

PDFgui – a small box modelling platform for nanoscale structure analysis

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October 17, 2022



A reflection on PDFgui usage: increasing popularity

PDFfit2 and PDFgui: computer programs for studying nanostructure in crystals

[Farrow, CL](#); [Juhas, P](#); (...); [Billinge, SJL](#)

3rd Workshop on Reverse Monte Carlo Methods

Aug 22 2007 | [JOURNAL OF PHYSICS-CONDENSED MATTER](#) 19 (33)

PDFfit2 is a program as well as a library for real-space refinement of crystal structures. It is capable of fitting a theoretical three-dimensional (3D) structure to atomic pair distribution function data and is ideal for nanoscale investigations. The fit system accounts for lattice constants, atomic p ... [Show more](#)

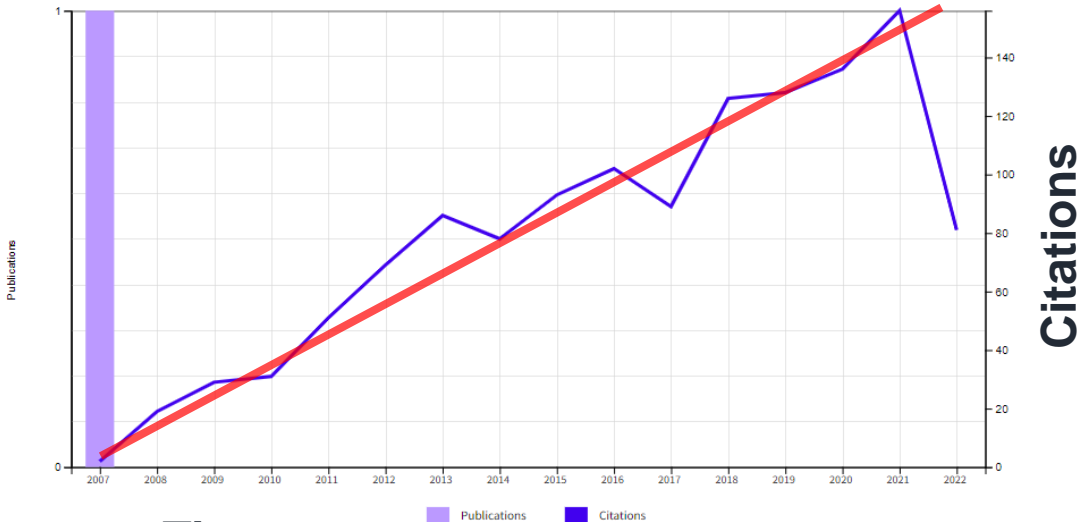
 [Full Text at Publisher](#) ***

1,276
Citations

28
References



Web of Science™



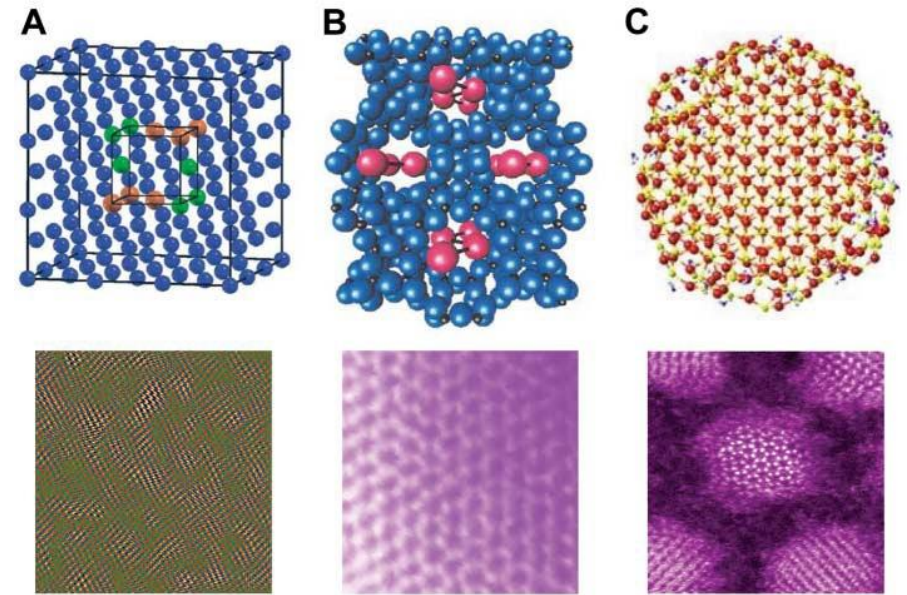
1 Publication	Citations							Average per year	Total
	< Previous year Next year >					Average per year	Total		
	2018	2019	2020	2021	2022				
Total	126	128	136	156	81	79.75	1,276		
PDFfit2 and PDFgui: computer programs for studying nanostructure in crystals Farrow, CL ; Juhas, P ; (...); Billinge, SJL 3rd Workshop on Reverse Monte Carlo Methods Aug 22 2007 JOURNAL OF PHYSICS-CONDENSED MATTER 19 (33)	126	128	136	156	81	79.69	1,275		

Overview

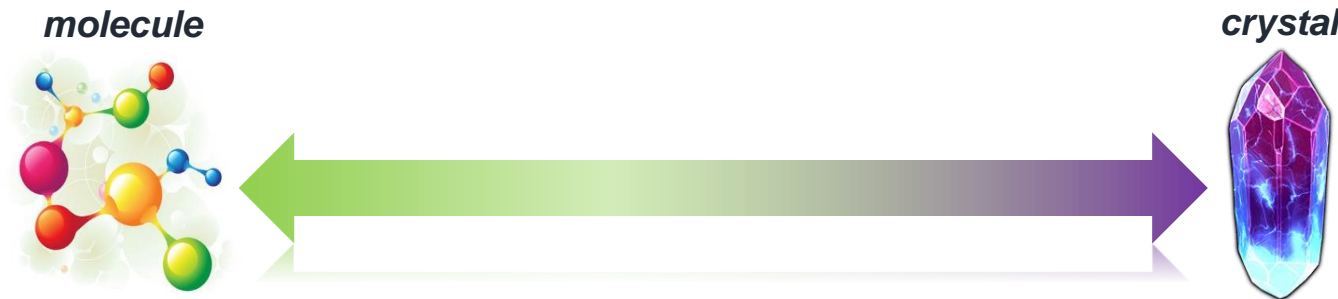
- Small box modelling and PDFgui
- Notes of relevance for PDF analysis
- PDFgui parameters & program structure
- Illustrative PDFgui-based science example

PDF approach

- Non crystalline materials
(liquids, amorphous solids, polymers)
- Nanoscale materials
- Disordered crystalline systems
with nanoscale heterogeneities



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



PDF data modeling

Small Models: Least Squares Refinement

Up to several hundreds of atoms

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

Refinements as function of r -range

Large Models: Reverse Monte Carlo

20000 + atoms

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

Constraints utilized

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

Multi-level /Complex Modeling

Refine higher level parameters (not each atom)

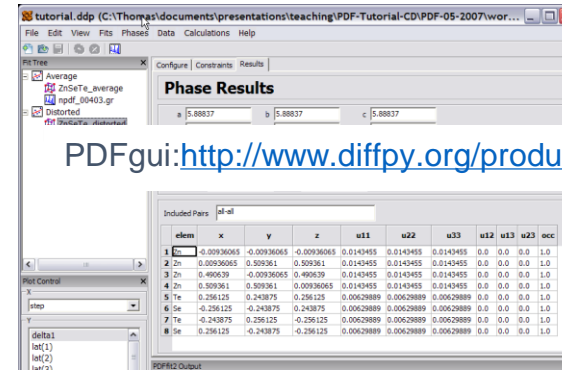
Example nanoparticle: *diameter, layer spacing, stacking fault probability*

Choose minimization scheme

Emerging: *ab initio* and force-field based approaches

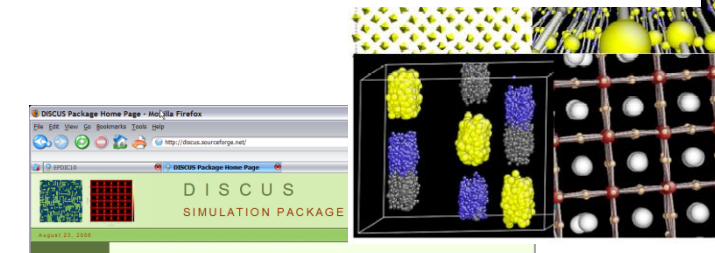
Density Functional Theory

Molecular Dynamics



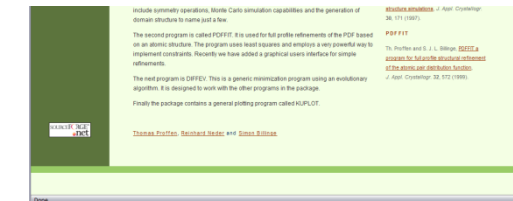
PDFgui: <http://www.diffpy.org/products/pdfgui>

RMCprofile: <http://www.isis2.isis.rl.ac.uk/rmc/>
EPSR: www.facebook.com/disord.matt



DIFFEV and DISCUS: <http://discus.sourceforge.net>

DiffPy-CMI: <http://www.diffpy.org/products/difffpycmi>



PDF data modeling

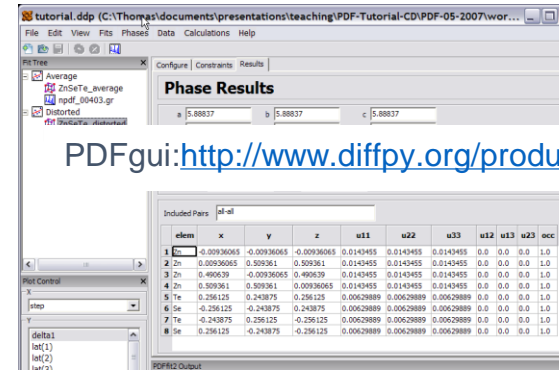
PDFgui

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Refinements as function of r -range



PDFgui: <http://www.diffpy.org/products/pdfgui>

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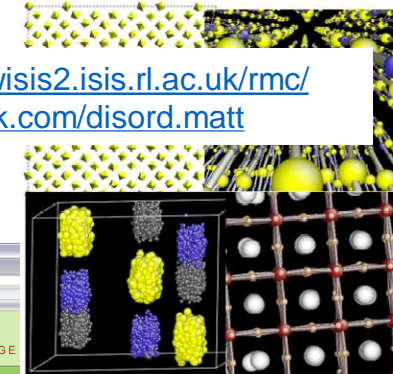
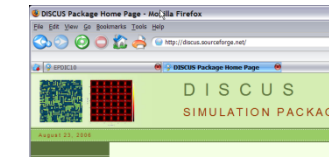
RMCprofile: <http://wwwisis2.isis.rl.ac.uk/rmc/>
EPSR: www.facebook.com/disord.matt

Multi-level /Complex Modeling

Refine higher level parameters (not each atom)

Example nanoparticle: *diameter, layer spacing, stacking fault probability*

Choose minimization scheme



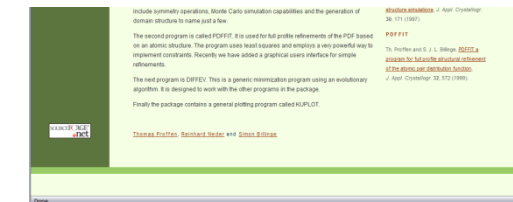
DIFFEV and DISCUS: <http://discus.sourceforge.net>

DiffPy-CMI: <http://www.diffpy.org/products/difffpycmi>

Emerging: *ab initio* and force-field based approaches

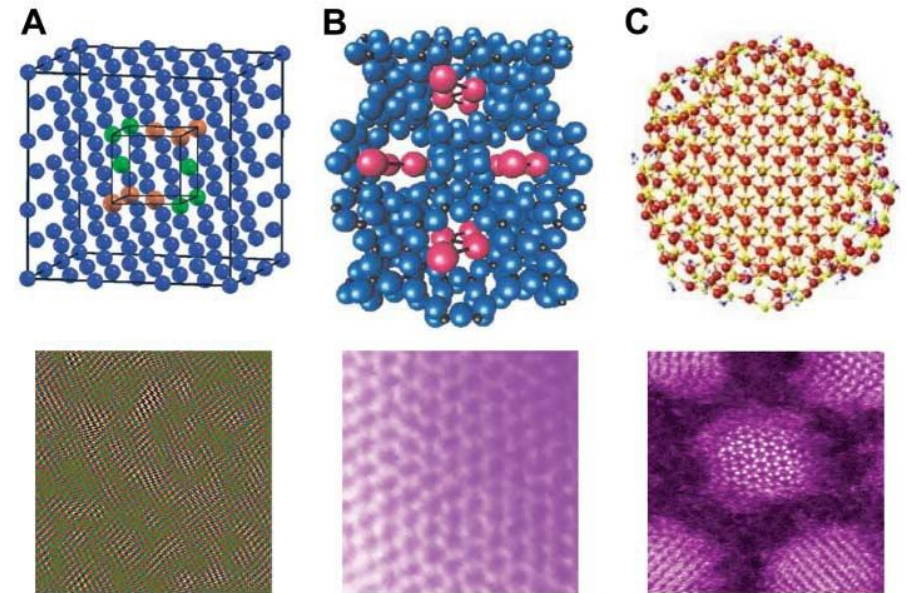
Density Functional Theory

Molecular Dynamics



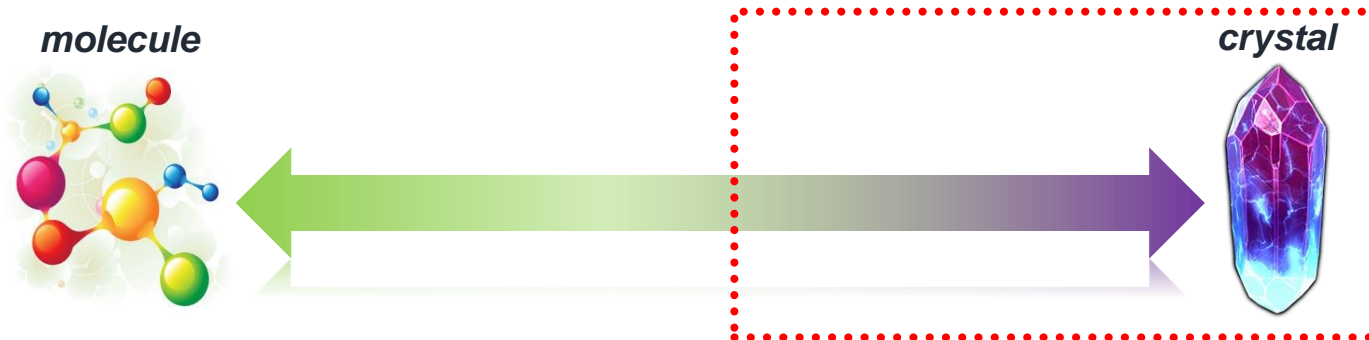
PDF approach

- Non crystalline materials
(liquids, amorphous solids, polymers)
- Nanoscale materials
- Disordered crystalline systems
with nanoscale heterogeneities



structure
PDFgui
symmetry breaking

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



Small box PDF modeling approach

- Small box: assumption of periodic boundary conditions (P1)
- Relatively small number of atoms (up to several hundred)
- Built-in symmetry constraints with symmetry equal to or **usually lower** than the average crystal symmetry
- Involves least squares refinement over selected r -range (typically up to a few unit cells, translational symmetry not relevant for narrow range fits, when box size effectively provides “metrics”)



PDF approach

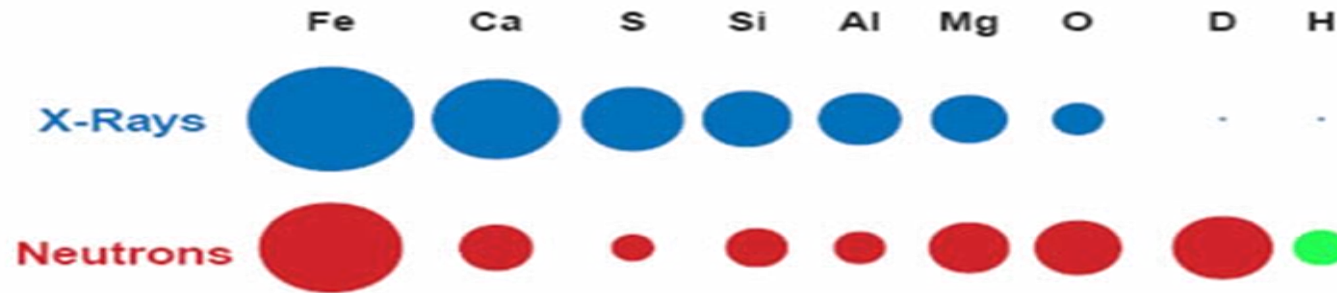
- Considering scattering contrast
- Considering absorption
- Considering isotopes and resonances

hydrogen 1 H 1.0079																	helium 2 He 4.0026	
lithium 3 Li 6.941	beryllium 4 Be 9.0122											boron 5 B 10.811	carbon 6 C 12.011	nitrogen 7 N 14.007	oxygen 8 O 15.999	fluorine 9 F 18.998	neon 10 Ne 20.180	
sodium 11 Na 22.990	magnesium 12 Mg 24.305											aluminum 13 Al 26.982	silicon 14 Si 28.086	phosphorus 15 P 30.974	sulfur 16 S 32.065	chlorine 17 Cl 35.453	argon 18 Ar 39.948	
potassium 19 K 39.098	calcium 20 Ca 40.078	scandium 21 Sc 44.956	titanium 22 Ti 47.867	vanadium 23 V 50.942	chromium 24 Cr 51.996	manganese 25 Mn 54.938	iron 26 Fe 55.845	cobalt 27 Co 58.933	nickel 28 Ni 58.693	copper 29 Cu 63.546	zinc 30 Zn 65.39	gallium 31 Ga 69.723	germanium 32 Ge 72.61	arsenic 33 As 74.922	selenium 34 Se 78.96	bromine 35 Br 79.904	krypton 36 Kr 83.80	
rubidium 37 Rb 85.468	strontium 38 Sr 87.62	yttrium 39 Y 88.906	zirconium 40 Zr 91.224	niobium 41 Nb 92.906	molybdenum 42 Mo 95.94	technetium 43 Tc [98]	ruthenium 44 Ru 101.07	rhodium 45 Rh 102.91	palladium 46 Pd 106.42	silver 47 Ag 107.87	cadmium 48 Cd 112.41	indium 49 In 114.82	tin 50 Sn 118.71	antimony 51 Sb 121.76	tellurium 52 Te 127.60	iodine 53 I 126.90	xenon 54 Xe 131.29	
cesium 55 Cs 132.91	barium 56 Ba 137.33	* 57-70	lutetium 71 Lu 174.97	hafnium 72 Hf 178.49	tantalum 73 Ta 180.95	tungsten 74 W 183.84	rhenium 75 Re 186.21	osmium 76 Os 190.23	iridium 77 Ir 192.22	platinum 78 Pt 195.08	gold 79 Au 196.97	mercury 80 Hg 200.59	thallium 81 Tl 204.38	lead 82 Pb 207.2	bismuth 83 Bi 208.98	polonium 84 Po [209]	astatine 85 At [210]	radon 86 Rn [222]
francium 87 Fr [223]	radium 88 Ra [226]	** 89-102	lawrencium 103 Lr [262]	rutherfordium 104 Rf [261]	dubnium 105 Db [262]	seaborgium 106 Sg [266]	bohrium 107 Bh [264]	hassium 108 Hs [269]	meitnerium 109 Mt [268]	unnilium 110 Uun [271]	ununium 111 Uuu [272]	unbibium 112 Uub [277]						
													ununquadium 114 Uuq [289]					

* Lanthanide series

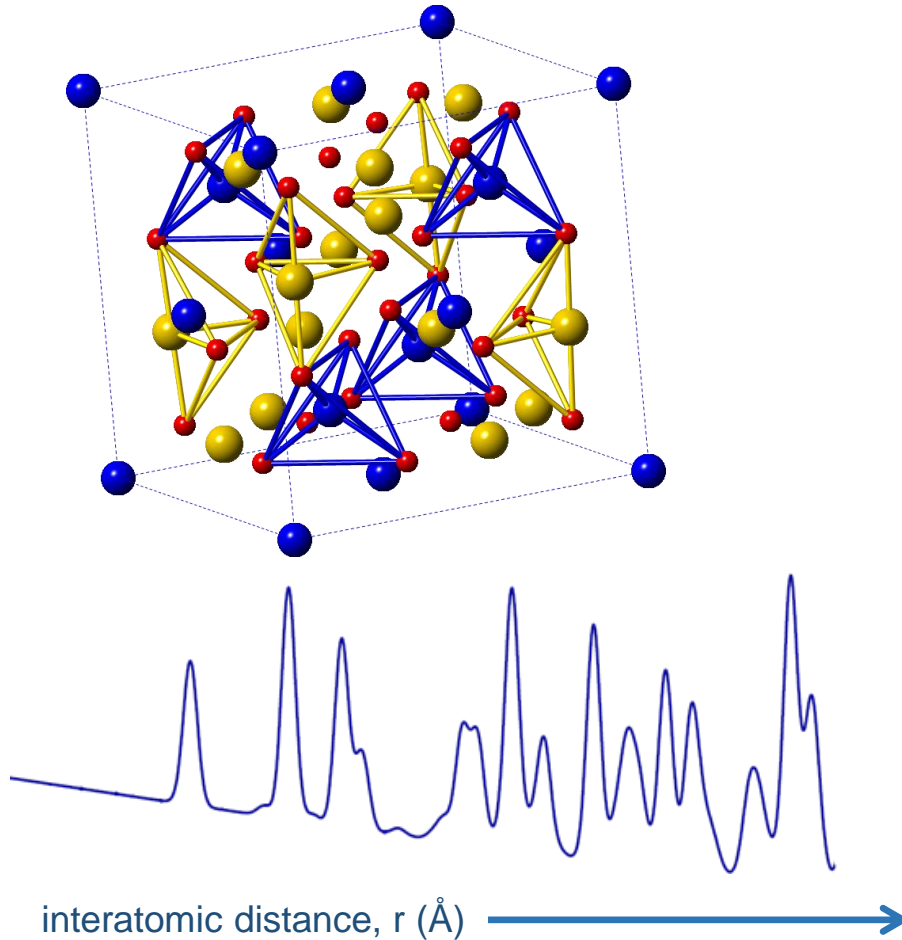
lanthanum 57 La 138.91	cerium 58 Ce 140.12	praseodymium 59 Pr 140.91	neodymium 60 Nd 144.24	promethium 61 Pm [145]	samarium 62 Sm 150.36	europium 63 Eu 151.96	gadolinium 64 Gd 157.25	terbium 65 Tb 158.93	dysprosium 66 Dy 162.50	holmium 67 Ho 164.93	erbium 68 Er 167.26	thulium 69 Tm 168.93	ytterbium 70 Yb 173.04
actinium 89 Ac [227]	thorium 90 Th 232.04	protactinium 91 Pa 231.04	uranium 92 U 238.03	neptunium 93 Np [237]	plutonium 94 Pu [244]	americium 95 Am [243]	curium 96 Cm [247]	berkelium 97 Bk [247]	californium 98 Cf [251]	einsteinium 99 Es [252]	fermium 100 Fm [257]	mendelevium 101 Md [258]	nobelium 102 No [259]

** Actinide series



PDFgui handles
xPDF & nPDF

PDF approach



Experiment



Raw data



Data reduction



PDF



Analysis

$$I_{tot} = I_{sam} + I_{bgnd}$$

$$I_{sam} = A \cdot P \cdot [C \cdot I_{coh} + I_{inc} + I_{mul}]$$

$$S(Q) = \frac{I_{coh}(Q) - \langle b^2 \rangle + \langle b \rangle^2}{\langle b \rangle^2}$$

$$Q = \frac{4\pi \sin \theta}{\lambda}$$

experiment

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

PDFgui does **NOT**
fix data problems

model

relationship to structure

$$G(r) = \frac{1}{Nr \langle b \rangle^2} \sum_{i \neq j} b_i b_j \delta(r - r_{ij}) - 4\pi r \rho_0$$

PDFgui provides
a PDF calculator

PDF approach

Relationship to structure

$$G(r) = \frac{1}{Nr \langle b \rangle^2} \sum_{i \neq j} b_i b_j \delta(r - r_{ij}) - 4\pi r \rho_0$$

r_{ij} – interatomic distance between atoms i and j
 $\rho_0 = N/V$ average number density (number of atoms per unit volume)
 r – running variable (distance)

scattering “scale” for pair of atoms i and j weighted by averaged scattering “strength”

Neutrons: b_{coh}
 X-rays: $f(Q=0)$, effectively Z

Experimental setup limitations

$$G(r) = \frac{2}{\pi} \int_{Q_{\text{MIN}}}^{Q_{\text{MAX}}} Q (S(Q) - 1) \sin Qr \, dQ$$

Truncation effects in Fourier transform (termination ripples, limited r -resolution)

Ideally one would like to have

- broad Q -range
- good Q -resolution

This is not always essential!

Small angle scattering information is (usually) missing

PDFgui – awareness of various effects

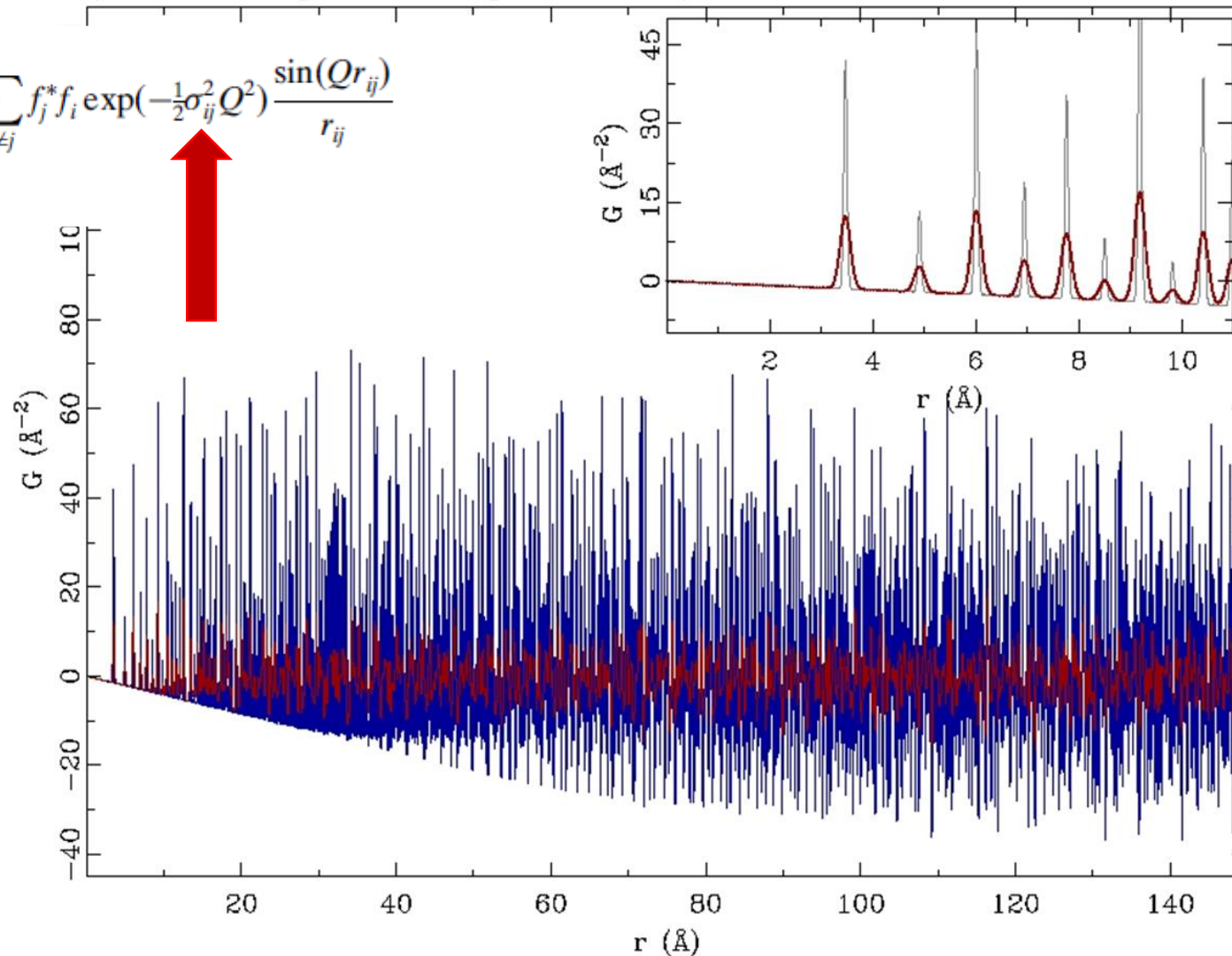
Some effects that should be accounted for in data modelling

- Thermal broadening
- Correlated motion of nearest neighbors
- Finite Q_{\max} (truncation)
- Limited Q-space resolution (field of view)
- Particle size

Effect of thermal broadening

Thermal vibrations of atoms broaden PDF peaks
anisotropic atomic displacement parameters (ADPs)

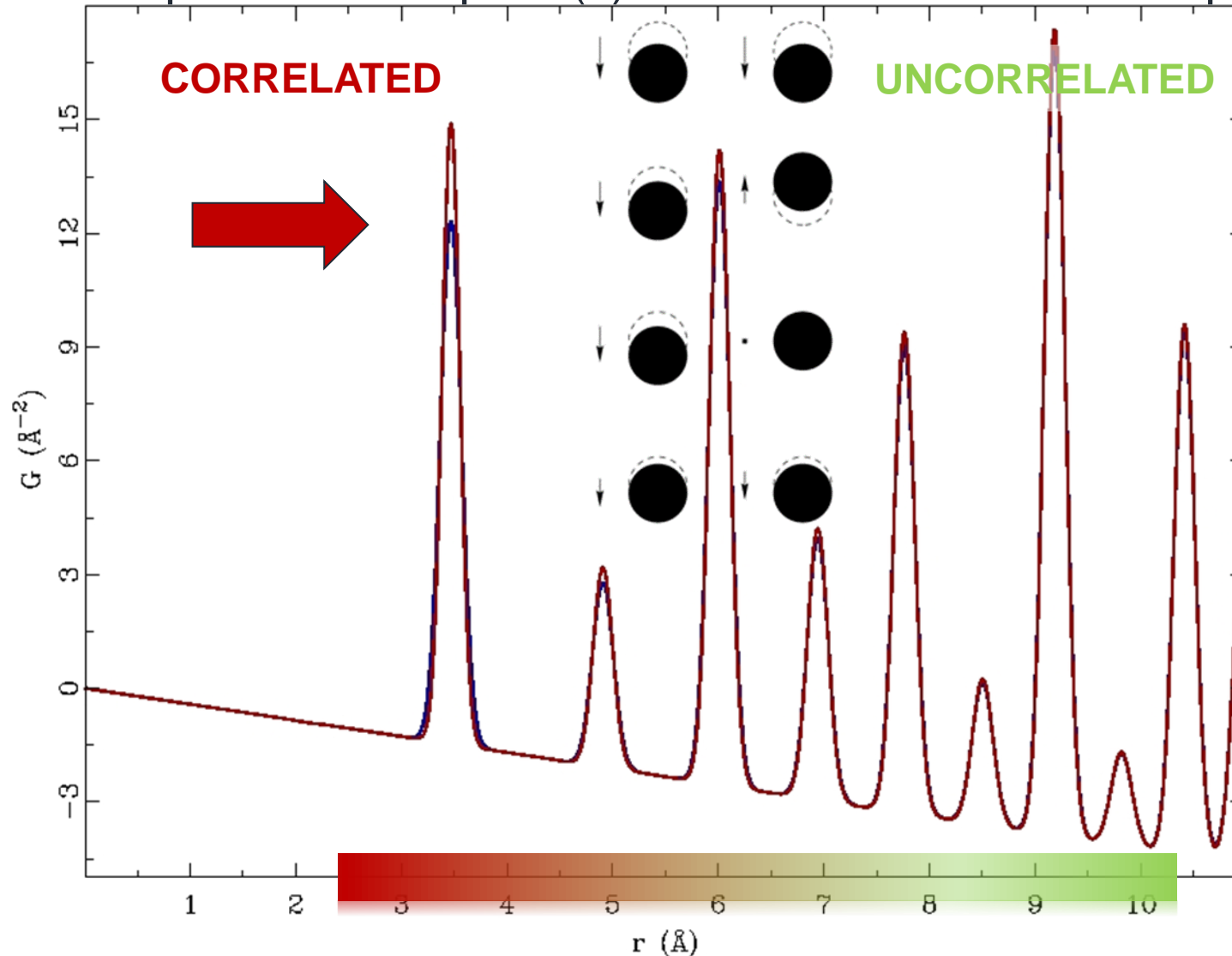
$$F(Q) = \frac{1}{N(f)^2} \sum_{i \neq j} f_j^* f_i \exp\left(-\frac{1}{2} \sigma_{ij}^2 Q^2\right) \frac{\sin(Qr_{ij})}{r_{ij}}$$



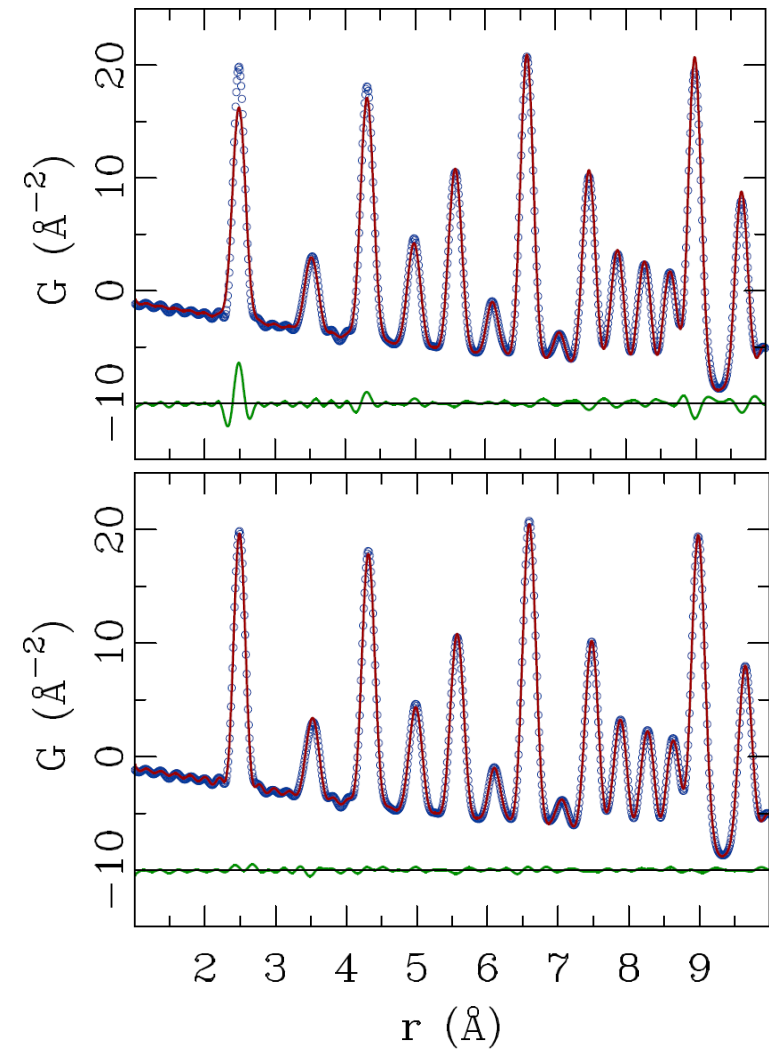
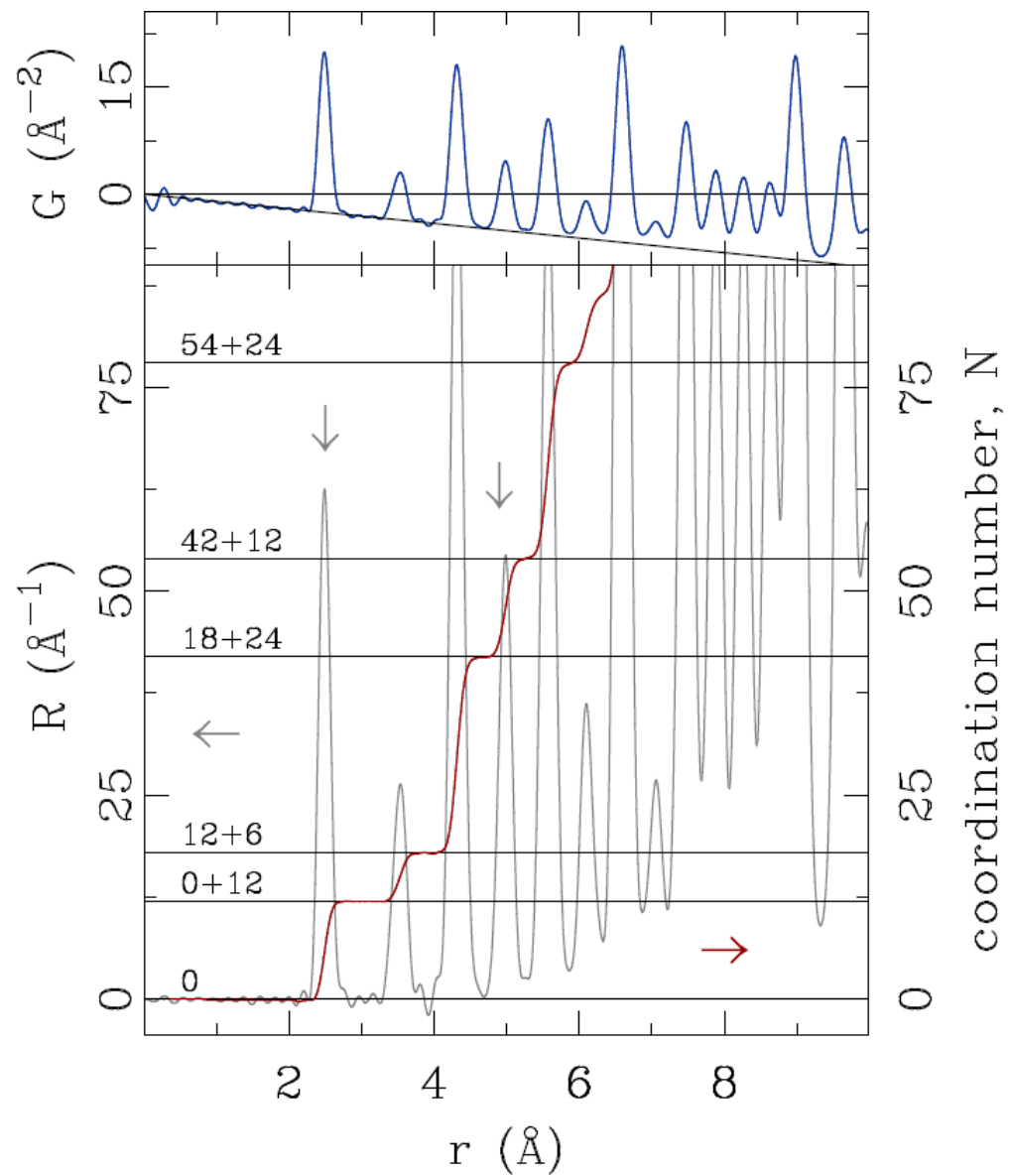
PDFgui accounts
for ADPs

Effect of correlated atomic motion

Nearest neighbors tend to vibrate in correlated manner
this sharpens the NN peak(s) in PDF relative to distant peaks



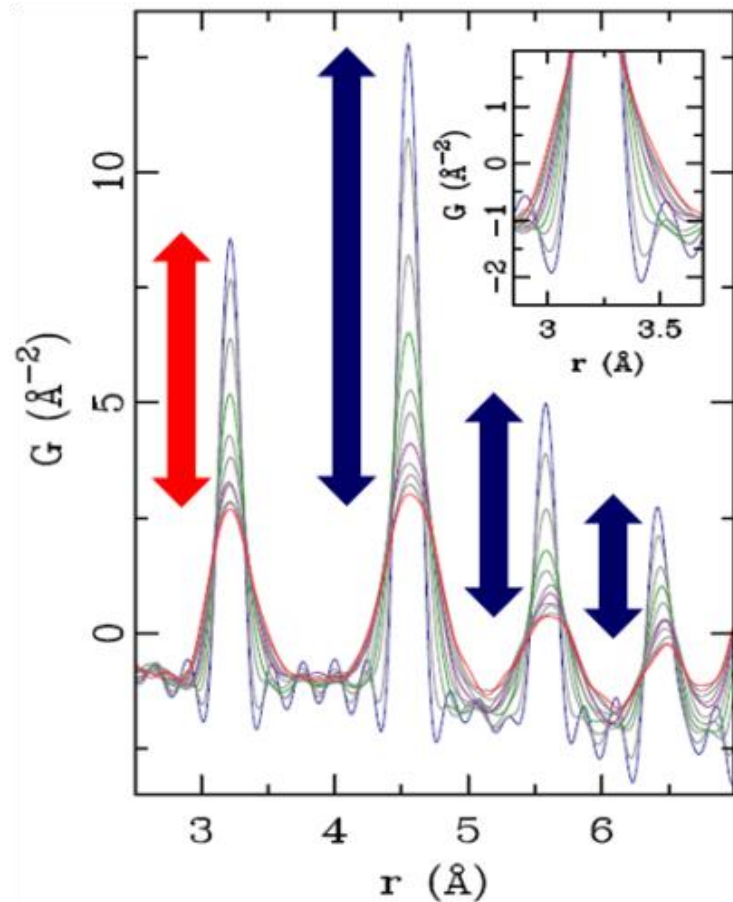
Effect of correlated atomic motion



PDF correlated atomic motion outlaws

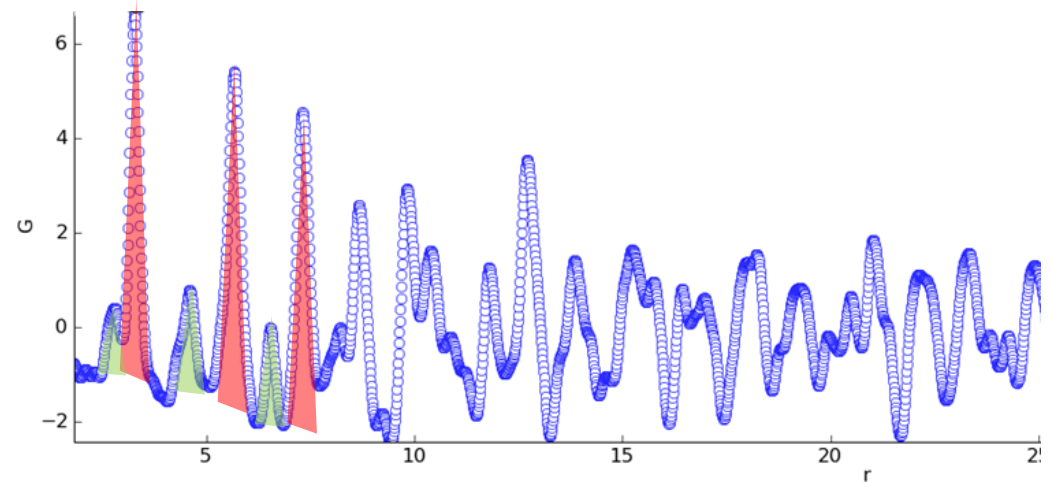
Weak effects: soft bonding
(e.g. PbTe)

break the rule



Enhanced effects: strong bonding
(e.g. in CeCoIn_5)

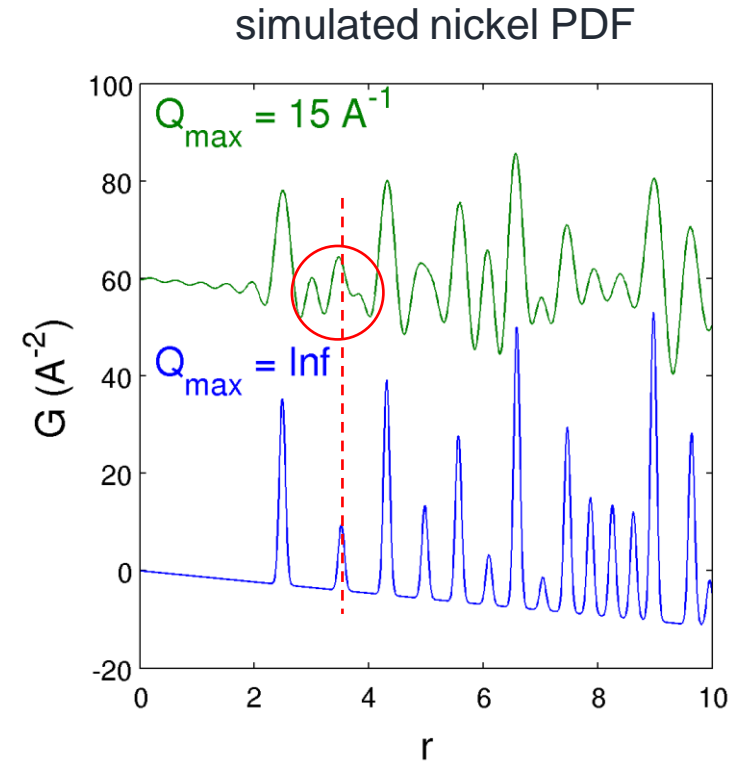
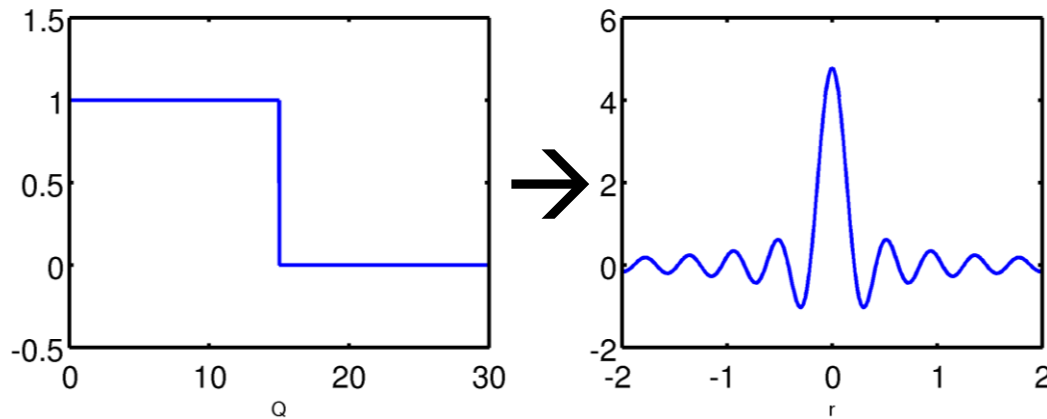
difficult to model



PDFgui handles most
correlated motion cases
(empirical corrections)

Effect of finite data range (Q_{\max} truncation)

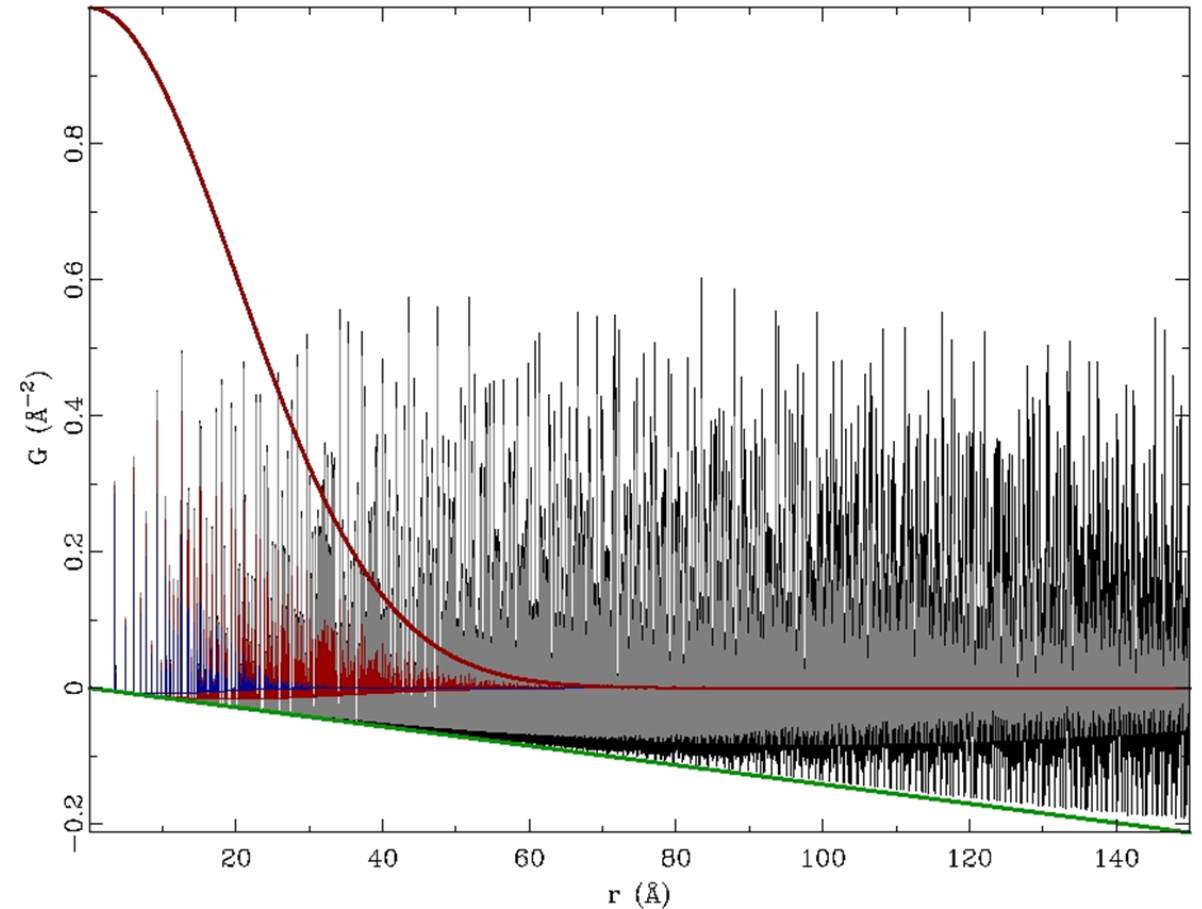
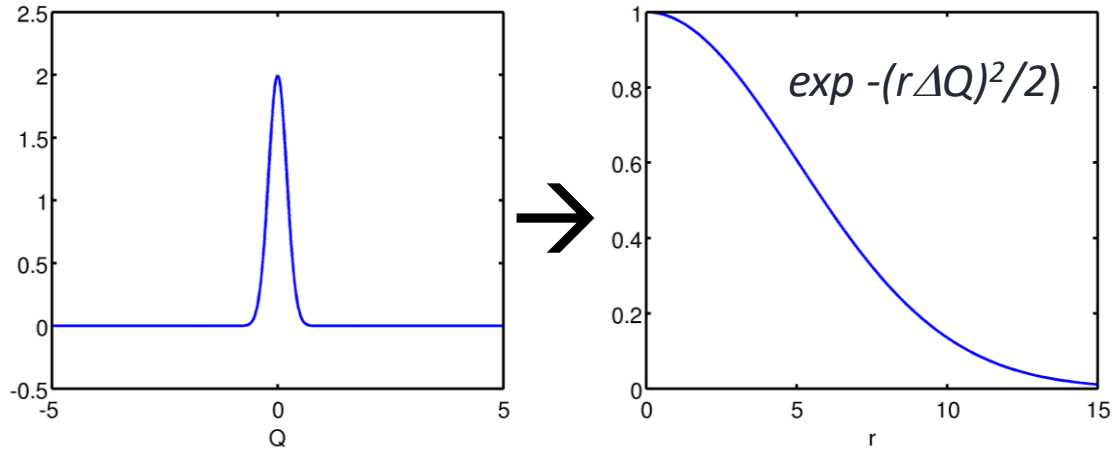
$$G(r) = \frac{2}{\pi} \int_0^{Q_{\max}} F(Q) \sin Qr \, dQ$$



- ideal $F(Q)$ is multiplied by a step function
- $G(r)$ gets convoluted with a sinc function $\text{sinc}(r) = \sin(Q_{\max} r) / r \rightarrow$
 r -resolution $\approx \pi/Q_{\max}$
- good r -resolution of G requires large Q_{\max}
 $Q = 4\pi \sin \theta/\lambda \rightarrow$ best results with TOF neutrons or high-energy X-rays

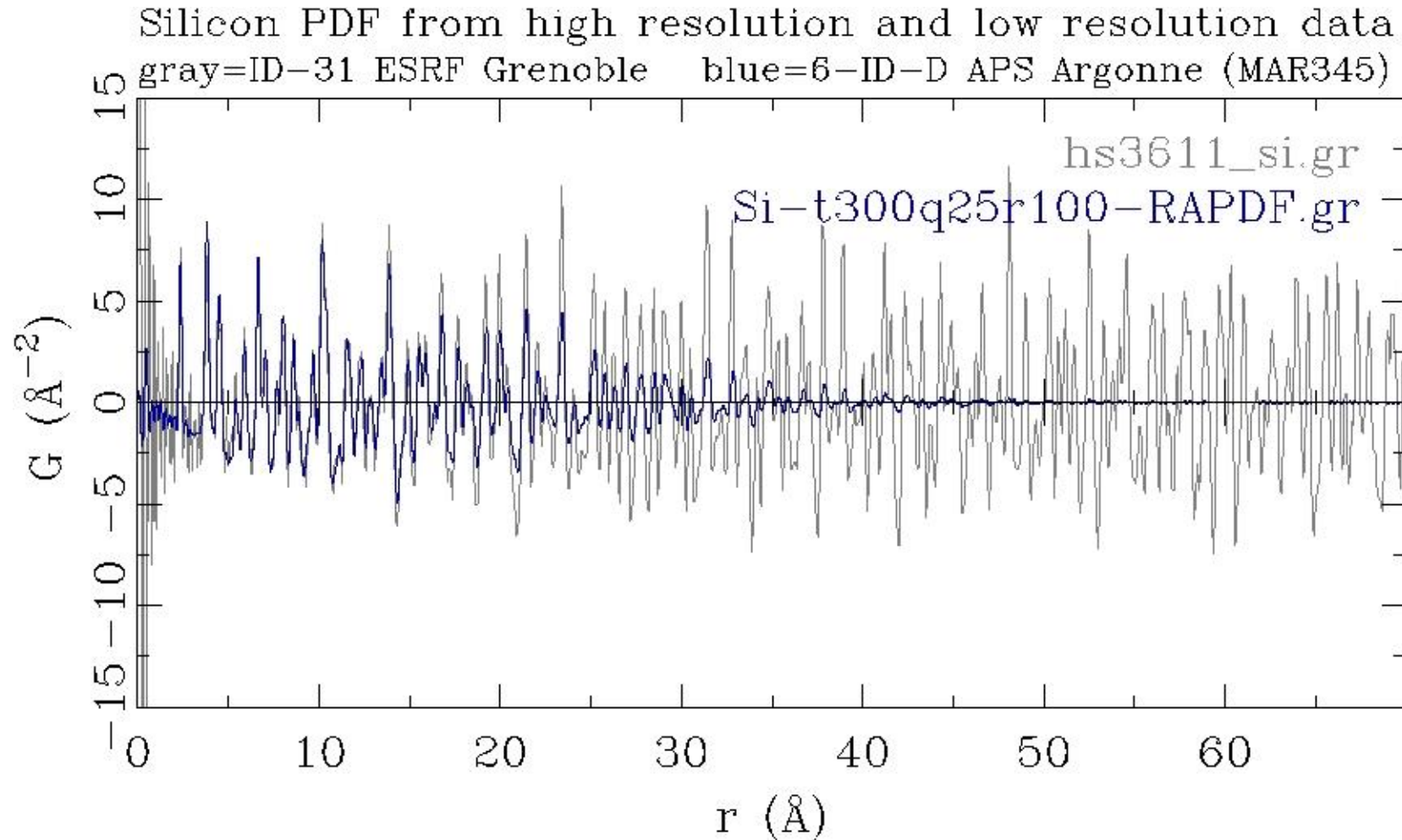
Effect of the Q-space resolution

- Ideal $F(Q)$ is convoluted by Gaussian to simulate finite Q resolution
- $G(r)$ gets multiplied by real-space Gaussian with reciprocal width



For $G(r)$ to have good r -range high resolution in Q is required
Q-resolution defines PDF “field of view”

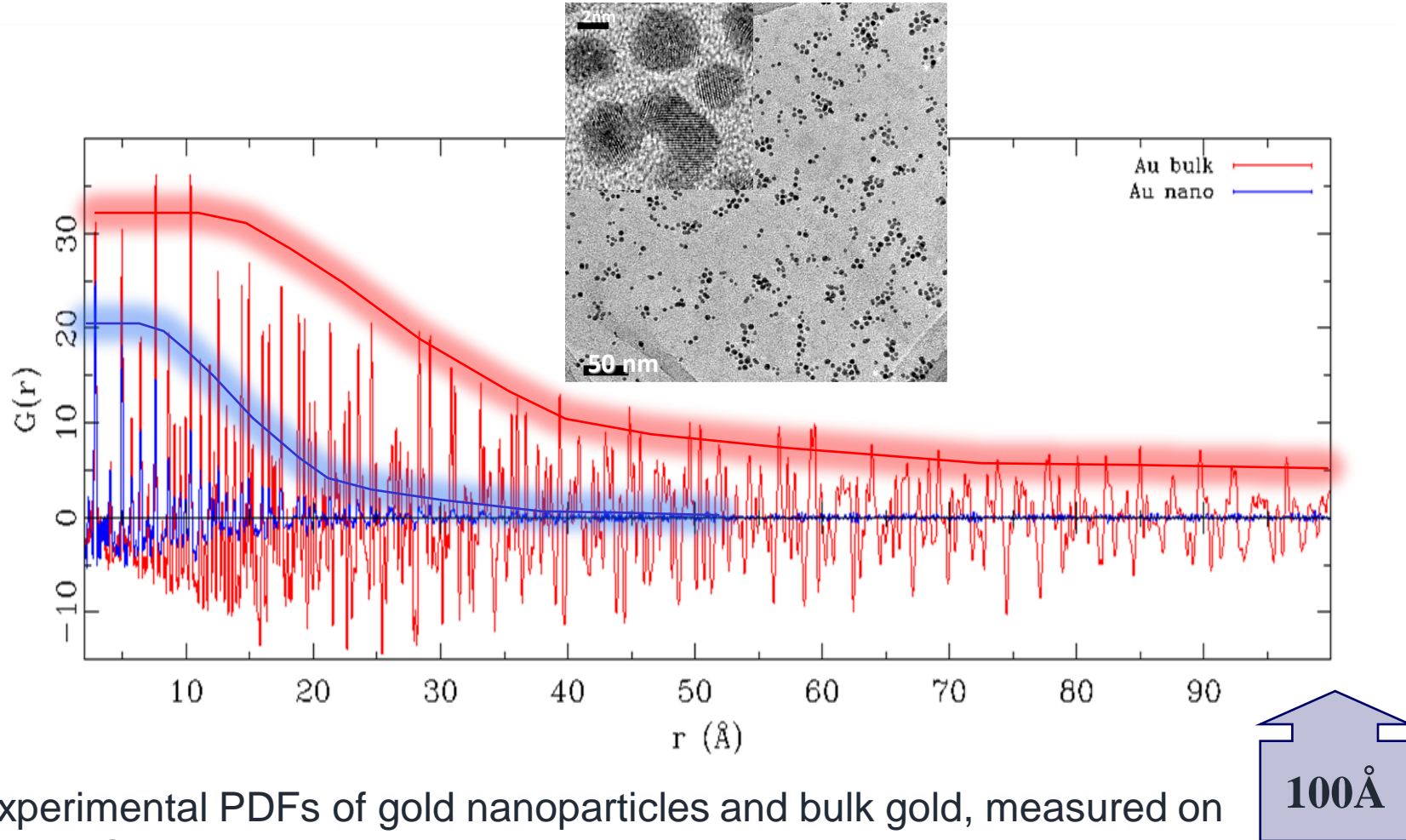
Effect of the Q-space resolution



PDFgui accounts for the effect

Effects of the finite particle size – nano vs bulk

K.L. Page et al., Chem. Phys. Lett. 393, 385 (2004).



Experimental PDFs of gold nanoparticles and bulk gold, measured on NPDF. Signal damping depends on both **shape** & **size**!

PDFgui accounts for spherical shapes only

Things needed for small box modeling ...

- PDF **data** (*sample.gr* files) and associated information such as Q_{\max} used, range of data, type of radiation, sample chemistry,
- In **small box modelling** approach, one typically starts from a **refinement** of a known/suspect structure, (thus reducing the volume of the parameter space as much as possible)
 - High-*r* region ~average structure
 - Low-*r* region ~local structure
(biased view with bulk materials in mind)
- **Starting structure information**
 - space group and lattice parameters
 - fractional coordinates (asymmetric unit cell) & occupancies
 - having site-multiplicities handy may be helpful for crosschecking (e.g. **PDFgui works with symmetrized cells**)
 - Having an origin choice handy, if multiple are available, could matter

PDF modeling

- PDF is simulated from a known structure model

$$G_{calc}(r) = \frac{1}{Nr\langle b \rangle^2} \sum_{i \neq j} b_i b_j \frac{1}{\sqrt{2\pi}\sigma_{ij}} \exp \left[-\frac{(r - r_{ij})^2}{2\sigma_{ij}^2} \right] - 4\pi r \rho_0$$

- structure model is parameterized by a set of parameters p_i
- residuum R_w - difference between observed and simulated PDF

ADP

$$R_w(p_1, p_2, \dots) = \sqrt{\frac{\sum_n [G_{obs}(r_n) - G_{calc}(r_n)]^2}{\sum_n G_{obs}^2(r_n)}}$$

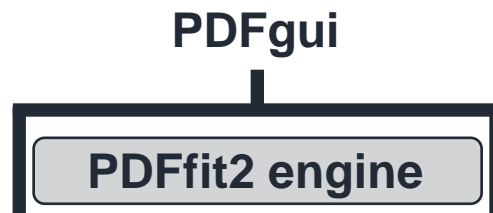
- least-squares refinement of p_i to minimize R_w
- Effects from setup (e.g. finite Q-resolution) or sample (correlated NN-motion) accounted for

$$B(r) = e^{-\frac{(rQ_{damp})^2}{2}}$$

$$\sigma_{ij} = \sigma'_{ij} \sqrt{1 - \frac{\delta_1}{r_{ij}} - \frac{\delta_2}{r_{ij}^2} + Q_{broad}^2 r_{ij}^2}$$

PDFgui overview

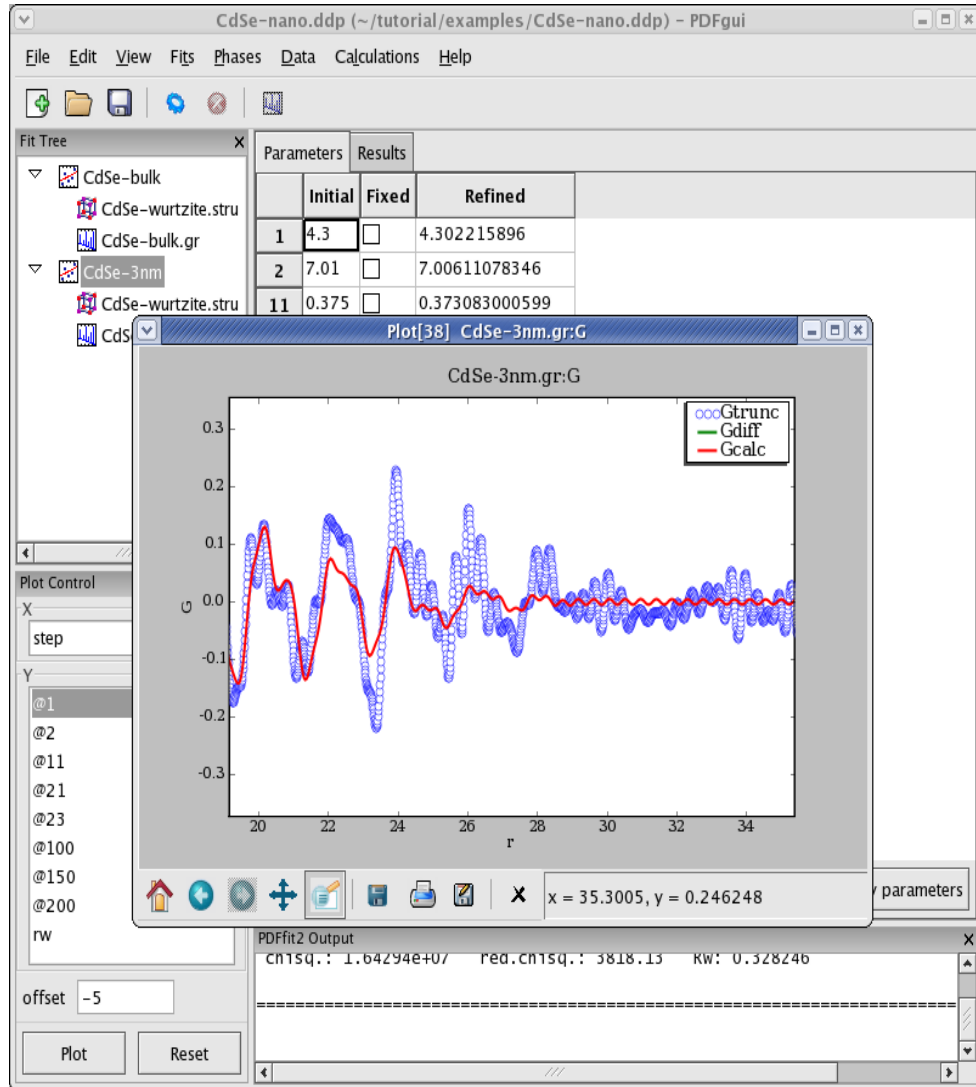
- PDFgui is a **graphical interface** (modeling platform) **built on the PDFfit2 engine**
- The PDFfit2 engine written in C++, Python accessible, can be prompt operated
- PDFgui organizes fits **and simplifies many data analysis tasks**, such as configuring, executing, and plotting multiple fits, **adding functionality** to script driven PDFfit2
- PDFfit2 calculates & fits a theoretical 3D-structure to PDF data (does all the work!)
- The fit system accounts for lattice constants, atomic positions and anisotropic ADPs, correlated atomic motion, as well as standard experimental factors affecting the data
- The atomic positions and thermal coefficients can be constrained to follow symmetry requirements of an arbitrary space group, enabling studies of local broken symmetry



PDFgui overview

PDFgui

- GUI interface to PDFfit2 is user friendly modelling environment that **can be used for quick simulations (useful for experiment planning and sensitivity tests)**
- can **organize** multiple related fits in a single **project file** (.ddp file) easily shareable with colleagues, with **journal facility**
- powerful **visualization facilities**
 - live plotting of refined PDF profiles
 - parametric plots of variables from multiple fits
 - 3D structure visualization (optional connection to structure plotting)
- **structure model manipulation**
 - supports xyz, PDF, CIF and PDFfit formats
 - supercell expansion
 - expansion of asymmetric unit
 - generation of symmetry constraints for coordinates and atomic displacement factors, ADPs (“thermals”)
- **wizards** for T-series, doping-series, r-series (smart extraction of meta-data from files)



Easy set up for “on the fly” refinements of incoming data helps making experimental decisions

PDFgui parameters and program structure

- PDFgui parameters associated with DATASET

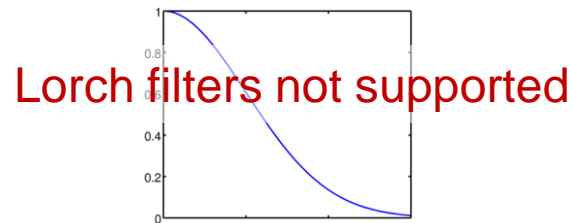
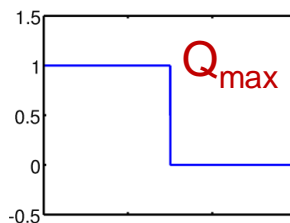
Fit range (r_{MIN} , r_{MAX})
fixed in refinement

user selected refinement r -range

Q_{max}
fixed in refinement

upper limit of integration used in Fourier transform
defines r -space resolution, predetermined

Q_{damp}
refined for calibrant
fixed for sample



Gaussian dampening (due to limited Q -resolution)

Q_{broad}
refined for calibrant
fixed for sample

High- r peak broadening (due to increased refined intensity noise at high Q and other sources, only significant when r_{MAX} is large)

dscale
refined

scale factor associated with dataset

PDFgui parameters and program structure

- PDFgui parameters associated with PHASE

pscale
refined

phase scale factor
NOTE: could be redundant/correlated with **dscale**

a, b, c, α , β , γ
refined

lattice parameters

x[n]
y[n]
z[n]
occ[n]
u[1..6,n]
refined (per symmetry)

x-position (fractional coordinates)
y-position
z-position
site occupancy
anisotropic displacement parameters U_{ij} [\AA^{-2}]

NOTE: Refinement parameters **can be correlated**, particularly when a model is refined over a **narrow r-range** of data. **PDFgui reports on correlations $> |0.8|$**

PDFgui parameters and program structure

- PDFgui parameters associated with PHASE for correlated atomic motion

delta1
refined

1/r contribution to peak sharpening [\AA^{-1}]

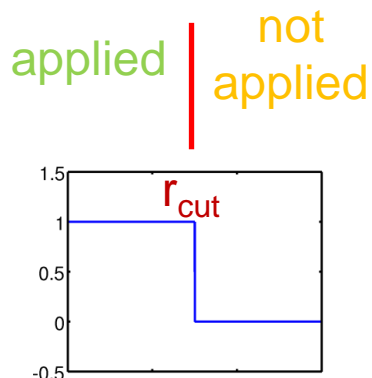
delta2
refined

1/r² contribution to the peak sharpening [\AA^{-2}]

sratio
refined

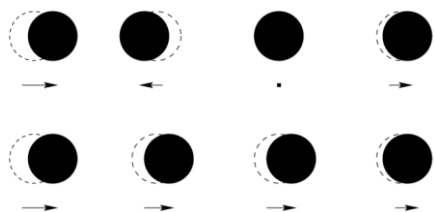
peak width reduction for correlated motion
(special cases of rigid structural units)

rcut
constat



radius cutoff for applying the **sratio**
sharpening factor [\AA]

Note: Empirical correlated motion parameters are selected depending on material, they are **very strongly correlated** and affect other parameters



$$\sigma_{ij} = \sigma'_{ij} \sqrt{1 - \frac{\delta_1}{r_{ij}} - \frac{\delta_2}{r_{ij}^2} + Q_{broad}^2 r_{ij}^2}$$

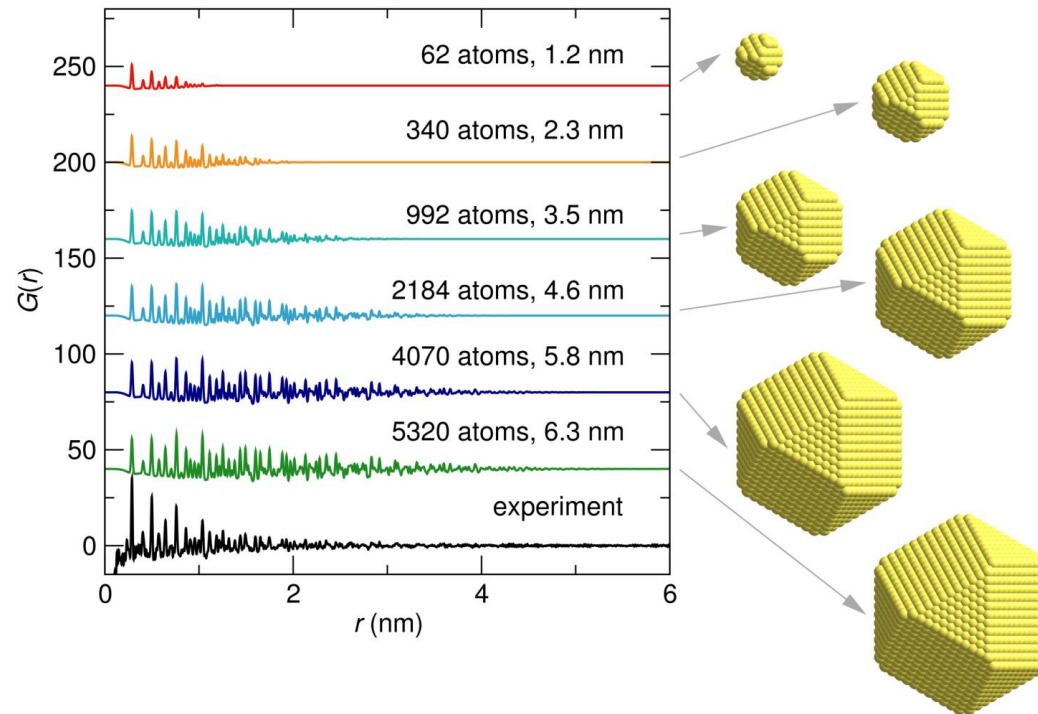
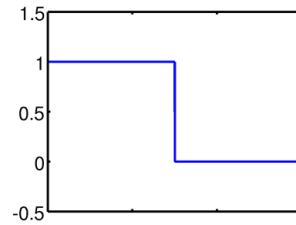
PDFgui parameters for nanoparticles

spdiameter
refined

spherical particle diameter for PDF shape
damping function [\AA]

stepcut
constant

r value above which the PDF is truncated
to zero [\AA]



PDFgui parameters and program structure

- PDFgui declarations associated with PHASE

X
declaration

atom type associated with given site (all sites)
e.g. Ni/Ta/Ca (label used to read scattering info
from lookup tables of b_{coh} and Z).

- PDFgui declarations associated with DATASET

Neutron/X-ray
declaration

scatterer type
(used to determine lookup table)

NOTE: In rare instances one may experience the following

In case of X-ray radiation Z_X is used for element X. If ions present one can change X from original element to a fellow element with adequate electron count.

In case of neutron radiation b_{cohX} is used for element X. Lookup table contains information per natural isotope abundance. If isotope substitution is present, lookup table has to be modified with adequate b specified for a dummy element with made-up alphabetical code that will then be declared in the phase using that alphabetical code.

PDFgui parameters and program structure

Parameters are assigned by the handle syntax `@pn`, where `pn` is the parameter number

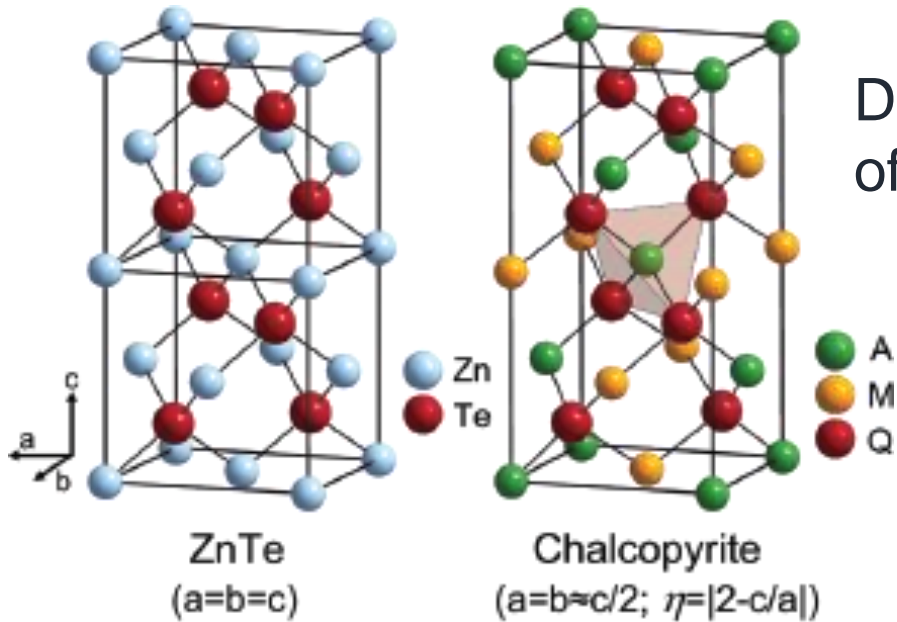
For example, `@1`, `@55`, `@321`, etc, note that numbers do not have to be consecutive

Variables that are assigned the same handle will be described by the same parameter

Caution should be exercised to avoid unintentional assignment of the same parameter number to incompatible variables (variables of different type)

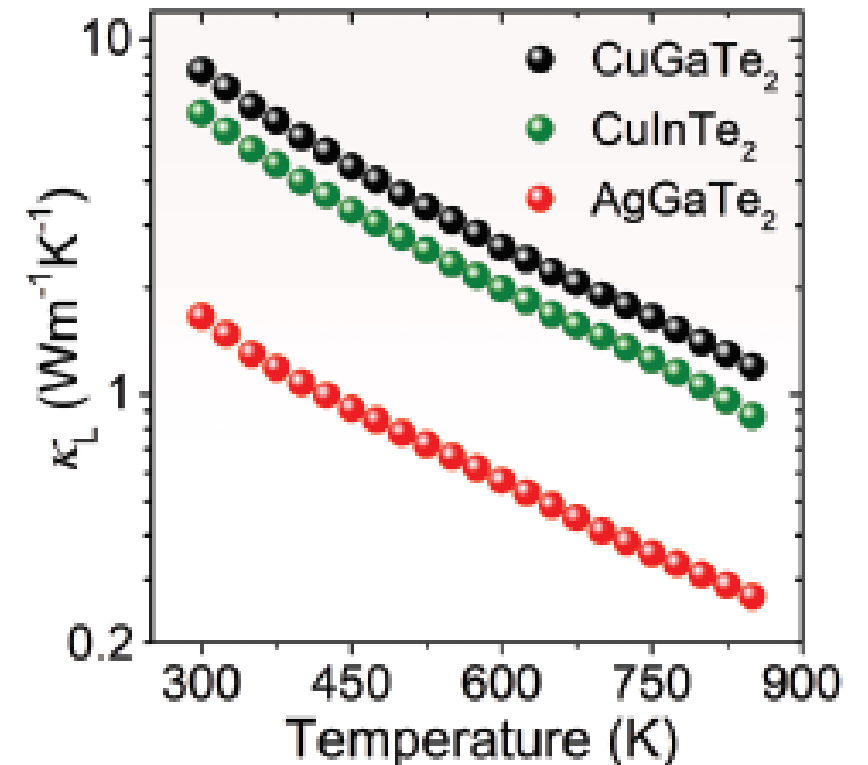
...more details at the tutorial 😊

Illustrative example: emerging state in AgGaTe_2

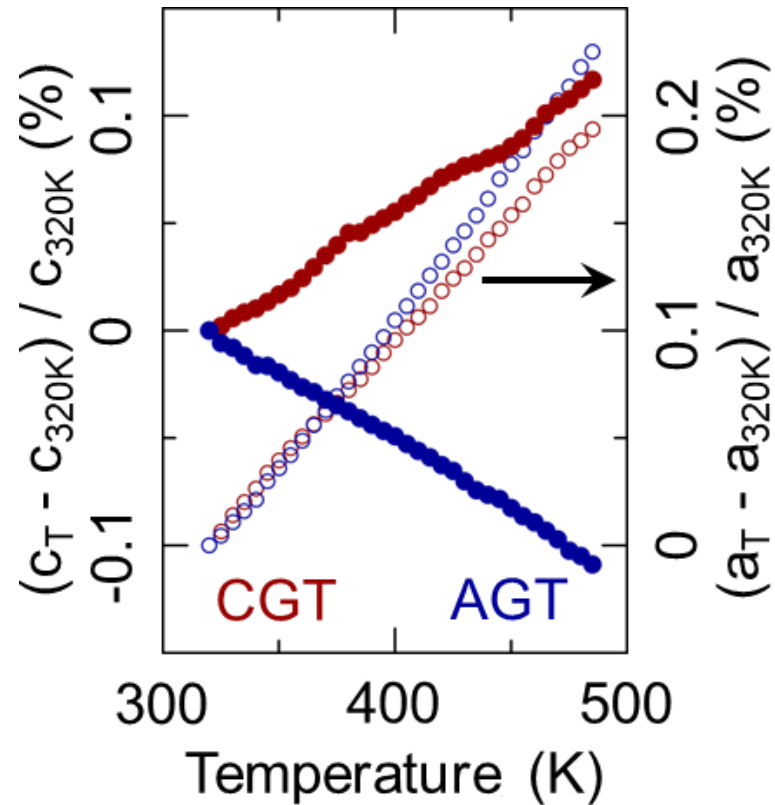


Diamondoid structures (zincblende doubled along c-axis) of intense interest in high-performance thermoelectricity

Why is lattice thermal conductivity at high temperature Ultralow, and smaller in Ag- than in the Cu-variants?

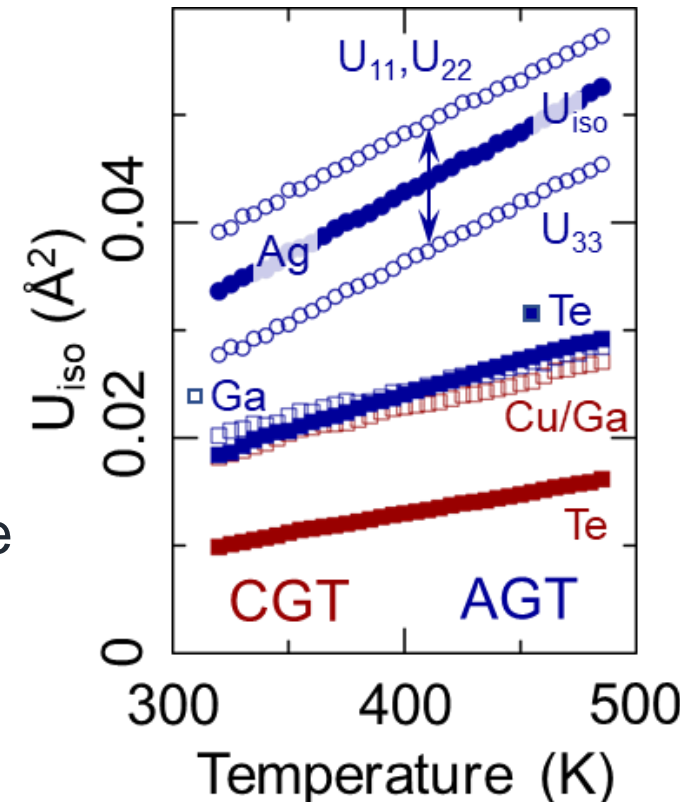


Illustrative example: emerging state in AgGaTe_2

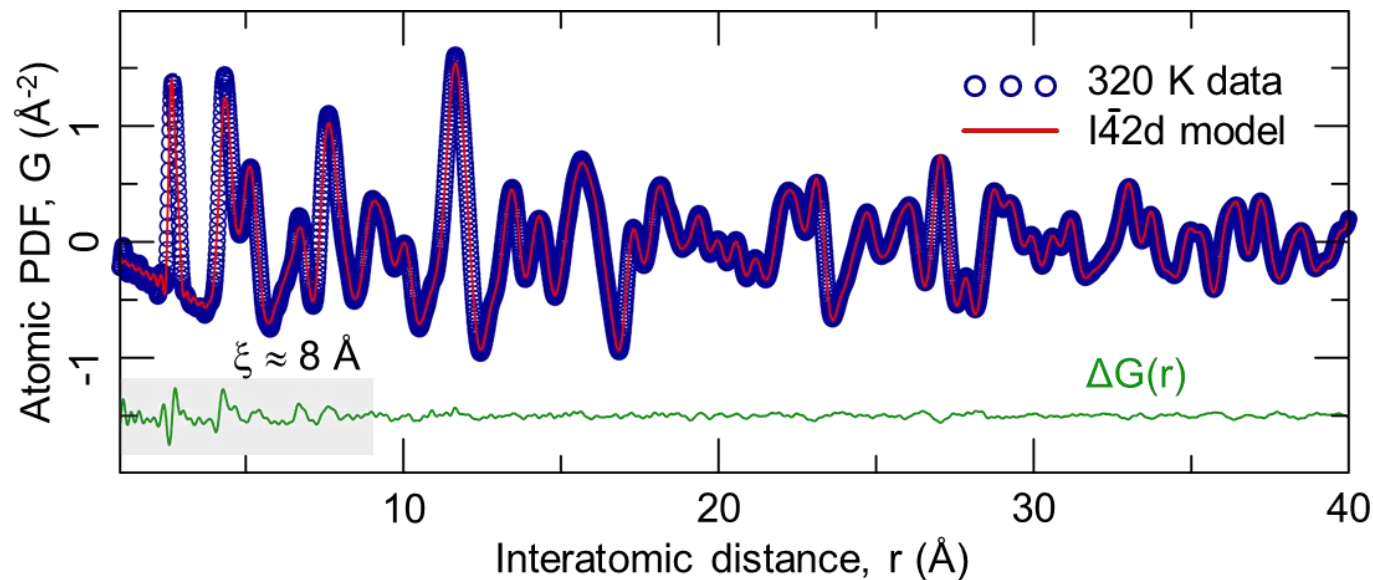


Rietveld finds that in average structure c-axis of **Ag-variant** has negative thermal expansion (**NTE**) while **Cu-variant** behaves normally. Why?

Atomic ADPs of **Ag** are abnormally enlarged in the ab-plane (perp. to c-axis) indicating in-plane nanoscale disorder!

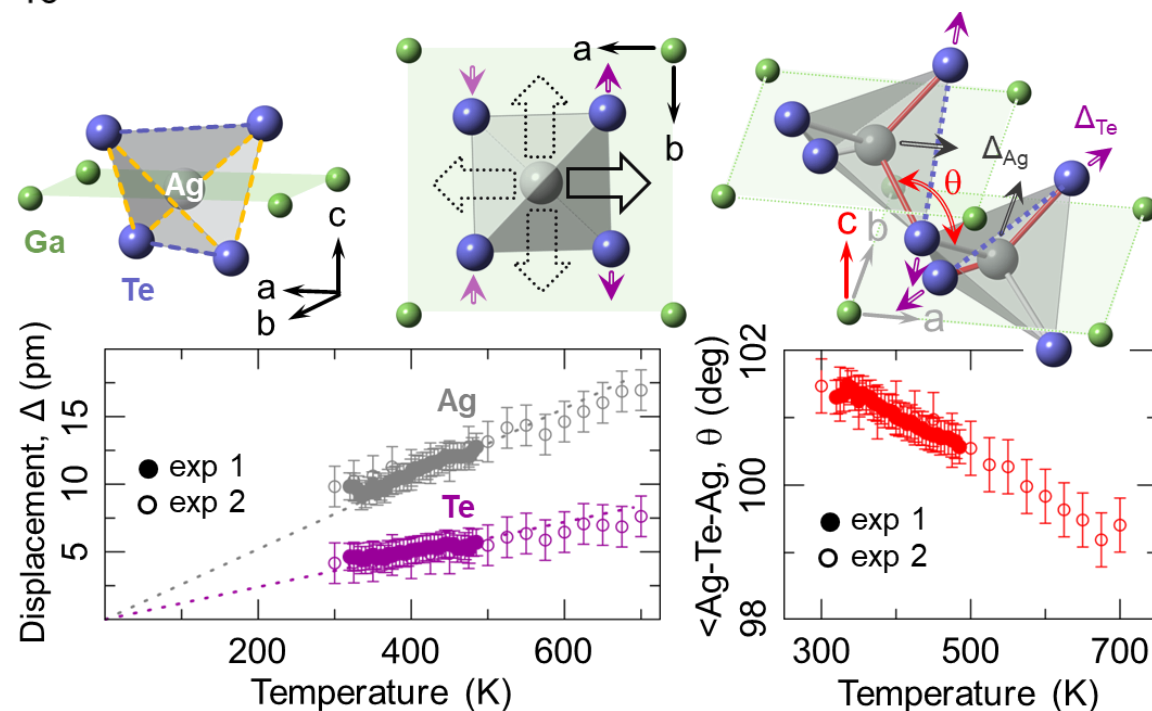


Illustrative example: emerging state in AgGaTe_2



PDFgui modeling evidences short-range distortion of AgTe_4 tetrahedra, correlated over nanometer length-scale!

- discovery via elaborate PDFgui modeling
- distortion involves local AgTe_4 rotations leading to global NTE effect
- continuous emergence on warming
- NTE a macroscopic measure of nanoscale distortion and its evolution on warming



Hongyao Xie et al, *Adv. Mater.* **34**, 2202255 (2022)