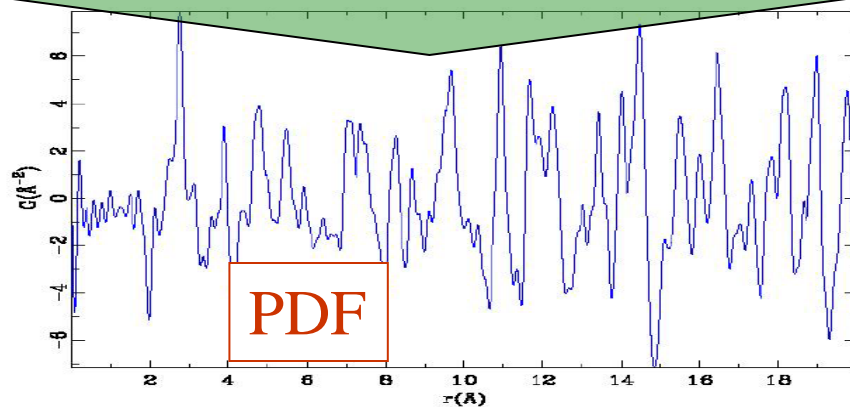
The PDF is the **Fourier transform** of the **total scattering** diffraction pattern !

Proffen, Z. Krist, 215, 661 (2000)

The atomic Pair Distribution Function

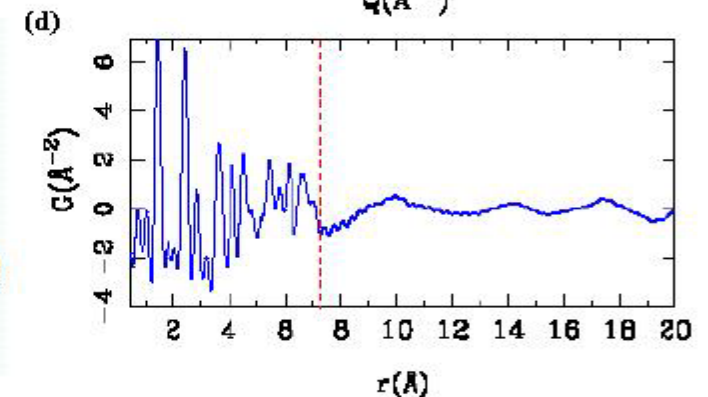
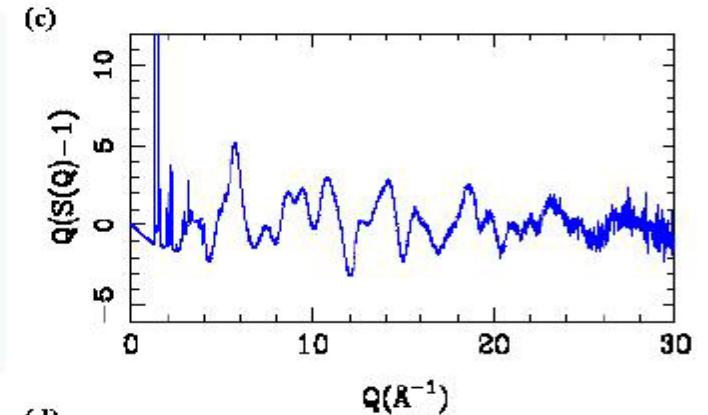
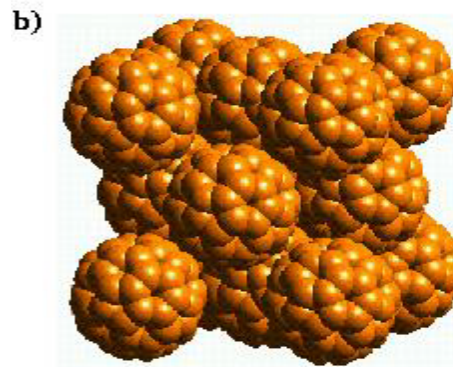
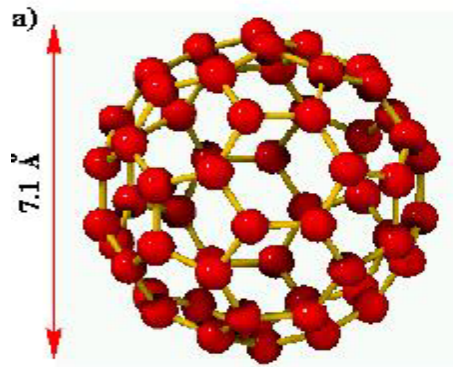


$$G(r) = \frac{2}{\pi} \int_0^{\infty} Q[S(Q) - 1] \sin Qr dQ$$

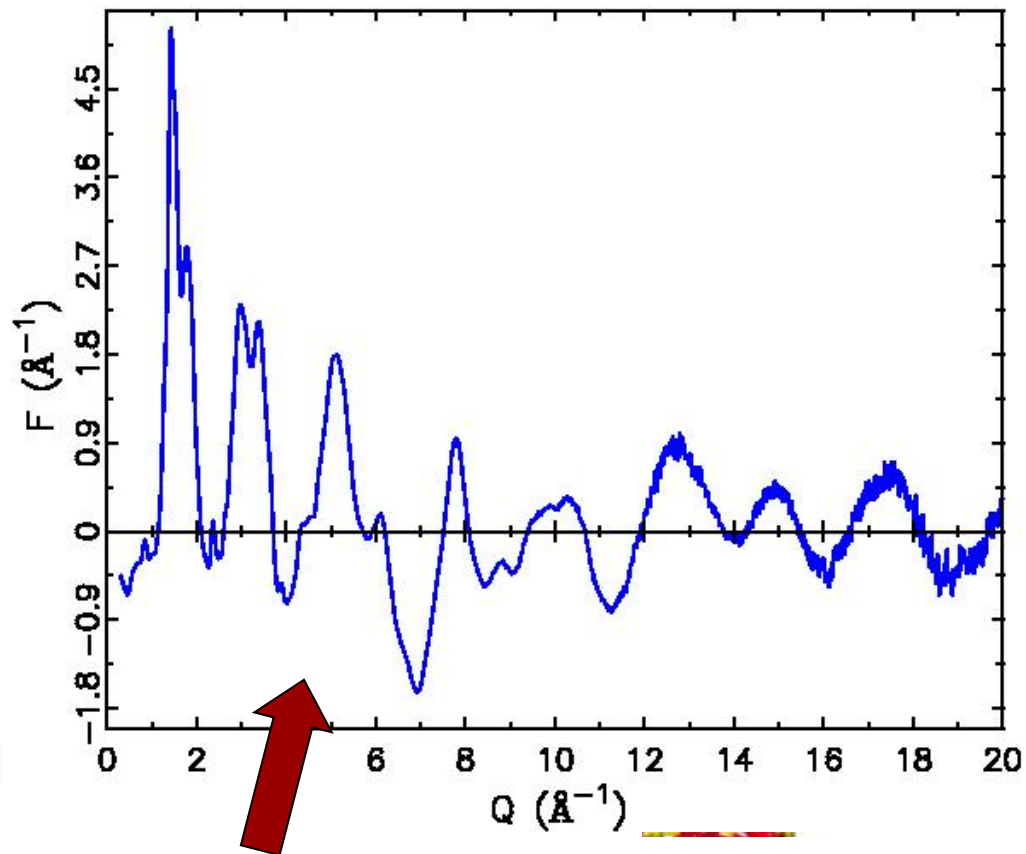
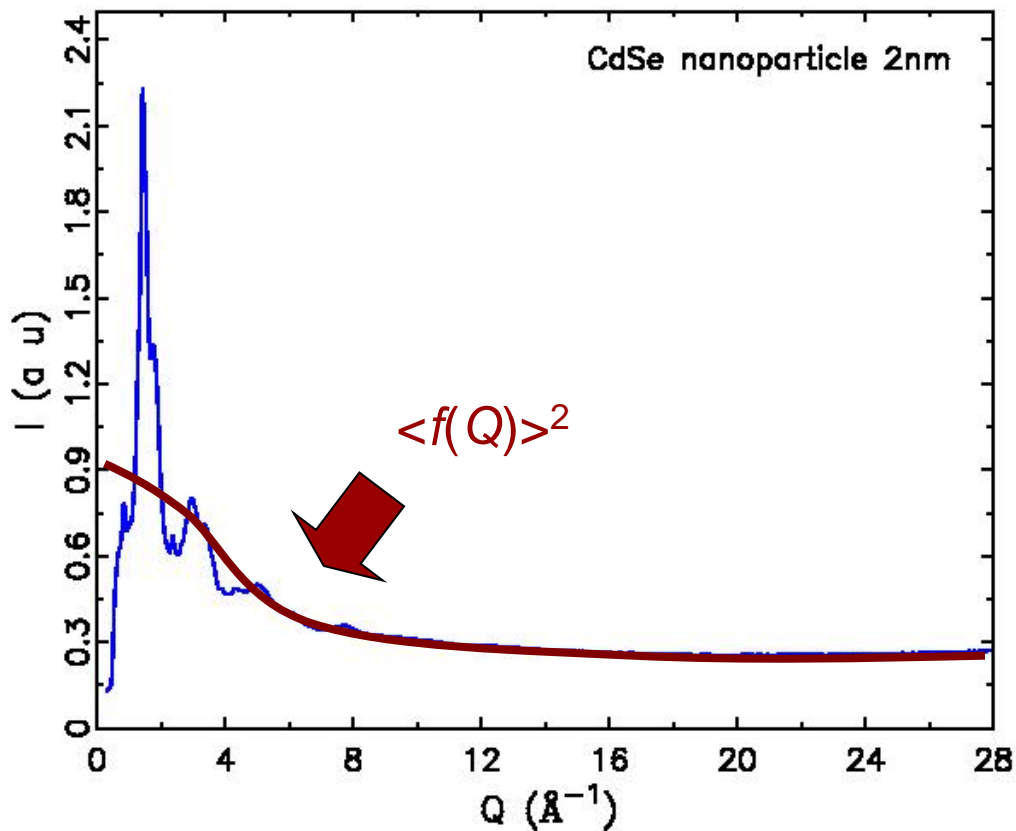


What is the PDF?

- Sit on an atom and look at your neighborhood
- $G(r)$ gives the probability of finding a neighbor at a distance r
- PDF is experimentally accessible
- PDF gives the local structure



But there is no information at high-Q...?



$$G(r) = \frac{2}{\pi} \int_0^{\infty} Q[S(Q) - 1] \sin Qr \, dQ$$

Computational issues: A Brief History of PDF



- Pieter Debye, 1915:

$$I = \sum_n \sum_m f_m f_n^* \frac{\sin qr_{mn}}{qr_{mn}}$$

- Fritz Zernike and Jon Prins, 1927:

$$4\pi r^2 \rho(r) = 4\pi r^2 \rho_a + \frac{2r}{\pi} \int_0^\infty qi(q) \sin qrdq$$



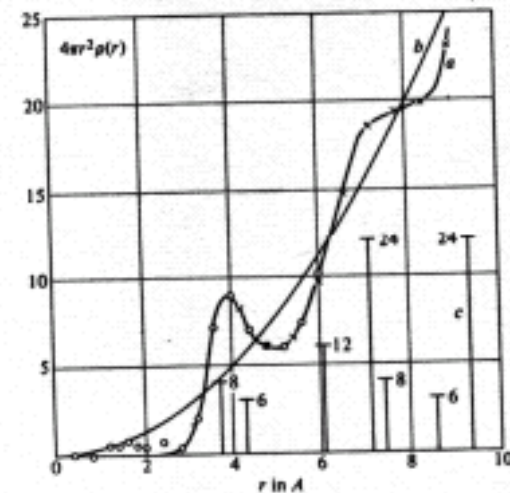
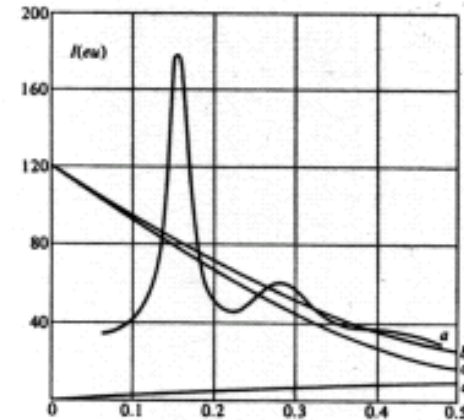
History

Debye and Menke, Z. Phys. (1930)

PDFs of mercury

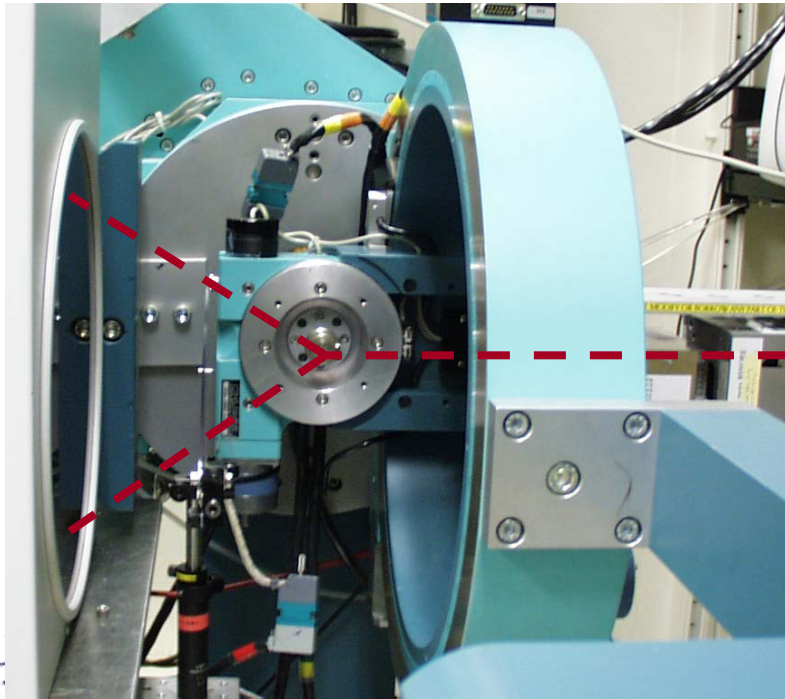
Tarasov, L. P., and Warren, B. E., (1936) *J. Chem. Phys.*, **4**, 236.

X-ray PDFs of molten sodium



The Atomic Pair Distribution Function (PDF) Method

- Use modern high intensity x-ray and neutron sources to collect unprecedentedly precise data
- Utilize all the information: **Bragg and diffuse scattering**
- Use modern computing capabilities to analyze, model and visualize the data

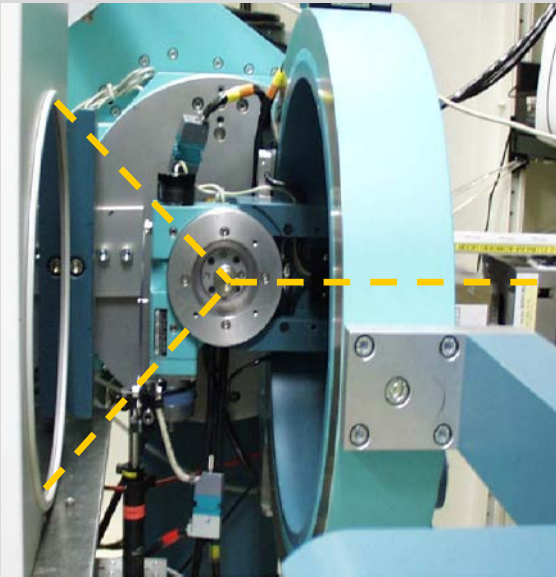


- Chupas et al., J. Appl. Crystallogr. (2003)
- Billinge-group, BNL, SUNY-SB, APS collaboration
- Main developments thanks to Pete Chupas and Xiangyun Qiu

X-ray PDF measurements

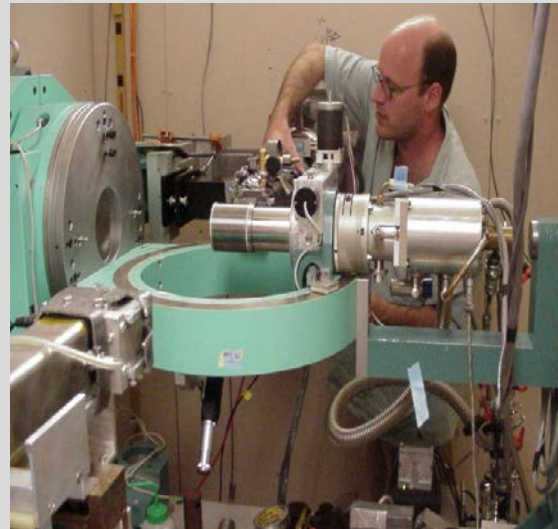
Area detector setup at high energy synchrotron beamlines.

- Fast (30 Hz)



Single/Multi energy dispersive detector setup.

- Slow (hours)
- Very high Q resolution



Laboratory diffractometers

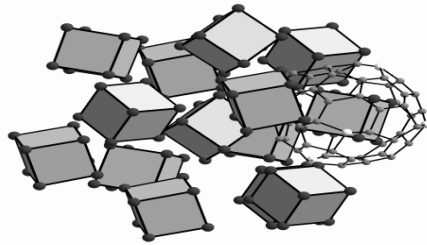
- Feasible with Mo or Ag radiation
- Limited Q_{max}
- Slow (hours)



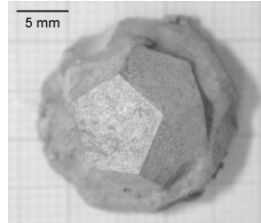
Synchrotron beamlines for PDF work

- NSLS-II @ Brookhaven National Laboratory
 - XPD
 - XPD-2 (under construction)
- APS @ Argonne National Laboratory
 - 11IDB, 11IDC
- ESRF
 - ID15, ID11, ID22
- Spring 8
 - various
- DESY
 - P07
- Diamond
 - XPDF (undergoing commissioning)

X-ray PDF: In-house measurements



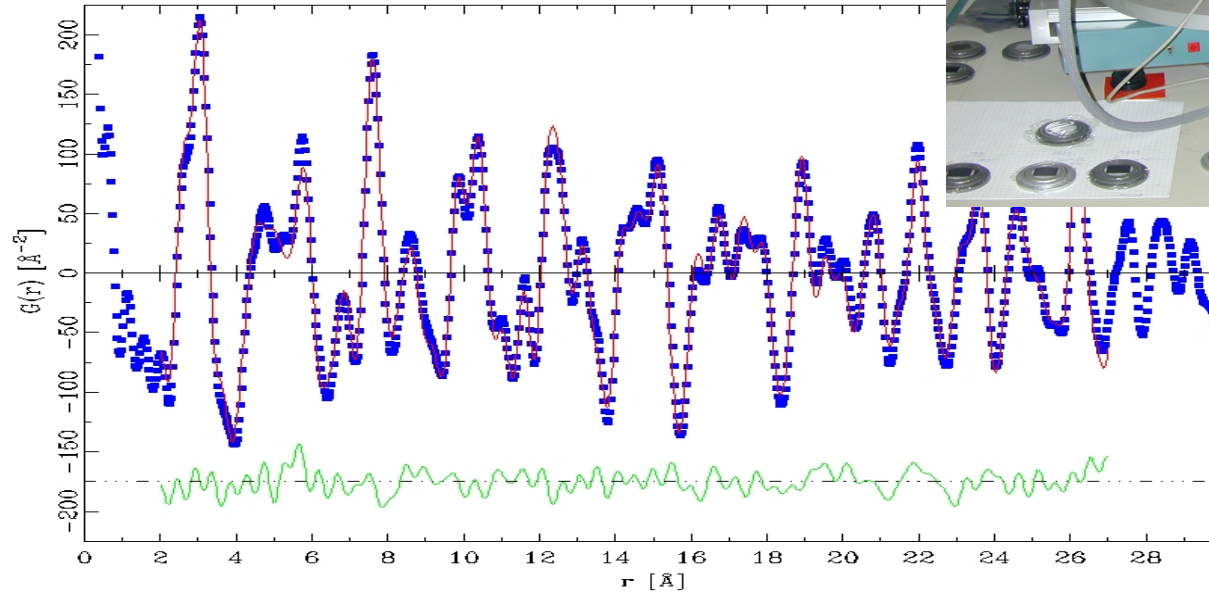
fci-Ho-Mg-Zn



Huber Guinier diffractometer
 $Q_{\max} = 13.5 \text{ \AA}^{-1}$

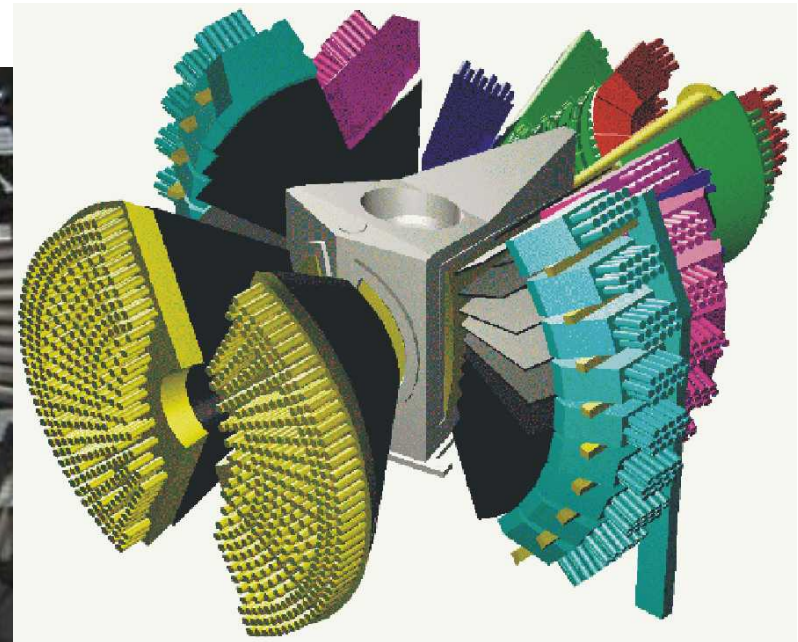


$\chi^2/1$ -model for *fci-Ho*₉*Mg*₂₆*Zn*₆₄
R=12.9%



Brühne et al., *Z. Kristallogr.* **219**
(2004) 245-258

RAPDF with Neutrons



POWGEN3 & NOMAD @SNS

D4 @ILL

GEM, POLARIS &
NIMROD @ISIS

PDFs from laboratory microscopes



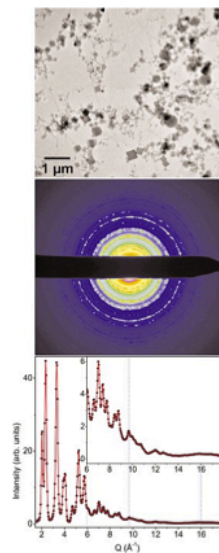
IN THE CITY OF NEW YORK

HAVEN
LABORATORY

Zeitschrift für Kristallographie

CRYSTALLINE
MATERIALS

CM



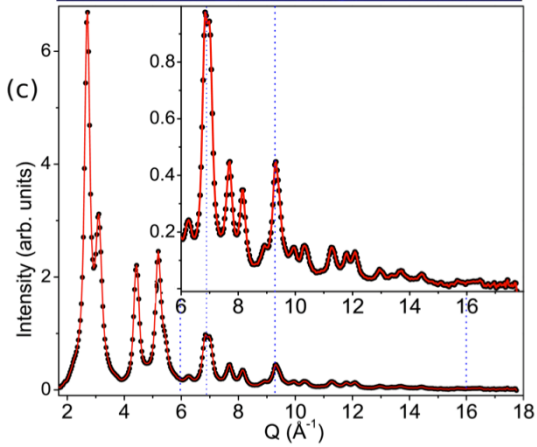
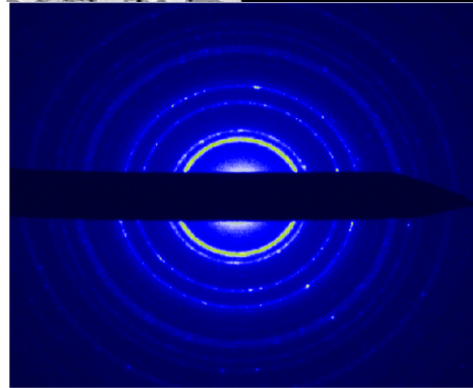
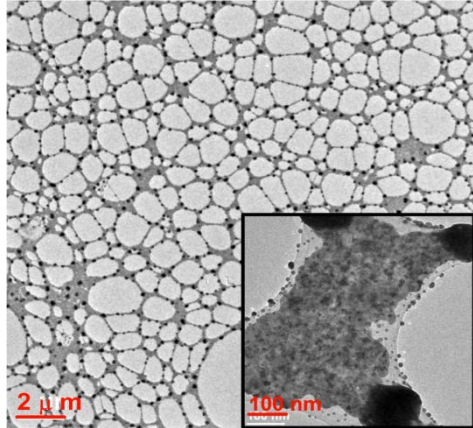
Volume 227 5/2012

Analysis of Complex Materials

Edited by Thomas Proffen and Reinhard B. Neder

Oldenbourg

Au (1000) Å particles

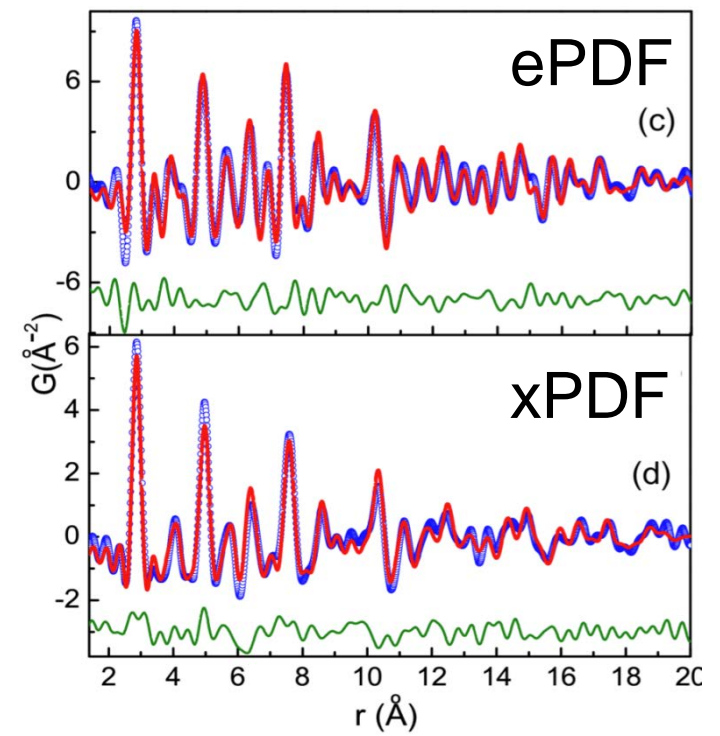
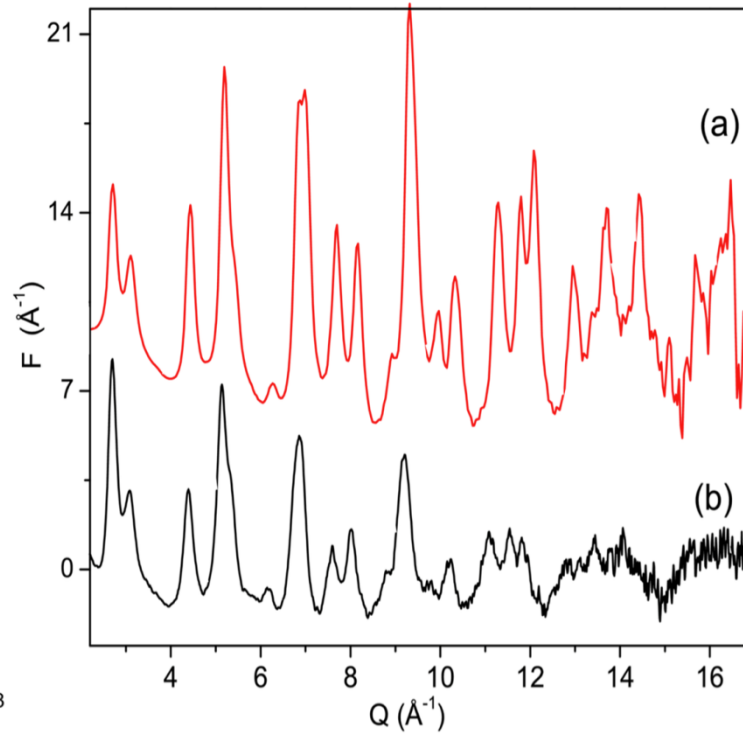


	ePDF (film)	ePDF (NP)	xPDF
Q_{\max} (\AA^{-1})	15.25	15.25	15.25
Fit range (\AA)	1–20	1–20	1–20
Cell parameter (\AA)	4.075(3)	4.076(2)	4.058(1)
U_{iso} (\AA^2)	0.033(4)	0.006 (3)	0.014(1)
Diameter (\AA)	$\sim 27^a$	$\sim 1000^b$	24.51(9)
Q -damp (\AA^{-1})	0.095(5)	0.095(5)	0.047(2)
R_w (%)	17	24	20

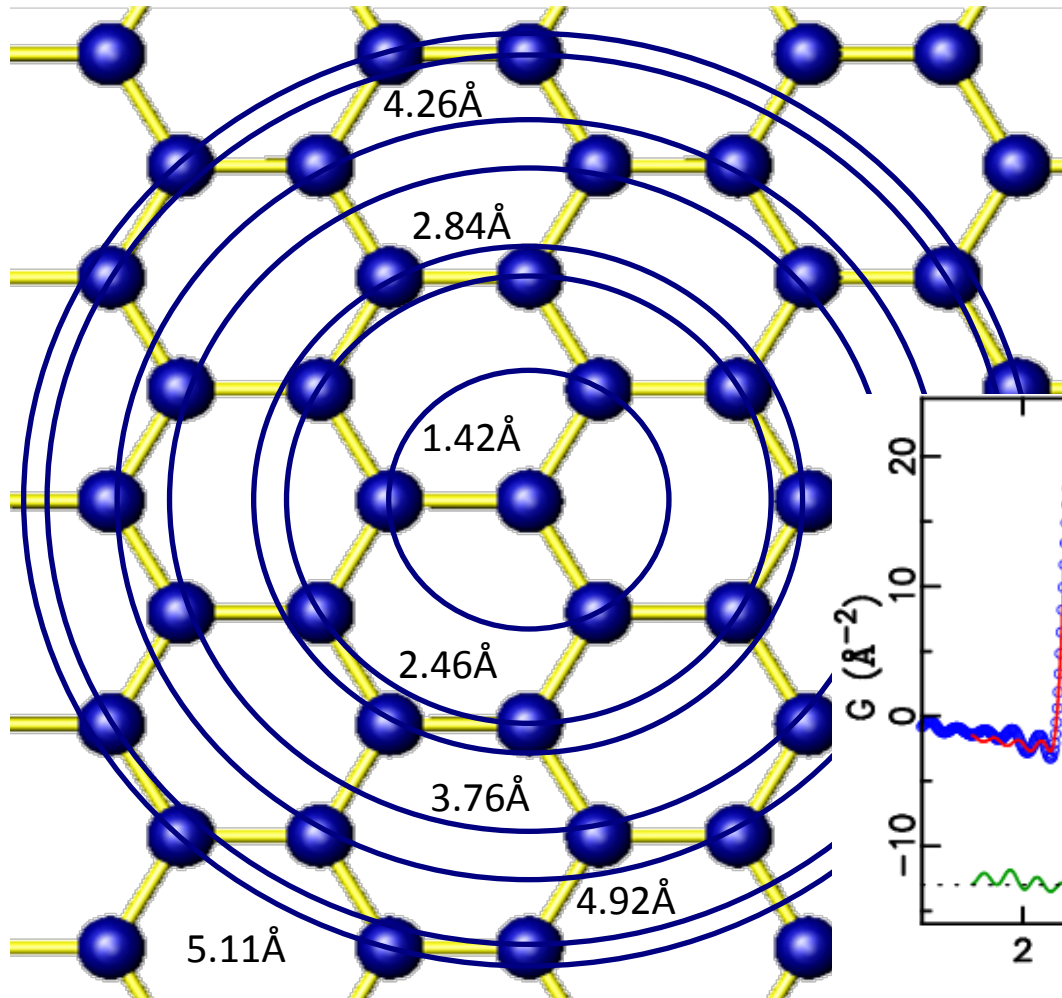
a: film thickness measured during deposition

b: NP diameter estimated directly from the TEM image

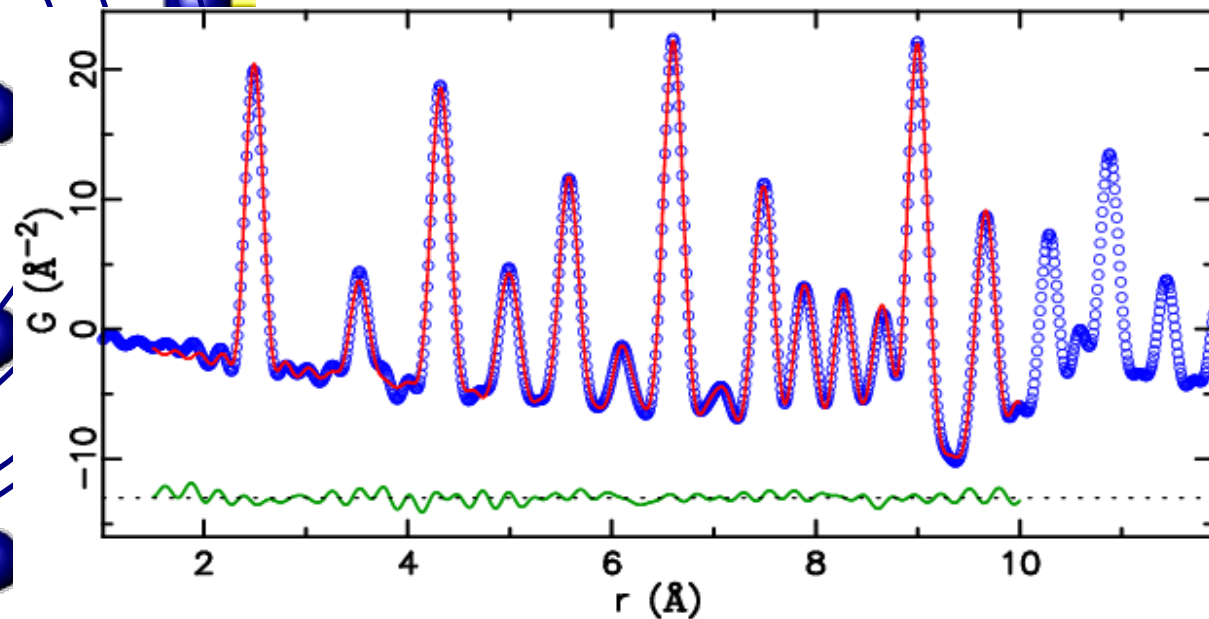
ePDFsuite software. Ask for details



Nanostructure refinement



Pair distribution function (PDF) gives the probability of finding an atom at a distance “r” from a given atom.



Modeling summary

- **Small Box modeling**

- Similar in nature to Rietveld refinement of powder diffraction data
- Small number of parameters, highly constrained fits
- Danger of model bias, difficult to find distorted solutions.
- Exemplars: PDFgui

- **Large Box modeling**

- Large number of atoms in a box allowed to move around to get good fits
- Small number of constraints, exploratory unbiased fitting distorted solutions
- Danger of overfitting and degenerate solutions. Difficult uncertainties
- Exemplars: RMCprofile, RMC and Diffey in DISCUS, E

- **George Box modeling**

- All models are wrong; some models are useful.
 - George E. P. Box, William Hunter and Stuart Hunter
Experimenters, second edition, 2005, page 440.



PDFgui

- Used to be called “real-space Rietveld”
 - Starting point is a crystallographic description of the model
 - Small Unit cell, periodic boundary conditions
 - Fits to $G(r)$ which is the FT of $F(Q)$
- PDFgui
 - Available from diffpy.org
 - Development funded by NSF-DANSE program



Fit Tree

- PbSe
 - PbSe.cif
 - PbSe.gr

Plot Control

X:

Y:

offset:

Configure Constraints Results

Phase Configuration

a b c

alpha beta gamma

Scale Factor

delta1 delta2 spdiameter

sratio rcut stepcut

Included Pairs

	elem	x	y	z	u11	u22	u33	u12	u13	u23	occ
1	Pb	0.5	0.5	0.5	0.0186431	0.0186431	0.0186431	0.0	0.0	0.0	1.0
2	Pb	0.5	0.0	0.0	0.0186431	0.0186431	0.0186431	0.0	0.0	0.0	1.0
3	Pb	0.0	0.5	0.0	0.0186431	0.0186431	0.0186431	0.0	0.0	0.0	1.0
4	Pb	0.0	0.0	0.5	0.0186431	0.0186431	0.0186431	0.0	0.0	0.0	1.0
5	Se	0.0	0.0	0.0	0.0143116	0.0143116	0.0143116	0.0	0.0	0.0	1.0
6	Se	0.0	0.5	0.5	0.0143116	0.0143116	0.0143116	0.0	0.0	0.0	1.0
7	Se	0.5	0.0	0.5	0.0143116	0.0143116	0.0143116	0.0	0.0	0.0	1.0
8	Se	0.5	0.5	0.0	0.0143116	0.0143116	0.0143116	0.0	0.0	0.0	1.0



Fit Tree

- PbSe
- PbSe.cif
- PbSe.gr

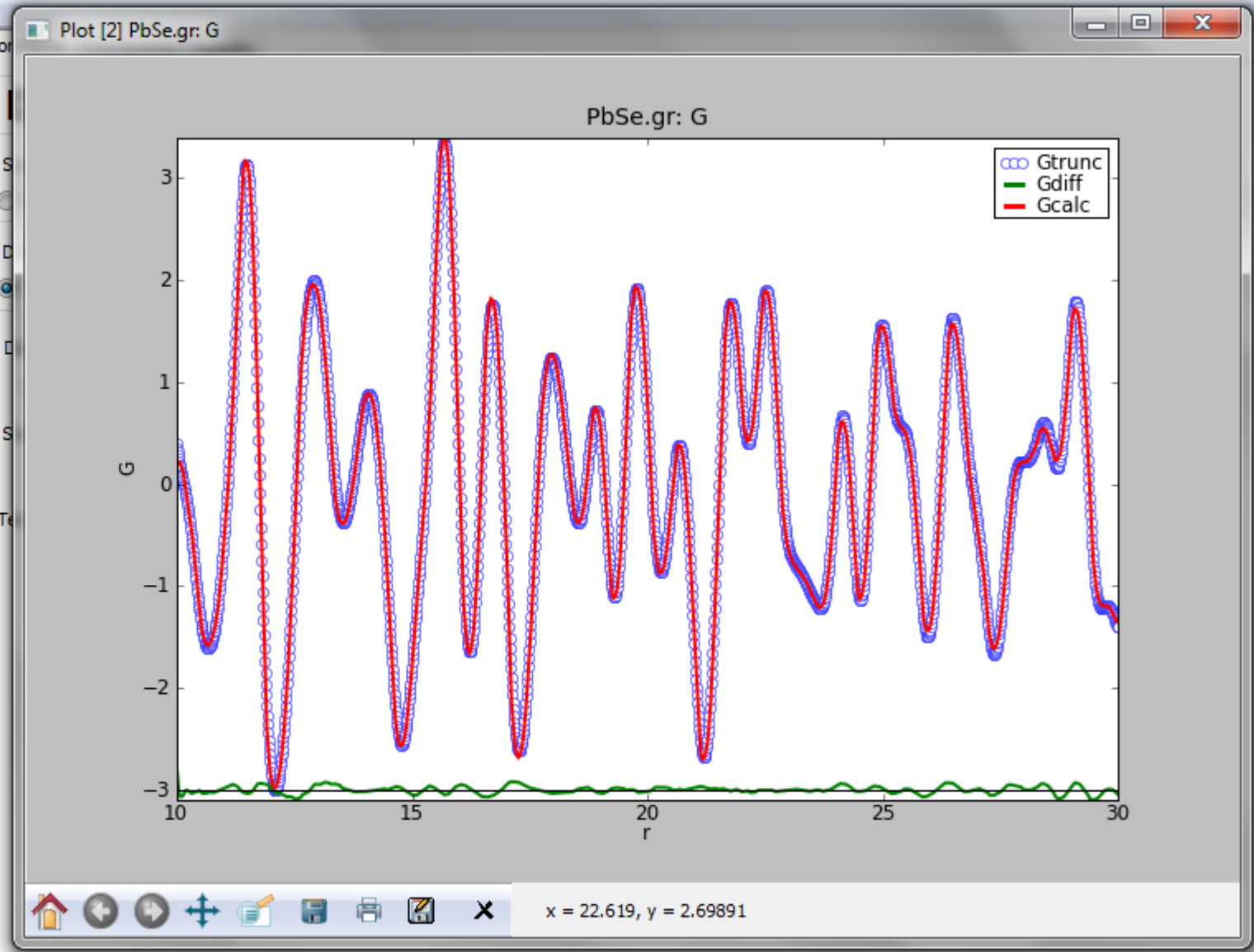
Plot Control

X: step

Y: Gcalc, Gdiff, Gobs, Gtrunc, crw, dGcalc

offset: -3

Plot Reset

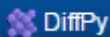


CMI: complex modeling infrastructure

- CMI

- Also available at diffpy.org
- Very powerful
- Very difficult to use
- We are working on a more friendly user interface and better documentation, but for now it is advised to contact us and we can help you get started

Diffpy-Complex Modeling Infrastructure: Diffpy-CMI



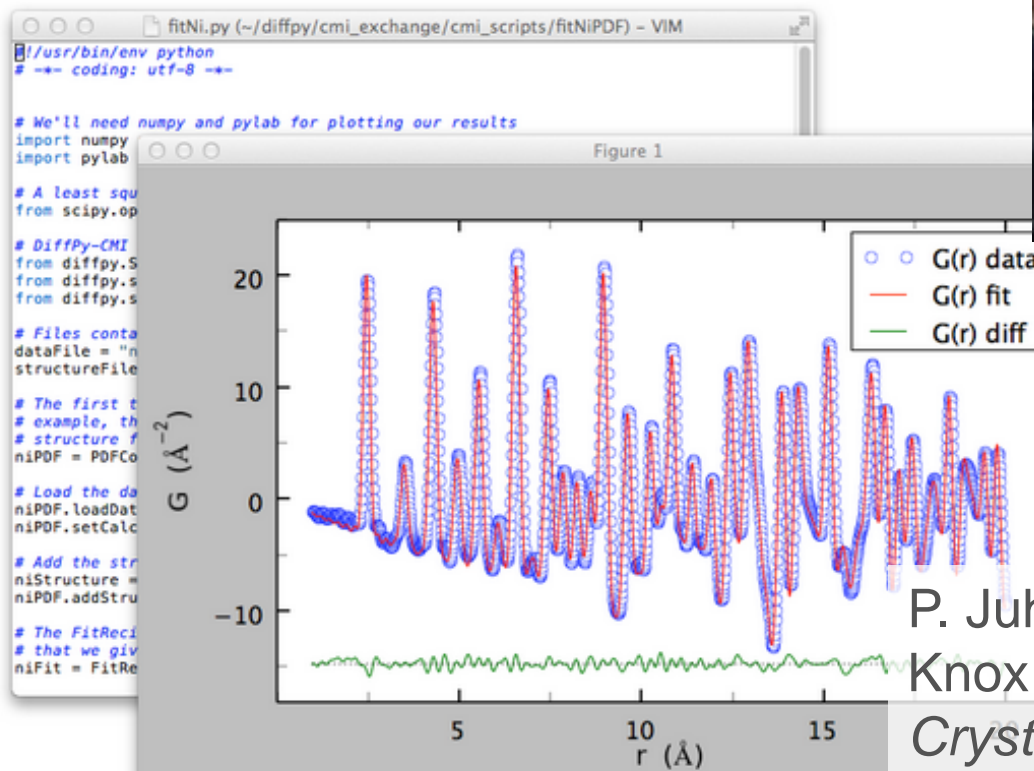
Community Publications Products -

DiffPy-CMI

DiffPy-CMI is our complex modeling framework. It is a highly flexible library of Python modules for robust modeling of nanostructures in crystals, materials.

The software provides functionality for storage and manipulation of structure data and calculation of structure-based quantities, such as PDF, SA overlaps, bond lengths, and coordinations. Most importantly the DiffPy-CMI package contains a fitting framework for combining multiple experimental data into a single problem.

This is an early release of code that is under intense development, with support for installation on Unix, Linux, and Macintosh machines. The software will evolve rapidly, but we want to make the code available at the earliest possible date. Please make use of the software and provide feedback as you go, but please be patient and check back frequently for updates.



P. Juhás, C. L. Farrow, X. Yang, K. R. Knox and S. J. L. Billinge, *Acta Crystallogr. A*, (2015).

thebillinge.com

untitled

```
1  #!/usr/bin/env python
2  # -*- coding: utf-8 -*-
3
4
5  # We'll need numpy and pylab for plotting our results
6  import numpy as np
7  import pylab
8
9  # A least squares fitting algorithm from scipy
10 from scipy.optimize.minpack import leastsq
11
12 # DiffPy-CMI modules for building a fitting recipe
13 from diffpy.Structure import loadStructure
14 from diffpy.srfit.pdf import PDFContribution
15 from diffpy.srfit.fitbase import FitRecipe, FitResults
16
17 # Files containing our experimental data and structure file
18 dataFile = "ni-q27r100-neutron.gr"
19 structureFile = "ni.cif"
20 spaceGroup = "Fm-3m"
21
22 # The first thing to construct is a contribution. Since this is a simple
23 # example, the contribution will simply contain our PDF data and an associated
24 # structure file. We'll give it the name "nickel"
25 niPDF = PDFContribution("nickel")
26
27 # Load the data and set the r-range over which we'll fit
28 niPDF.loadData(dataFile)
29 niPDF.setCalculationRange(xmin=1, xmax=20, dx=0.01)
30
31 # Add the structure from our cif file to the contribution
32 niStructure = loadStructure(structureFile)
33 niPDF.addStructure("nickel", niStructure)
34
35 # The FitRecipe does the work of calculating the PDF with the fit variable
36 # that we give it.
37 niFit = FitRecipe()
38
39 # give the PDFContribution to the FitRecipe
40 niFit.addContribution(niPDF)
41
42 # Configure the fit variables and give them to the recipe. We can use the
```

untitled

```
66
67 # Turn off printout of iteration number.
68 niFit.clearFitHooks()
69
70 # We can now execute the fit using scipy's least square optimizer.
71 print "Refine PDF using scipy's least-squares optimizer:"
72 print " variables:", niFit.names
73 print " initial values:", niFit.values
74 leastsq(niFit.residual, niFit.values)
75 print " final values:", niFit.values
76 print
77
78 # Obtain and display the fit results.
79 niResults = FitResults(niFit)
80 print "FIT RESULTS\n"
81 print niResults
82
83 # Plot the observed and refined PDF.
84
85 # Get the experimental data from the recipe
86 r = niFit.nickel.profile.x
87 gobs = niFit.nickel.profile.y
88
89 # Get the calculated PDF and compute the difference between the calculated and
90 # measured PDF
91 gcalc = niFit.nickel.evaluate()
92 baseline = 1.1 * gobs.min()
93 gdiff = gobs - gcalc
94
95 # Plot!
96 pylab.figure()
97 pylab.plot(r, gobs, 'bo', Label="G(r) data",
98           markerfacecolor='none', markeredgecolor='b')
99 pylab.plot(r, gcalc, 'r-', Label="G(r) fit")
100 pylab.plot(r, gdiff + baseline, 'g-', Label="G(r) diff")
101 pylab.plot(r, np.zeros_like(r) + baseline, 'k:')
102 pylab.xlabel(r"r ($\AA$)")
103 pylab.ylabel(r"G ($\AA^{-2}$)")
104 pylab.legend()
105
106 pylab.show()
107
```

Diffpy project (BNL LDRD)

Complex Modeling infrastructure: Diffpy-CMI

Official release of Diffpy-CMI v0.1

www.diffpy.org



Community Publications Products ▾

Search

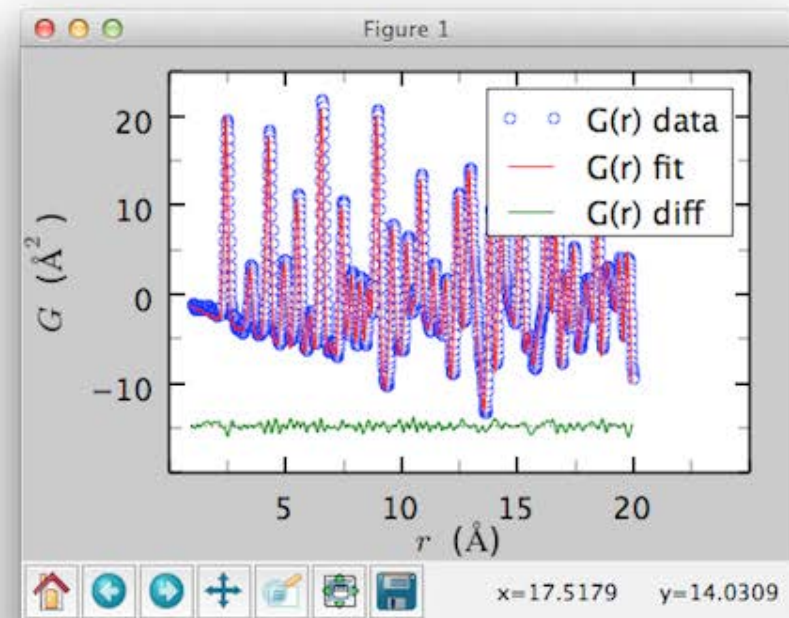
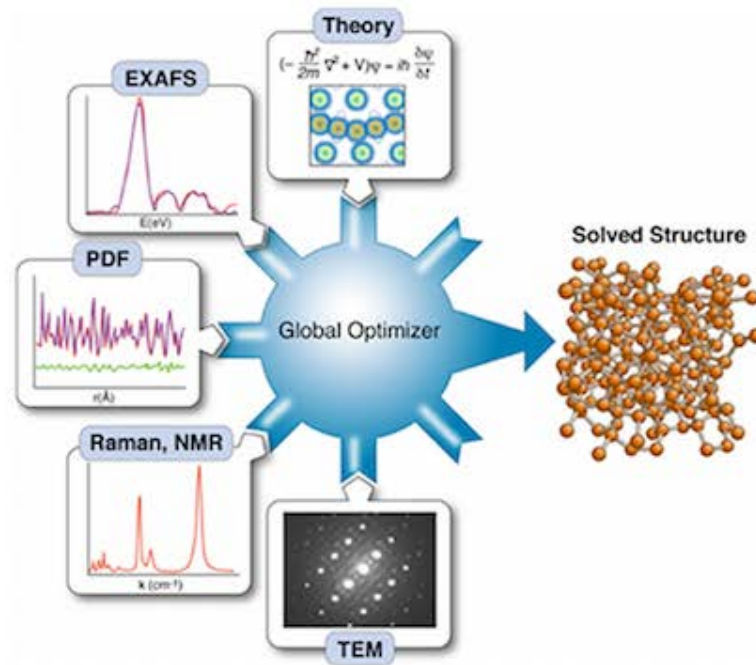
DiffPy-CMI is now available!

Get DiffPy-CMI

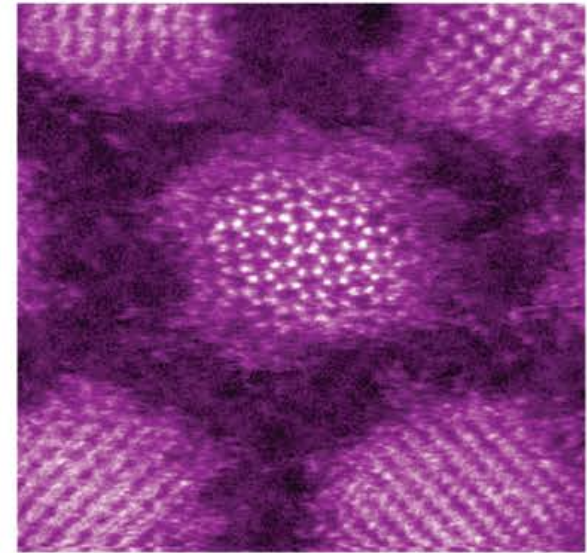
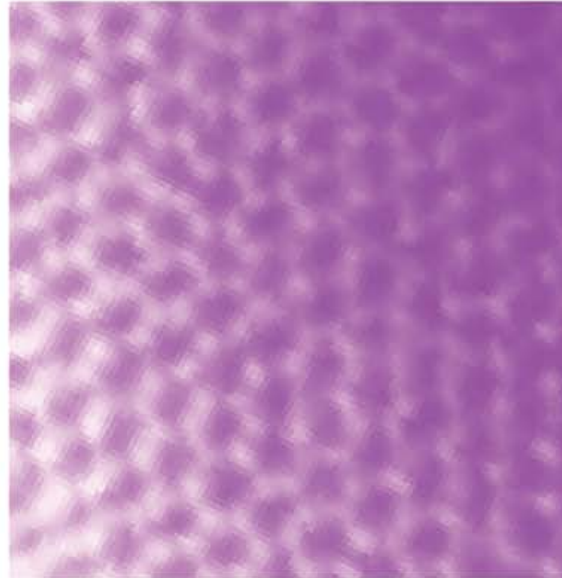
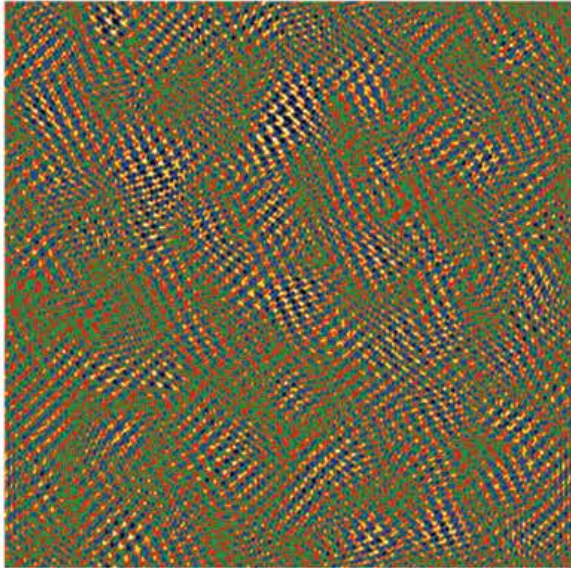
Credits

DiffPy - Atomic Structure Analysis in Python

A free and open source software project to provide python software for diffraction analysis and the study of the atomic structure of materials.



Nanomaterials



The Nanoparticle structure problem

1. Powder of similar but not identical powders
 1. Structure
 2. Defects
 3. TD properties Pt NPs

Quantum Dot solar cells

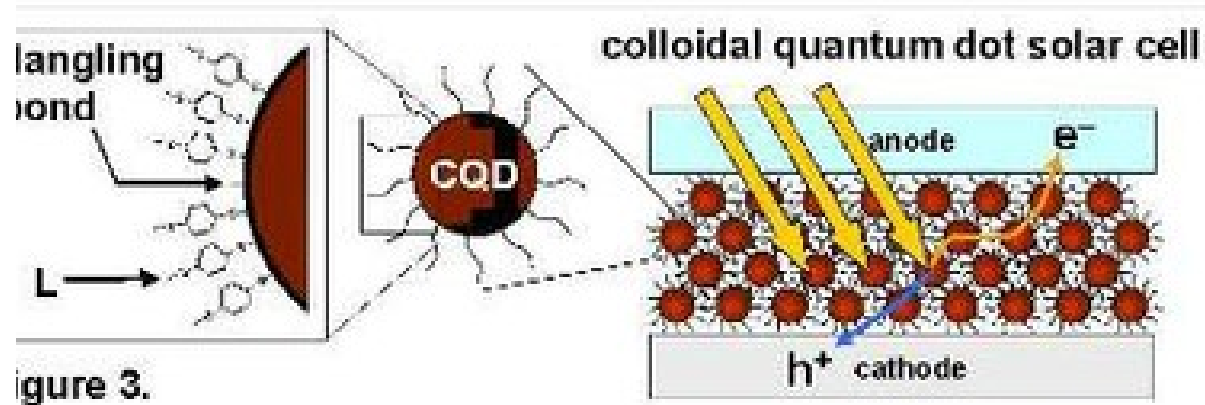
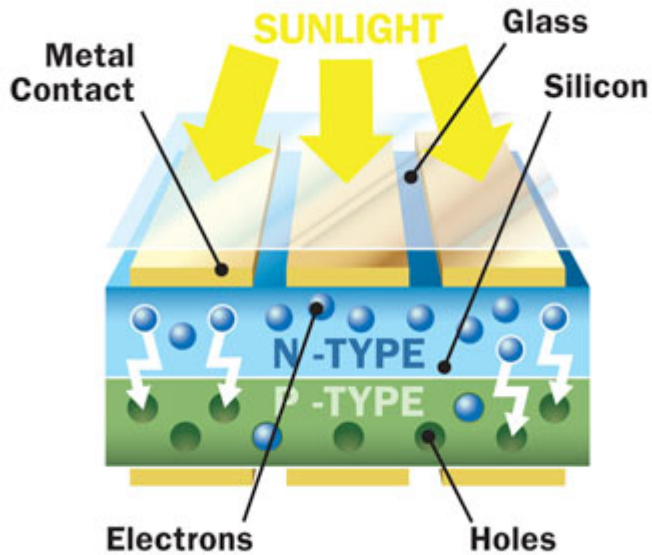
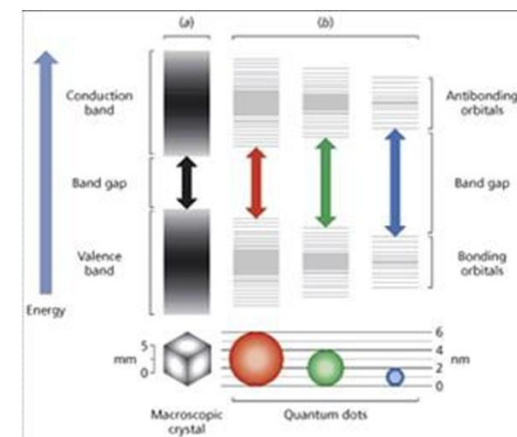
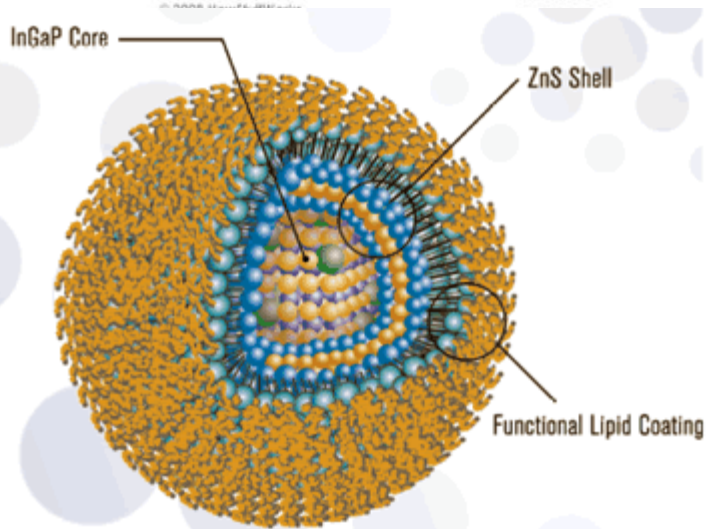
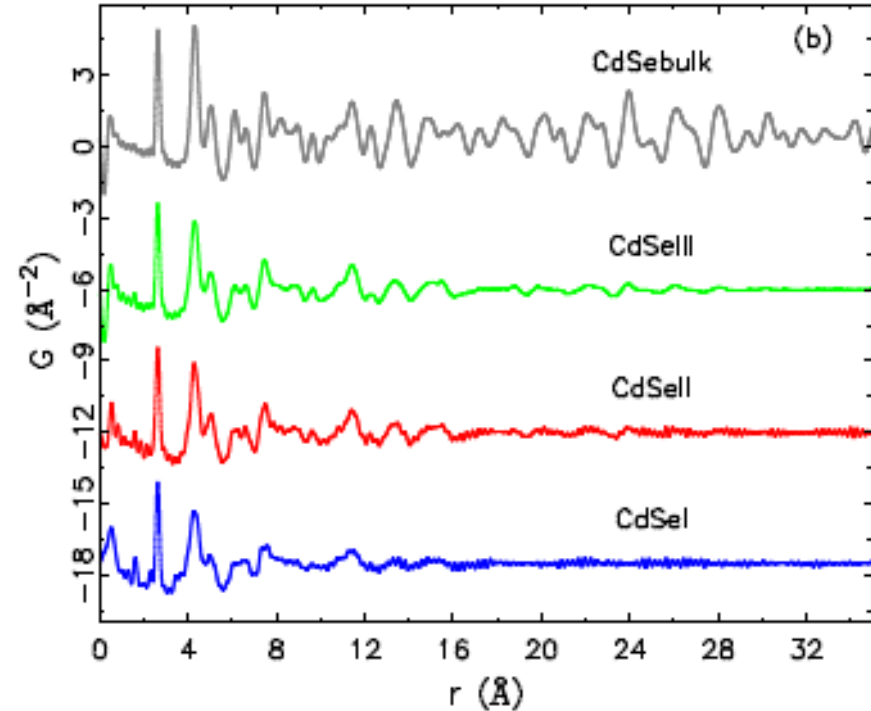
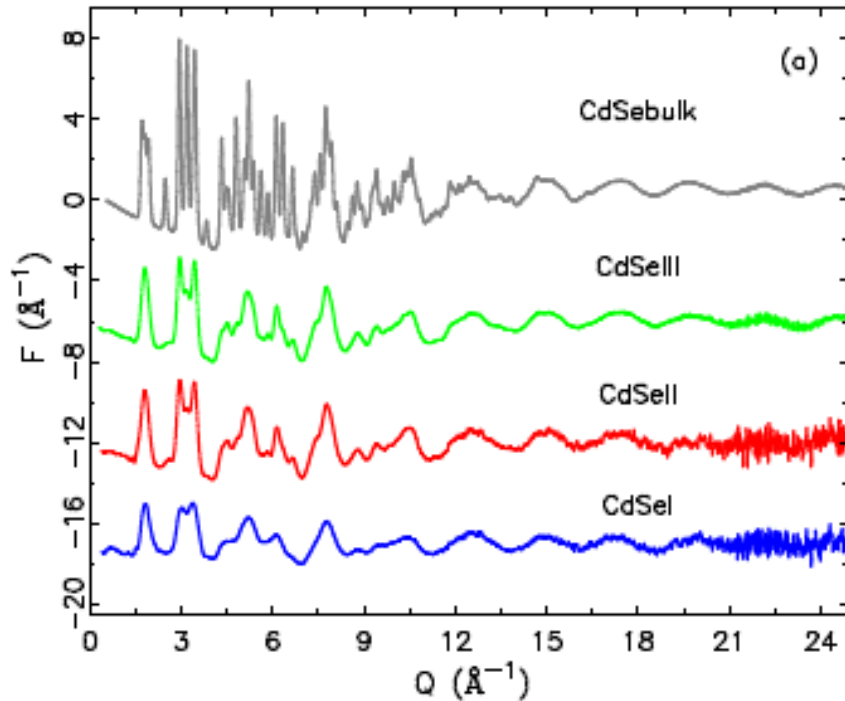


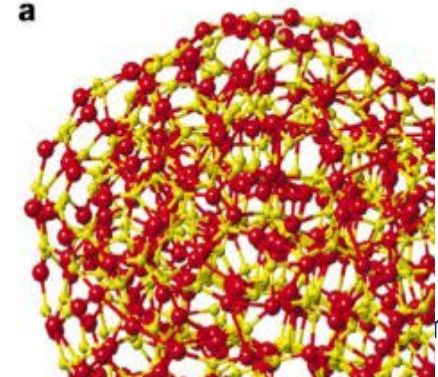
Figure 3.



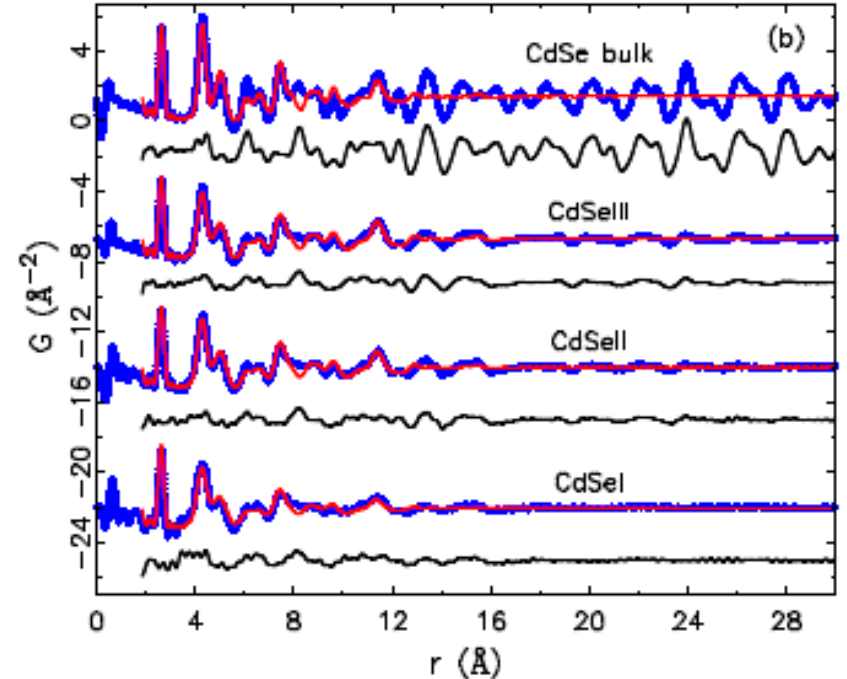
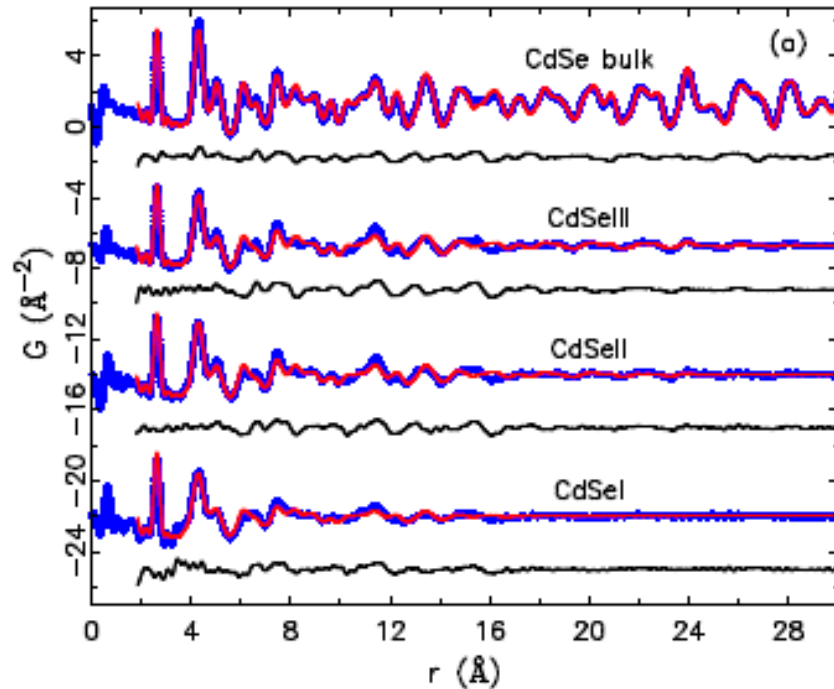
CdSe quantum dots



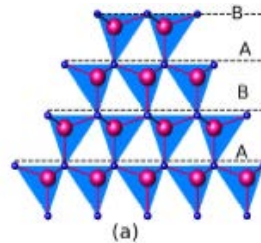
- RAPDF experiments at APS, Sector 6
- Work of grad student Ahmad Masadeh
- Masadeh, SJB *et al.* PRB **76**, 115413 (2007)



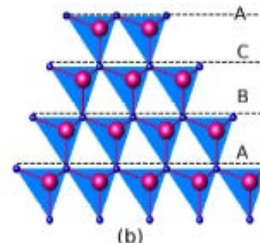
Structure of the CdSe core

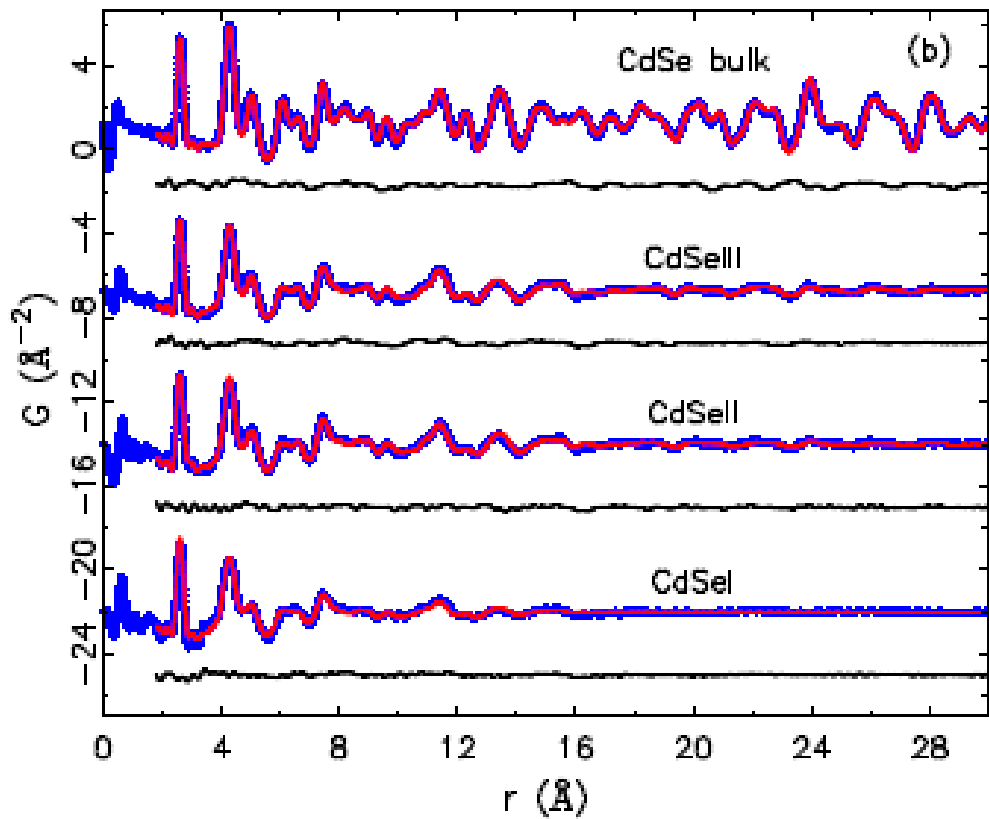


- Wurtzite structure



- Zinc blende structure



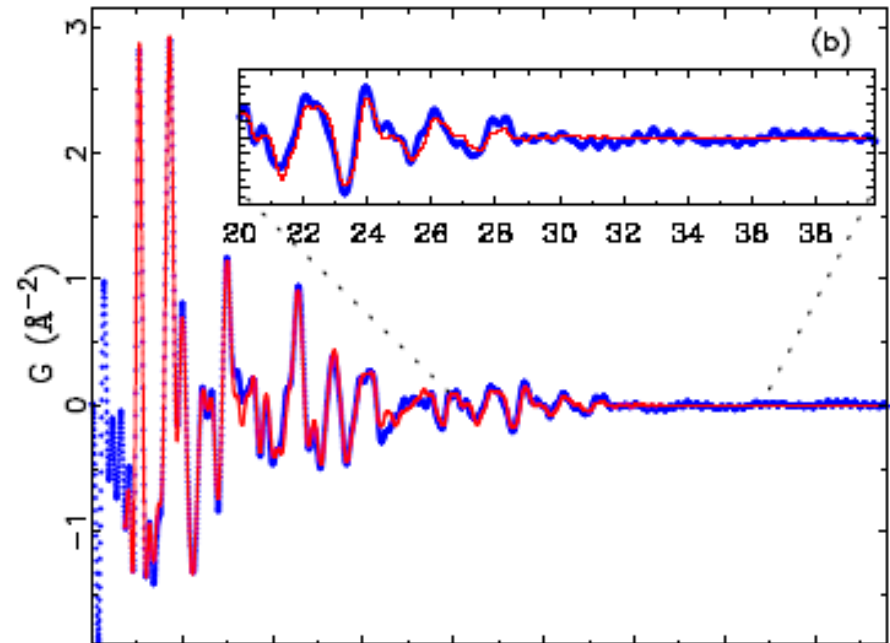
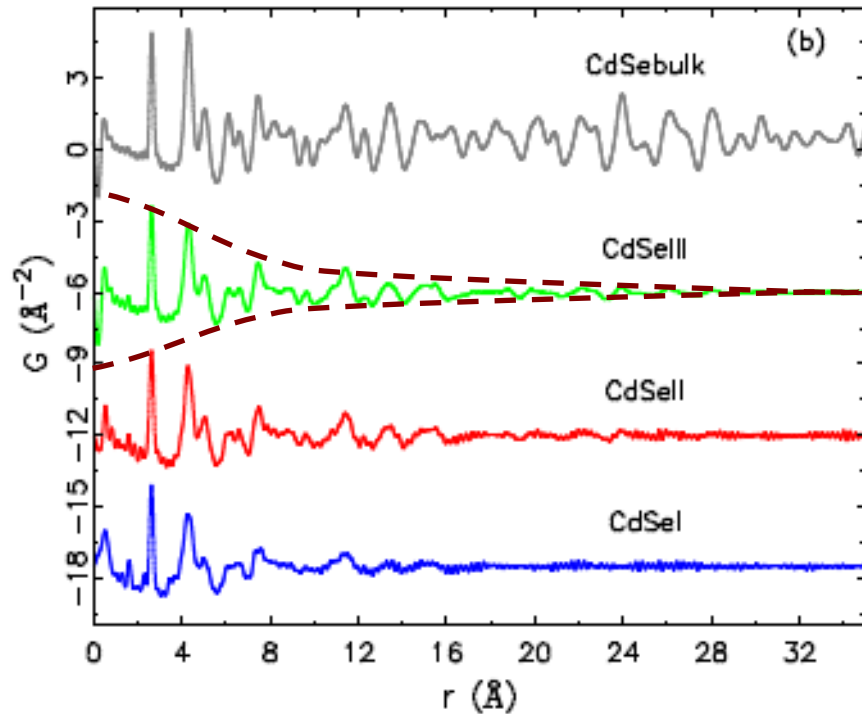


Masadeh, SJB *et al.* PRB 76,
115413 (2007)

Thanks to Reinhard Neder for
help with stacking fault
models

	CdSe-bulk		CdSeIII		CdSeII		CdSeI	
Stacking fault density (%)	0.0	33.0	0.0	50.0	0.0	50.0	0.0	50.0
a (Å)	4.3014(4)	4.3012(4)	4.2997(9)	4.2987(9)	4.3028(9)	4.3015(9)	4.2930(9)	4.2930(8)
c (Å)	7.0146(9)	7.0123(9)	7.0145(4)	7.0123(4)	6.9987(9)	6.9975(9)	6.9405(9)	6.9405(7)
Se <i>Z</i> -frac.	0.3774(3)	0.3771(3)	0.3761(9)	0.3759(9)	0.3751(6)	0.3747(6)	0.3685(9)	0.3694(9)
Cd $U_{11} = U_{22}$ (Å ²)	0.0108(2)	0.0102(2)	0.0146(7)	0.0149(7)	0.0149(6)	0.0112(5)	0.0237(9)	0.0213(8)
U_{33} (Å ²)	0.0113(3)	0.0112(3)	0.0262(9)	0.0241(9)	0.0274(9)	0.0271(9)	0.0261(9)	0.0281(9)
Se $U_{11} = U_{22}$ (Å ²)	0.0109(9)	0.0102(9)	0.0077(7)	0.0138(7)	0.0083(7)	0.0121(7)	0.0110(9)	0.0191(9)
U_{33} (Å ²)	0.0462(9)	0.0115(9)	0.1501(9)	0.02301(9)	0.1628(9)	0.0265(9)	0.1765(9)	0.0311(9)
NP ^a diameter (nm)	∞	∞	3.7(1)	3.7(1)	3.1(1)	3.1(1)	2.4(2)	2.2(2)
R_w	0.12	0.09	0.20	0.14	0.18	0.15	0.27	0.21

Size of the structural core



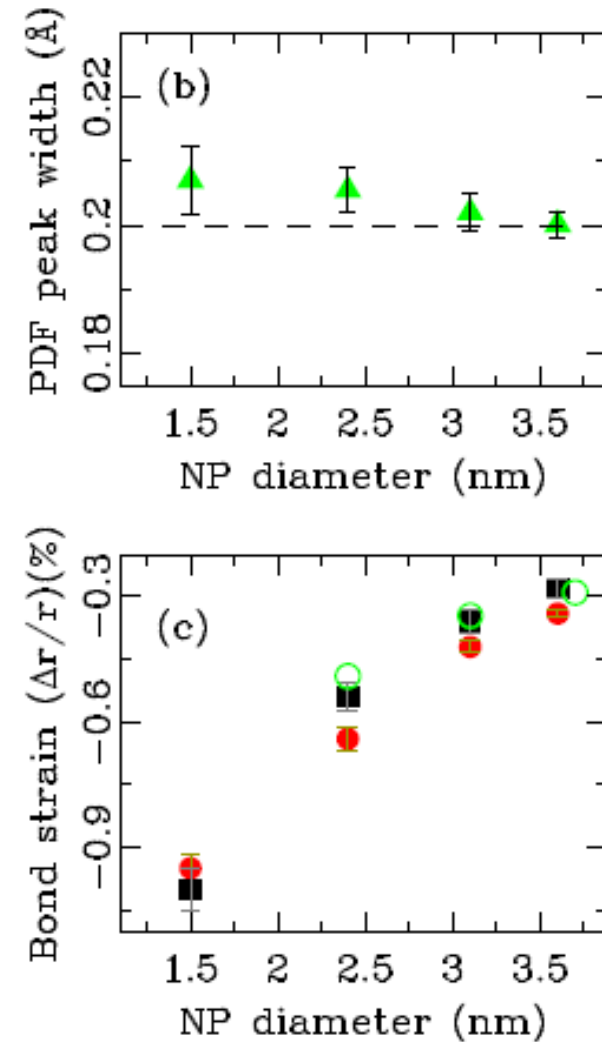
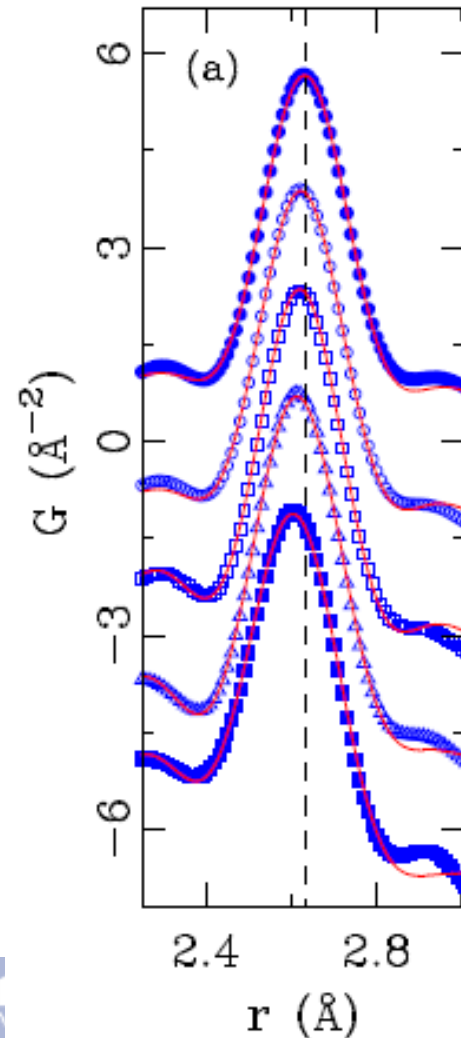
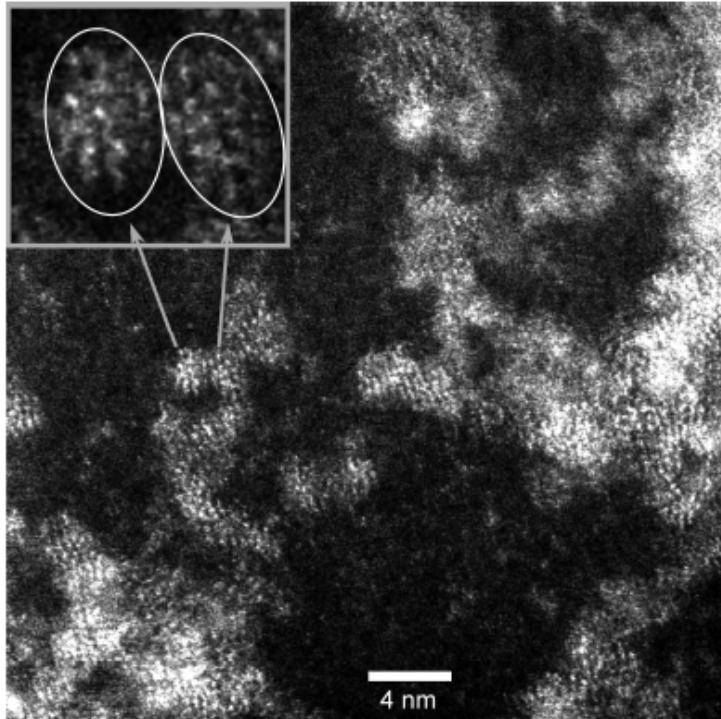
$$f(r, d) = \left[1 - \frac{3r}{2d} + \frac{1}{2} \left(\frac{r}{d} \right)^3 \right] \Theta(d - r),$$

- Masadeh, SJB *et al.* PRB **76**, 115413 (2007)
- Also see Shamoto paper, JAC 2007

TABLE I: CdSe nanoparticle diameter as determined using various methods.

	CdSeIII	CdSeII	CdSeI
Nucleation time (s)	1200	630	15
Diameter (nm)			
TEM	3.5(2)	2.7(2)	2.0(2)
UV-vis	3.5(4)	2.9(3)	≤ 1.90
PL	3.6(4)	2.9(3)	≤ 2.1
PDF	3.7(1)	3.1(1)	2.2(2)

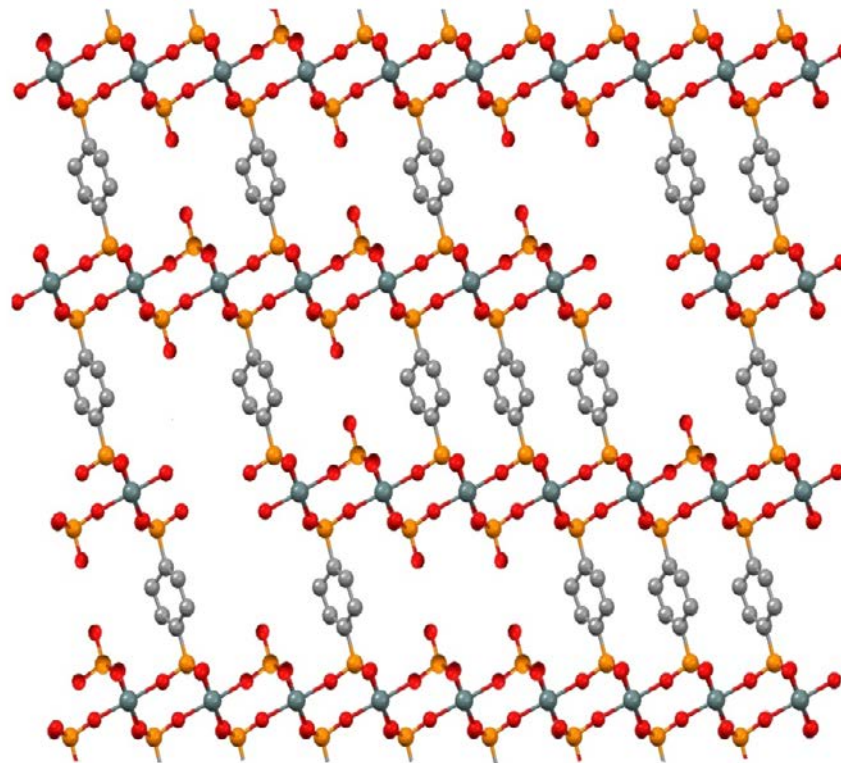
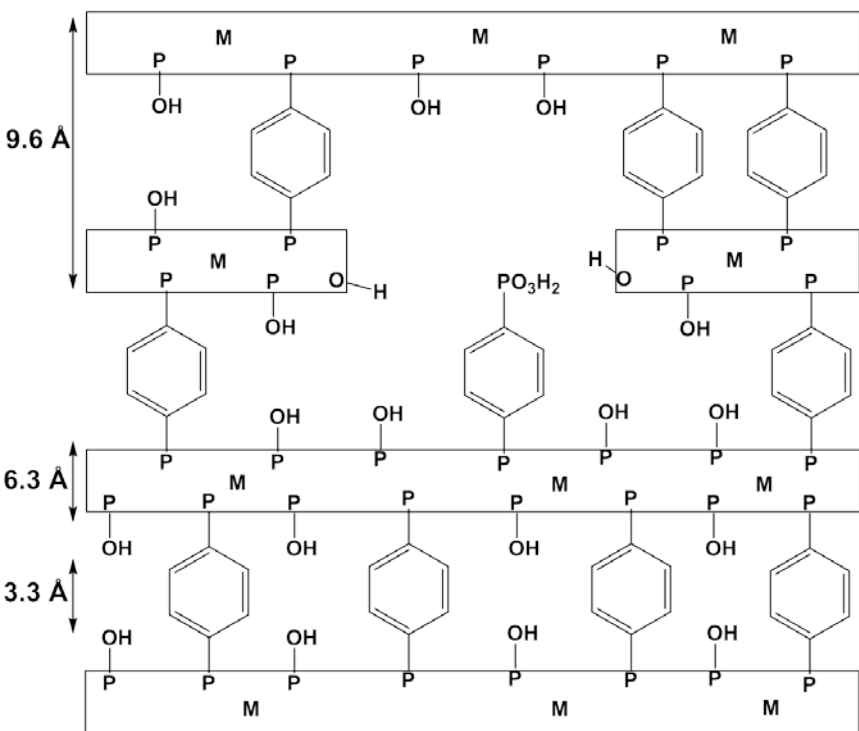
White Light Nanoparticles



- Xiaohao Yang, Masadeh, McBride, Bozin, Rosenthal and SJLB, *Phys. Chem. Chem. Phys.* **15**, 8480-8486 (2013)



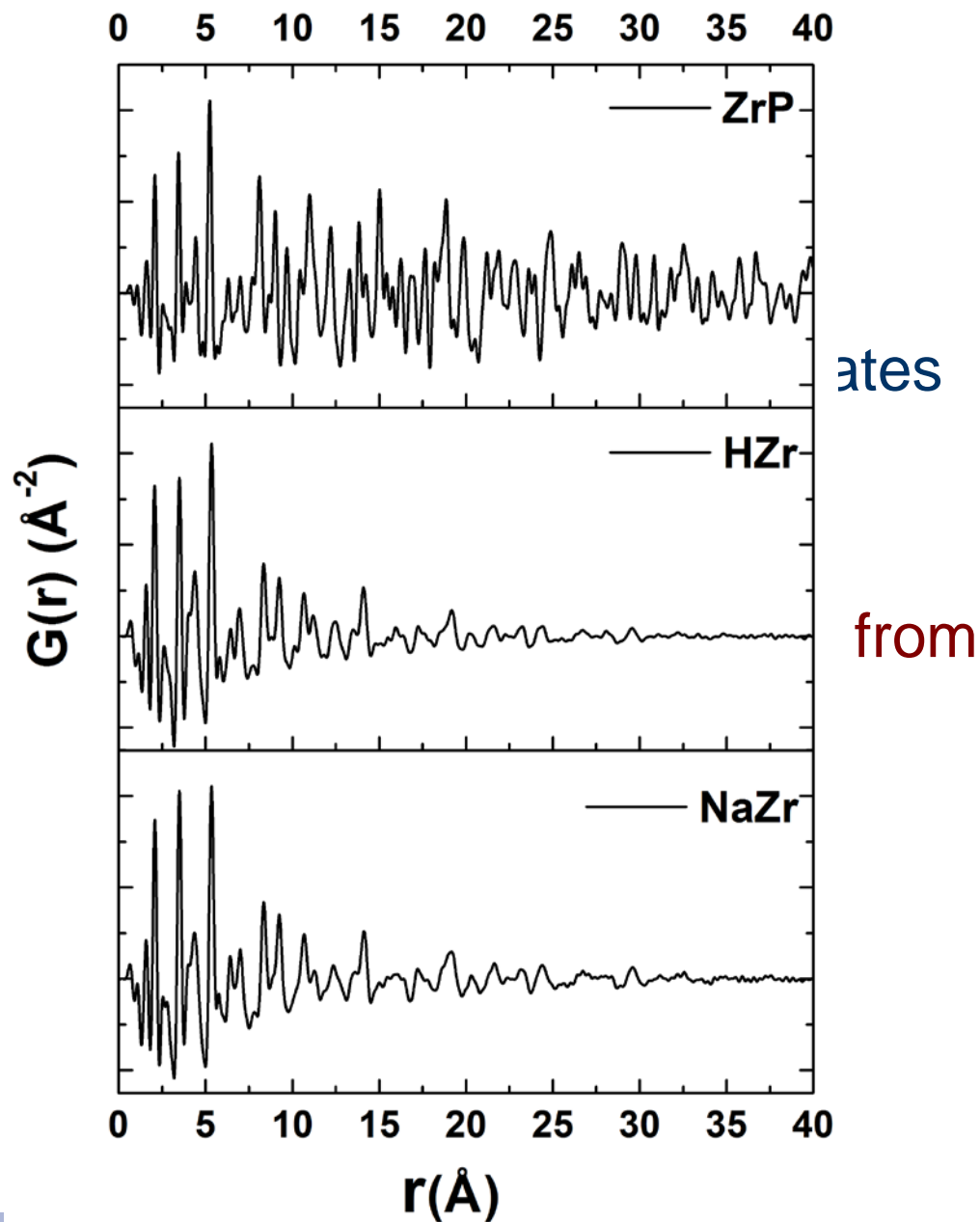
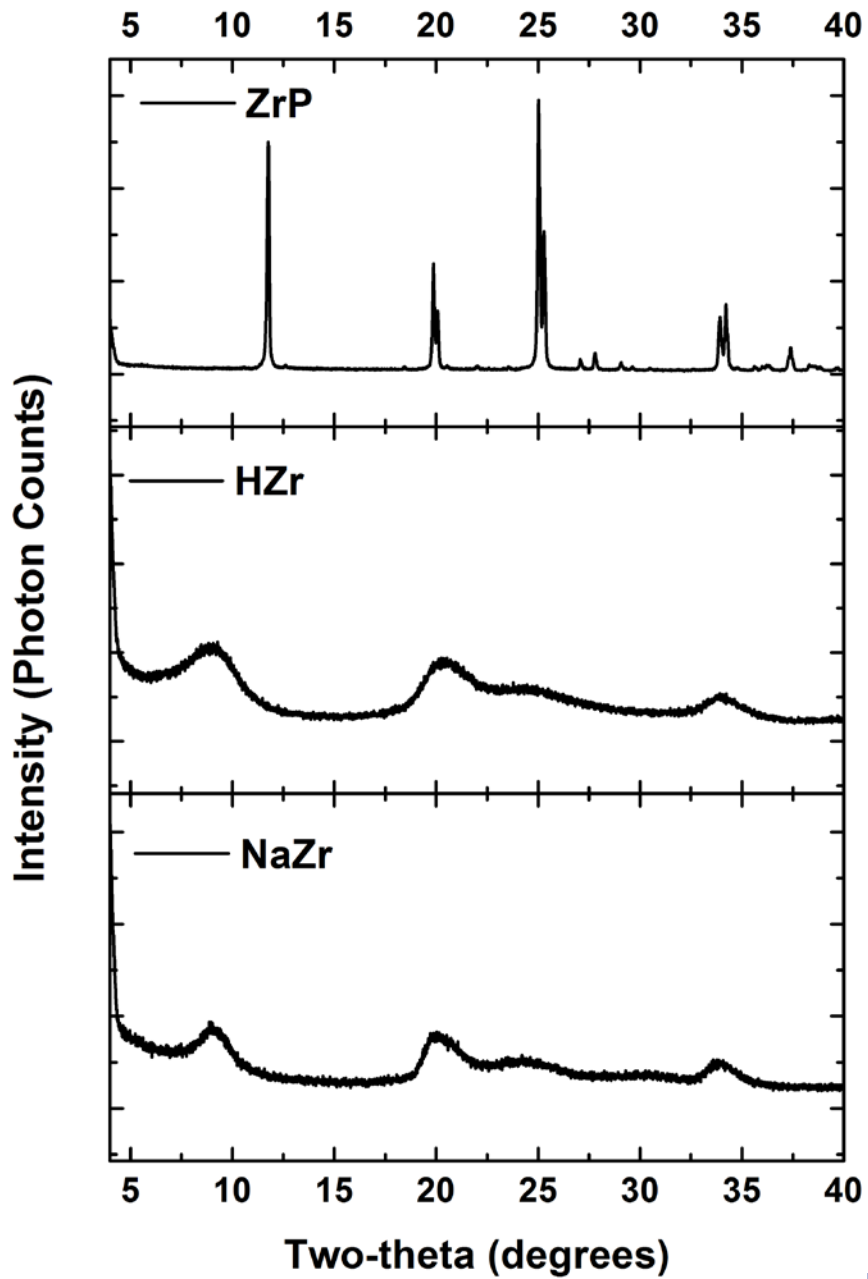
Zr/Sn phenyl phosphate, unconventional MOFs



Clearfield, A. *Dalton Trans.* 2008, **44**, 6089-6102.

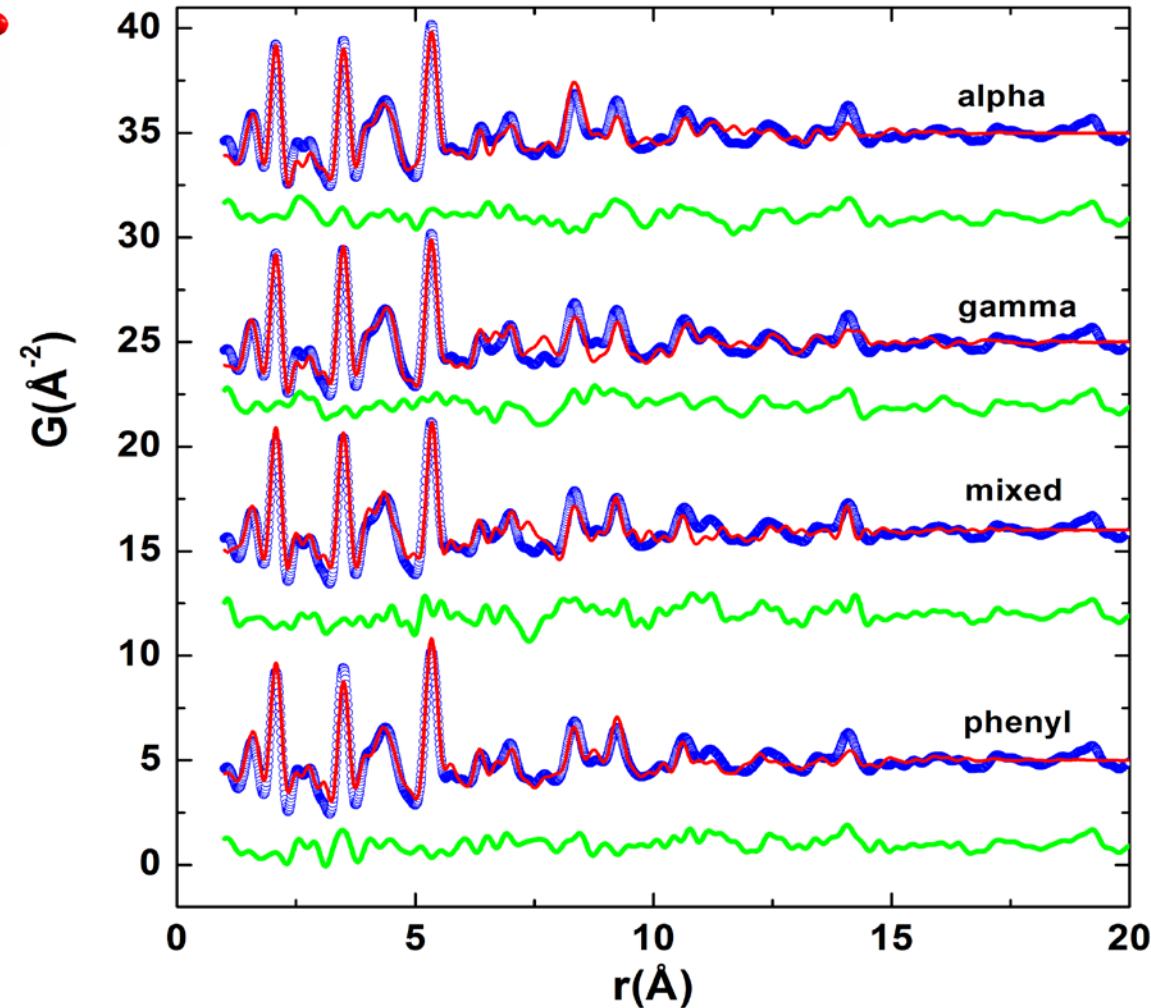
- Collaboration with the group of Abe Clearfield, Texas A&M
- Work of Chenyang Shi and Rita Silbernagel





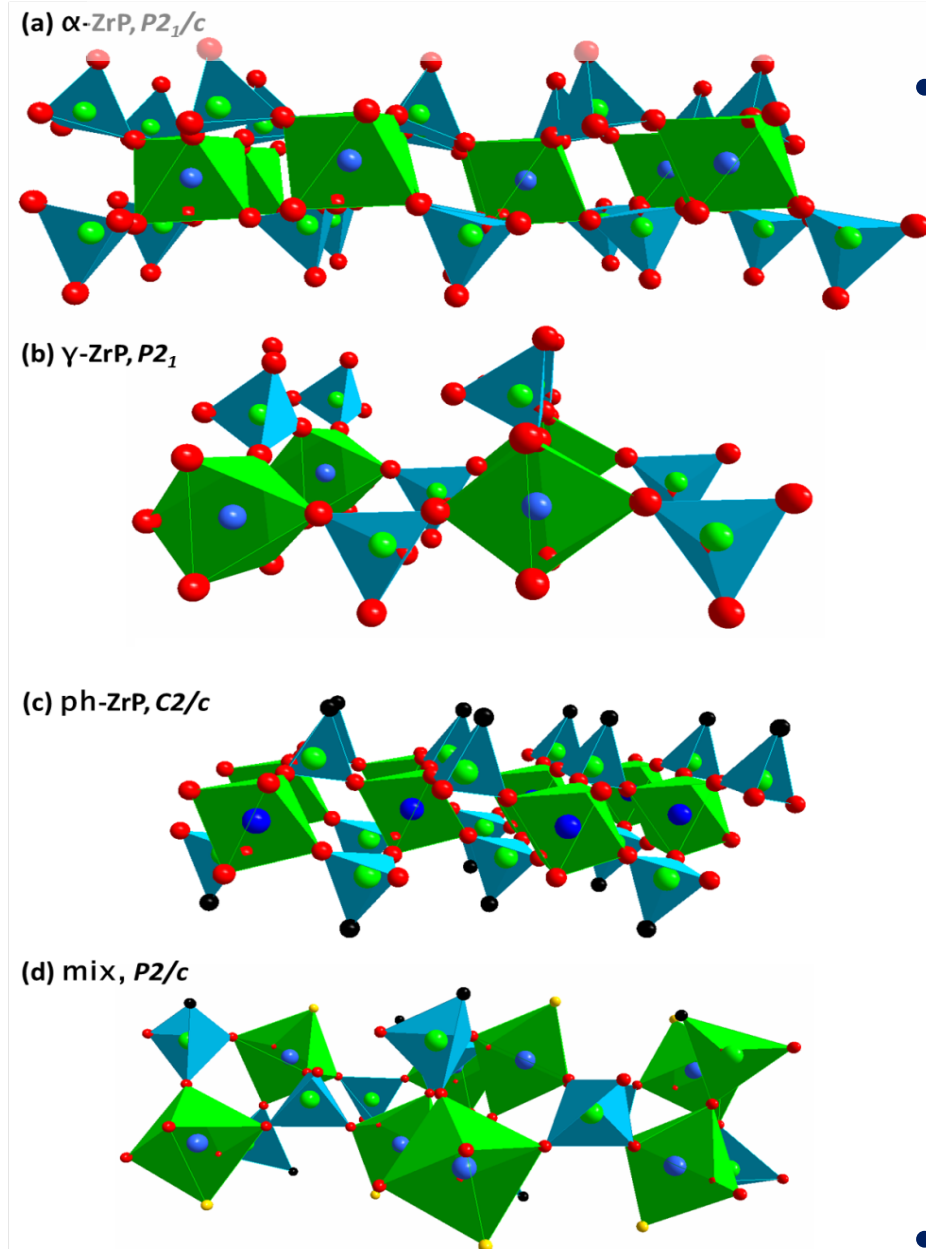
Try ZrP structures on H-Zr sample, PDFgui

- Use PDFgui to fit 3D crystal structures from the literature (as indicated)



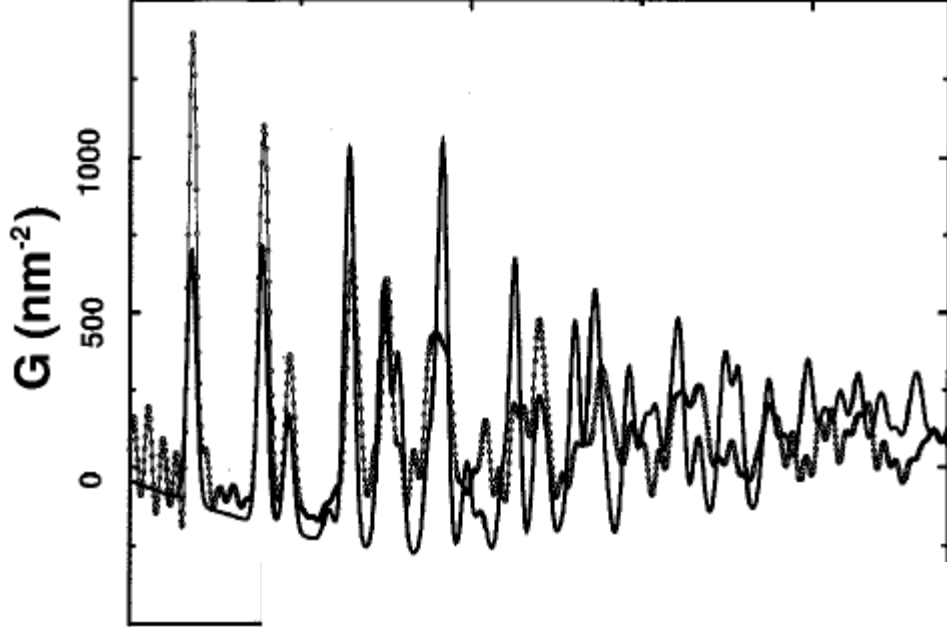
- Fits do well up to $\sim 7\text{\AA}$ but less well beyond

[HTTP://thebillinge.com](http://thebillinge.com)

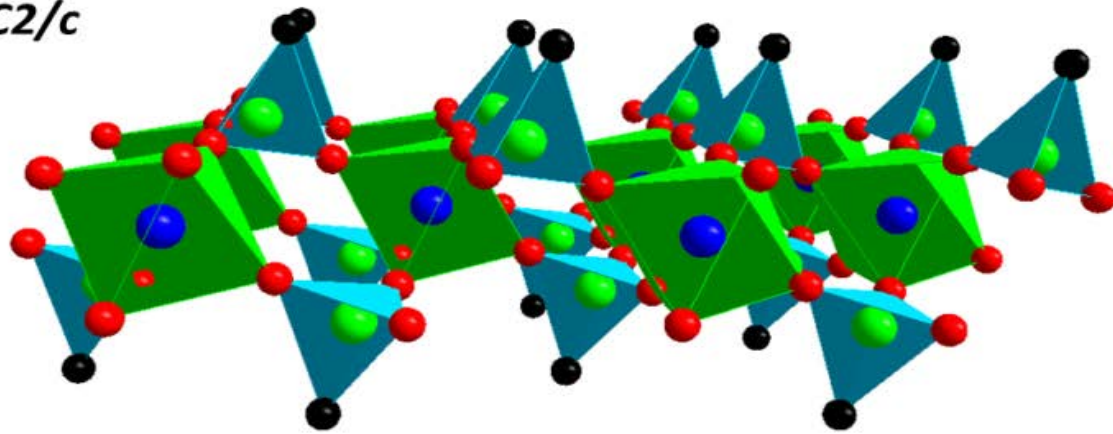
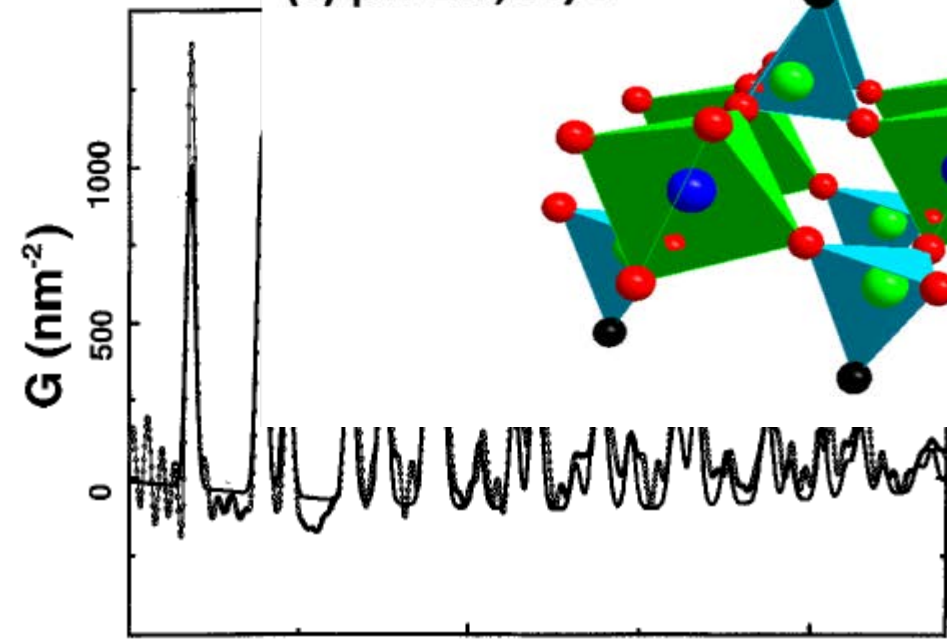


Graphene modeling circa 1996

- Poor person's modeling of turbostratic disorder
- Crystal structure of graphite in PDFFIT doesn't fit well (top)



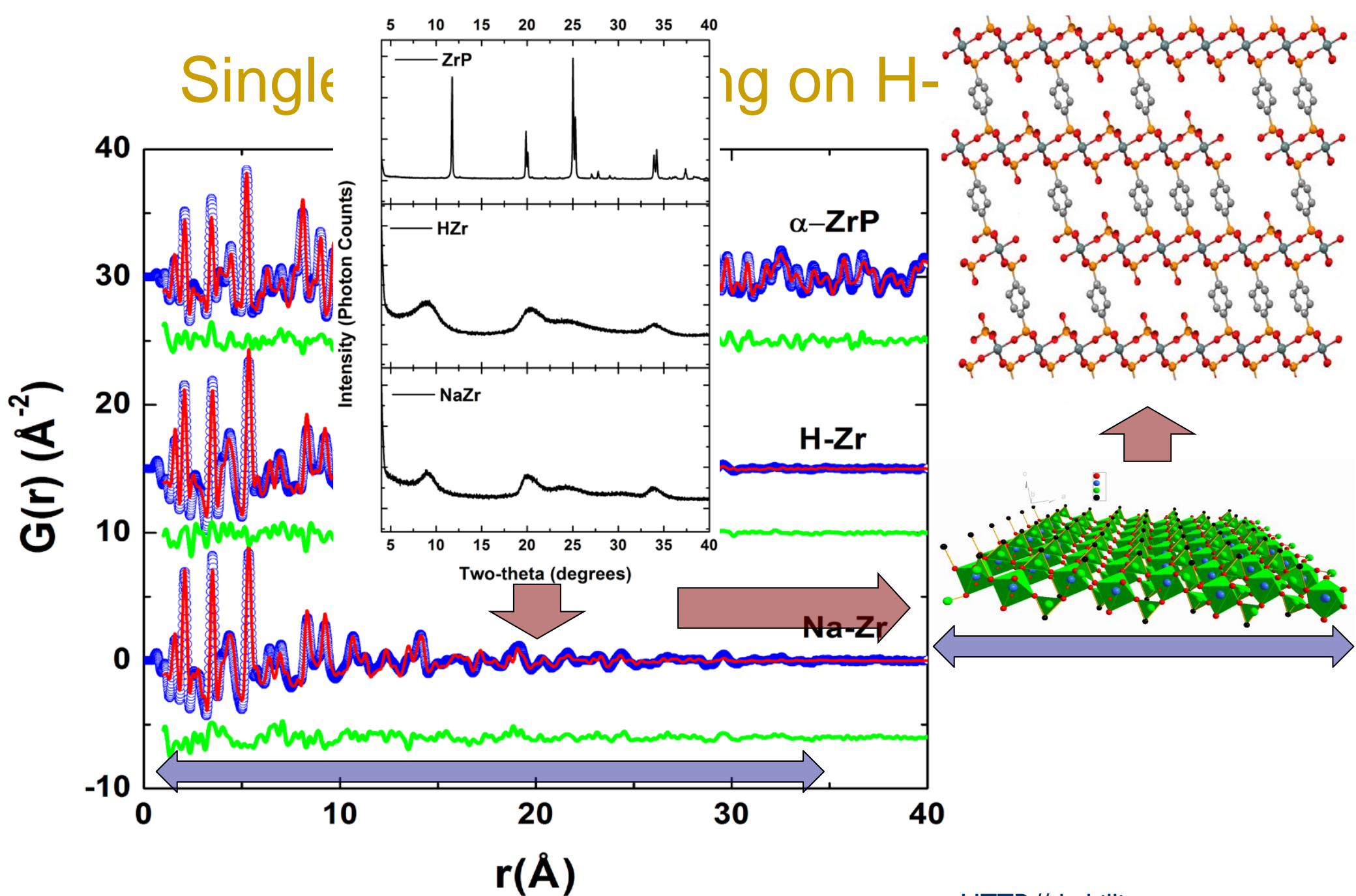
(c) ph-ZrP, C2/c



2159 (1996)

- This won't work here:

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er 8,



Structure solution from PDF

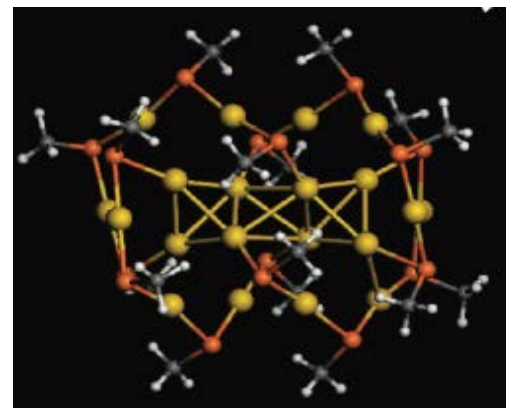
Example: DFT can predict structures

- DFT is one of the most accurate of the theories (but still approximate)
- This is the basis of Materials Prediction, a fundamental of Materials Genomics
- Can DFT predict the stable structure of Au nanoparticles?
 - Yes!

Thiolate-Protected Au₂₀(SR)₁₆ Cluster: Prolate Au₈ Core with New [Au₃(SR)₄] Staple Motif

Yong Pei, Yi Gao, Nan Shao, and Xiao Cheng Zeng*

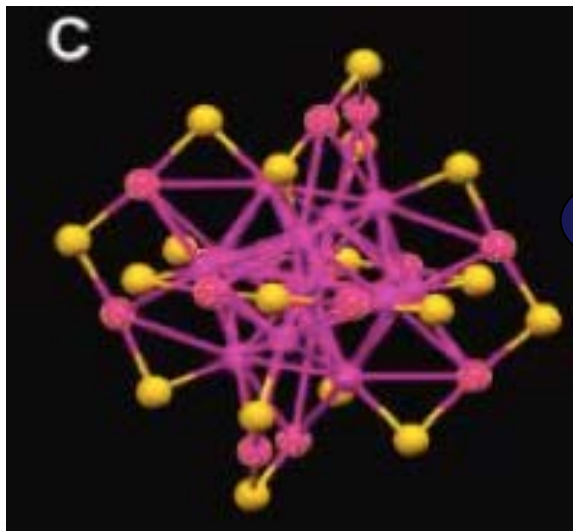
Department of Chemistry and Nebraska Center for Materials and Nanoscience, University of Nebraska-Lincoln, Lincoln, Nebraska 68588



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Correlating the Crystal Structure of A Thiol-Protected Au₂₅ Cluster and Optical Properties

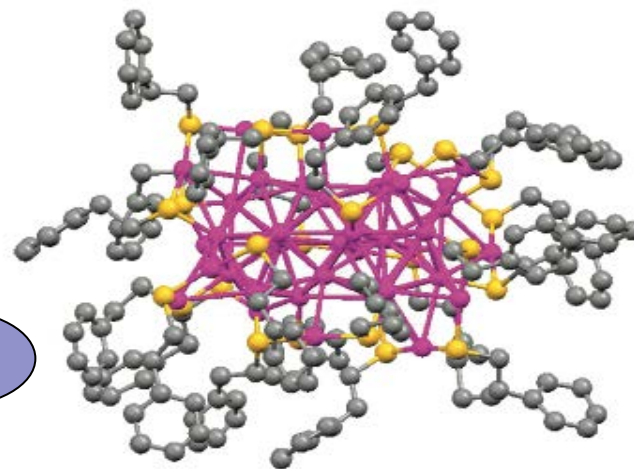
Manzhou Zhu,[†] Christine M. Aikens,[‡] Frederick J. Hollander,[§] George C. Schatz,^{||} and Rongchao Jin^{*†}



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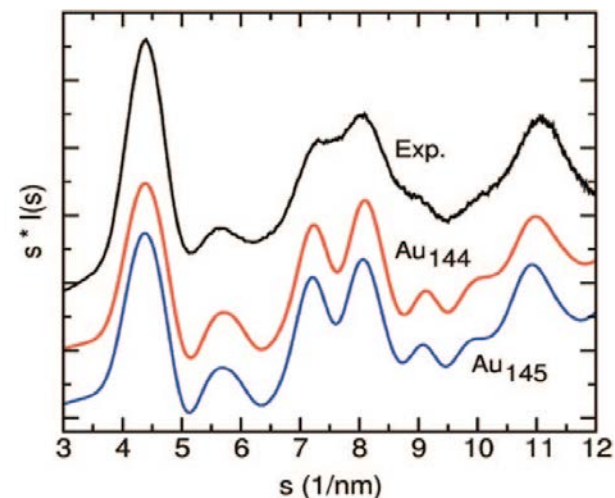
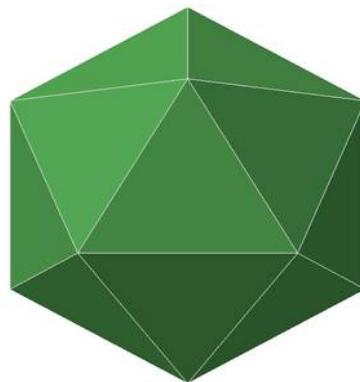
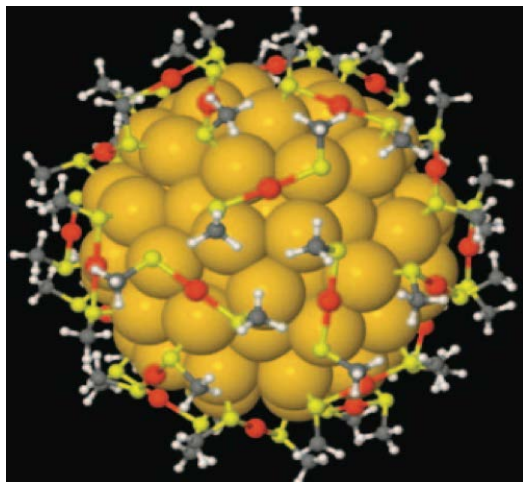
Total Structure Determination of Thiolate-Protected Au₃₈ Nanoparticles

Huifeng Qian,[†] William T. Eckenhoff,[‡] Yan Zhu,[†] Tomislav Pintauer,[‡] and Rongchao Jin^{*†}
Department of Chemistry, Carnegie Mellon University, Pittsburgh, Pennsylvania 15213 and Department of Chemistry and Biochemistry, Duquesne University, Pittsburgh, Pennsylvania 15282



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DFT study of Au₁₄₄ structure

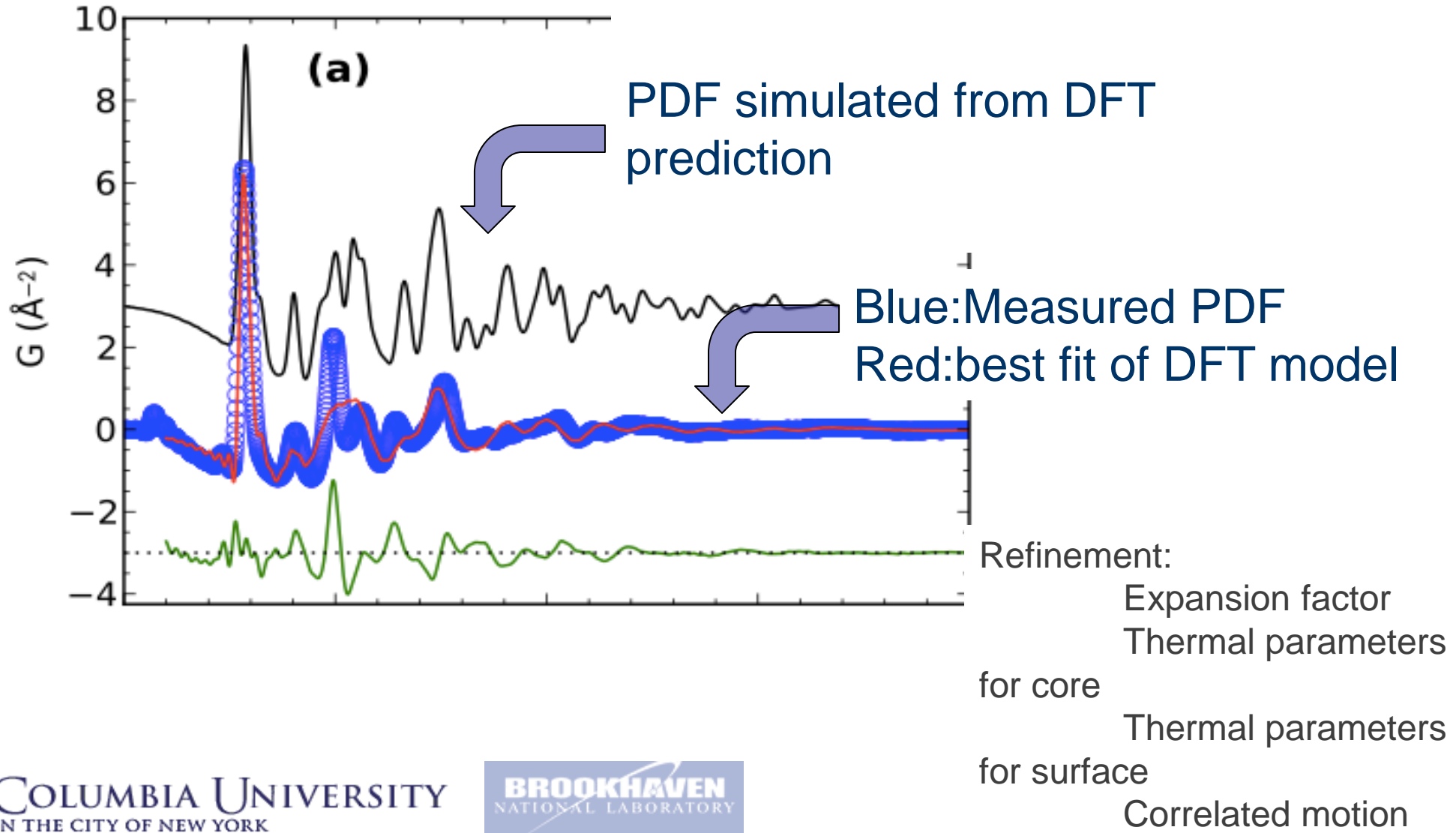


Icosahedral core

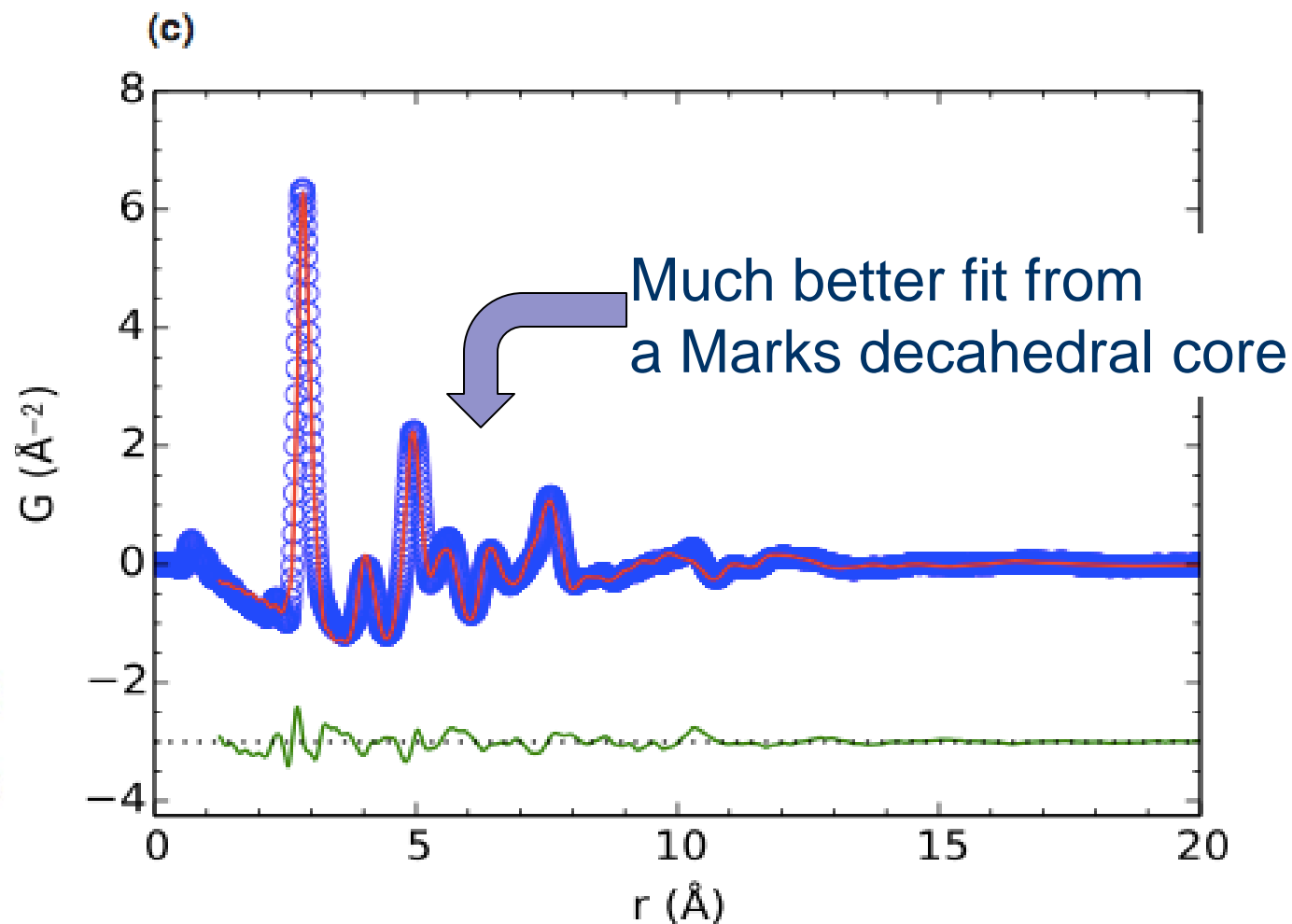
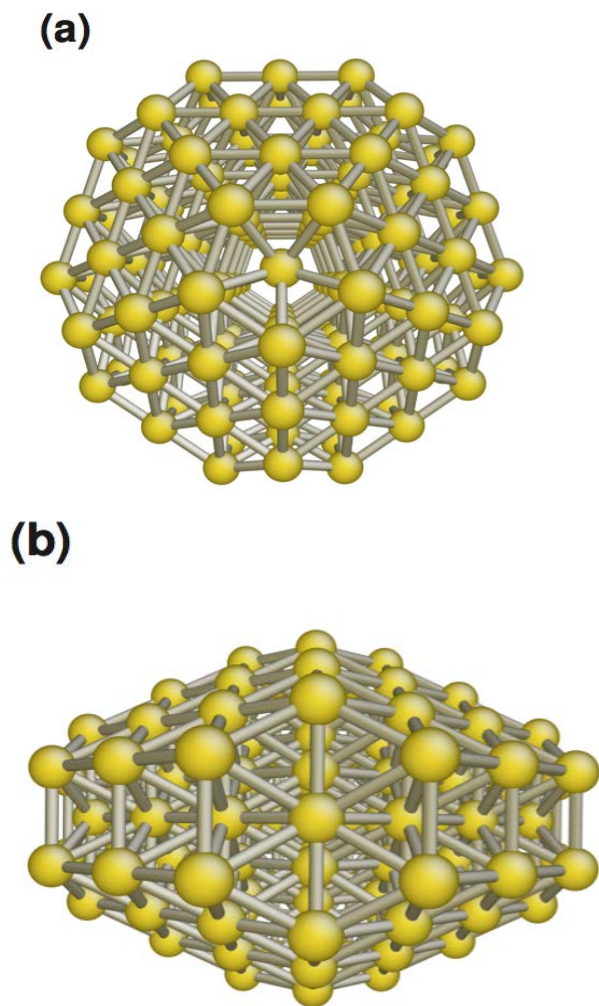
Au/S surface structure with ligand attachment

Validate this prediction:

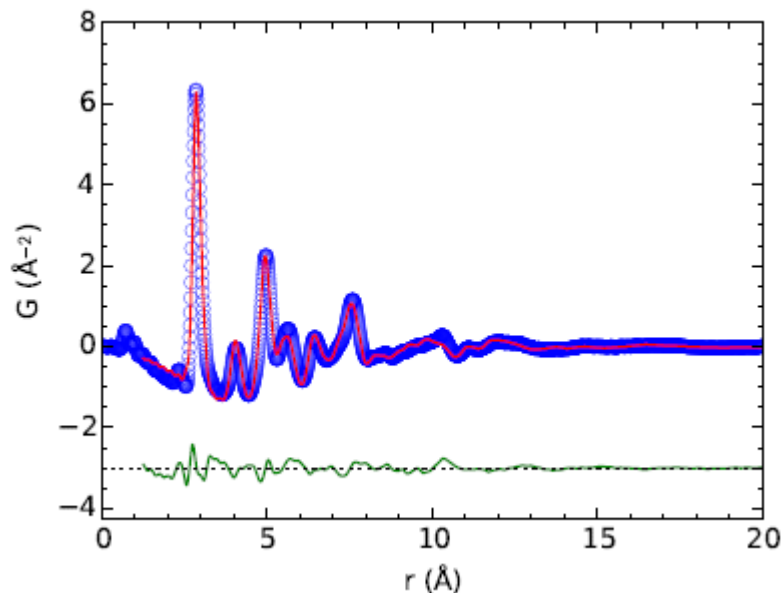
Measure X-ray diffraction data (in the form of an atomic pair distribution function (PDF))



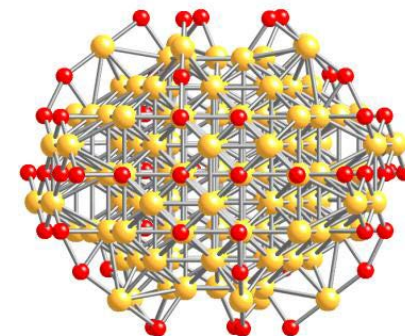
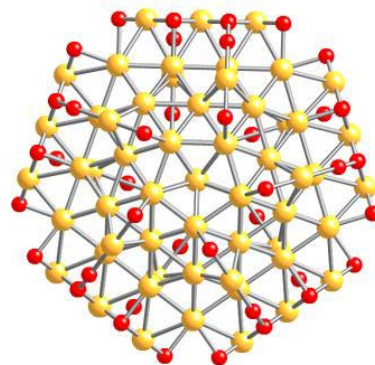
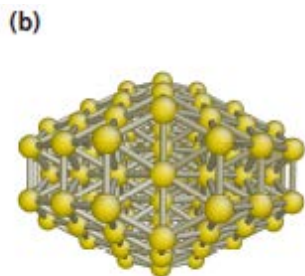
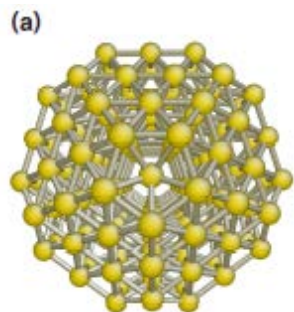
The MD6441 structure: 144 gold atoms



Gold Au144



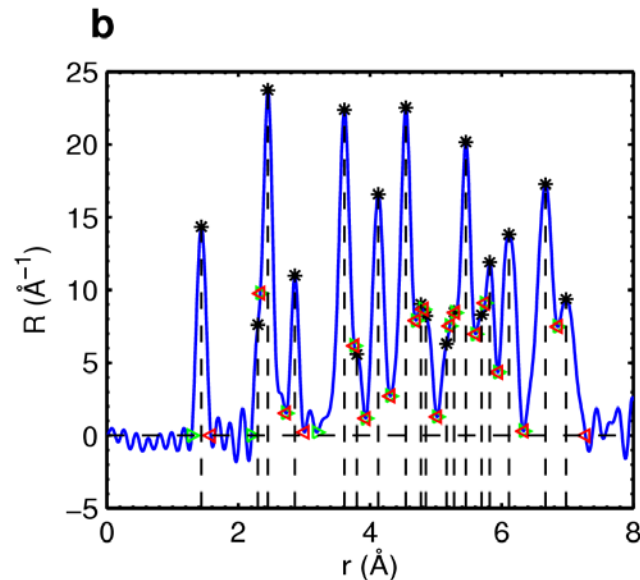
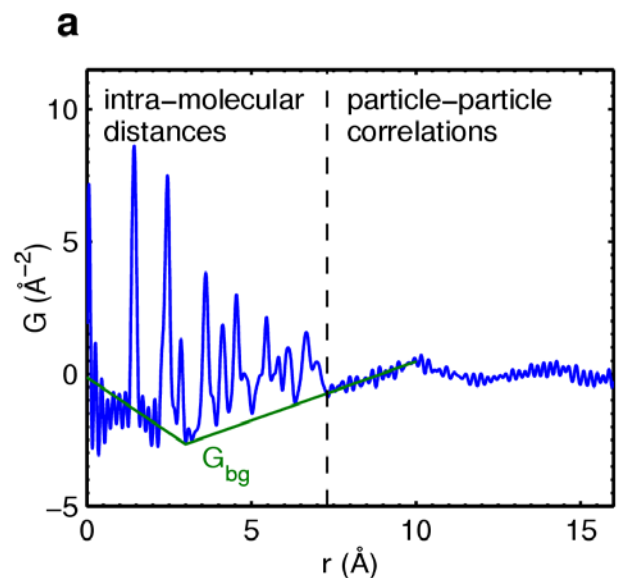
- Proper data validation illustrated theoretical limitation
- But our DFT colleagues told us the structural model also had to be incorrect: no low energy Au-thiol staples on the surface
- Better (correct?) model had a MD core and staples



Is there enough information for an ab-initio structure solution?

Example: C60

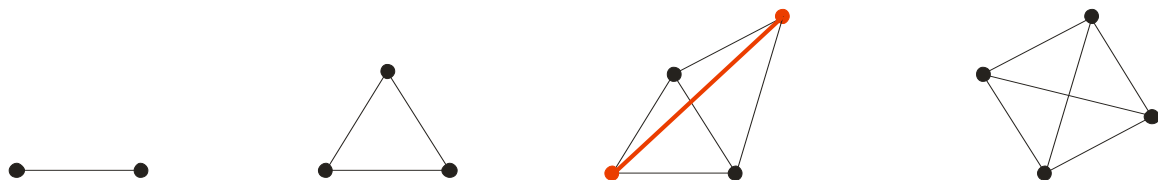
- 60 atoms $\Rightarrow n(n-1)/2 = 1770$ pair-vectors
- We know the lengths (not the directions) of ~ 18 unique distances
- We have an imperfect measure of the multiplicities of those distances
- We don't have any symmetry information to help us



Is the problem well conditioned or ill conditioned?
Is there a unique solution?

Illustration of cluster buildup

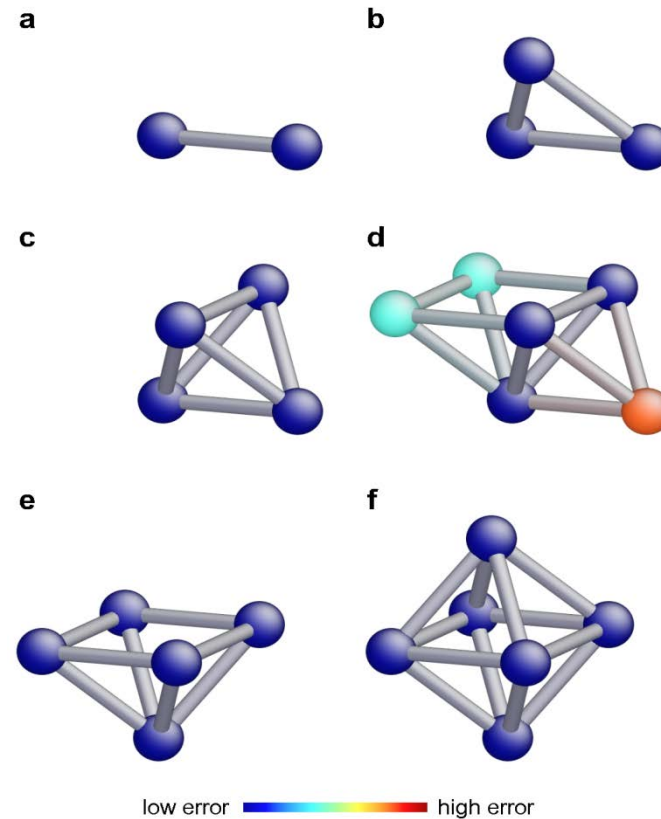
- square-distances = $[4 \times 1, 2 \times \sqrt{2}]$



- octahedron-distances = $[12 \times 1, 3 \times \sqrt{2}]$

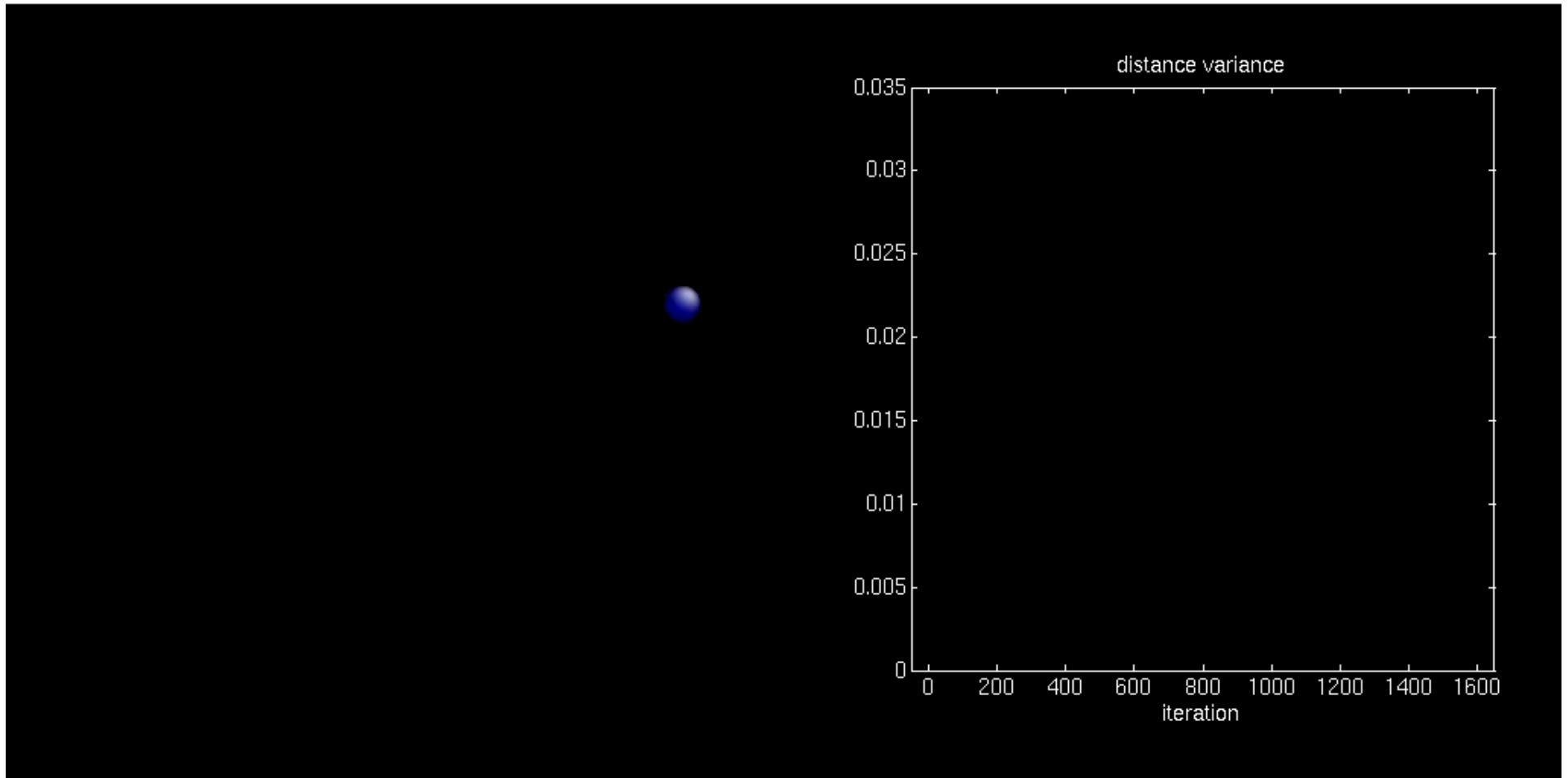
- minimized cost function:

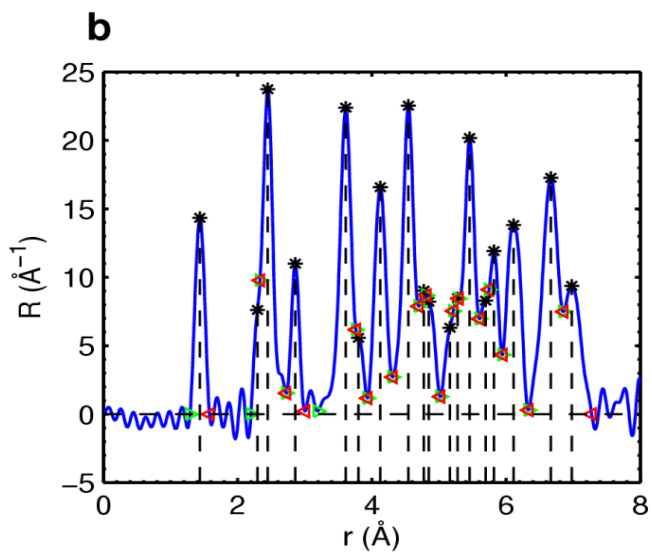
$$\text{var}(d) = \frac{1}{P} \sum_{k=1}^P [d_k - t_{l(k)}]^2$$



Juhas, SJB et al., Nature 2006

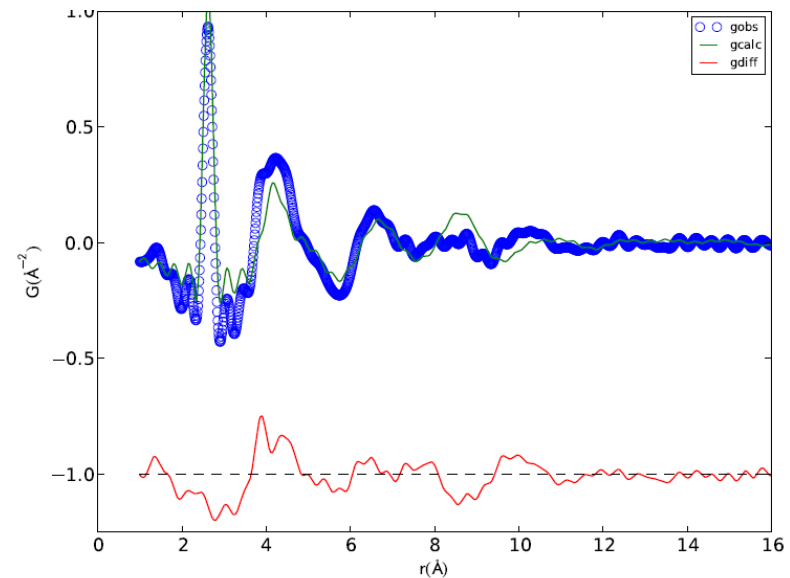
ab-initio structure solution directly from PDF data





60 atoms

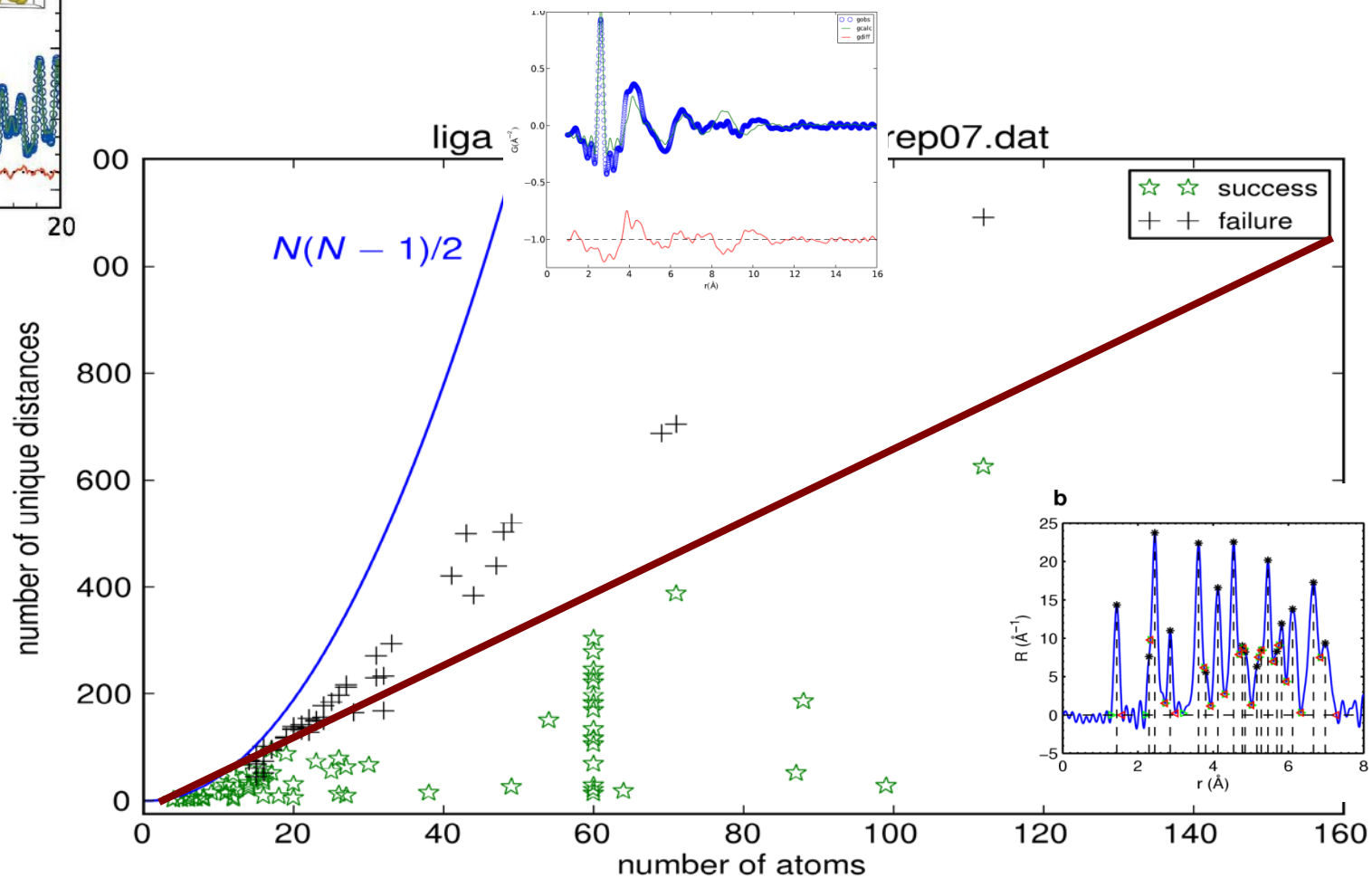
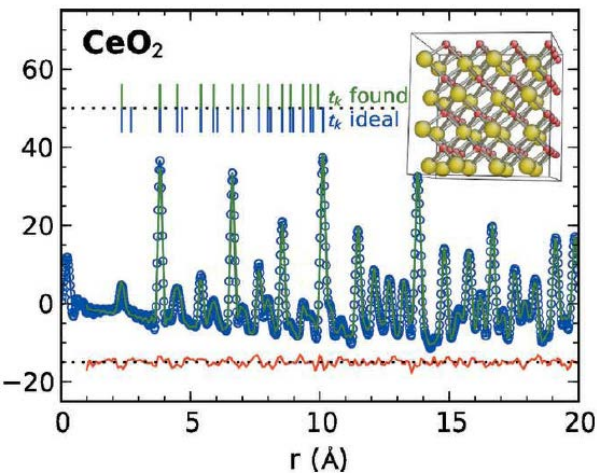
C_{60}



~64 atoms

Ultra-small CdSe NPs

Successology



Problem

Well posed problem:

Information in the PDF data

ILL POSED Problem!

Degrees of freedom in the model

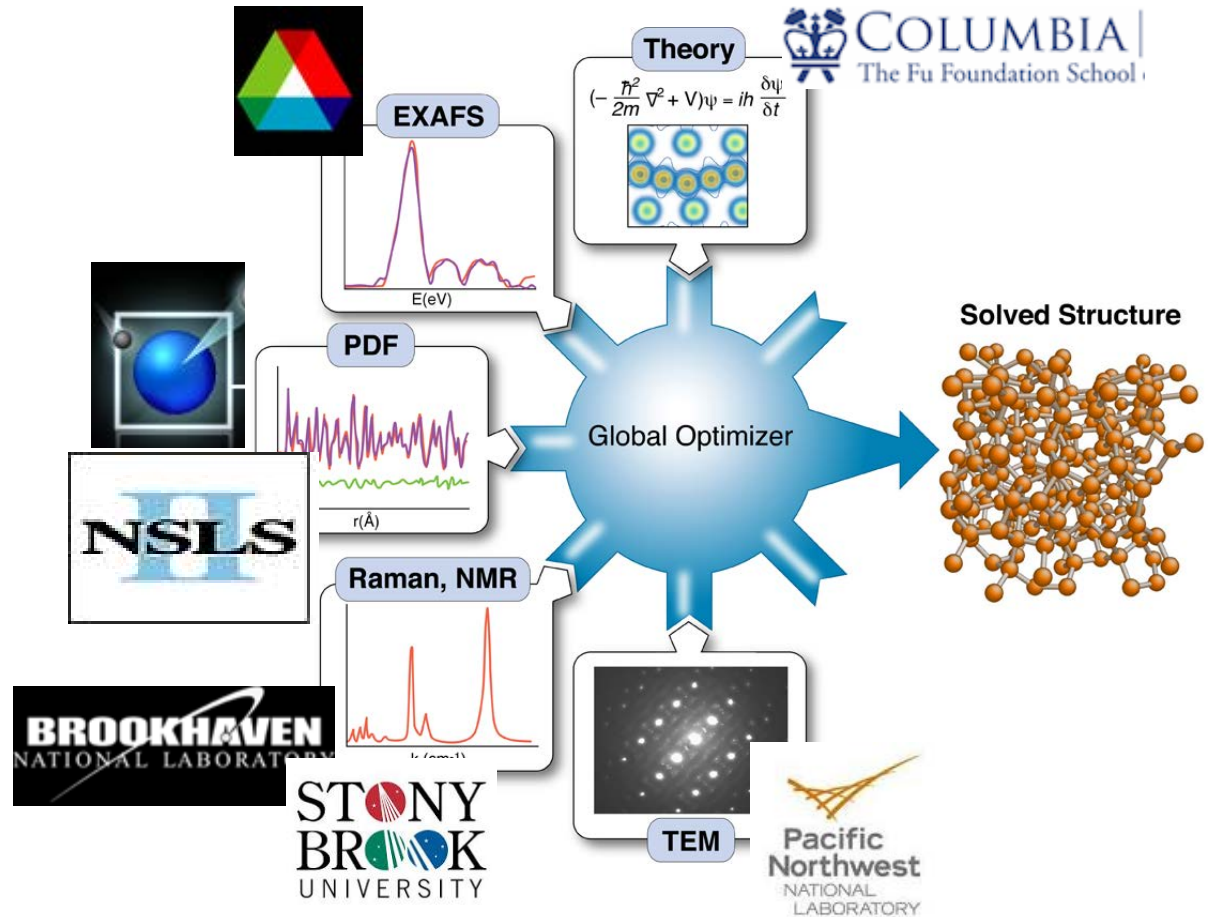
Bits of information

Structure Solution

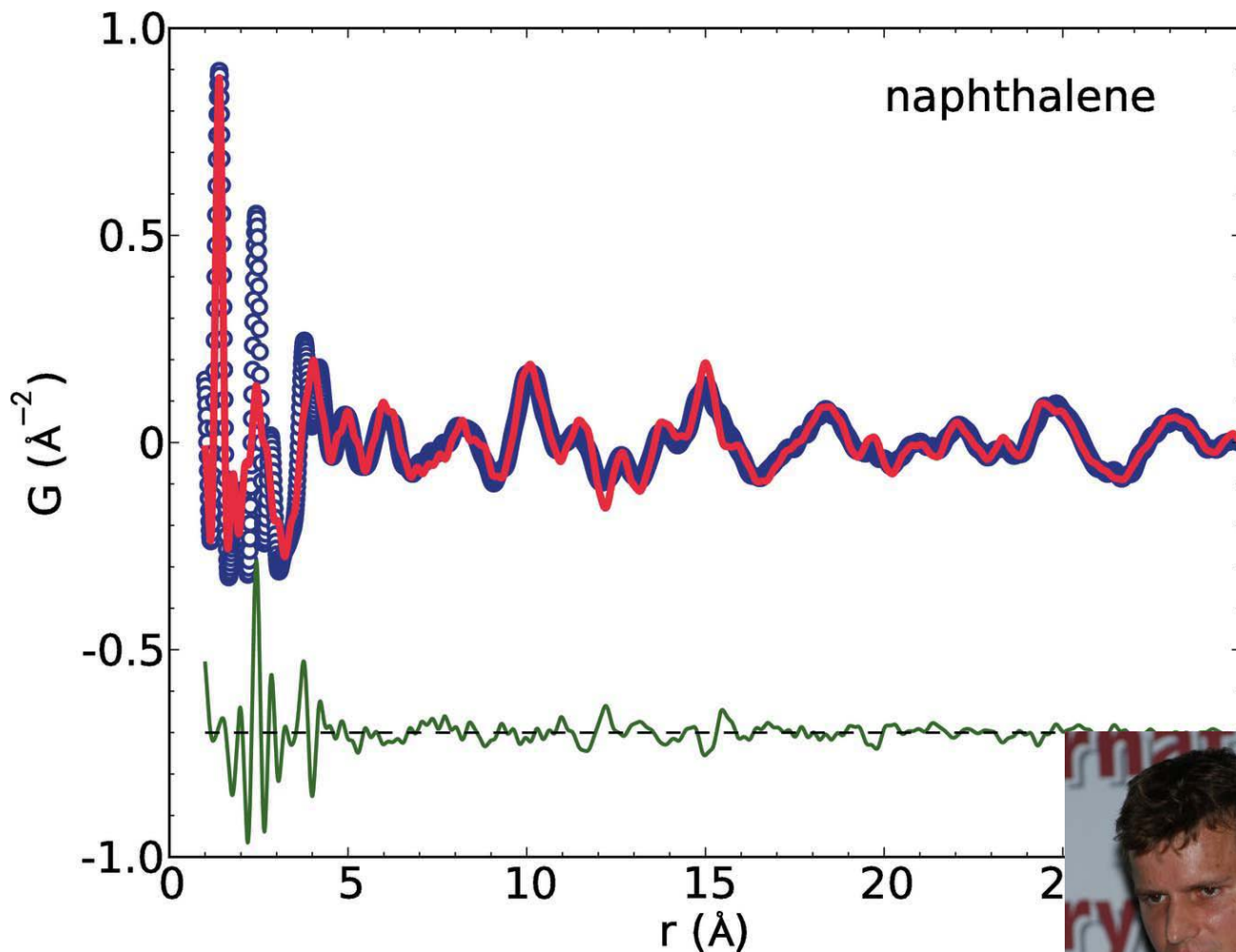


Complex Modeling Solution

- $c = a + ib$ – complex number mixes real and imaginary parts
- $m = e + it$ – complex modeling mixes experiment and theory in a coherent computational framework
- Billinge and Levin, Science 2007



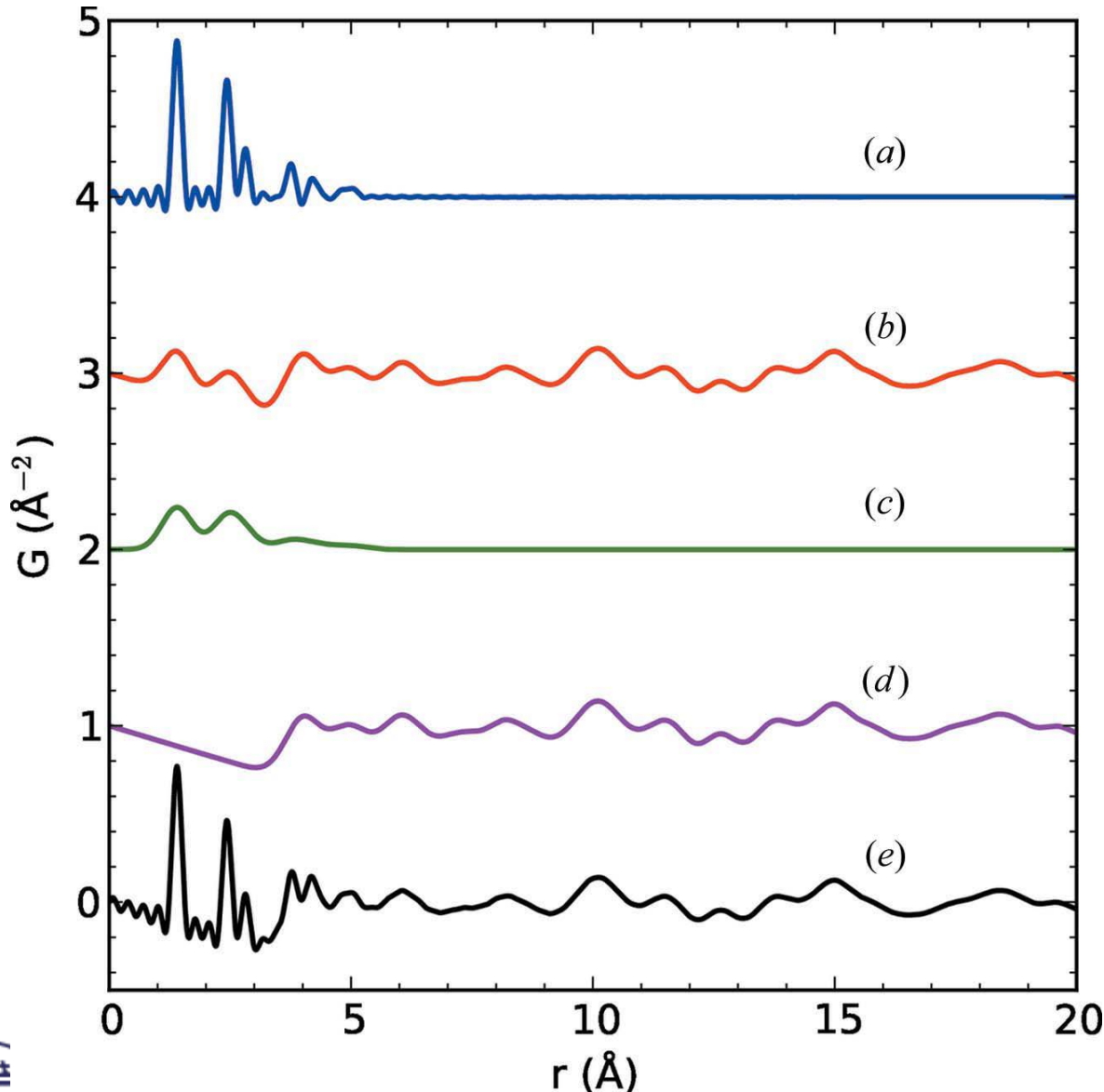
Solving structure of nanoparticles and molecular solids



- Regular PDFgui fit gives peaks too sharp in high-r, too broad at low-r
- With Dragica Prill, Martin Schmidt and Juhas,
- Prill, Juhás, Schmidt and S.J.L.B., *J. Appl. Crystallogr.* **48**, 171-178 (2015)

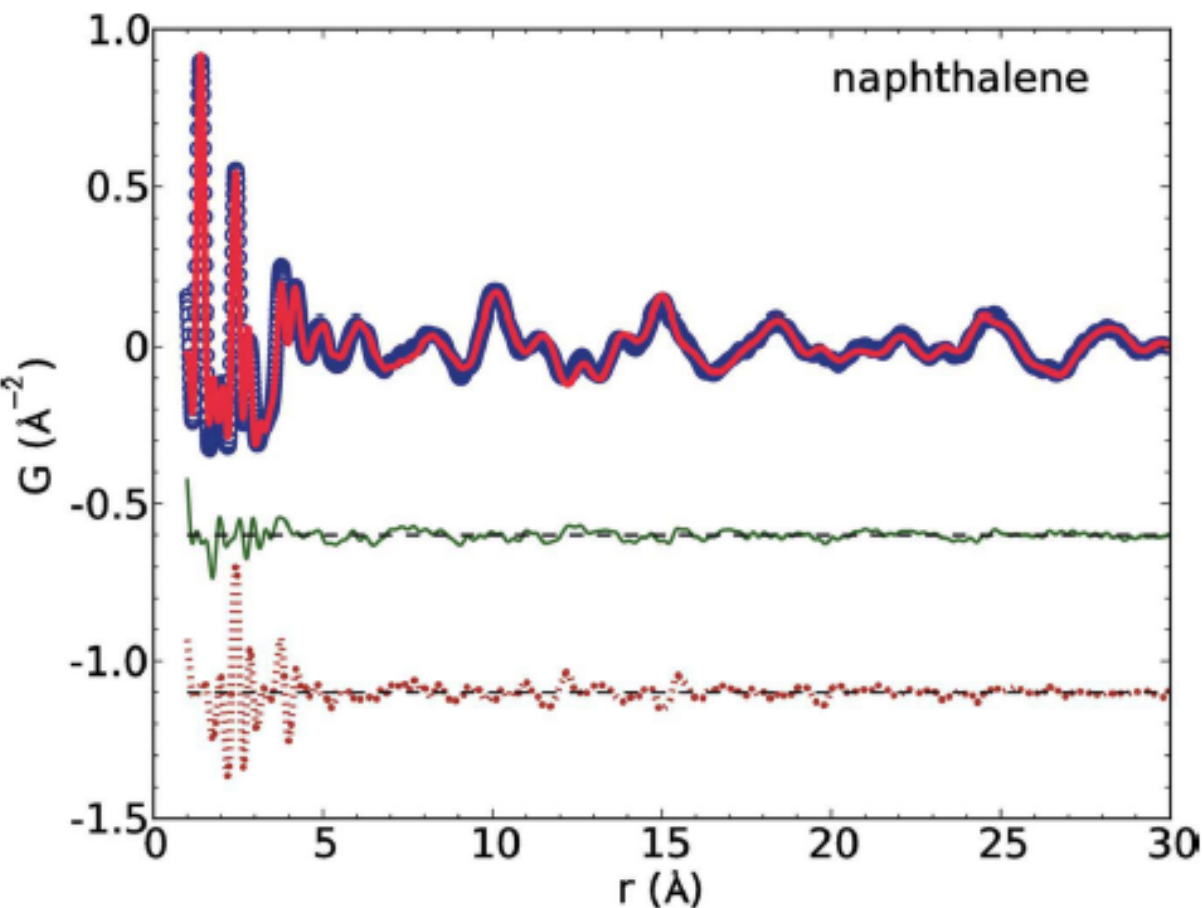


Refinement of molecular PDFs



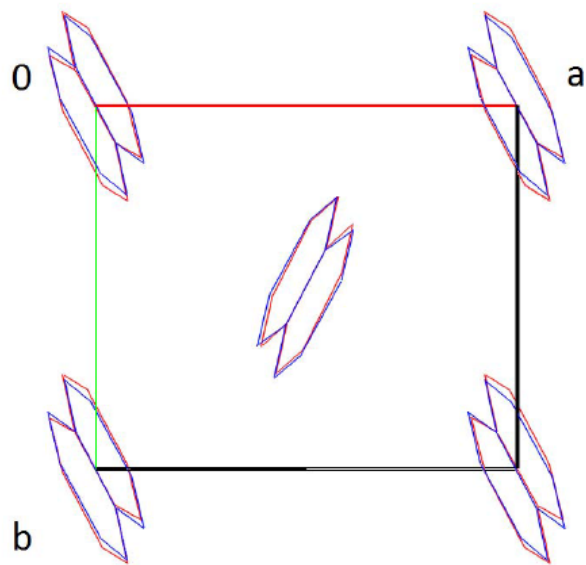
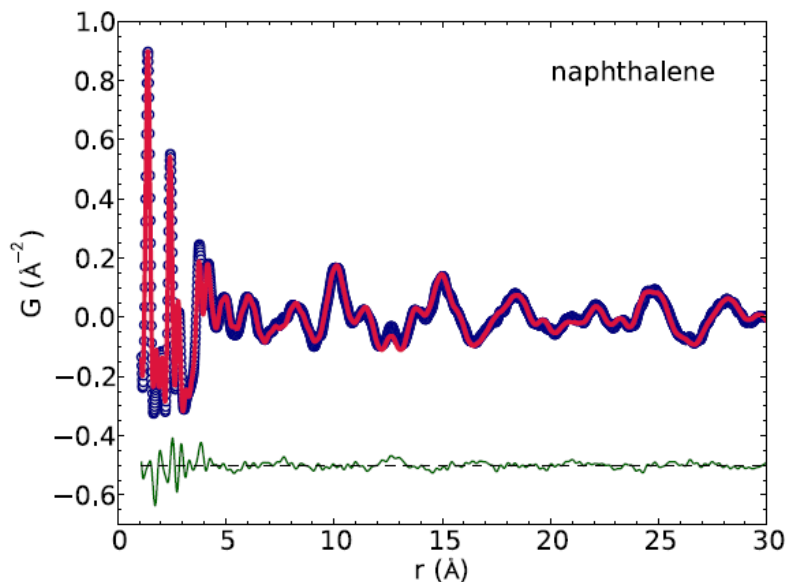
Workaround using DSE + RSC

1. Calculate molecule PDF using DSE (a)
2. Calculate crystal structure using RSC (b)
3. Calculate molecule using DSE but with crystal structure ADPs (c)
4. Determine inter-molecular correlation from (b)-(c)
5. Add (a) and (d) to get full pattern (e)



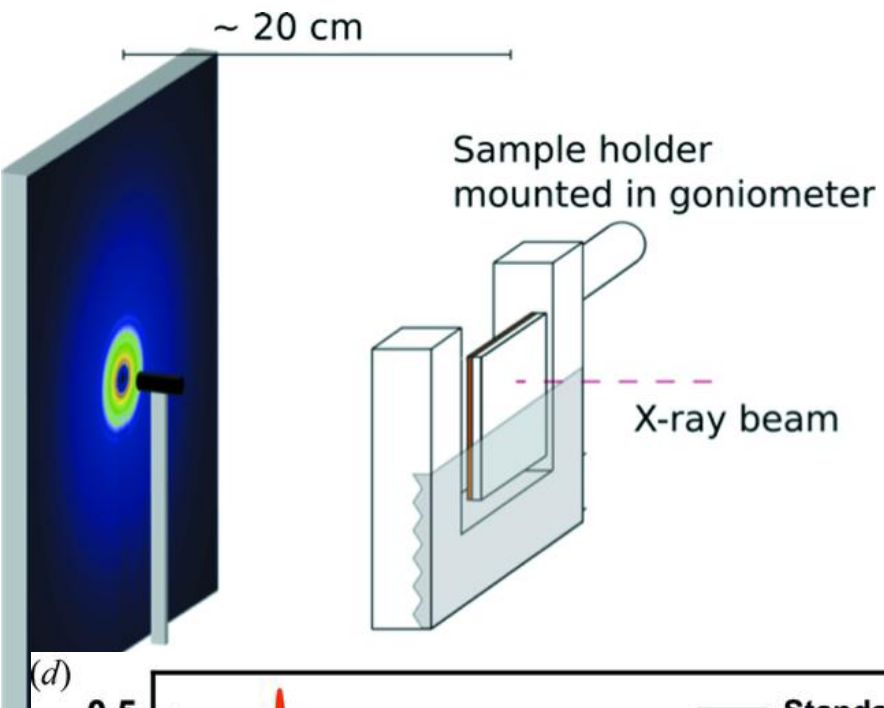
- Result is excellent fit over whole range
- Dragica Prill, Pavol Juhás, Martin U. Schmidt and SJLB *J. Appl. Crystallogr.* **48**, 171-178 (2015)

Update: Structure solution of molecular materials now possible

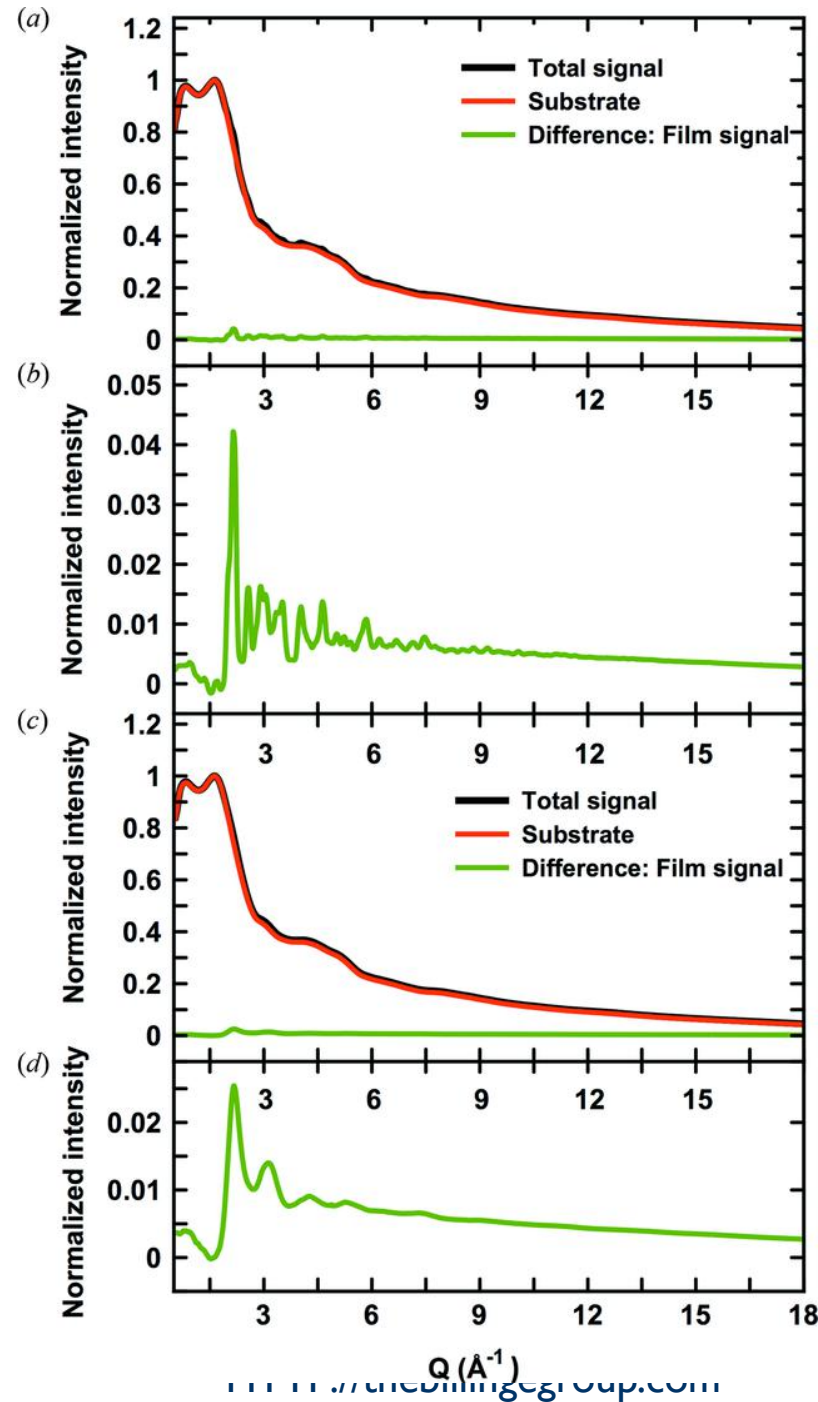
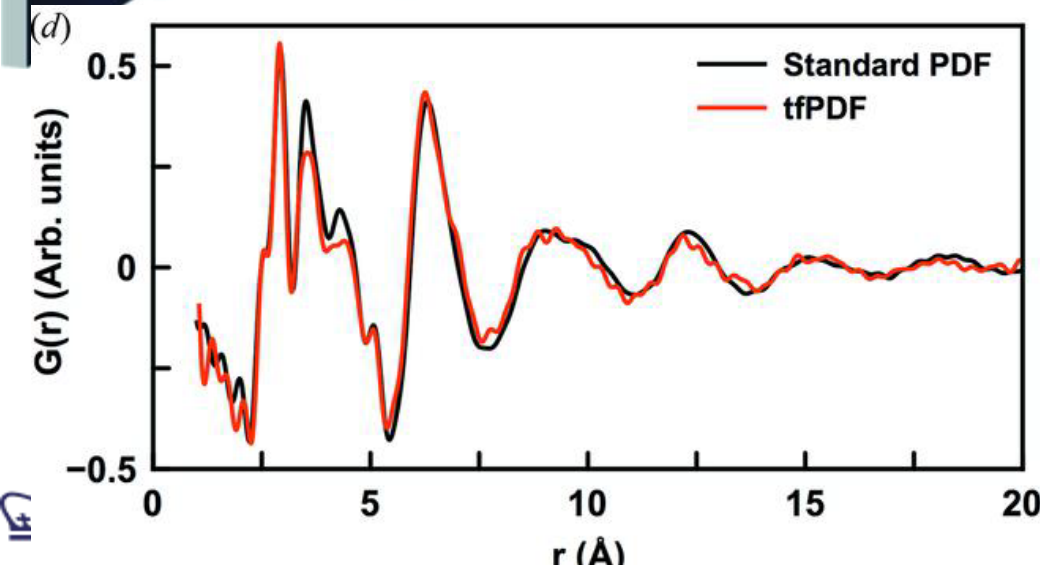


- pyobjcryst wraps functionality from ObjCryst++ (Favre-Nicolin and Cerny)
- Rigid body constraints and quaternions to describe spatial orientations of molecules
- Naphthalene, P1, Z=2
- Blue is single crystal structure, red is PDF derived structure
- Dragica Prill, Pavol Juhás, S. J. L. Billinge and Martin U. Schmidt, *Acta Crystallogr. A* **72**, 62-72 (2016)

Thin film PDF at normal incidence

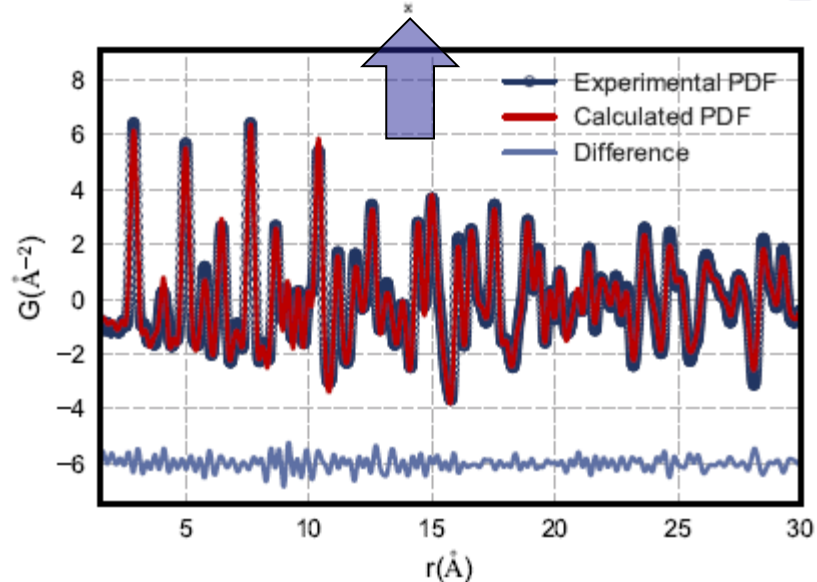
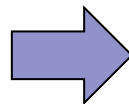
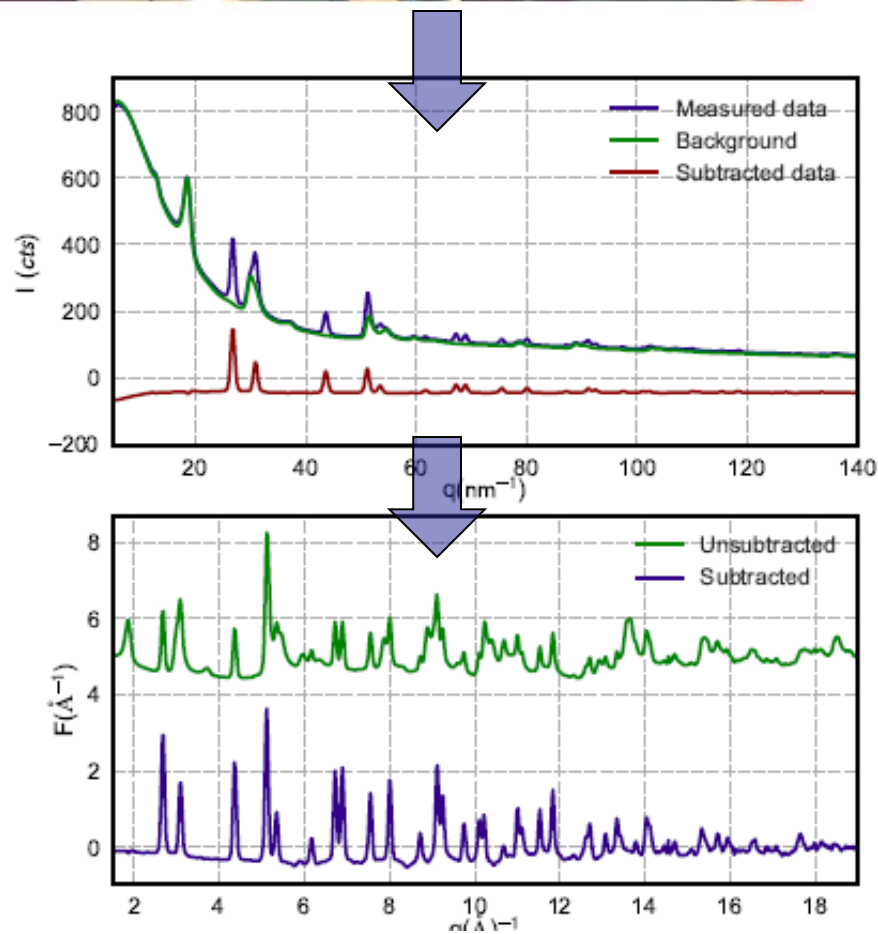
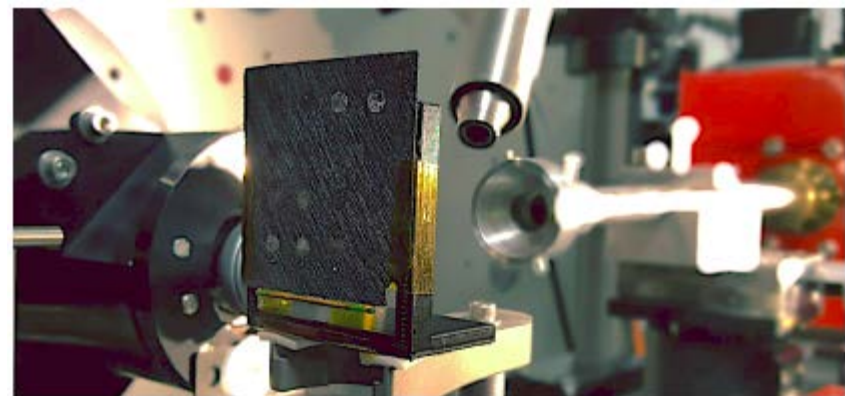


Jensen,
Iversen,
Johnson,
Dooryhee
SJLB et al.
IUCrJ 2015

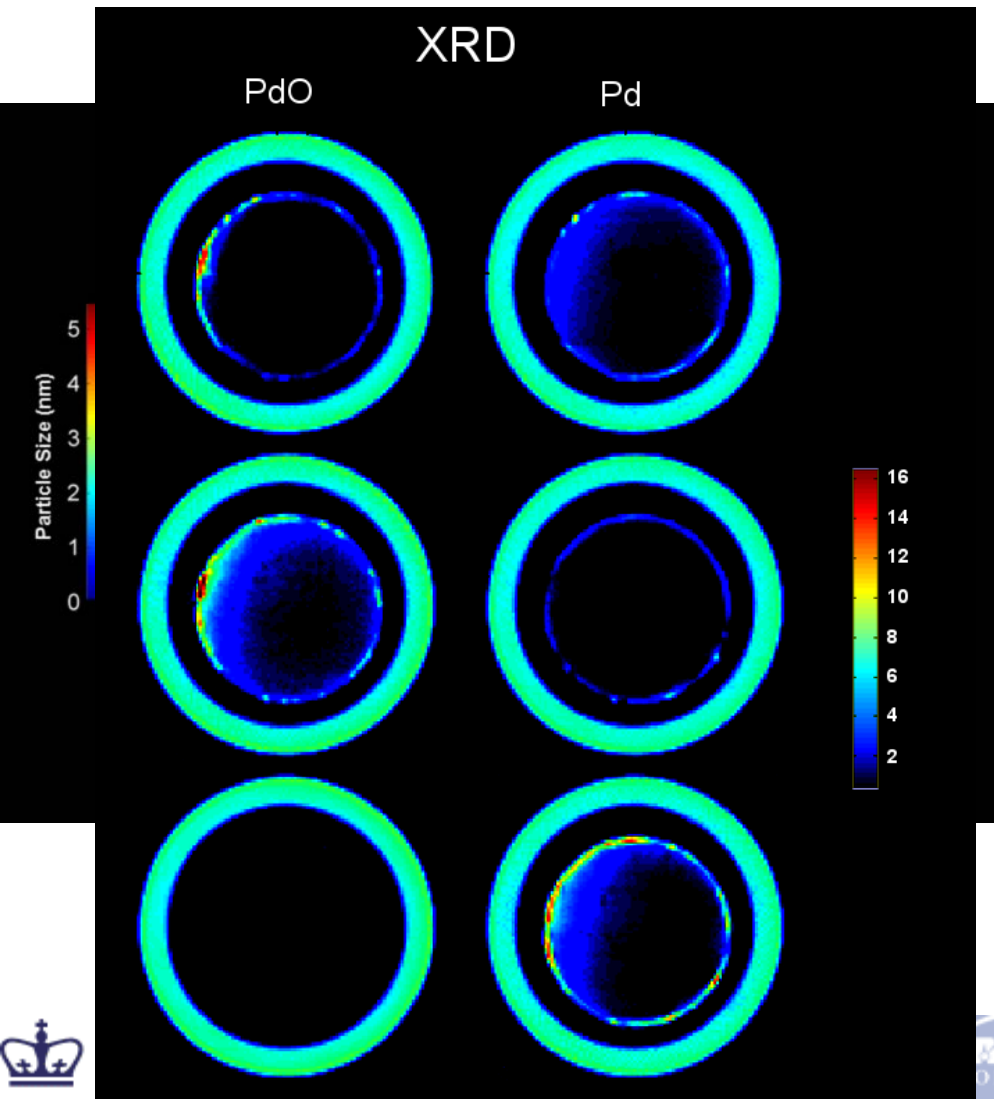


Spatially Resolved PDFs

- Anton Kovyakh, Soham Banerjee, Chia Hao Liu

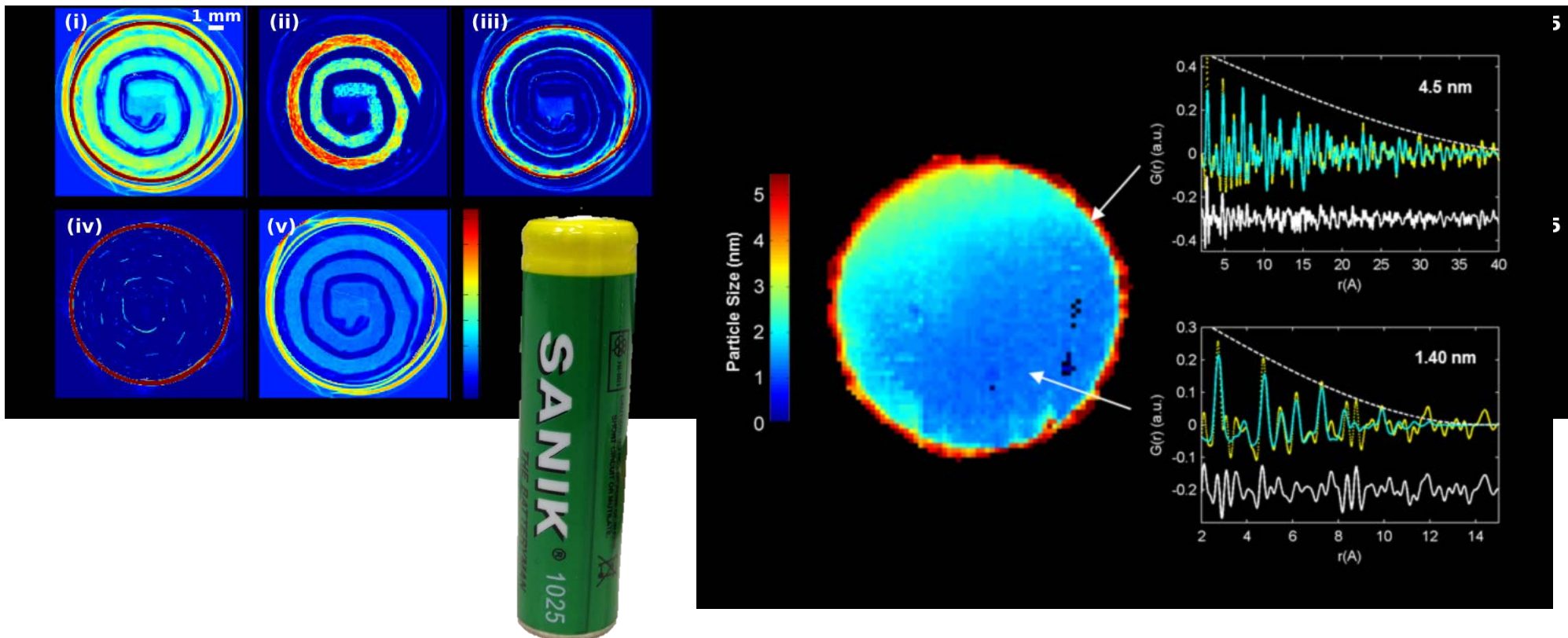


High throughput allows spatially resolved tomographic imaging



- Experiments on ID15 at ESRF
- Pt/PtO nanoparticle catalyst on a γ -alumina support in a flow rig
- Have a fully refinable PDF in every pixel of the image
- Large particle size in a shell around the rim, small particle size and much lower density in the middle
- => Spatially resolved, time resolved nanostructure studies
- S. D. M. Jacques, Di Michiel, SJLB et al. *Nat. Commun.* **4**, 2536 (2013)

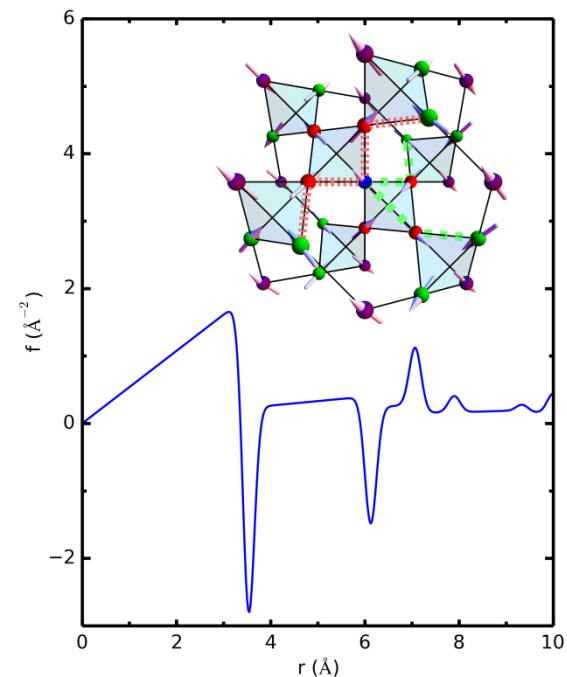
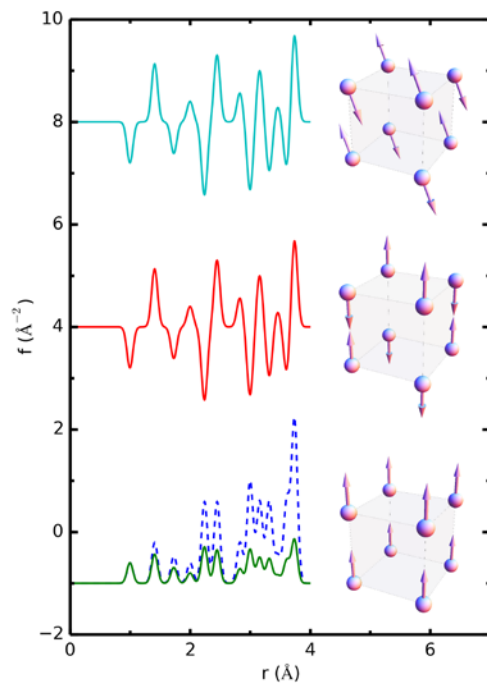
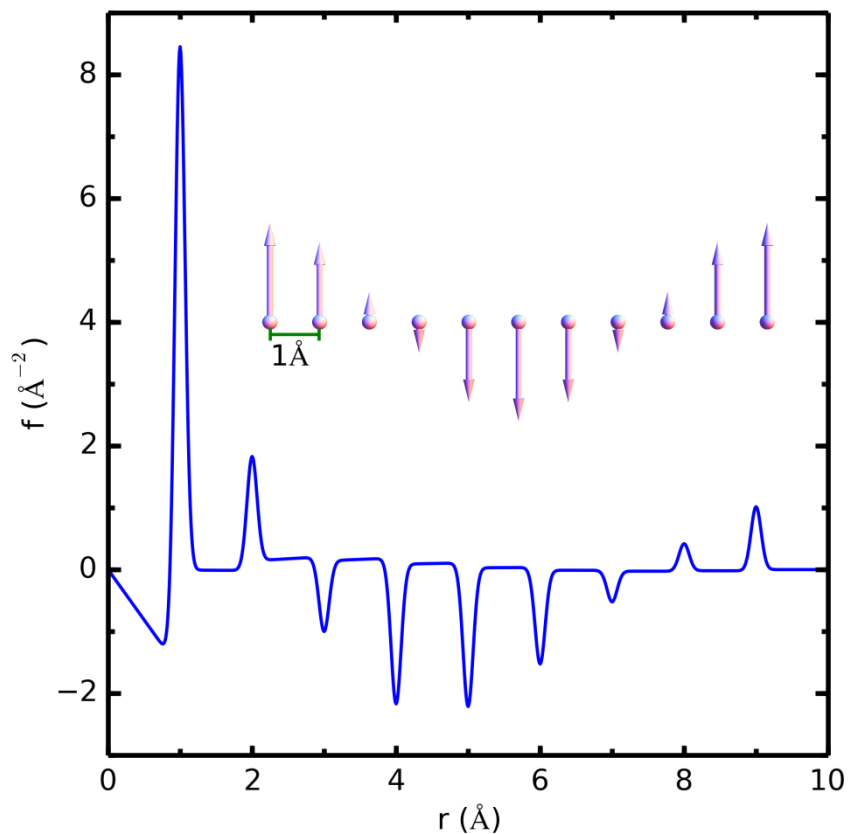
Batteries



10,000 2D datasets per image, 30 mins per image
~10Tb/day

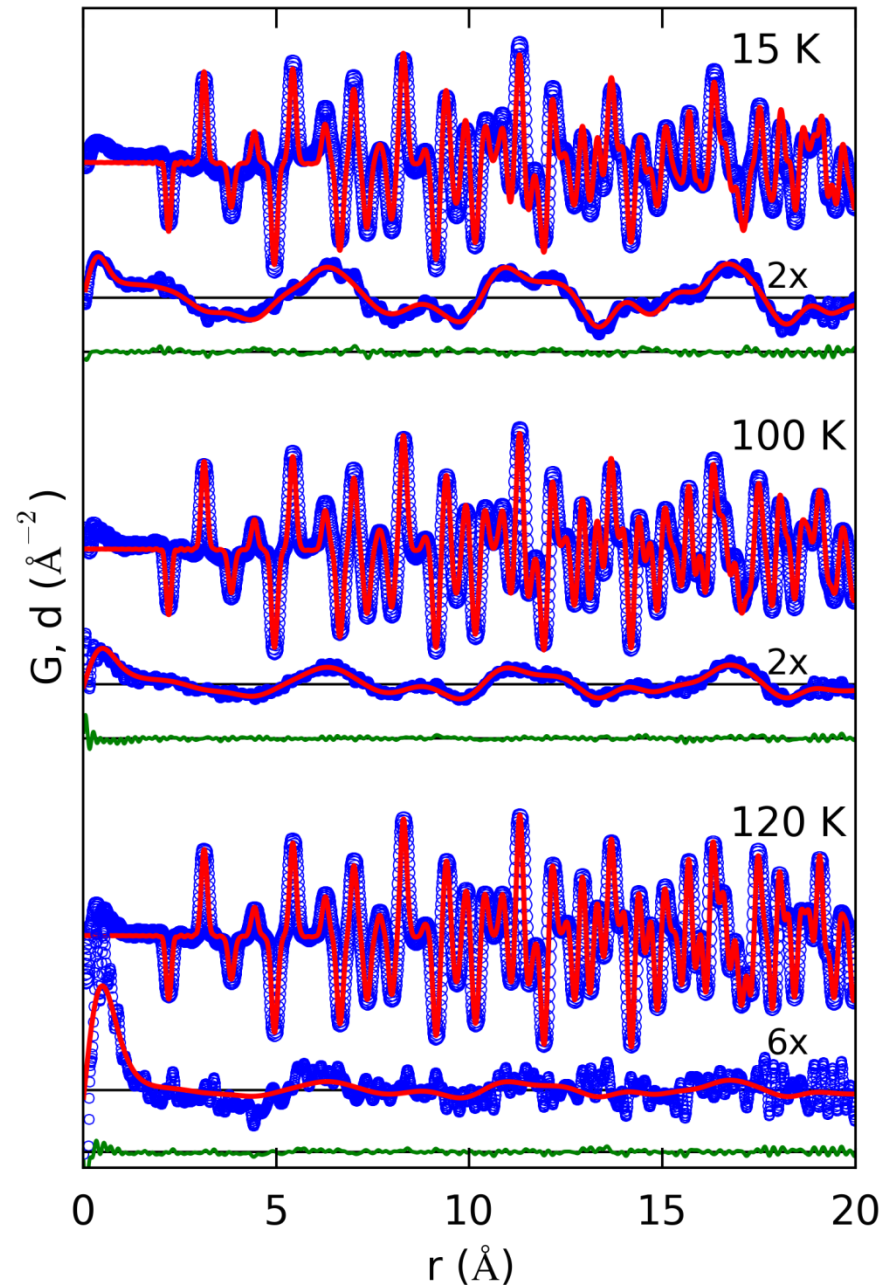
Jensen, Corr, Di Michiel, SJLB et al., *J. Electrochem. Soc.* (2015)

mPDF: PDF of short-range magnetic correlations



- Benjamin A. Frandsen, Xiaohao Yang and Simon J.L. Billinge, *Acta Crystallogr. A* **70**, 3-11 (2014).

MnO

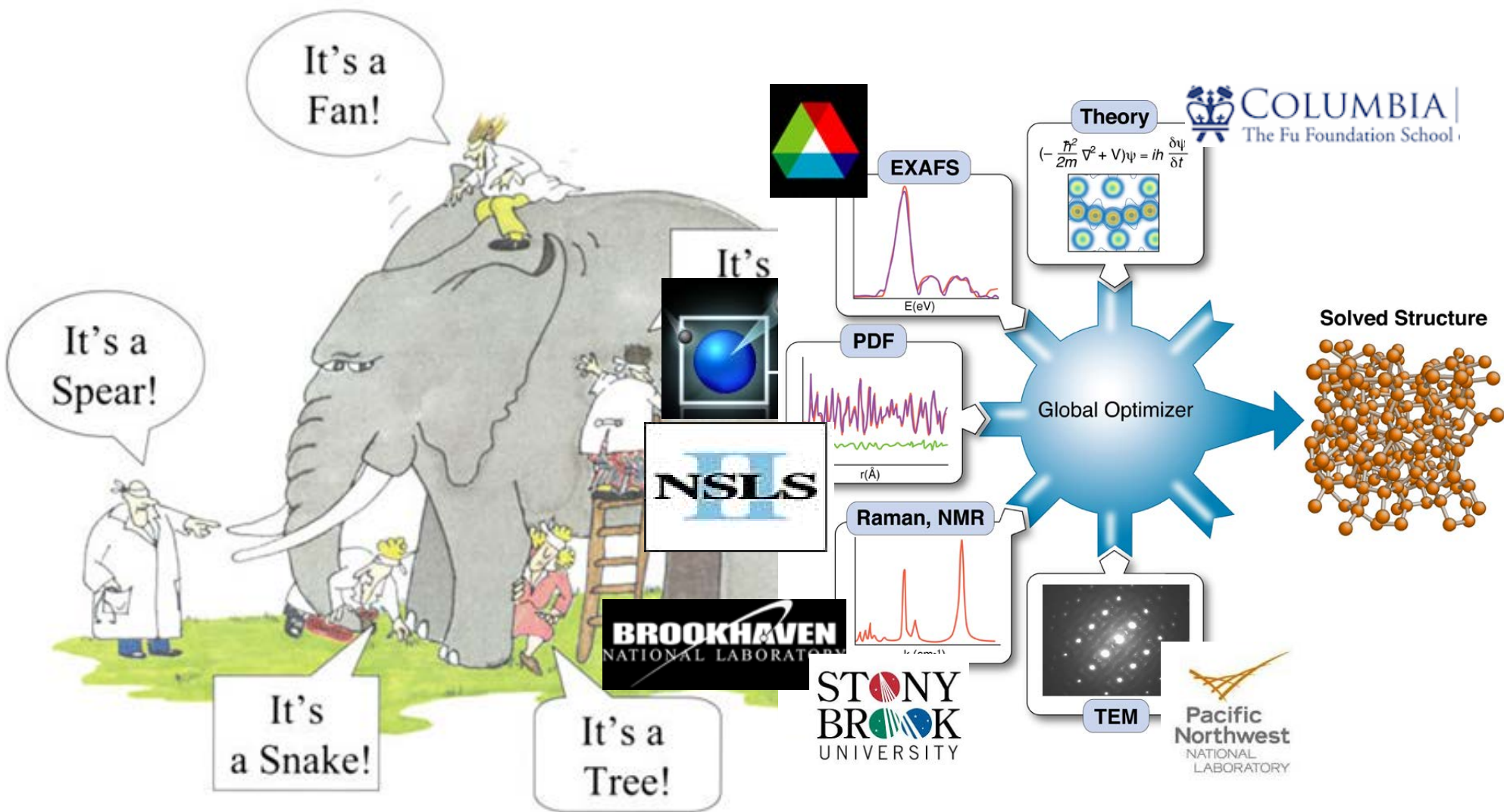


Top: *Blue*: measured nPDF signal
Red (top) calculated structural PDF
Btm: *Blue*: difference between
nPDFsignal and calculated
structural PDF
Red: calculated mPDF for AF MnO

Benjamin A. Frandsen, M. Brunelli, K. Page, Y. J. Uemura, Julie B. Staunton, SJLB, arXiv:1512.06270.

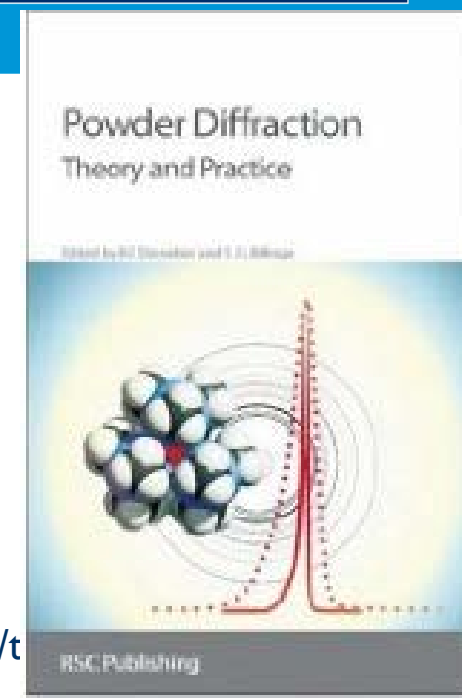
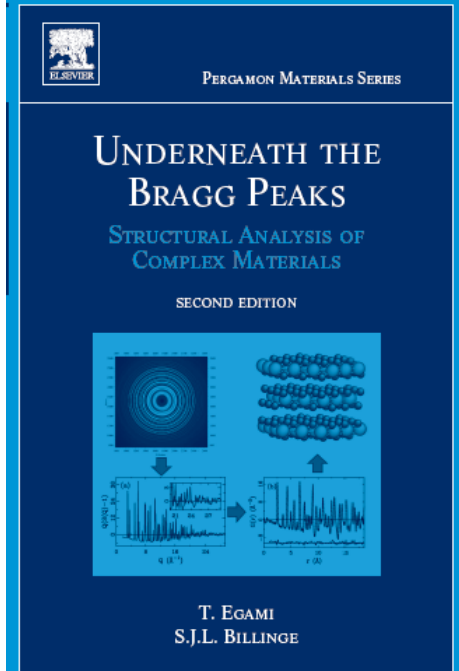
Frandsen, SJLB, Acta Crystallogr. A 71, 325-334 (2015)

Summary



Summary

- Many of society's toughest challenges require complex materials.
- Complex materials characterization present some of our toughest experimental and theoretical challenges
- In general, **complex modeling** solutions (combining multiple diverse information sources in a structure solution) will be needed to solve these problems



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