



# **Analysis of Local Structure by Atomic Pair Distribution Function**

Elena Willinger

Lecture series: Modern Methods in Heterogeneous  
Catalysis Research

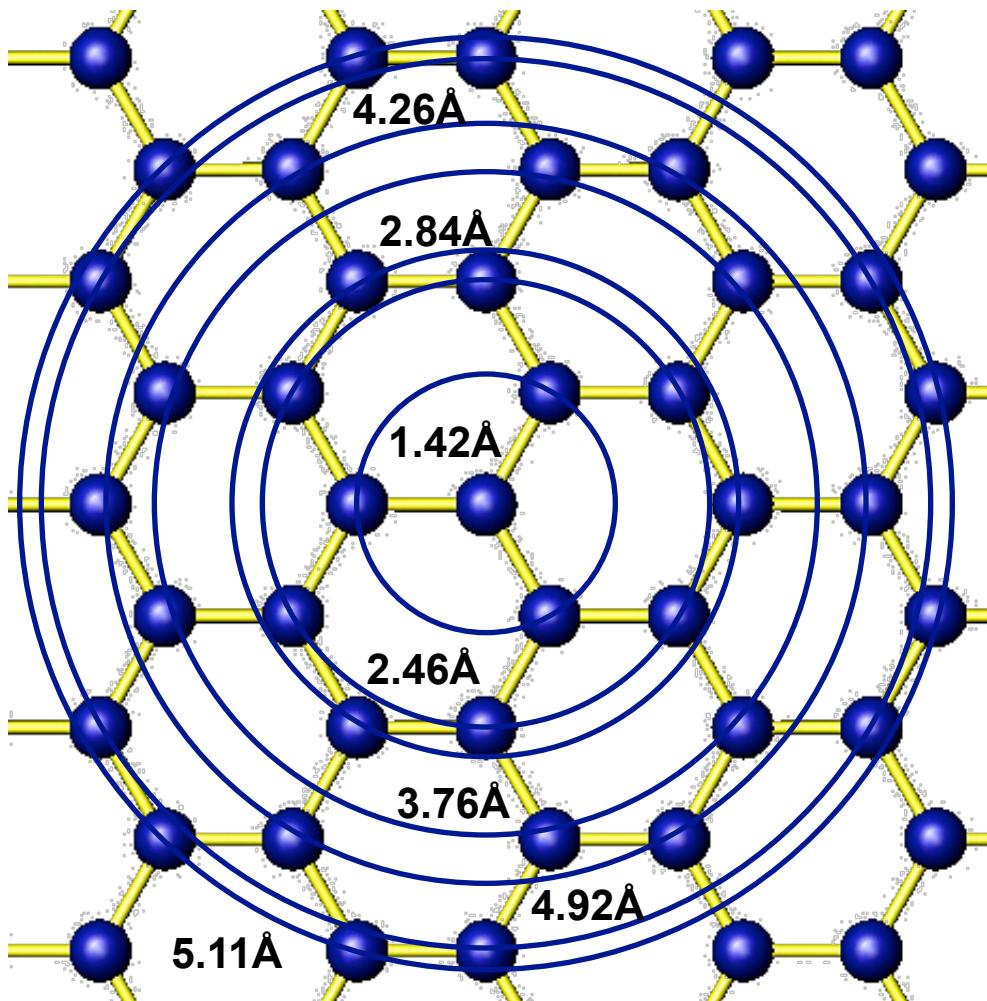


# Outline

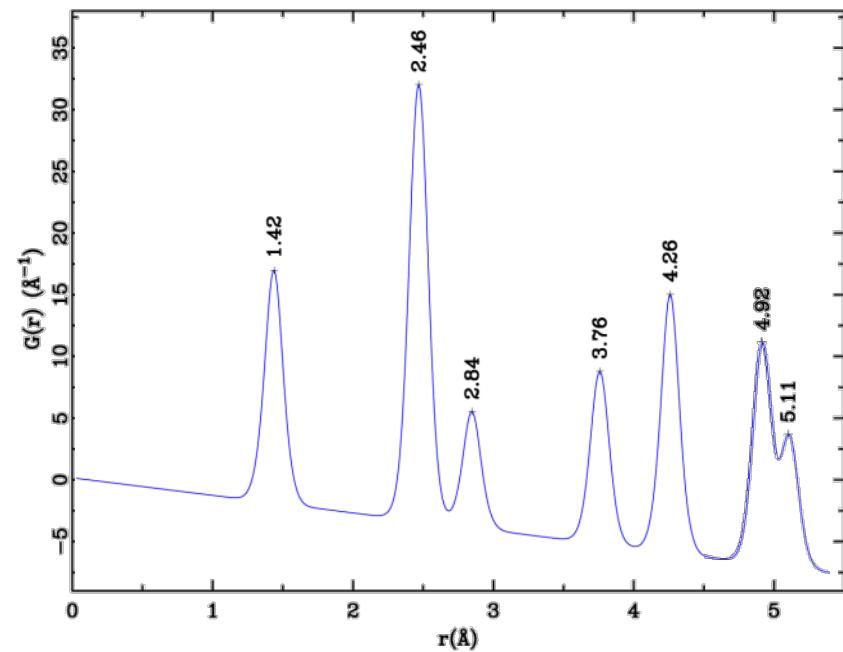


- What for do we need PDF?
- Scattering intensity
- Mathematical basis of the PDF
- Direct structural information from PDF
- PDF experiments: X-rays, neutrons, electrons
- Catalysis related examples

# What is a PDF?



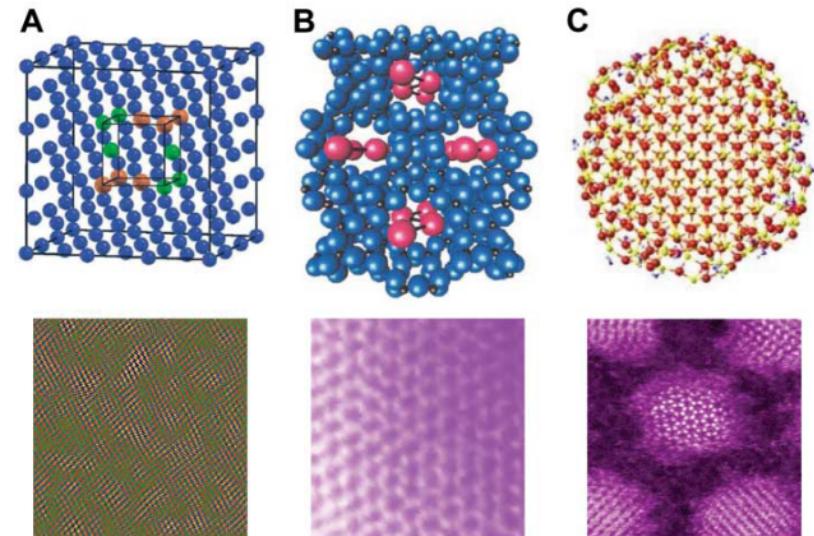
Pair distribution function (PDF) gives the probability of finding an atom at a distance “r” from a given atom.



# What for do we need PDF

## The challenge : Knowing the local structure

- ❖ Traditional crystallographic approach to structure determination is insufficient or fails for
  - ❖ **Non crystalline materials**
  - ❖ **Disordered materials**: The interesting properties are often governed by the defects or local structure !
  - ❖ **Nanostructures**: Well defined local structure, but long-range order limited to few nanometers (-> poorly defined Bragg peaks)
- ❖ A new approach to determine **local** and **nano-scale** structures is needed.

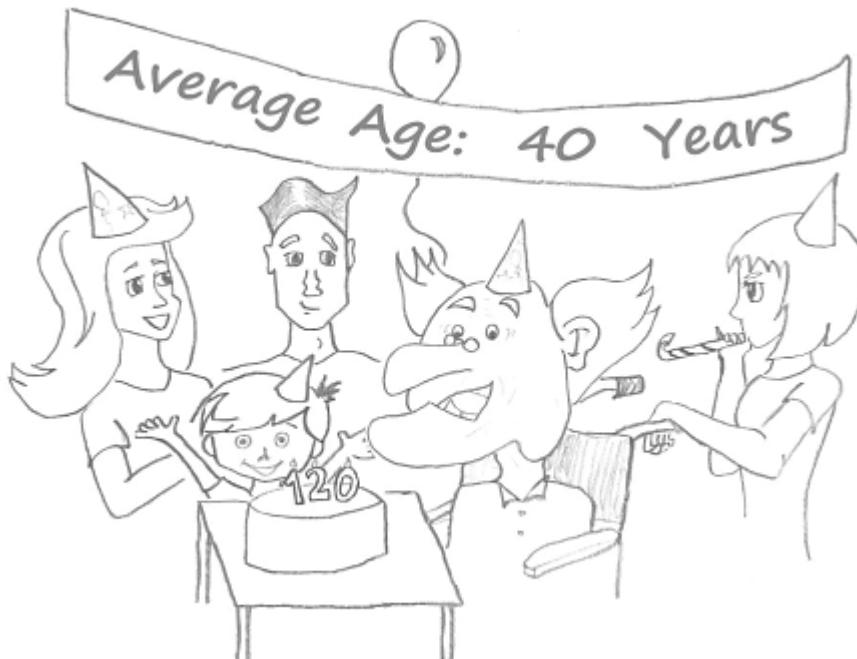


S.J.L. Billinge and I. Levin, **The Problem with Determining Atomic Structure at the Nanoscale**, *Science* **316**, 561 (2007).

# What for do we need PDF

Conventional XRD analysis of Bragg intensities yields the **average** structure of materials which can be deceiving !

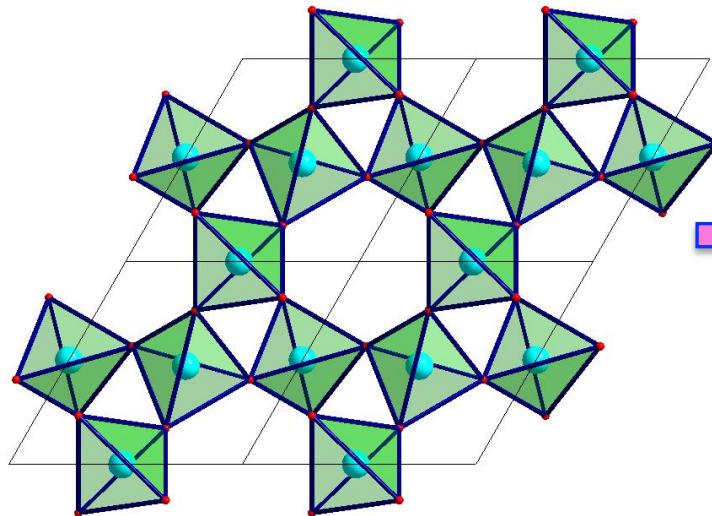
Considering going to a party where all you know is the average age is 40..



# What for do we need a PDF?

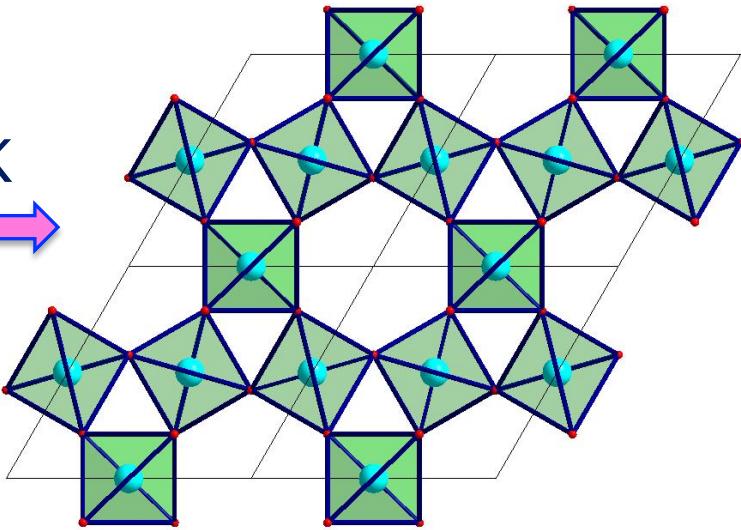
What exactly is meant by the difference between the local structure and the average crystallographic structure?

$\text{SiO}_2$  ( $\text{\textcircled{W}}$ -quartz)

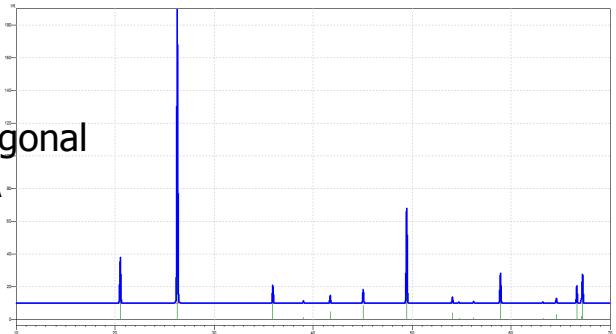


846 K

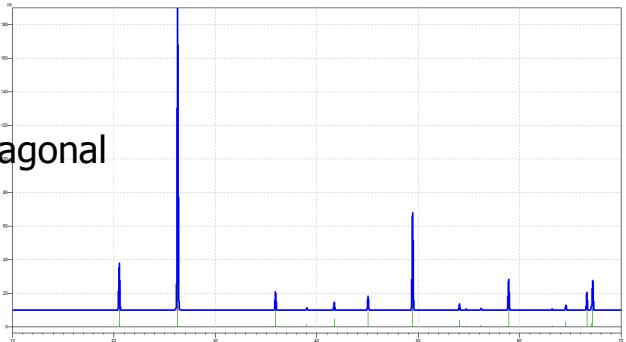
$\text{SiO}_2$  ( $\text{\textcircled{W}}$ -quartz)



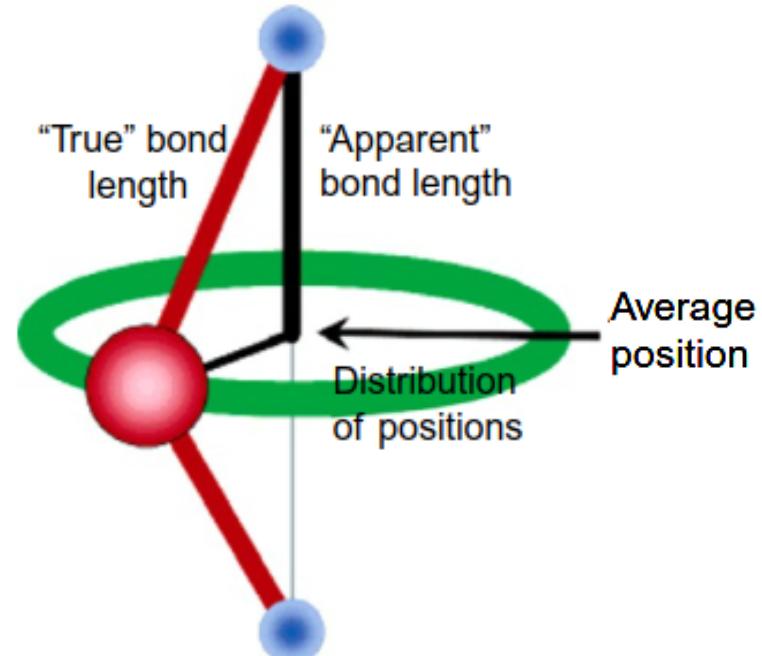
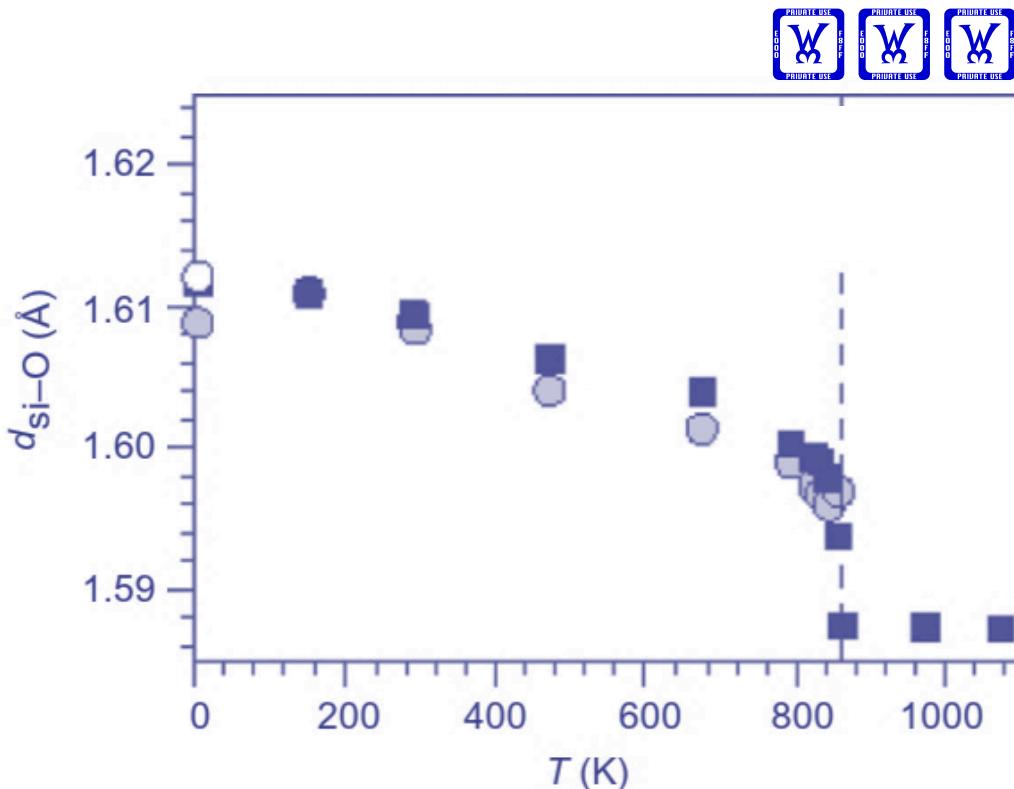
$\text{\textcircled{W}}$ -quartz  
 $P\ 3_2\ (154)$  - trigonal  
 $a=4.9841(12)\ \text{\AA}$   
 $c=5.4500(17)\ \text{\AA}$   
 $V=117.25(5)\ \text{\AA}^3$



$\text{\textcircled{W}}$ -quartz  
 $P\ 6_{422}\ (181)$  - hexagonal  
 $a=4.9965(1)\ \text{\AA}$   
 $c=5.4543(1)\ \text{\AA}$   
 $V=117.92(0)\ \text{\AA}^3$



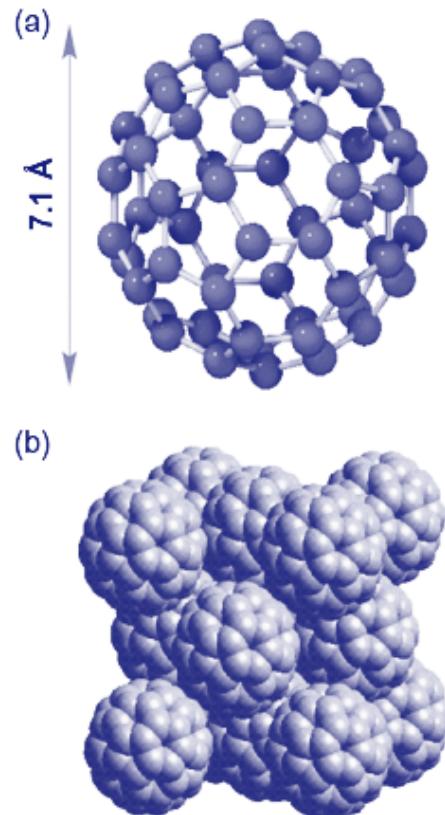
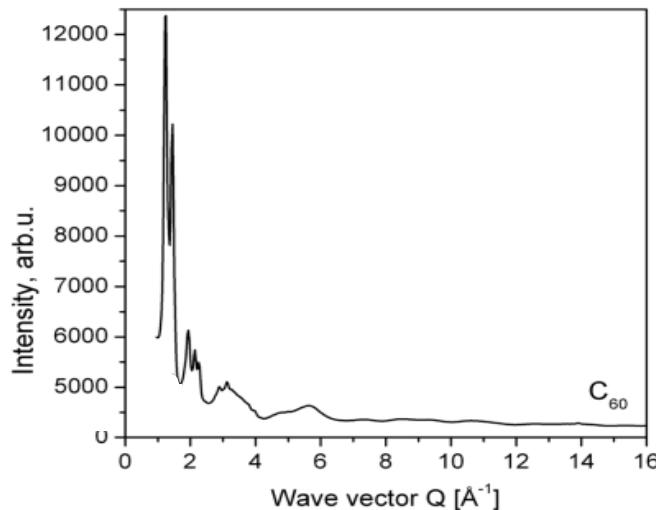
# What for do we need a PDF?



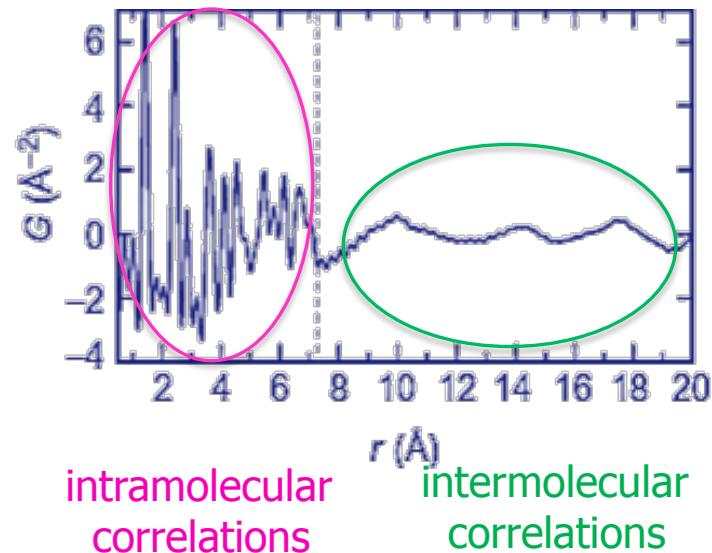
Neutron powder diffraction data

# What for do we need a PDF?

XRD pattern



X-ray PDF

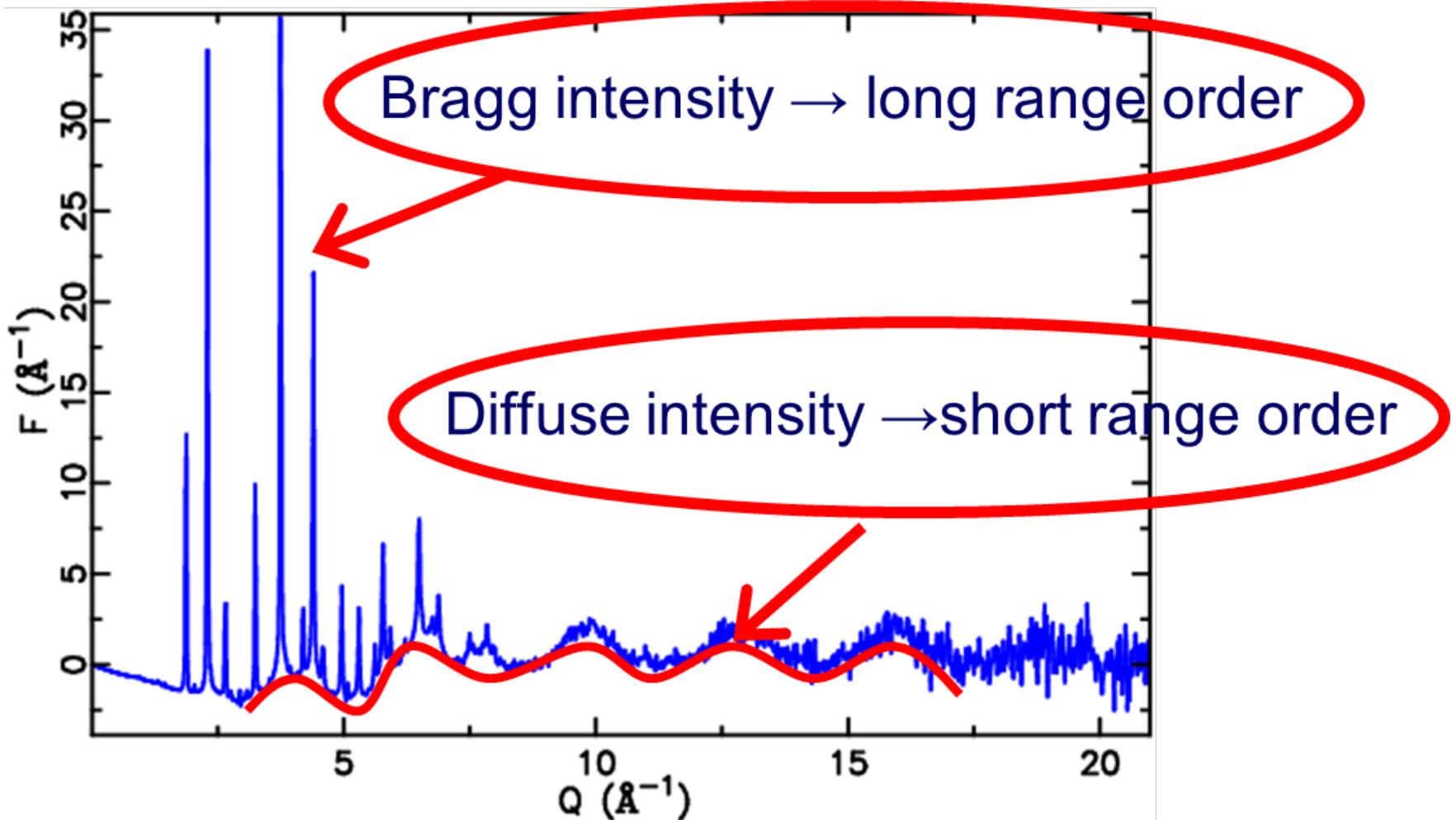


intramolecular  
correlations

intermolecular  
correlations

# Pair Distribution Function from total scattering experiments

PDF from total scattering experiments (X-ray, neutron or electron sources)

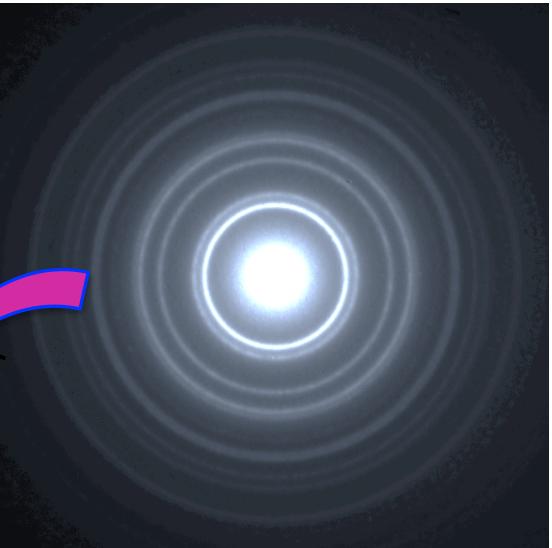




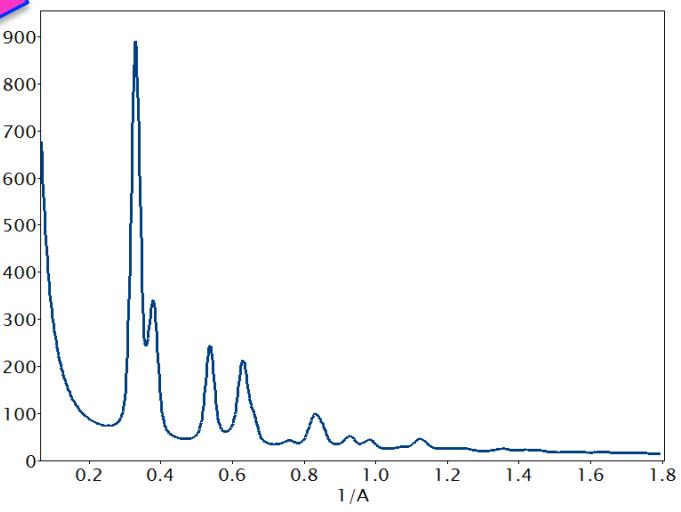
# Pair Distribution Function from total scattering experiments



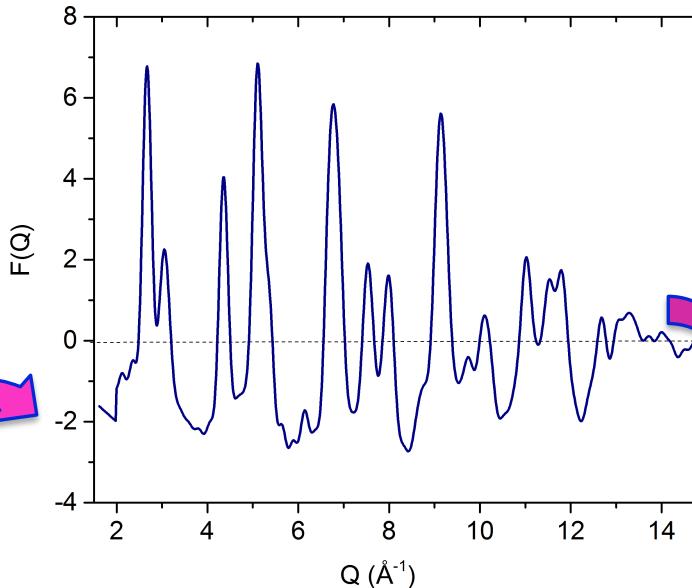
2D diffraction pattern



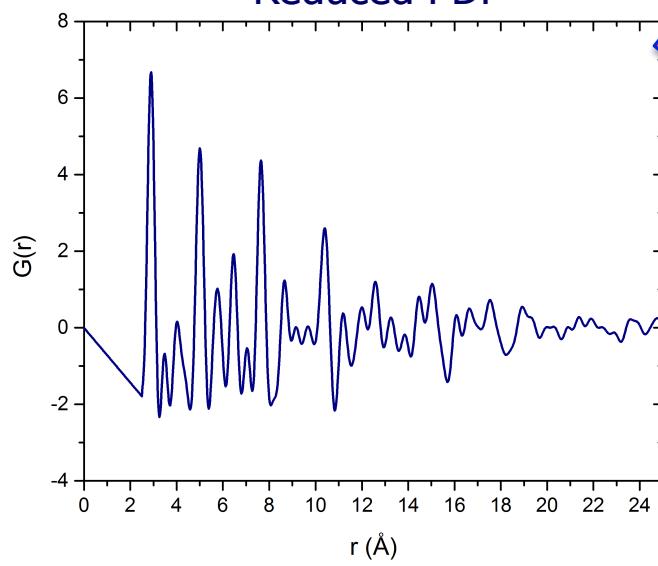
Intensity profile of the 2D diffraction pattern



Reduced structure function



Reduced PDF



Fourier transform



# Outline

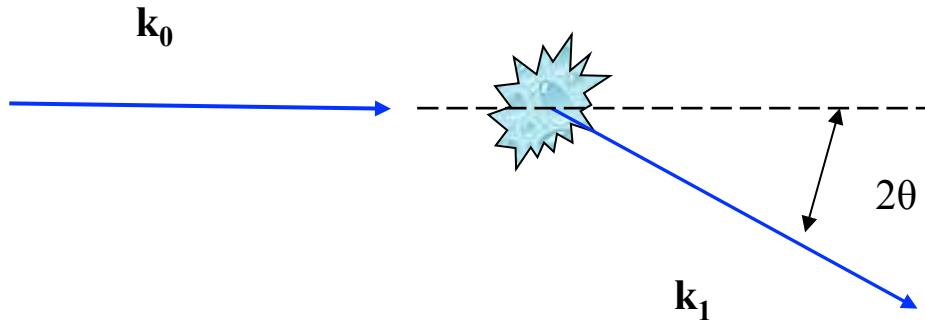
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# X-ray scattering physics

Plane wave approximation



the source and detector are far away  
from the object  
the object is small

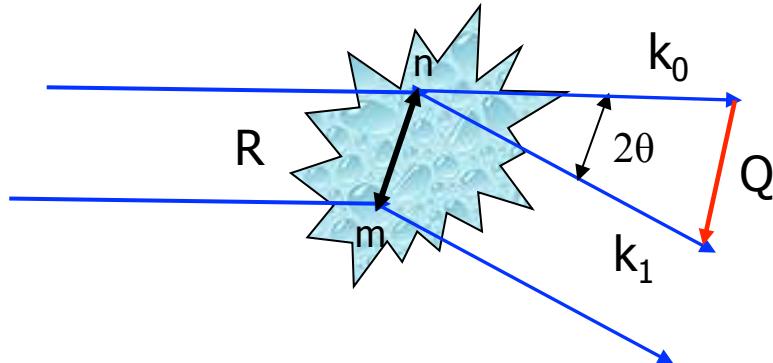


Elastic - no energy loss

coherent - no random phase shift

scattering

# X-ray scattering physics



$$Q = 2|k|\sin\theta \quad \text{scattering vector}$$

$$\Delta\phi = \mathbf{Q} \bullet \mathbf{R} \quad \text{phase shift}$$

Scattering intensity

$$I(\mathbf{Q}) = \sum A_m e^{-i(\mathbf{Q} \cdot \mathbf{R}_m)} \bullet \sum A_n e^{i(\mathbf{Q} \cdot \mathbf{R}_n)} = \sum \sum A_m A_n e^{-i(\mathbf{Q} \cdot (\mathbf{R}_m - \mathbf{R}_n))}$$

$\{\mathbf{R}_m - \mathbf{R}_n\}$  – Object property (unique set)

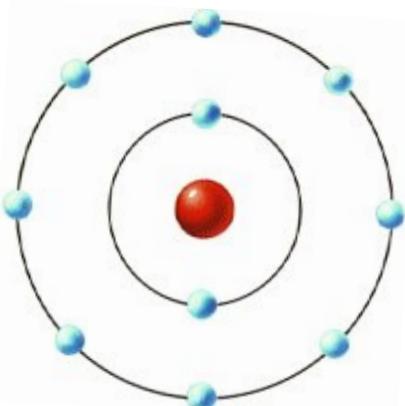
# X-ray scattering physics

## Atomic scattering amplitude $E(Q)$

$E(Q)$  is the sum of all the electrons scattering amplitudes

$$A_{at}(Q) = \sum_{j=0}^{\infty} z_j e(Qr_j) e^{iQr_j}$$

## Atomic scattering factor $f(Q)$



$$f(Q) = A_{at}(Q) / A_e(Q)$$

$$f(Q) = \sum_{j=0}^{\infty} z_j e(Qr_j) e^{iQr_j}$$
$$Q=0, f(Q)=Z$$

$$f_e(Q) = \frac{2}{a_0} \left[ Z - f_x(Q) \right]$$

Bohr radius  $a_0 \approx 0.5292 \text{ \AA}$

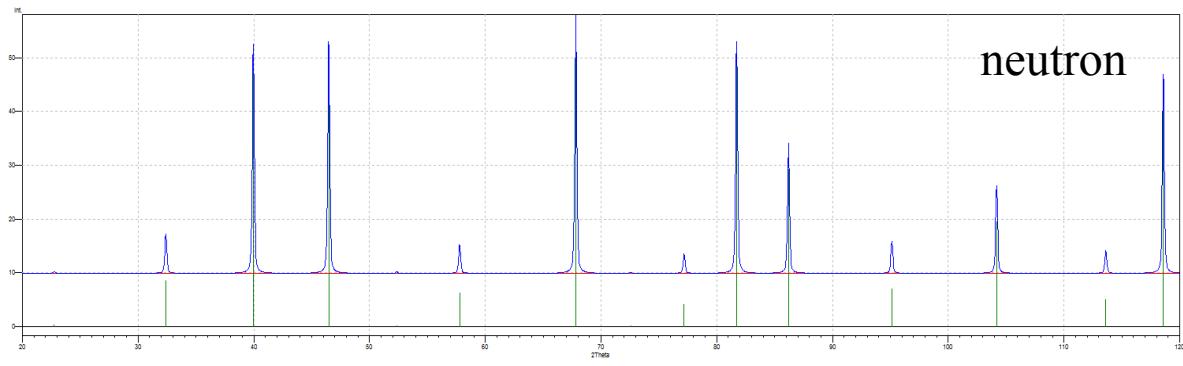
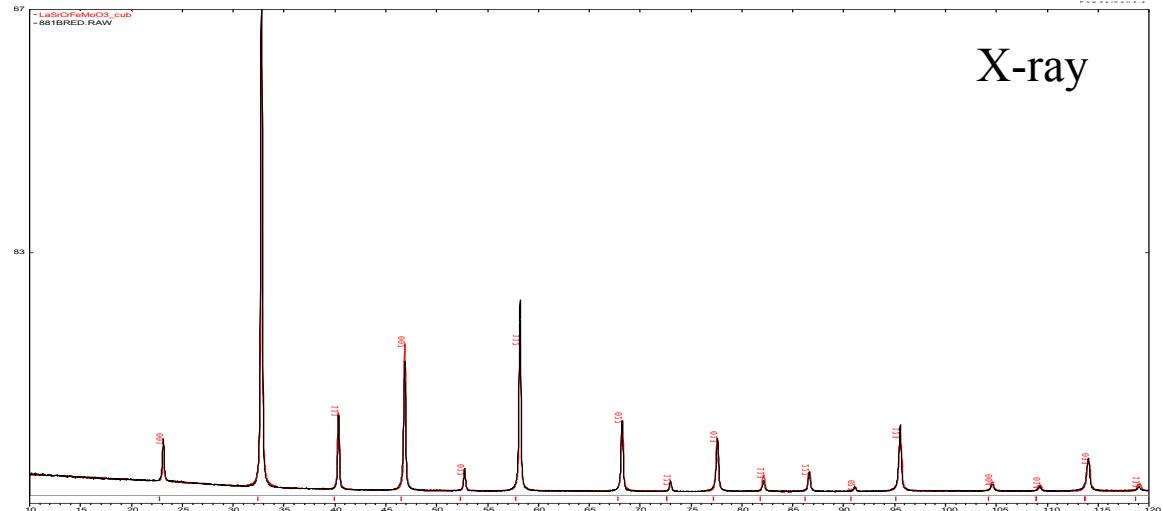
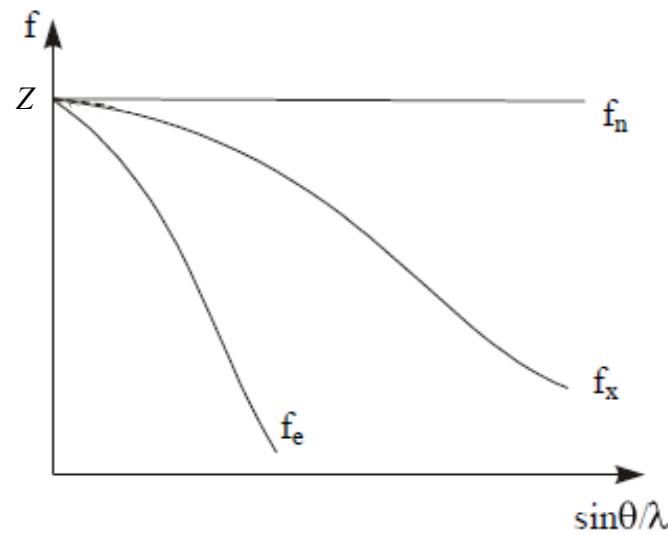
$$r_j=0, f(Q)=Z \text{ and doesn't depend on } Q$$



Since electrons are not concentrated in one point  $f(Q)$  depends on  $Q = 4\pi \sin \theta / \lambda$



# Atomic scattering factor





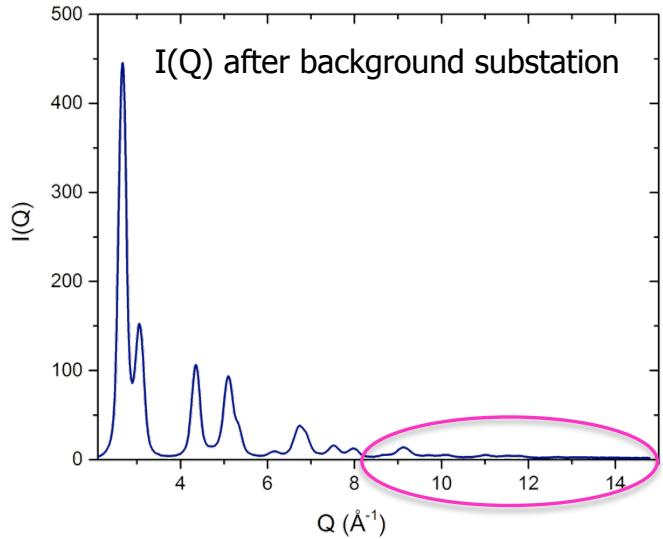
# Outline

- What for do we need PDF?
- Scattering intensity
- Mathematical basis of the PDF
- Direct structural information from PDF
- PDF experiments: X-rays, neutrons, electrons
- Catalysis related examples

# Mathematical basis of the PDF

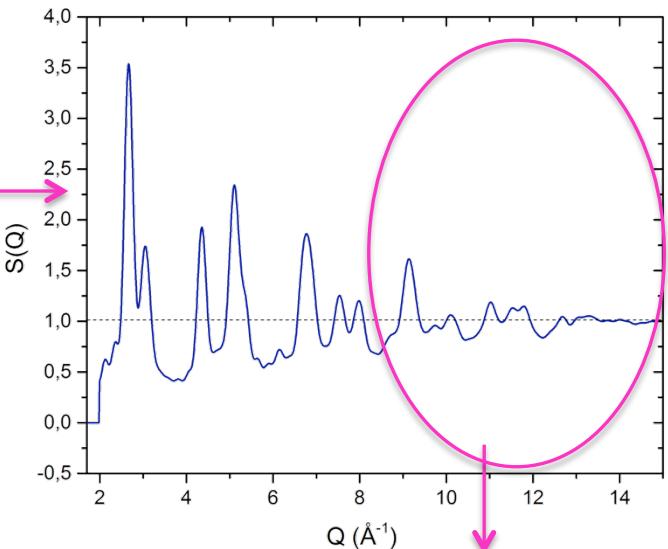
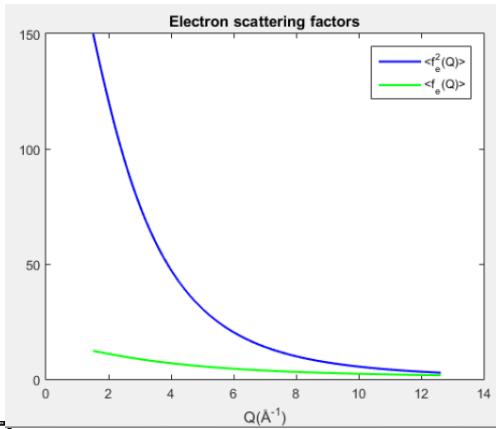
Debye's scattering intensity

$$I(Q) = \sum_{j,k}^N f_j(Q) f_k(Q) \frac{\sin(Qr_{jk})}{Qr_{jk}}$$



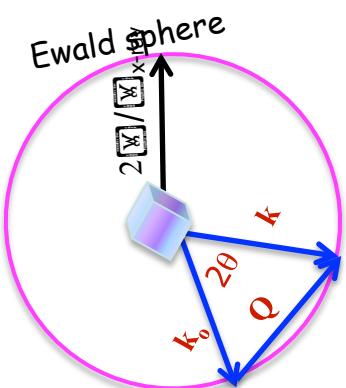
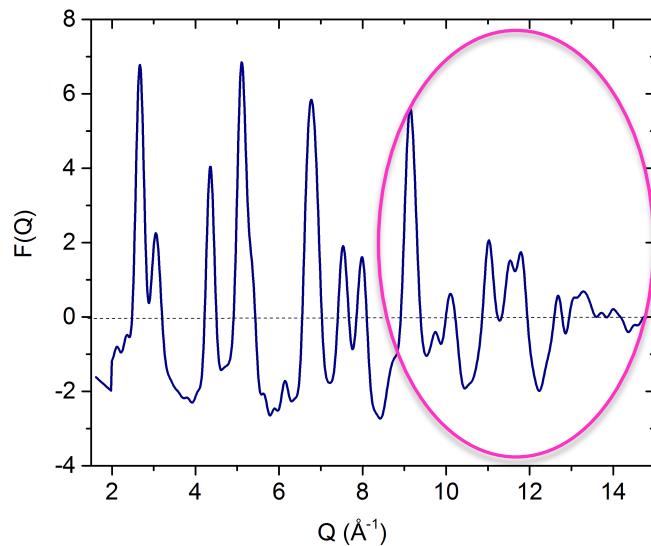
Total scattering structure function

$$S(Q) = 1 + \frac{I(Q) - \langle f^2(Q) \rangle_{\text{composition}}}{\langle f(Q) \rangle_{\text{composition}}^2}$$



Reduced total scattering structure function

$$F(Q) = Q[S(Q) - 1]$$



$$\begin{aligned} Q &= 2|\mathbf{k}| \sin \frac{\theta}{2} \\ \mathbf{k} &= 2\pi \frac{\mathbf{i}}{d} \frac{\mathbf{i}}{d} \frac{\mathbf{i}}{d} \\ Q &= 4\pi \sin \frac{\theta}{2} \frac{\mathbf{i}}{d} \frac{\mathbf{i}}{d} \frac{\mathbf{i}}{d} \\ Q &= 2\pi \frac{\mathbf{i}}{d} \frac{\mathbf{i}}{d} d \end{aligned}$$

# Mathematical basis of the PDF

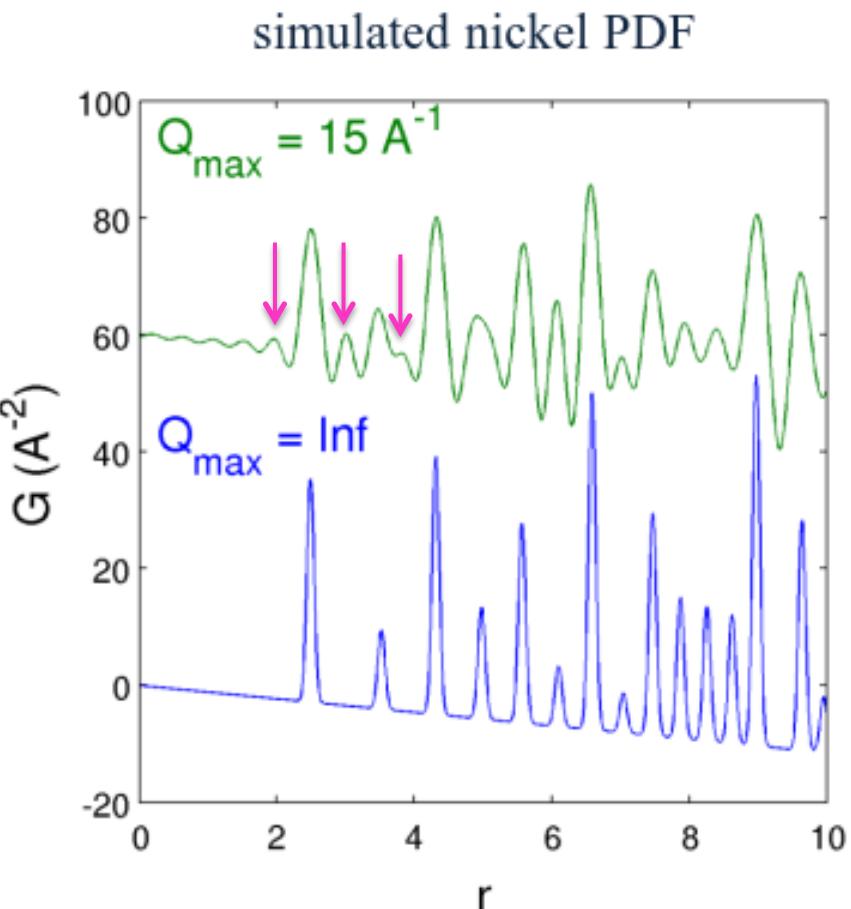
$$F(Q) = Q[S(Q) - 1] \xrightarrow{\text{FT}} G(r) = \frac{2}{\pi} \int_0^{\infty} F(Q) \sin(Qr) dQ$$

In practice,  $Q_{min}$  and  $Q_{max}$  are limited

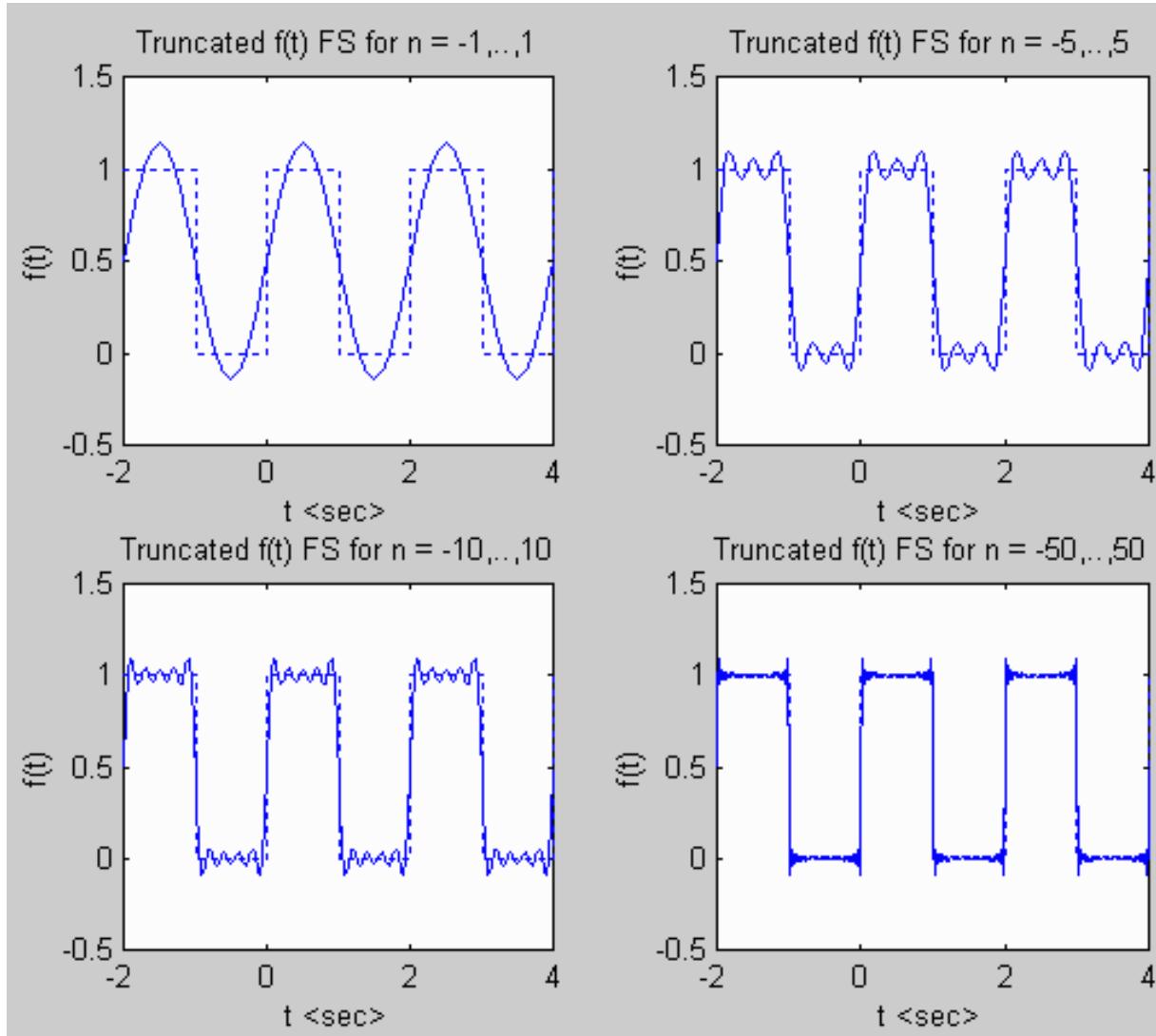
$Q_{max} = 30-50 \text{ \AA}^{-1}$  (X-ray Synchrotron)

$Q_{max} = 10-23 \text{ \AA}^{-1}$  (electrons)

$$G(r) = \left(\frac{2}{\pi}\right) \int_{Q_{min}}^{Q_{max}} F(Q) \sin(Qr) dQ$$

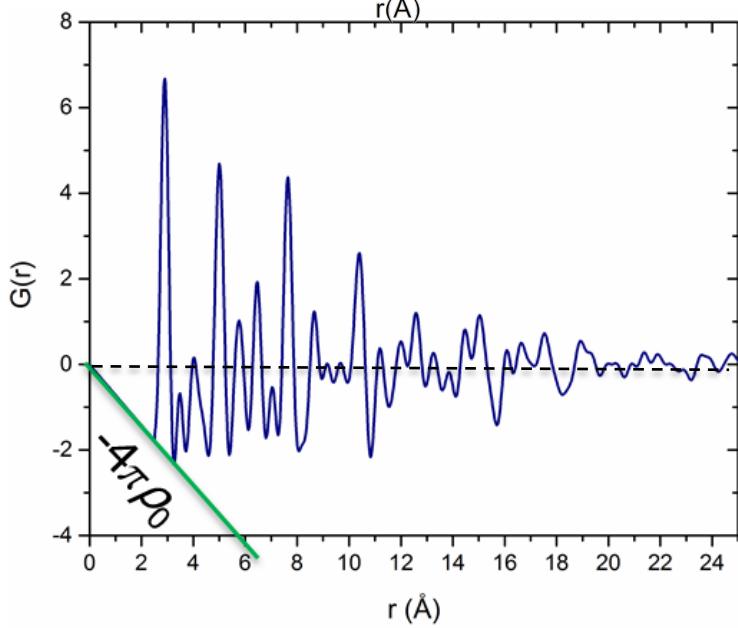
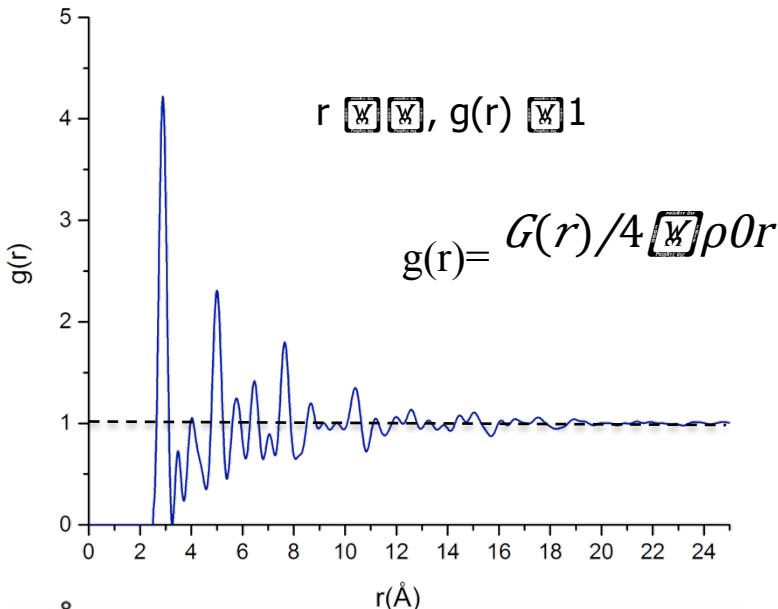


# Truncation of Fourier series



# Mathematical basis of the PDF

Pair correlation functions and relationship between them



$$\text{pair density function: } \langle \dots \rangle_r = \langle \dots \rangle_0 g(r)$$

the average number density of the material

$$G(r) = 4\pi r(\langle \dots \rangle(r) - \langle \dots \rangle_0) = 4\pi r(g(r) - 1)$$

Pair density function

reduced PDF

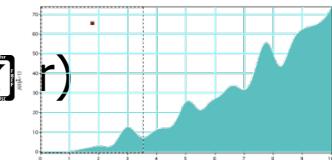
PDF

$$R(r) = 4\pi r^2 \langle \dots \rangle(r)$$

Radial distribution function

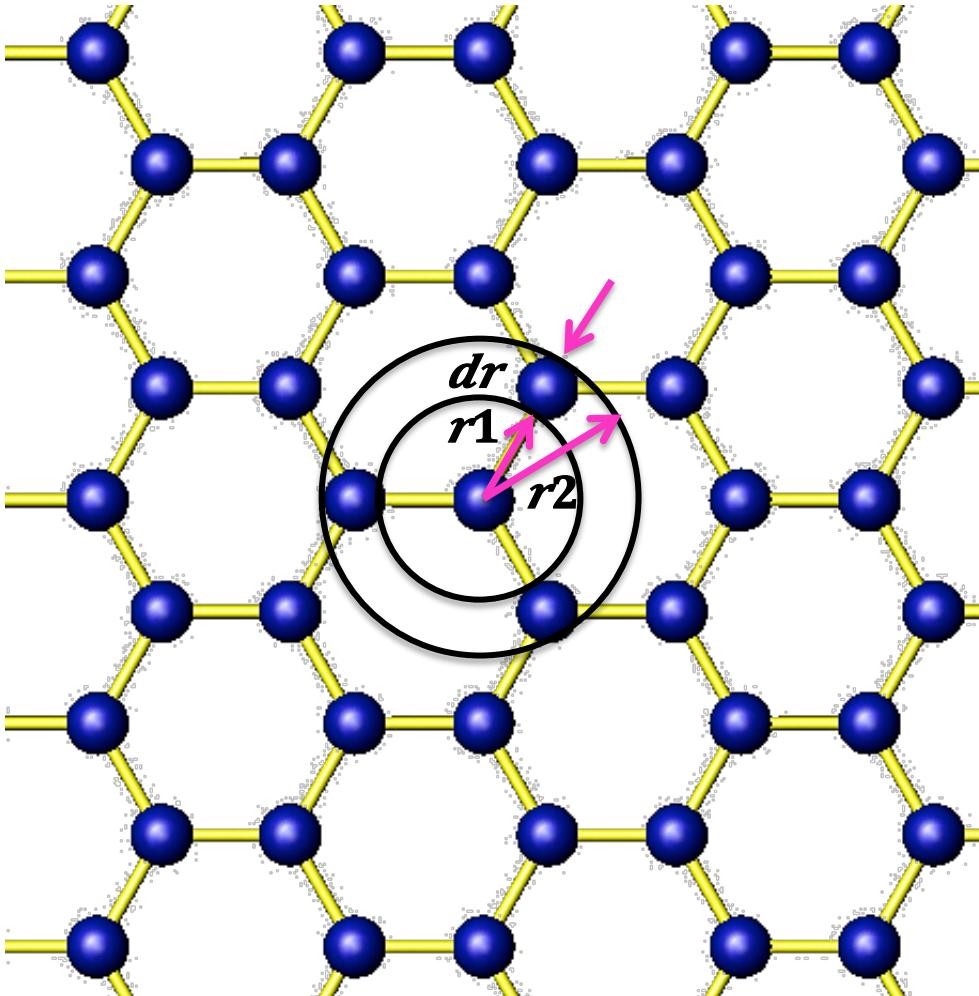
$$G(r) = R(r)/r - 4\pi\rho_0$$

$$N_c = \int_{r_1}^{r_2} R(r) dr \quad \text{the number of neighbors}$$

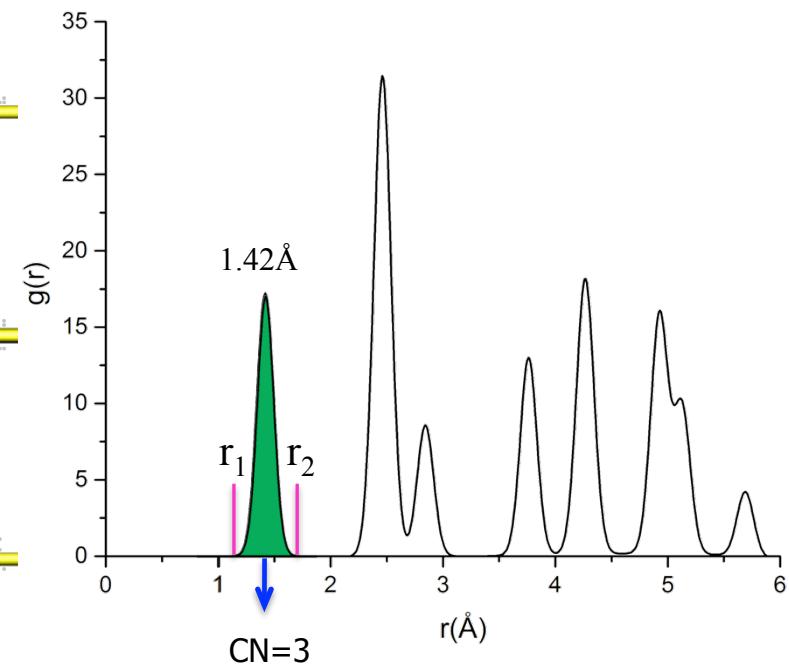


# Mathematical basis of the PDF

$$N_{Coord} = \int_{r_1}^{r_2} R(r) dr = \int_{r_1}^{r_2} 4\pi\rho_0 r^2 g(r) dr \rightarrow \text{the number of neighbors}$$



$R(r)dr$  is a number of atoms in an annulus of thickness  $dr$  at a distance  $r$  from another atom





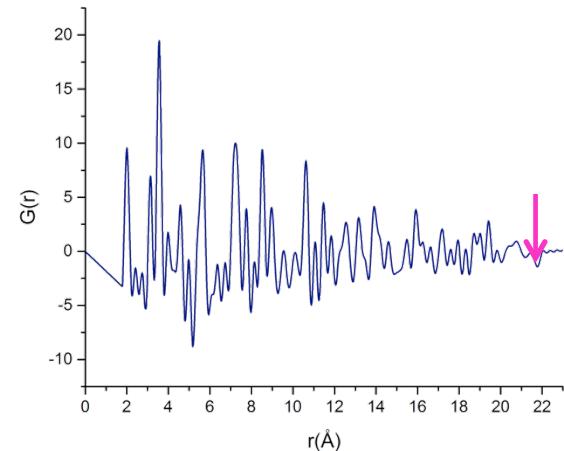
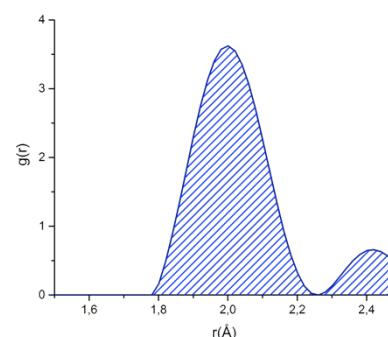
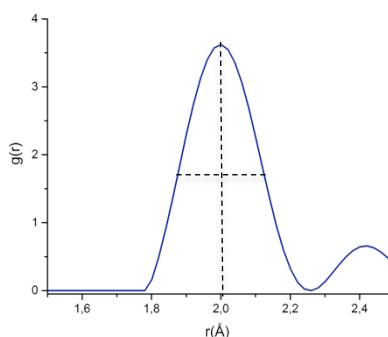
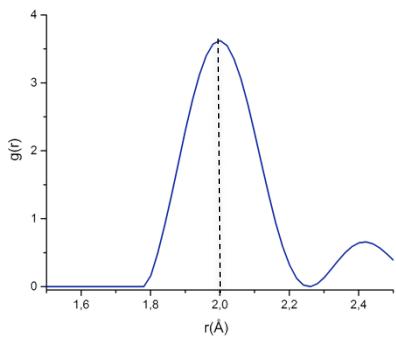
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# Direct information from the PDF

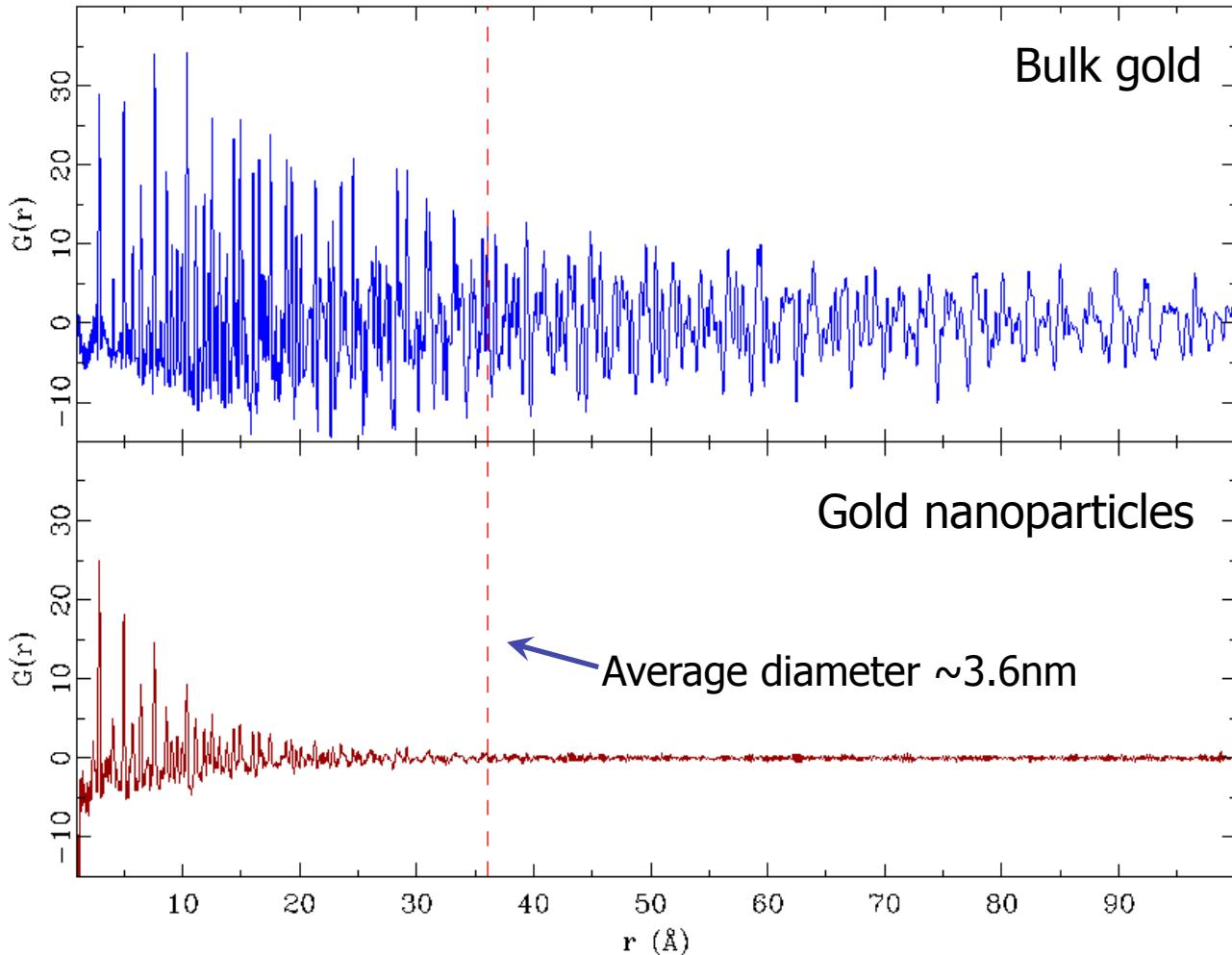
PDF contains the following structural/configurational information:

- Average interatomic distances → PDF peak position
- A structural disorder → PDF peak width (FWHM)
- Average coordination properties → Integral intensity of PDF peaks
- Particle size effect → PDF peak cut-off



# Direct information from the PDF

- PDF peak cut-off



K.L. Page, Th. Proffen, H. Terrones, M. Terrones, L. Lee, Y. Yang, S. Stemmer, R. Seshadri and A.K. Cheetham, **Direct Observation of the Structure of Gold Nanoparticles by Total Scattering Powder Neutron Diffraction**, *Chem. Phys. Lett.* **393**, 385-388 (2004).

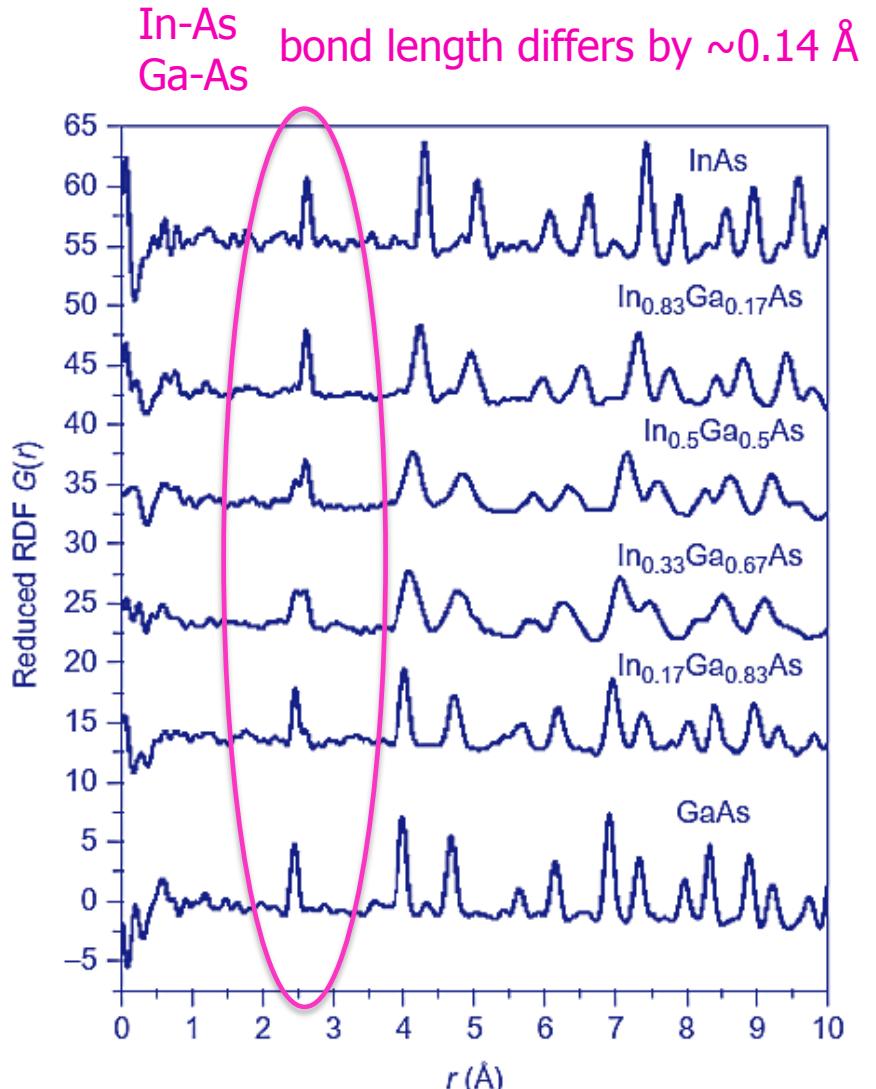
# Direct information from the PDF

- The PDF peak position yields bond length directly



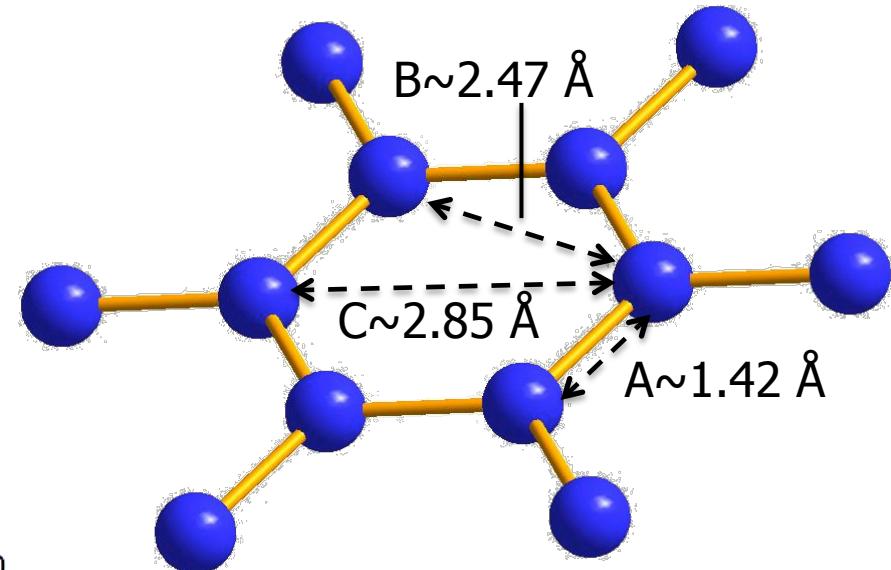
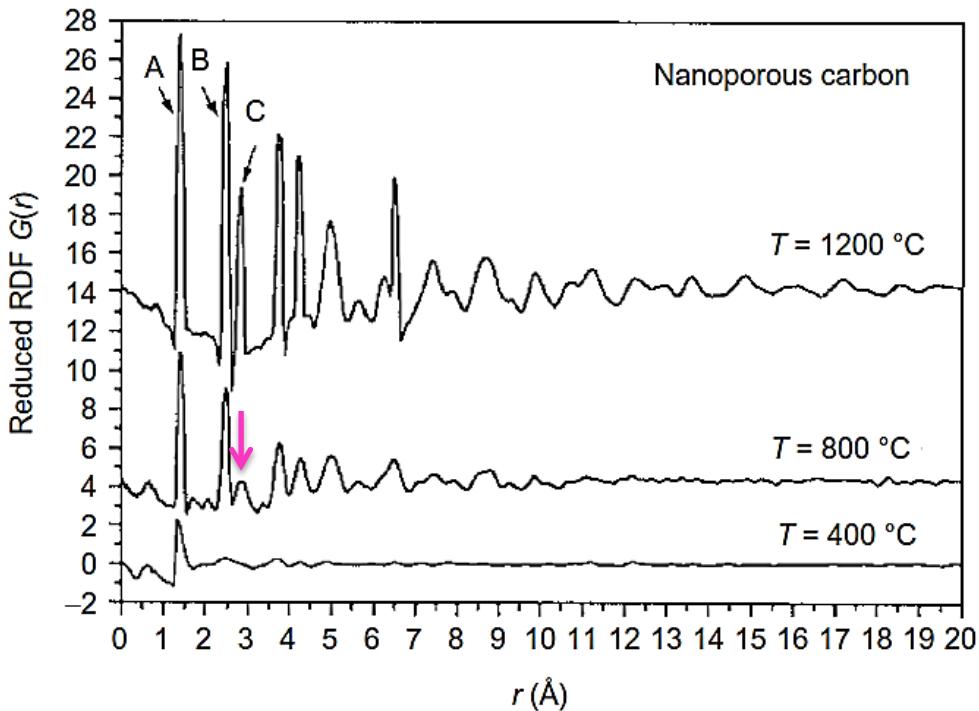
The lattice constant changes linearly with  $x$ , following Vegard's law

The crystallographic (Ga,In)-As distance represents only the average distance between the atoms at the (Ga,In) and As sites and corresponds to neither the actual Ga-As nor In-As distances.



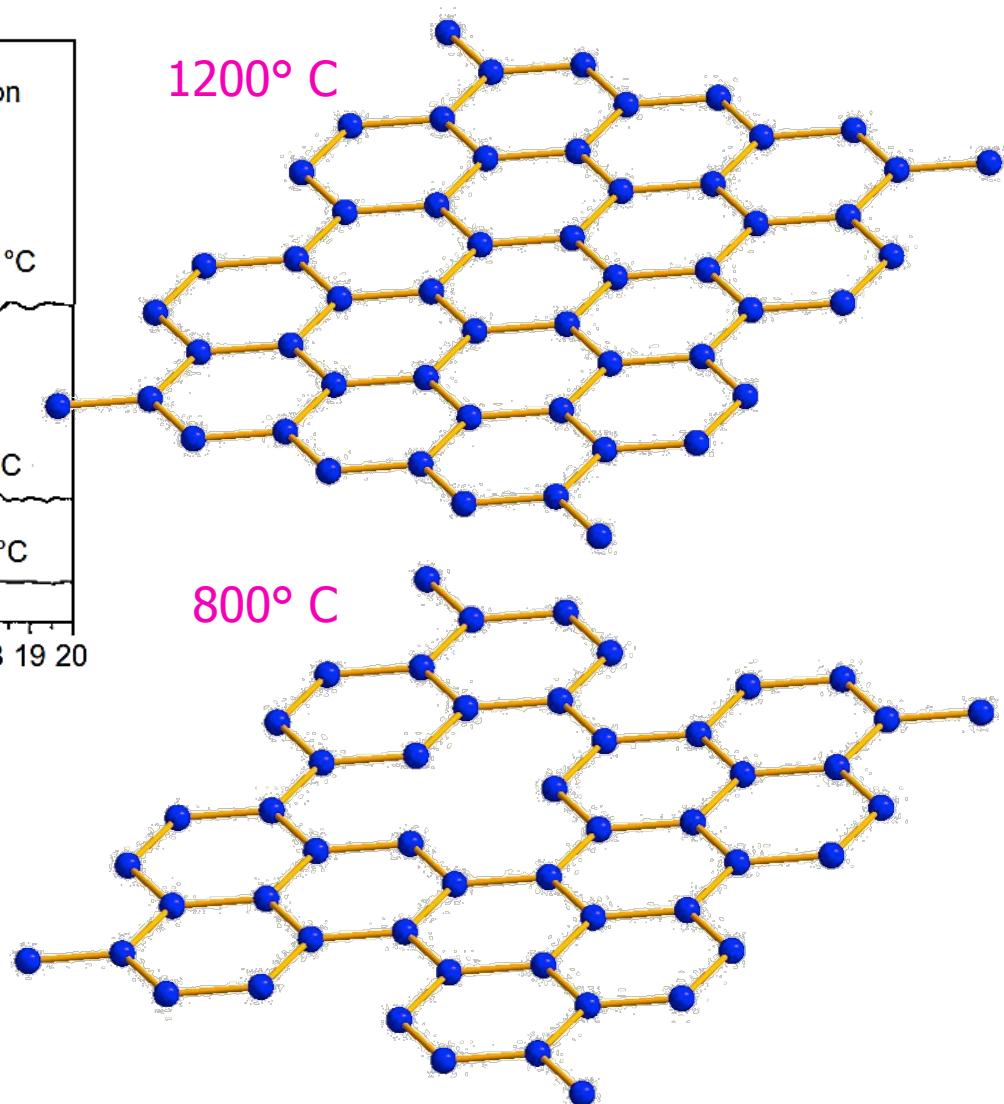
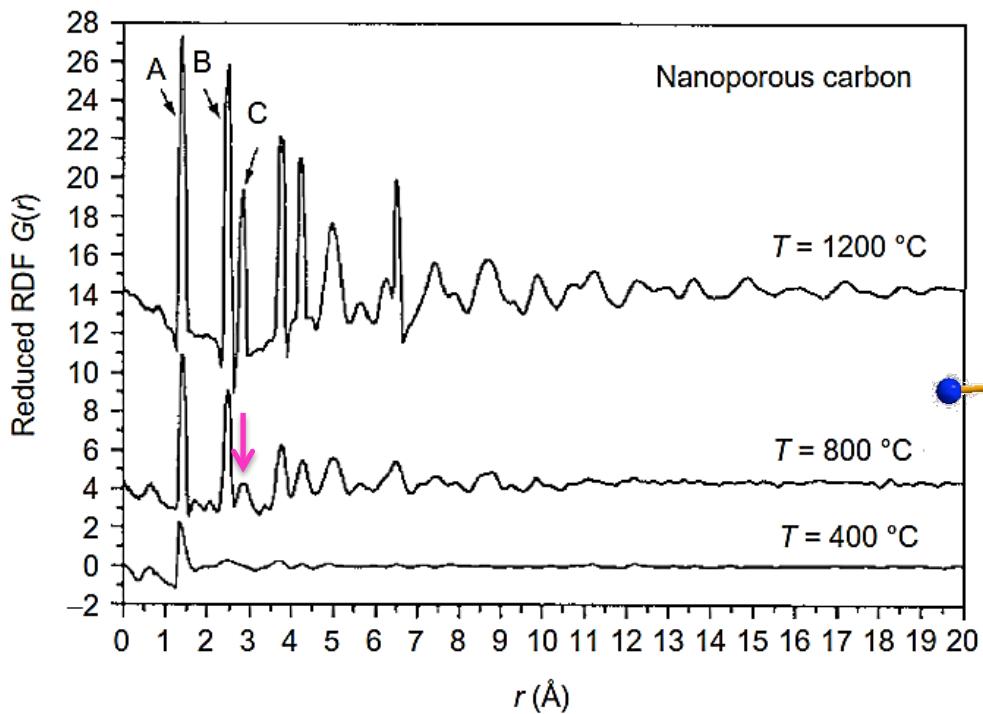
# Direct information from the PDF

- The integral intensity of PDF peaks yields the coordination number of the atom-atom correlation



A (c.n.)	
1200° C	3
800° C	2.6
400° C	1.9

# Direct information from the PDF



# Direct information from the PDF

- The PDF peak width reveals information about static and dynamic disorder of atomic pairs

The PDF peak width depends on

Thermal atomic motions

A doping induced disorder

Nanosize induced disorder  
or  
amorphization

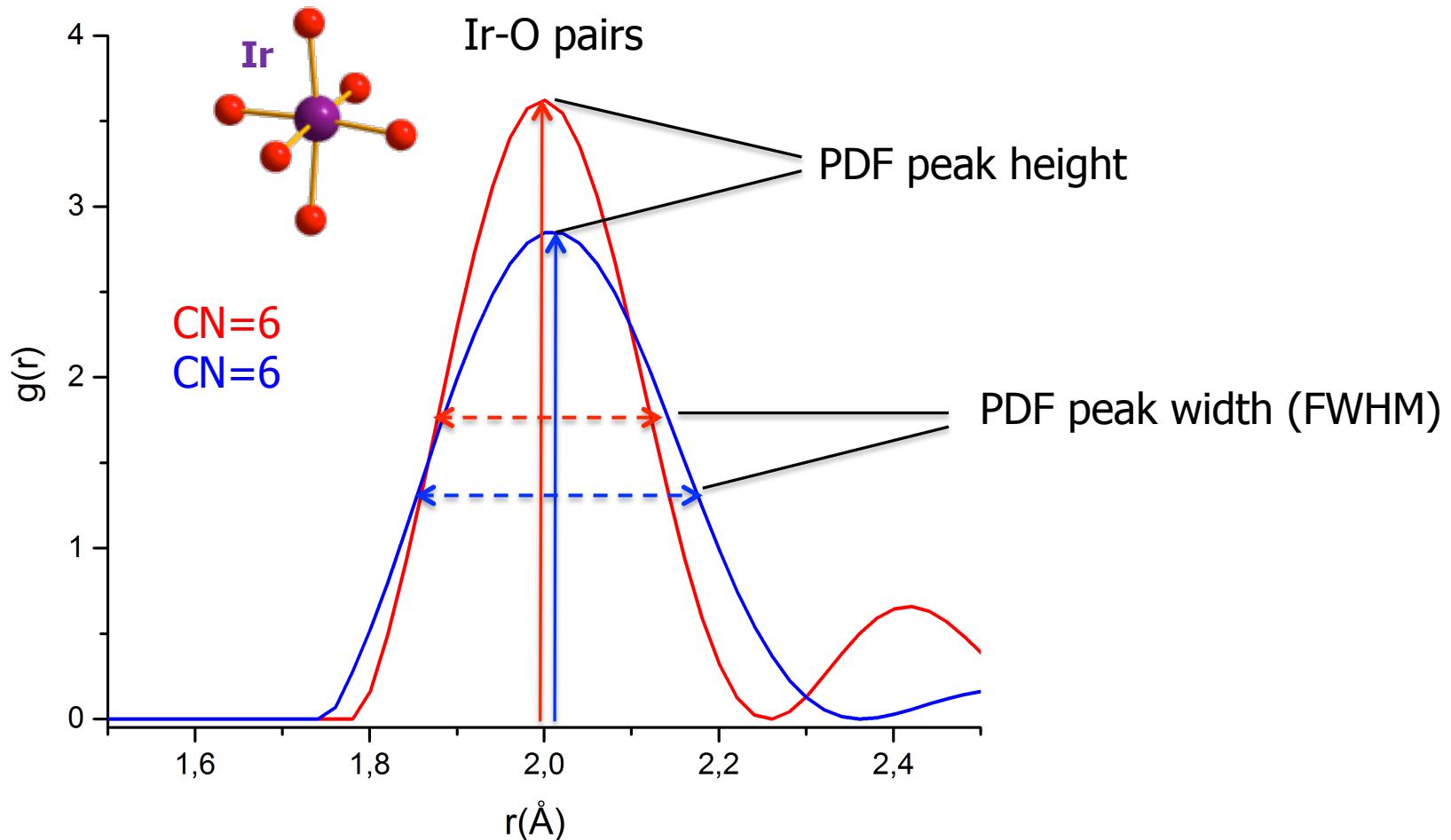
Dynamic structural disorder

Static structural disorder

# Direct information from the PDF

PDF peak height and PDF peak width are inversely proportional

$\text{IrO}_2$  crystalline phase ( $\text{Ir}^{4+}$ )  
 $\text{IrO}_x$  hydroxide disordered phase ( $\text{Ir}^{4+}\text{Ir}^{3+}$ )

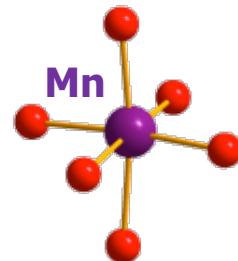


# Direct information from the PDF

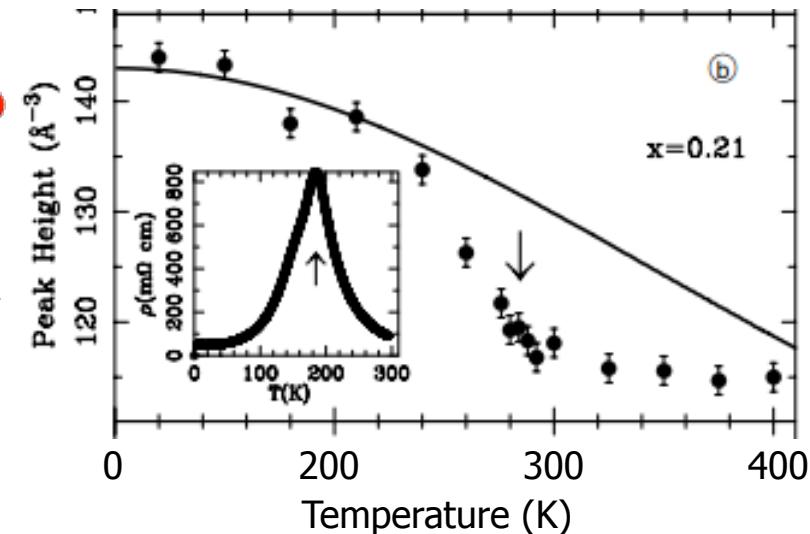
The PDF peak width as a function of doping and temperature



shows a phase transition from insulating paramagnetic phase to a metallic ferromagnetic phase



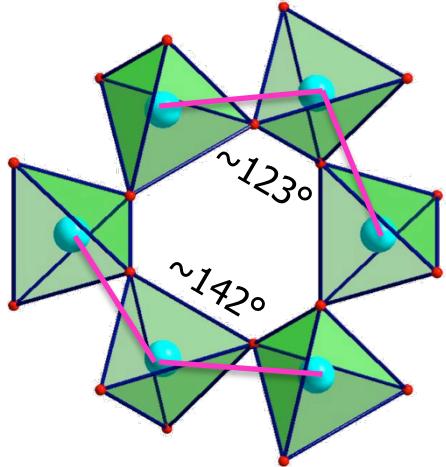
Insulating phase has localized charges:  $\text{Mn}^{3+}$  and  $\text{Mn}^{4+}$   
Metallic phase has delocalized charges:  $\text{Mn}^{(3+x)+}$



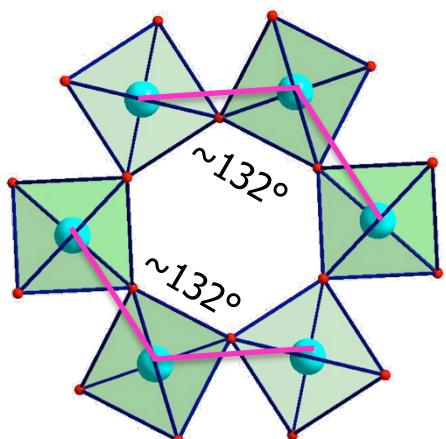
# Direct information from the PDF

The PDF peak width as a function of temperature

$\text{W}$ -Quartz



$\text{W}$ -Quartz





# Outline

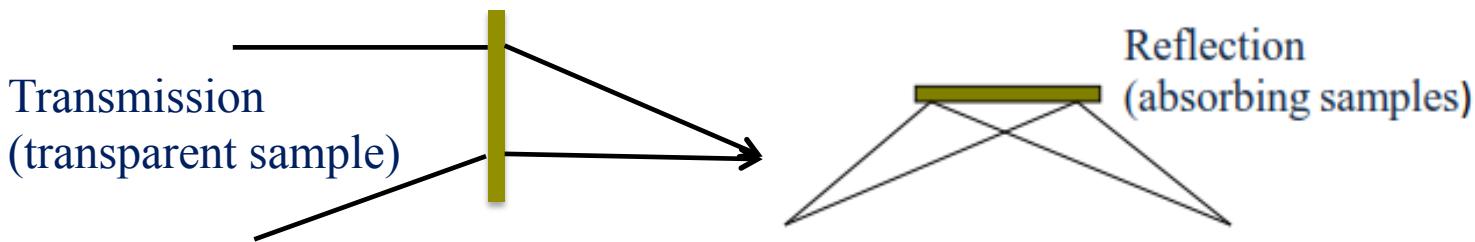


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# Where can we measure X-ray PDF?

## ■ In house X-ray experiments:

- Low  $r$  resolution, slow (and/or poor statistics)
- Mo:  $Q_{\max} \sim 17\text{\AA}^{-1}$ , Ag:  $Q_{\max} \sim 20\text{\AA}^{-1}$
- Easy
- Flat plate transmission or reflection geometry



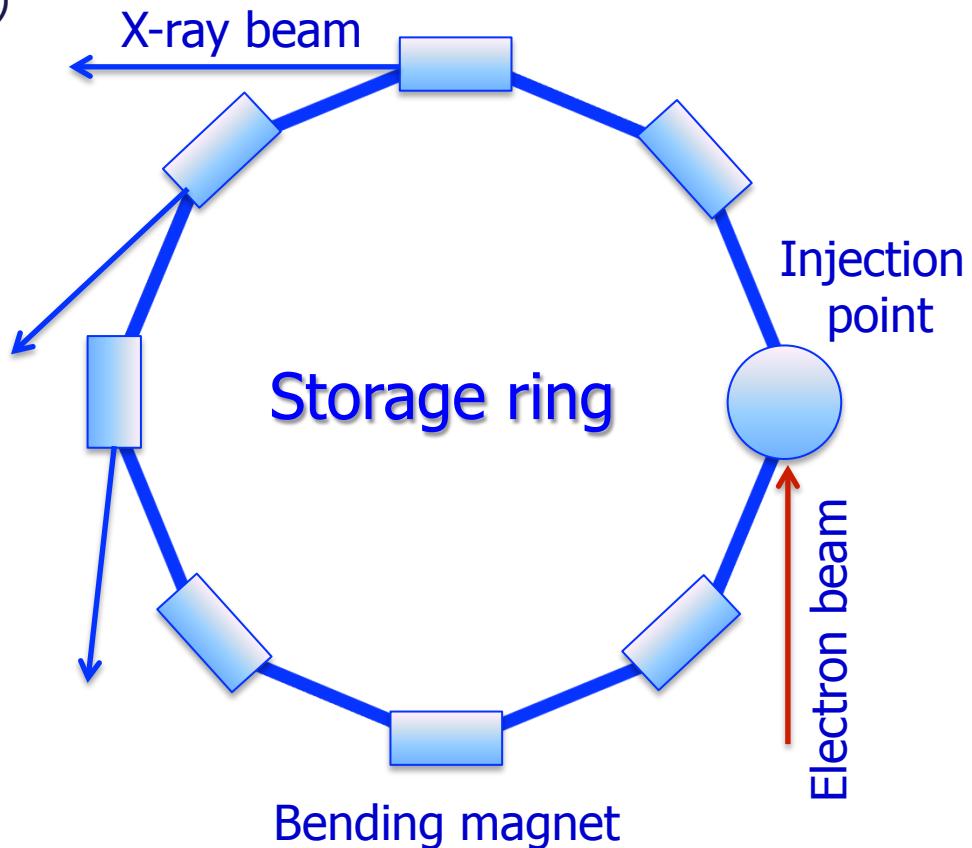
## ■ Synchrotron experiments:

- Little precious beamtime, but measurements are quick(er)
- High  $r$  resolution using high energy X-rays ( $Q_{\max} > 60\text{\AA}^{-1}$ )
- High intensity (x 10,000 times stronger)
- Parallel beam optics
- Generally flat plate or cylindrical transmission geometry

# Where can we measure X-ray PDF?

European Synchrotron Radiation Facility (ESRF)

Location: Grenoble (France)



## Advantages:

High brightness → small samples

High collimation → high resolution of  $2\theta$

Continuous spread of wavelengths

## Disadvantage:

the synchrotron sources are not available on a daily basis

# Where can we measure X-ray PDF?

a Exposure: 25 sec !

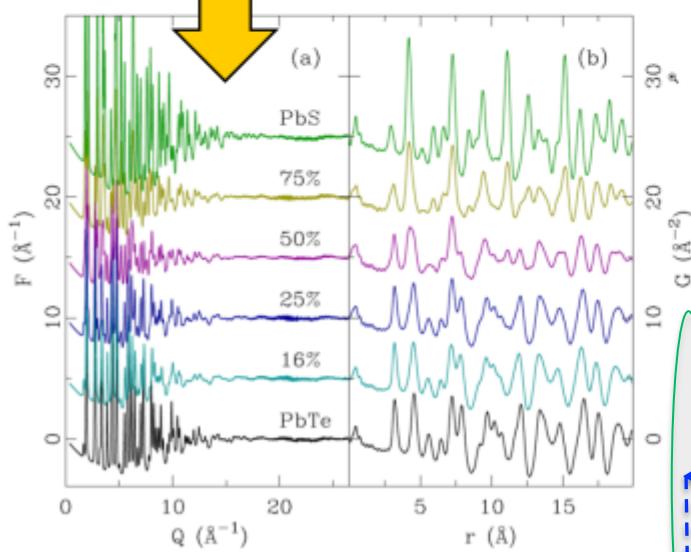
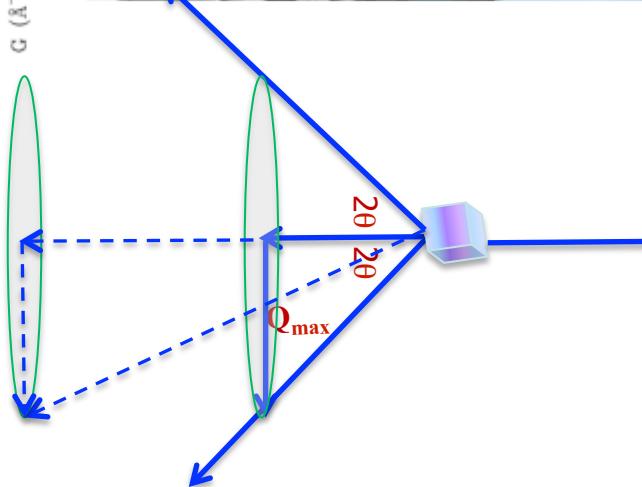
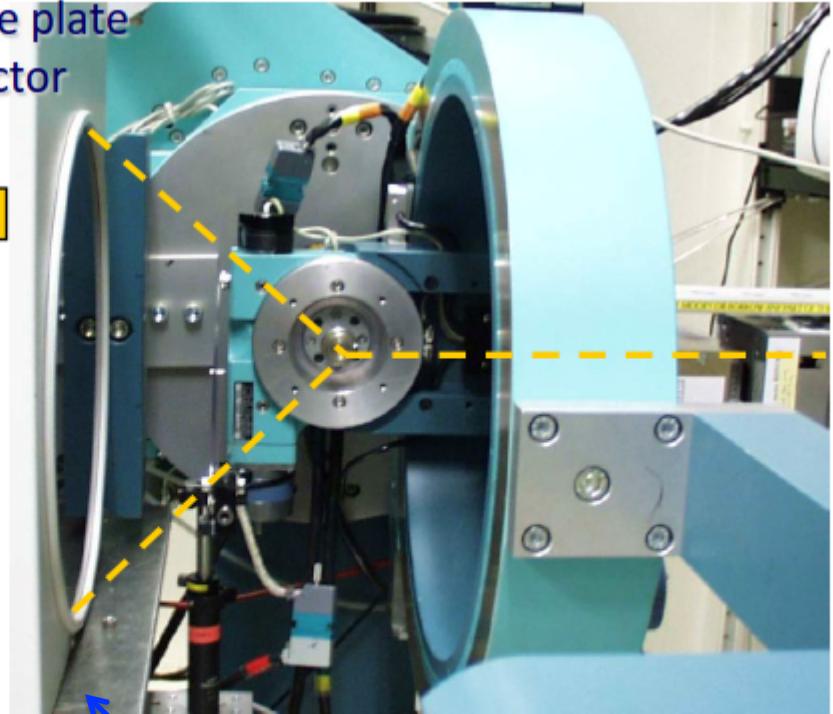


Image plate  
detector



# X-rays or neutrons?

*Highly complementary, depends on the nature of the problem at hand*

## Synchrotron X-rays

$f$  – proportional to  $Z$  (atomic number)

poor sensitivity to light elements

$f$  – decreases with  $Q = 4\pi \sin \theta / \lambda$

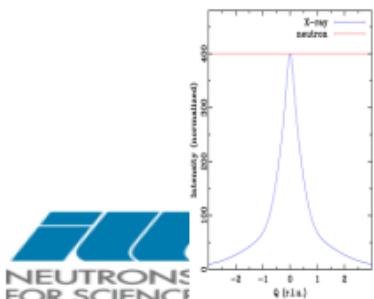
**sample amount**  $\sim 100$  mg

### acquisition time:

$\sim 5$  hours for point detector

$\sim 10$  seconds for area detector

$\sim 0.1$  seconds a-Si area detector



## Neutrons

$b$  – fluctuates with  $Z$

sensitive to light elements

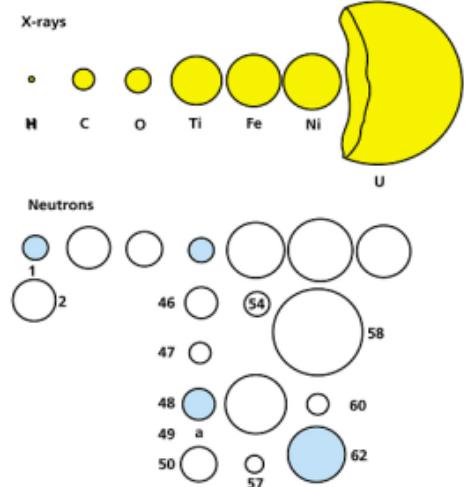
$b$  – constant with  $Q$

**sample amount**  $\sim 5 - 10$  g

### acquisition time:

$\sim 2-5$  hours, possibly longer

(much faster at the latest neutron sources,  
e.g., Oak Ridge Laboratory, Tennessee)



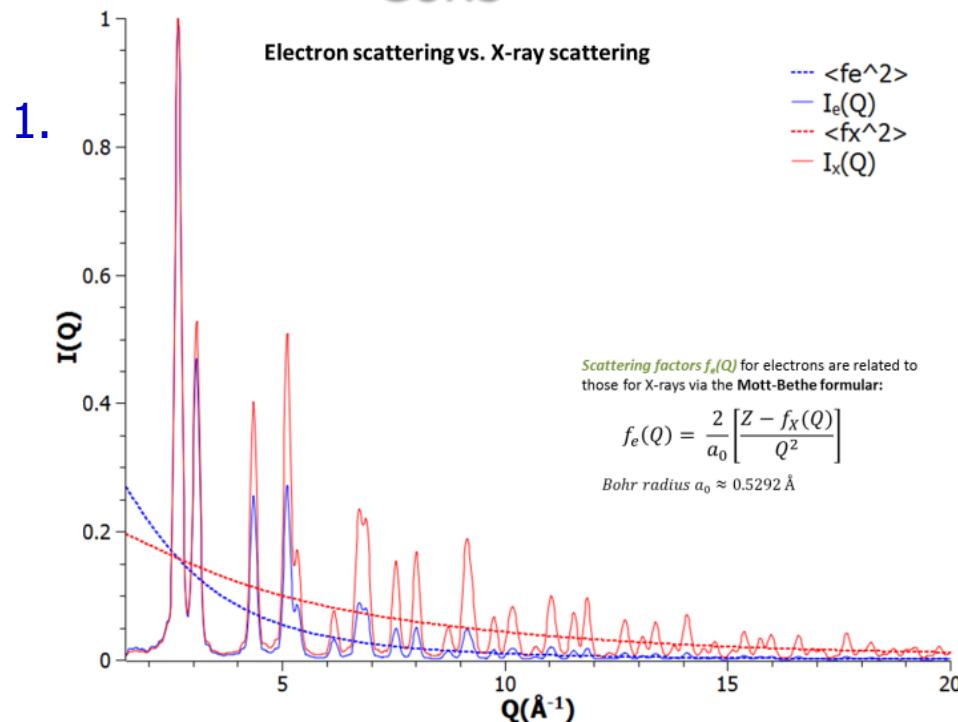
*Choice could depend also on issues related to the underlying structure, or sample characteristics such as size or absorption*

# X-rays or electrons?

## Pros

1. A low amount of a sample is needed (fractions of  $\mu\text{g}$ ).
2. Synchrotron beam time is not needed!!!  
TEM operator can easily switch from the image- to diffraction-mode.
3. It is a local method in the TEM.

## Cons



1. Electron scattering intensity is higher than X-ray scattering intensity at low Q.
2. Electron beam sensitivity of some materials



Electron beam radiation damage is 10 order of magnitude higher than that of X-rays

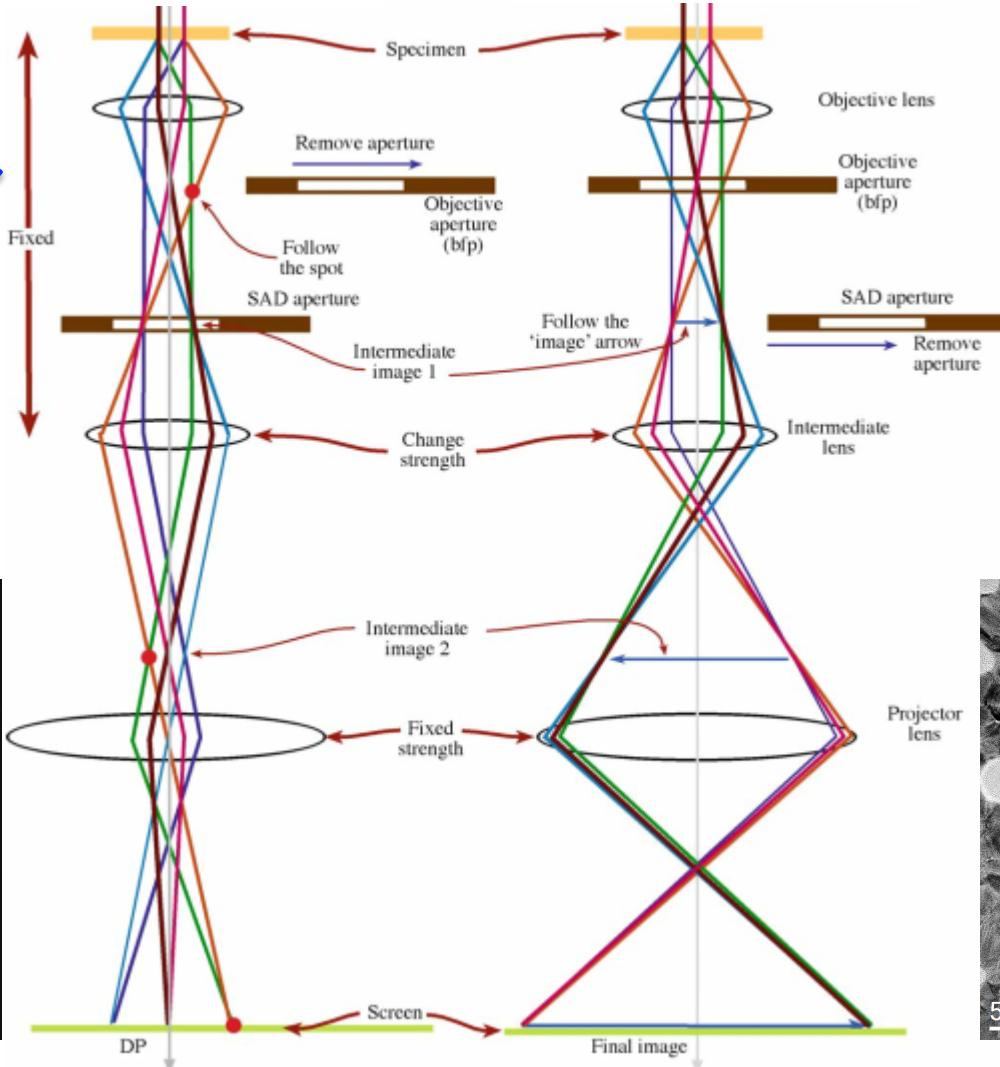


# TEM



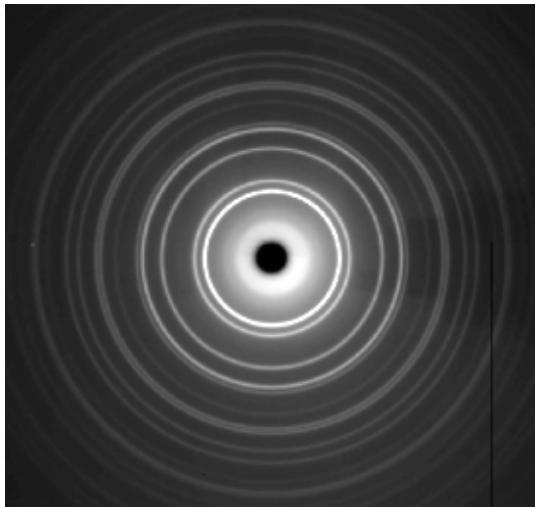
## Diffraction mode

## TEM image mode

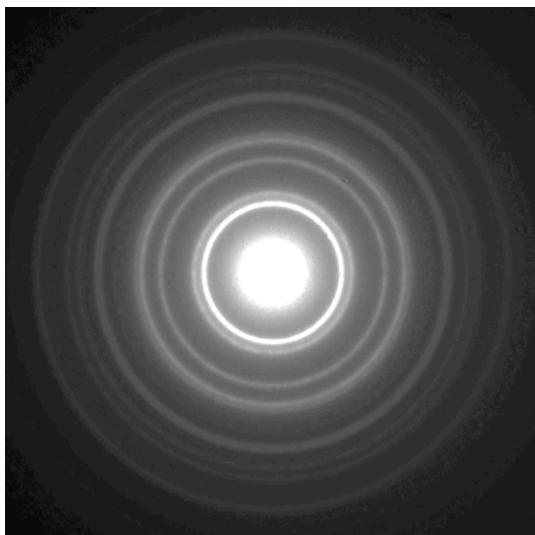


# X-rays or electrons?

2D XRD pattern

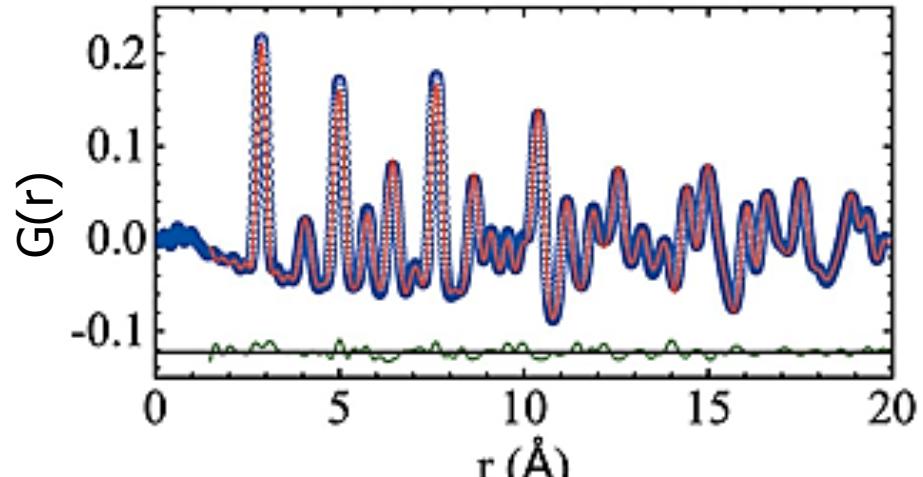


2D ED pattern

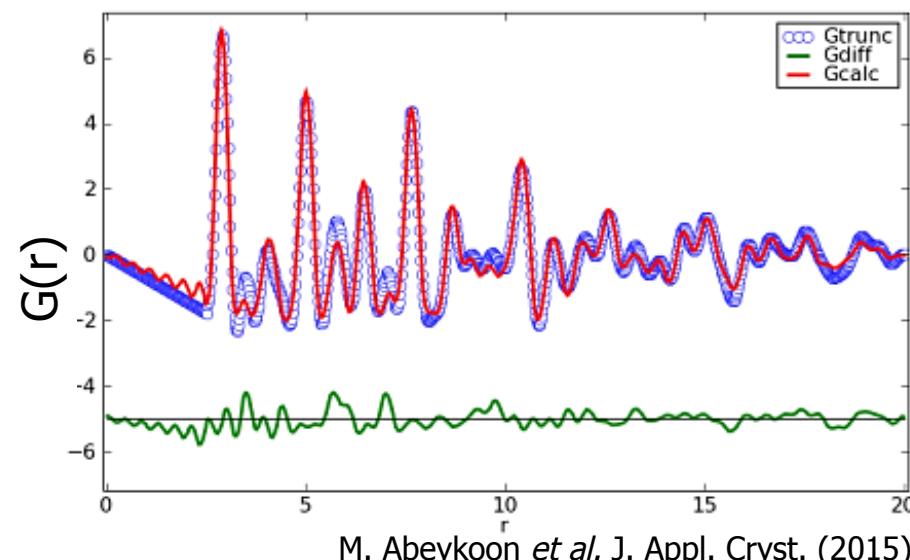


10 nm Au nanoparticles ( $Q_{\max} = 10 \text{\AA}^{-1}$ )

X-ray PDF



electron PDF



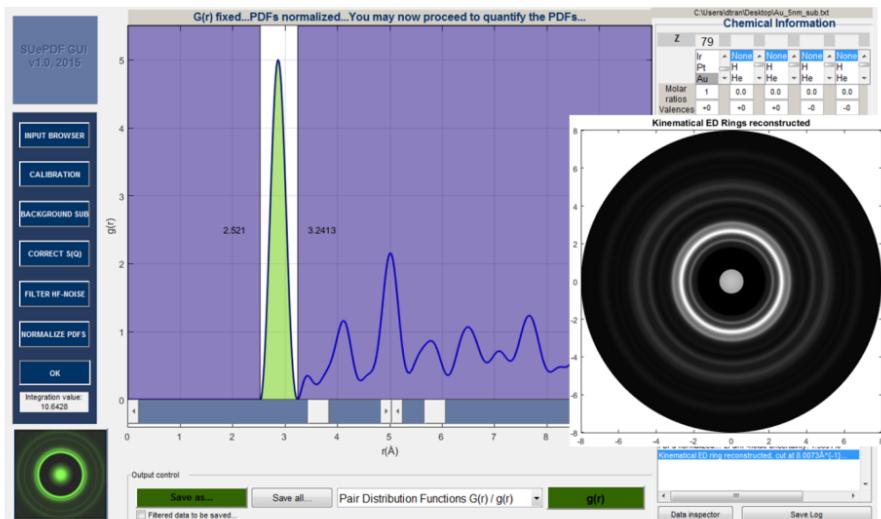
# Software for PDF modelling

The Software to abstract PDF from diffraction data

PDFgetX3 for XRD pattern

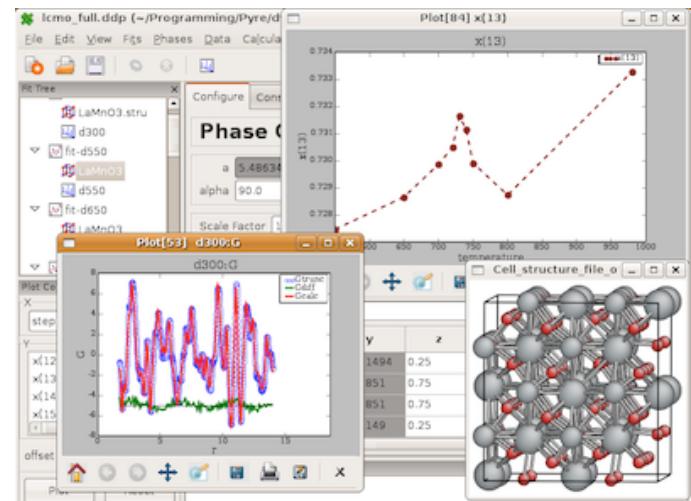
PDFgetN for NPD pattern

SUePDF for electron diffraction pattern



The software to model PDF

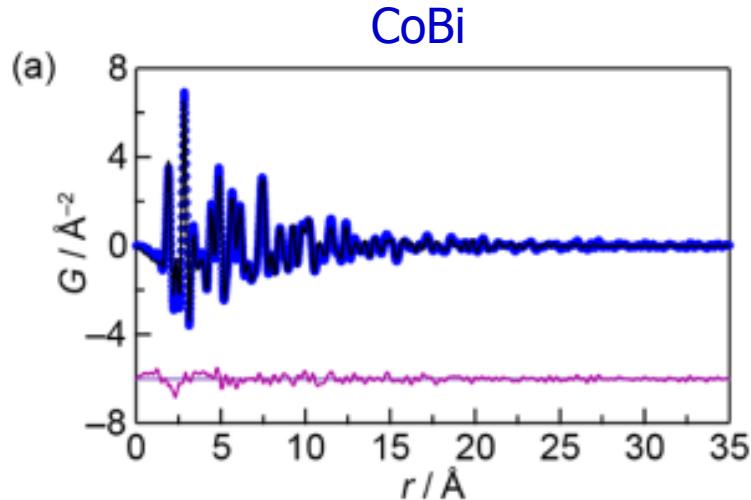
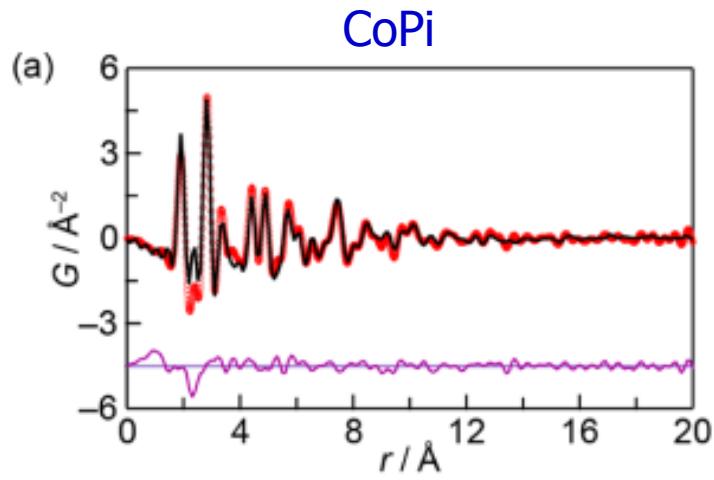
PDFgui (a least squares approach)



DiffPy-CMI advanced modelling

# Software for PDF modelling

Advanced modeling for nanoscale materials with SrFit and SrReal using Debye equation





# Outline

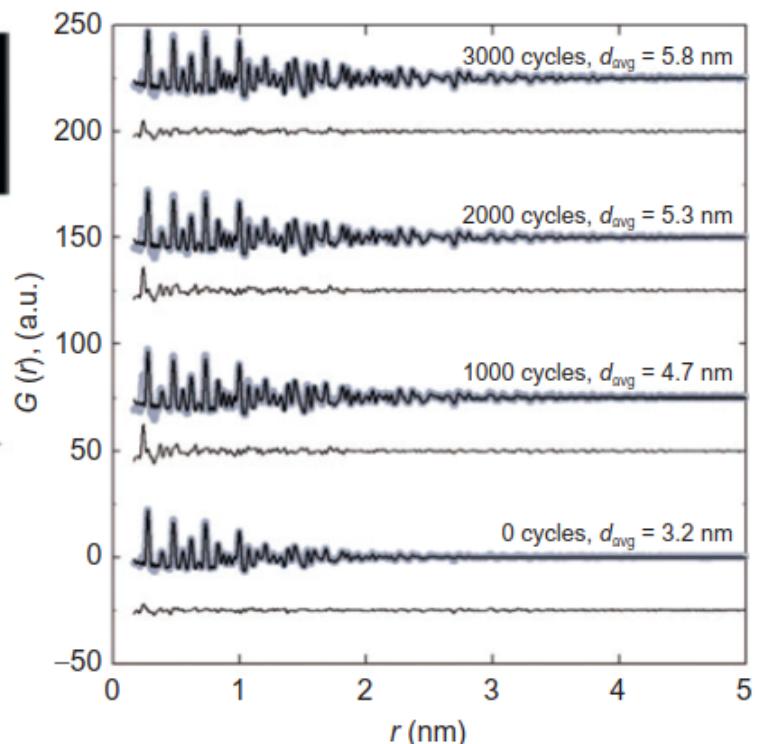
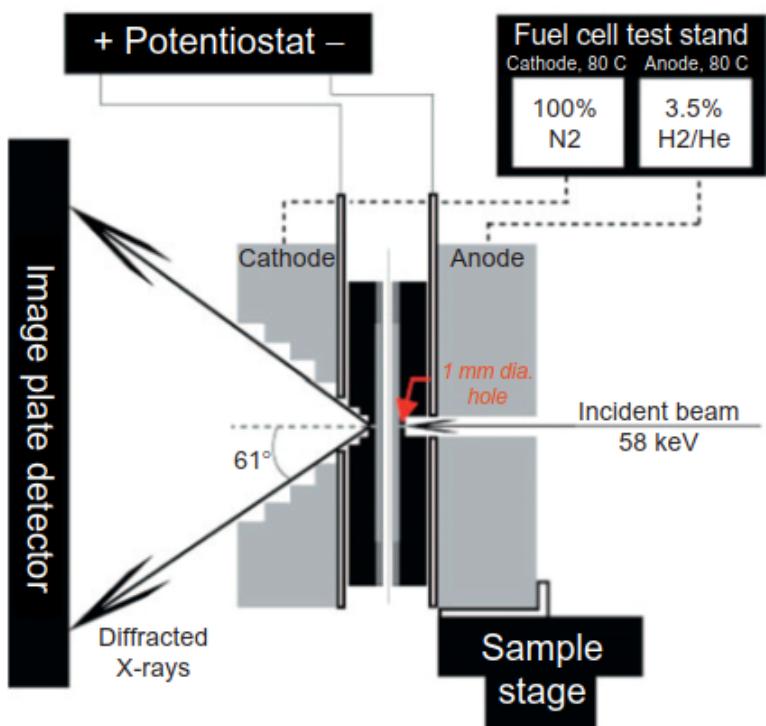


- What for do we need PDF?
- Scattering intensity
- Mathematical basis of the PDF
- Direct structural information from PDF
- PDF experiments: X-rays, neutrons, electrons
- **Catalysis related examples**

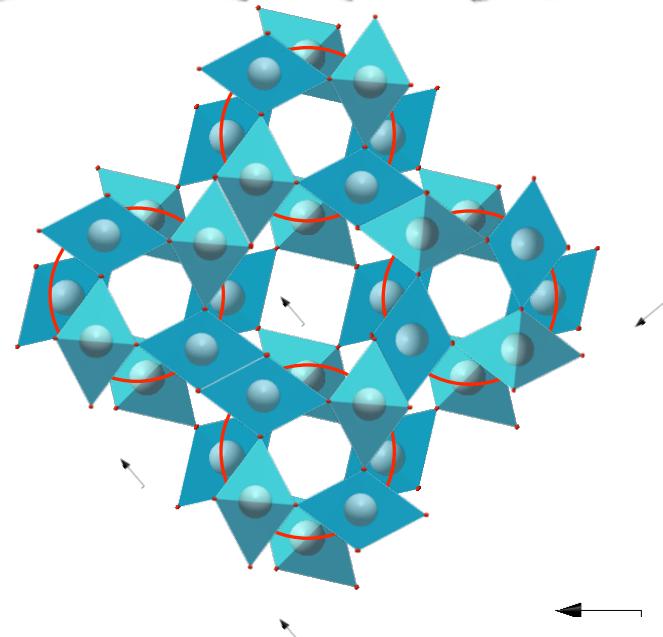
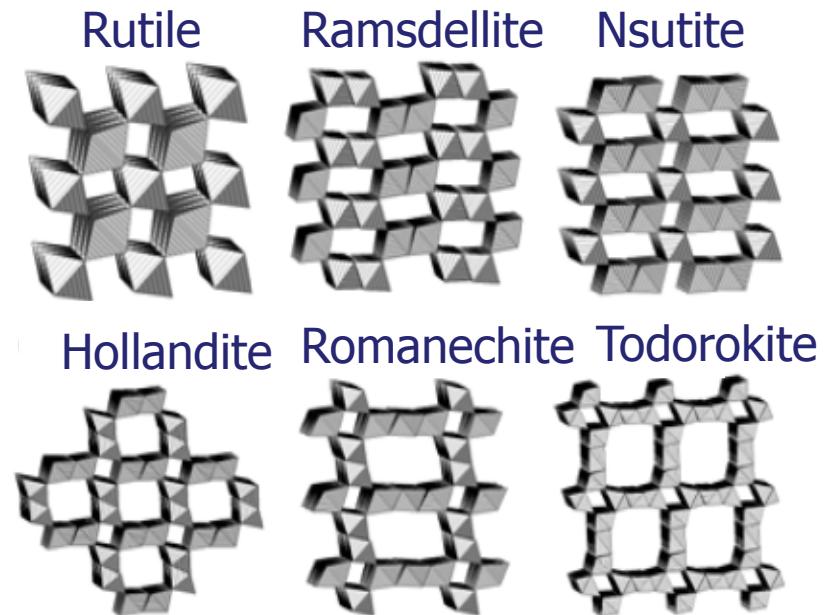
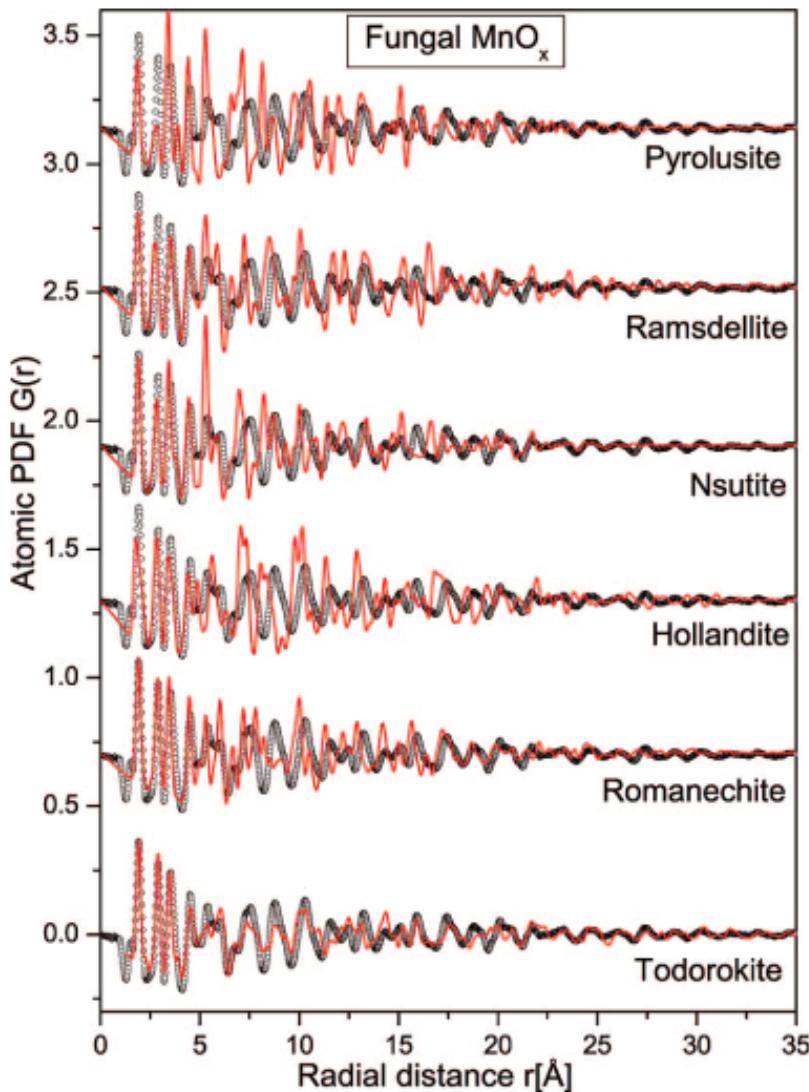
# Catalysis related examples

## PDF of an Operating Fuel Cell In Operando

Pt/C catalyst for Data were first measured with this device at 11IDB at APS

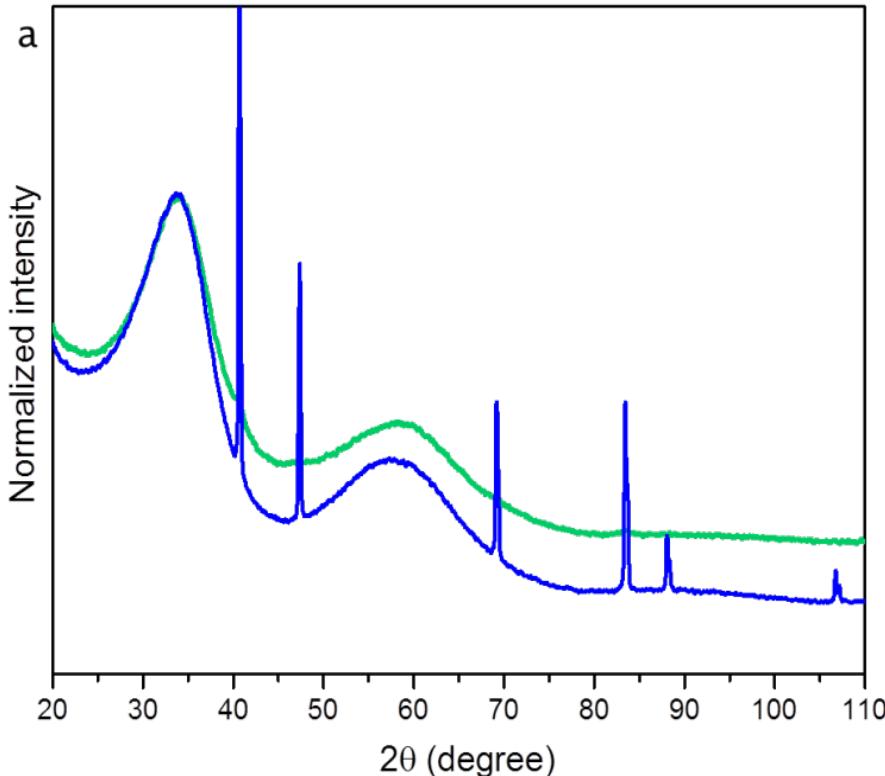


# Catalysis related examples



# Catalysis related examples

**IrO<sub>x</sub> (FHI-made)** shows much higher OER catalytic performance than **IrO<sub>x</sub> (Alfa Aesar)**



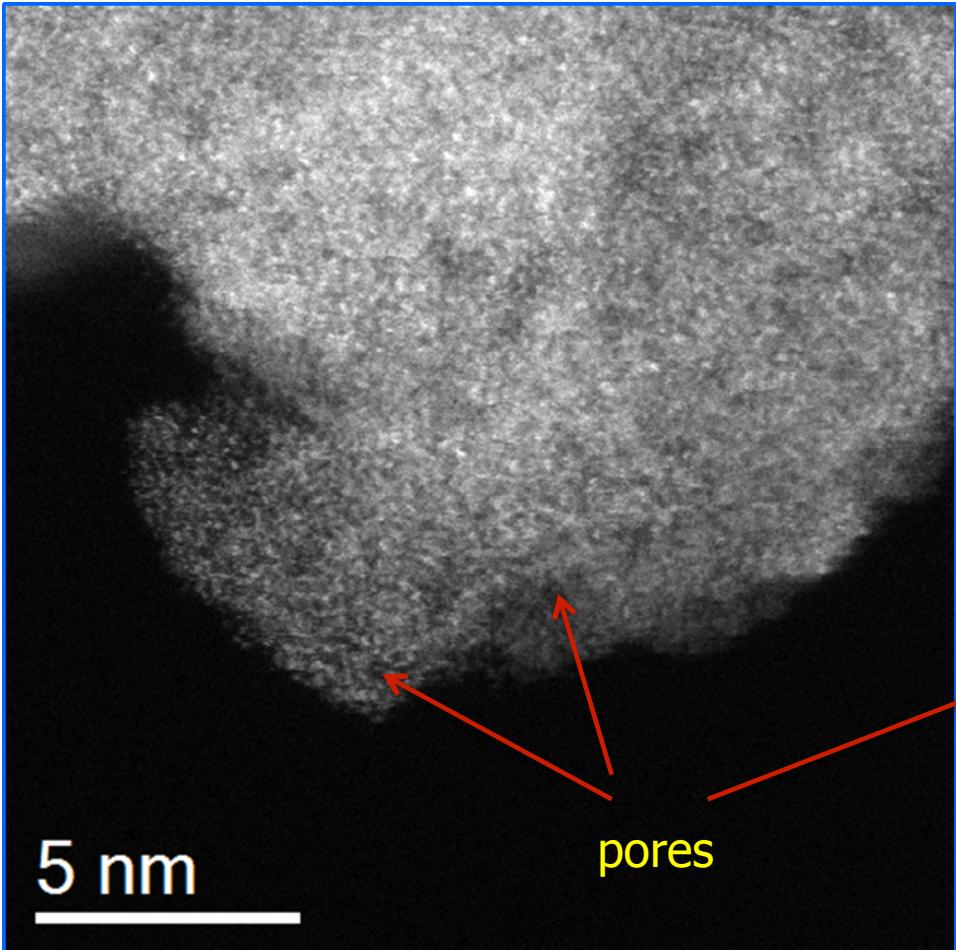
Except for the presence of metal impurities,  
XRD data does not show essential difference  
between commercial and FHI-made IrO<sub>x</sub> phases



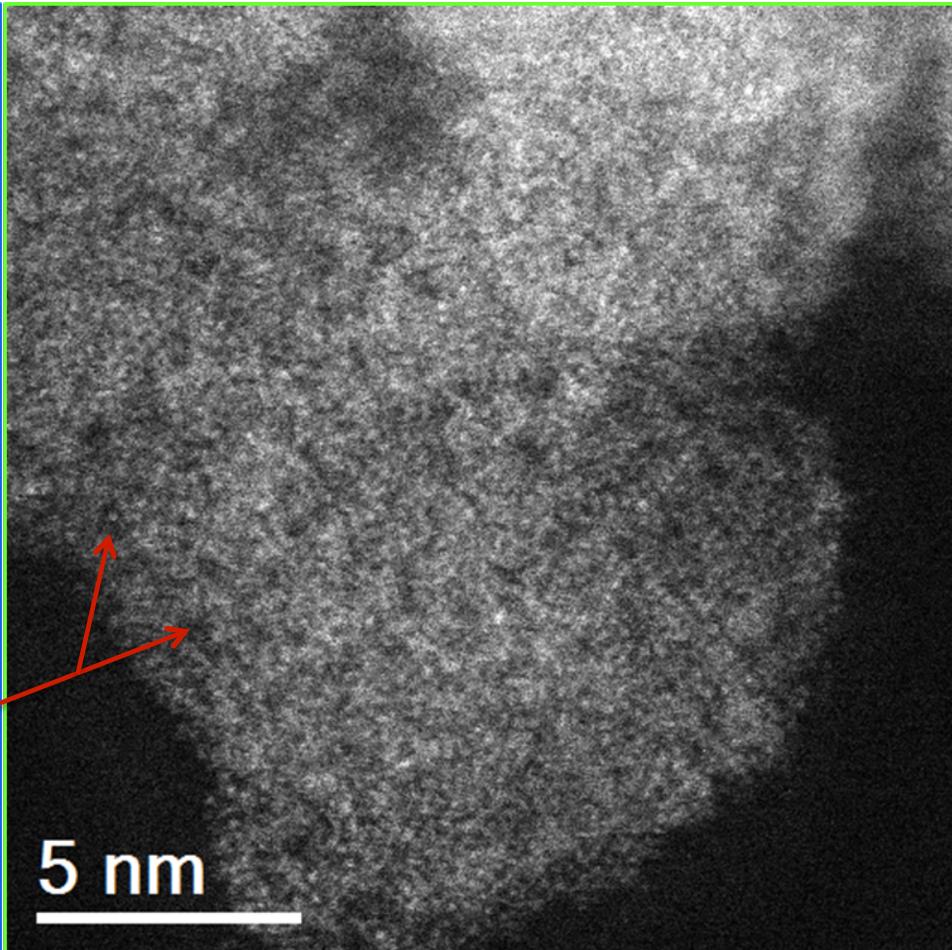
# HAADF



$\text{IrO}_x$ -commercial



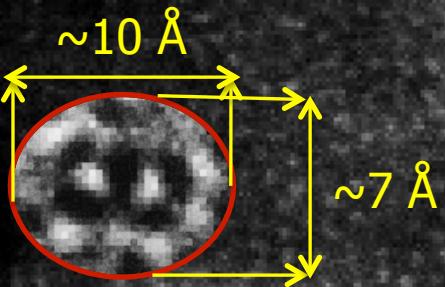
$\text{IrO}_x$ -FHI





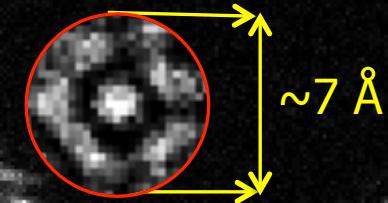
# Atomic resolution HAADF

$\text{IrO}_x$ -commercial



2 nm

$\text{IrO}_x$ -FHI

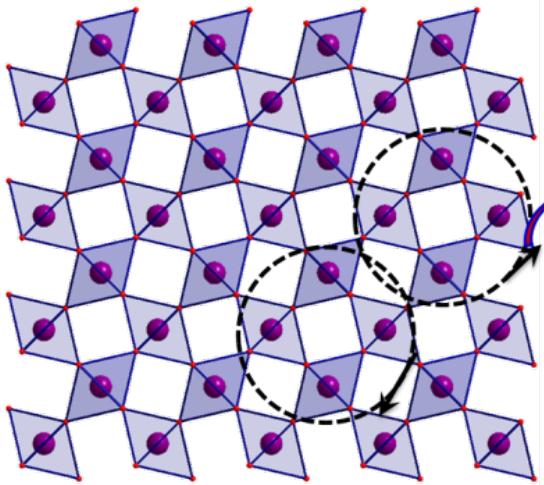


2 nm

EDX analysis shows O/Ir~2 for both samples  
 $\text{IrO}_x$ -FHI shows in addition a trace amount of K

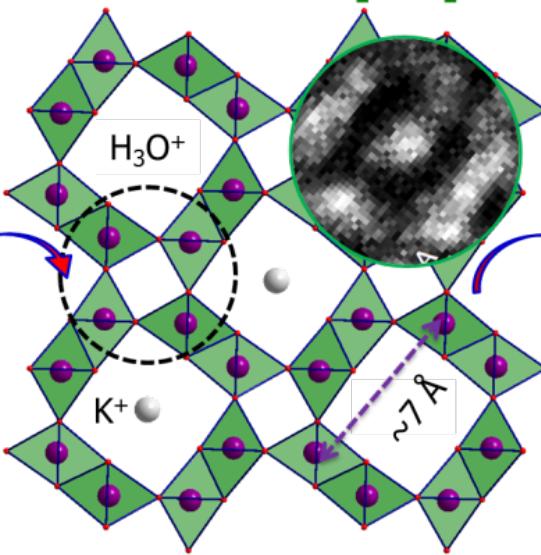
# Crystallographic approach

Rutile [1x1]



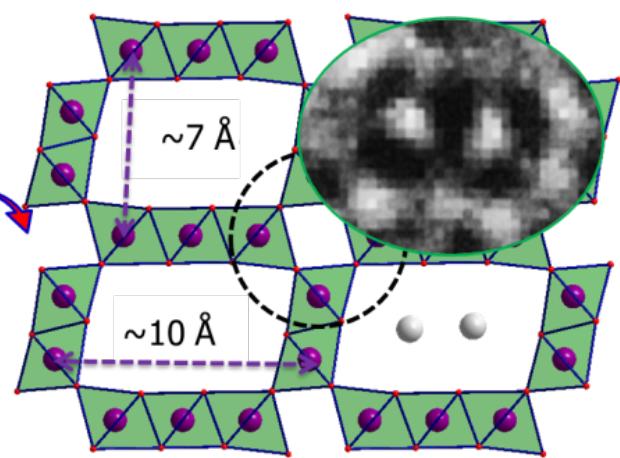
$\text{Ir}^{4+}$

Hollandite [2x1]



$\text{Ir}^{4+}\text{Ir}^{3+}$

Romanechite [3x1]



$\text{Ir}^{4+}\text{Ir}^{3+}$

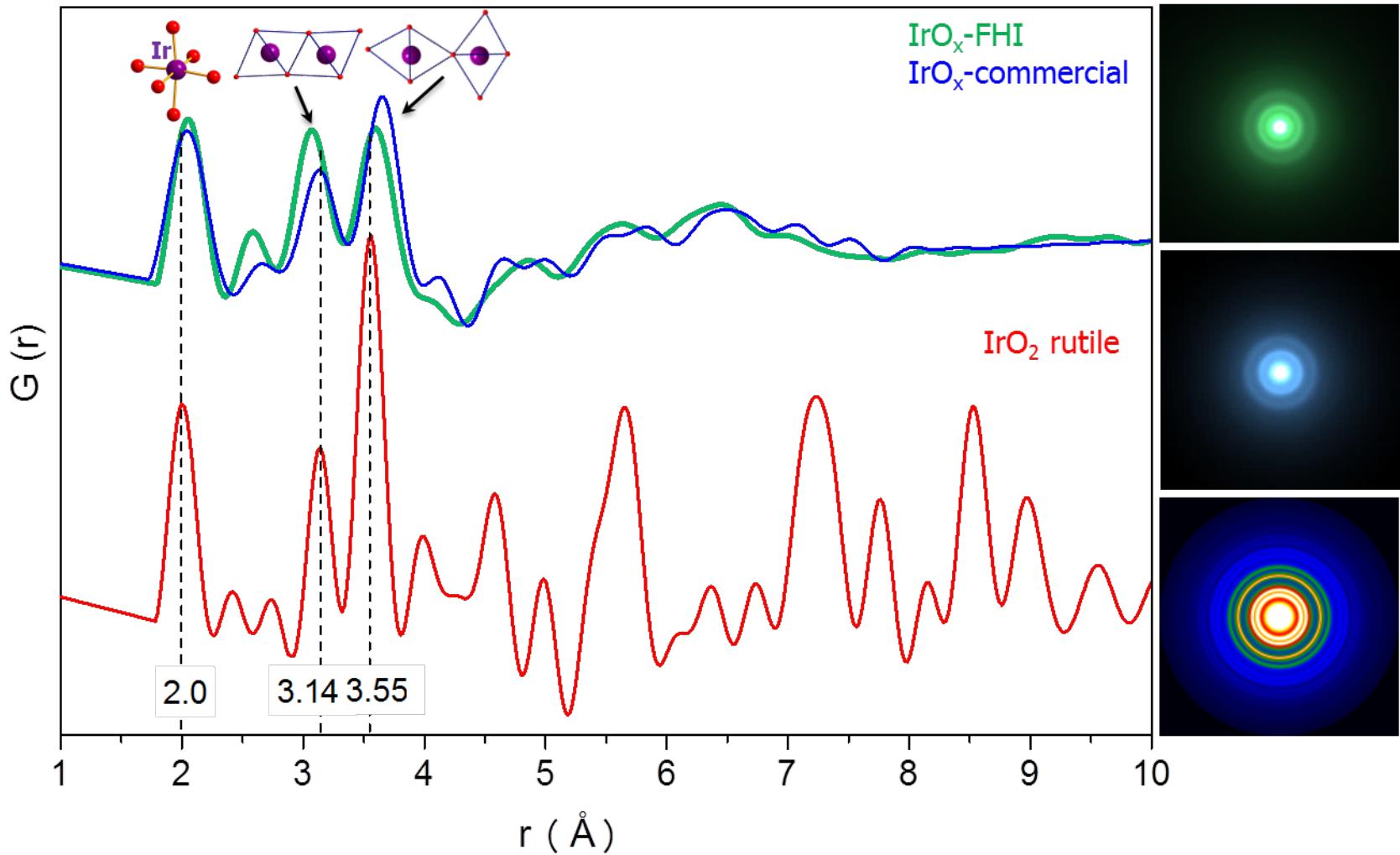


# ePDF analysis



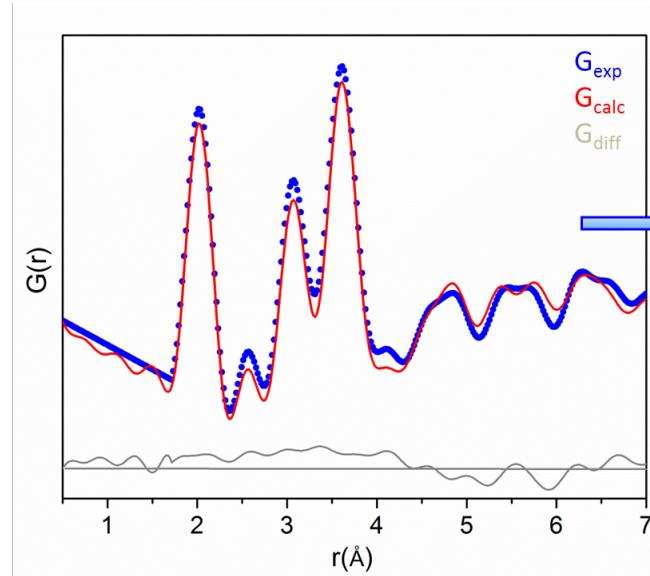
ePDF

SAED

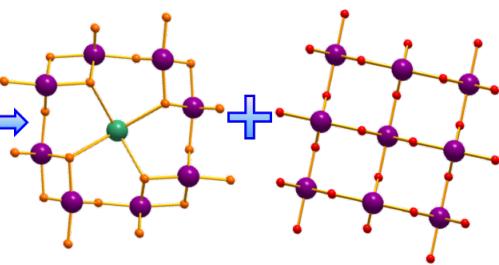


# ePDF modeling

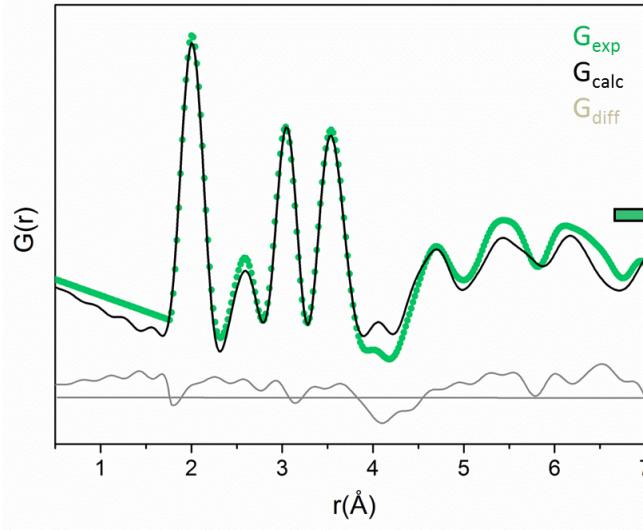
$\text{IrO}_x$ -commercial



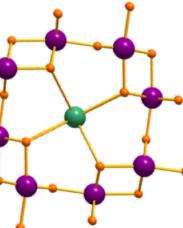
Hollandite + Rutile motifs



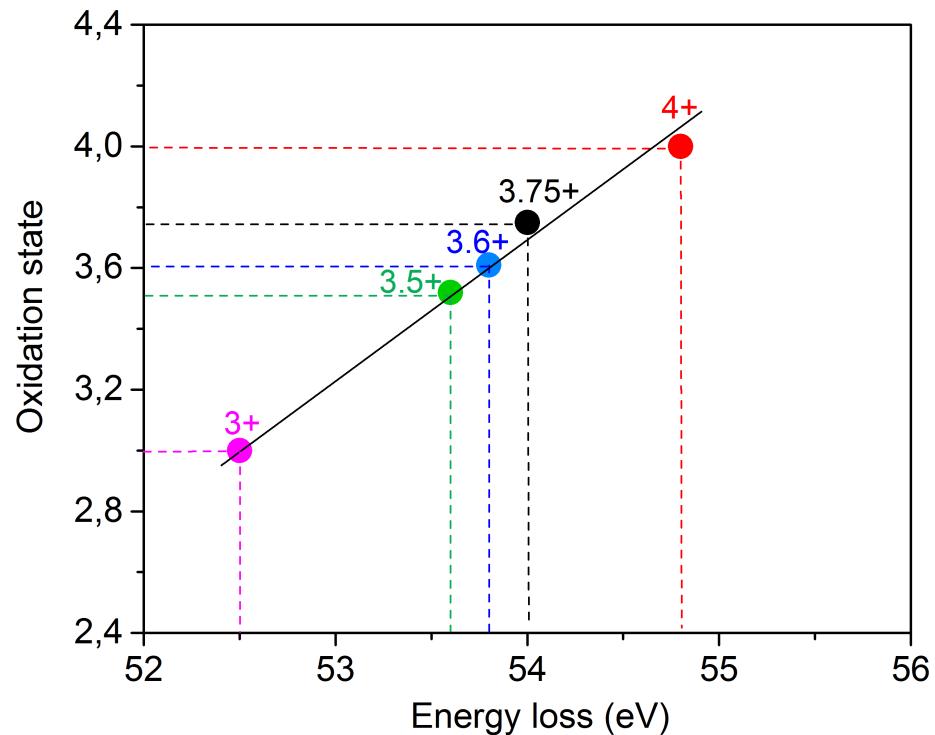
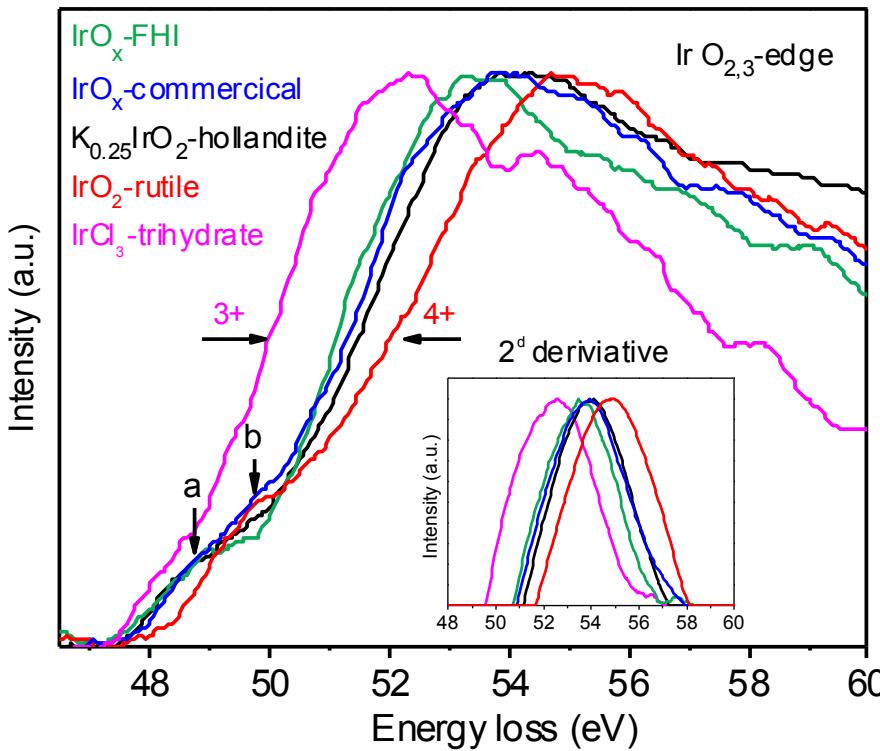
$\text{IrO}_x$ -FHI



Hollandite motif



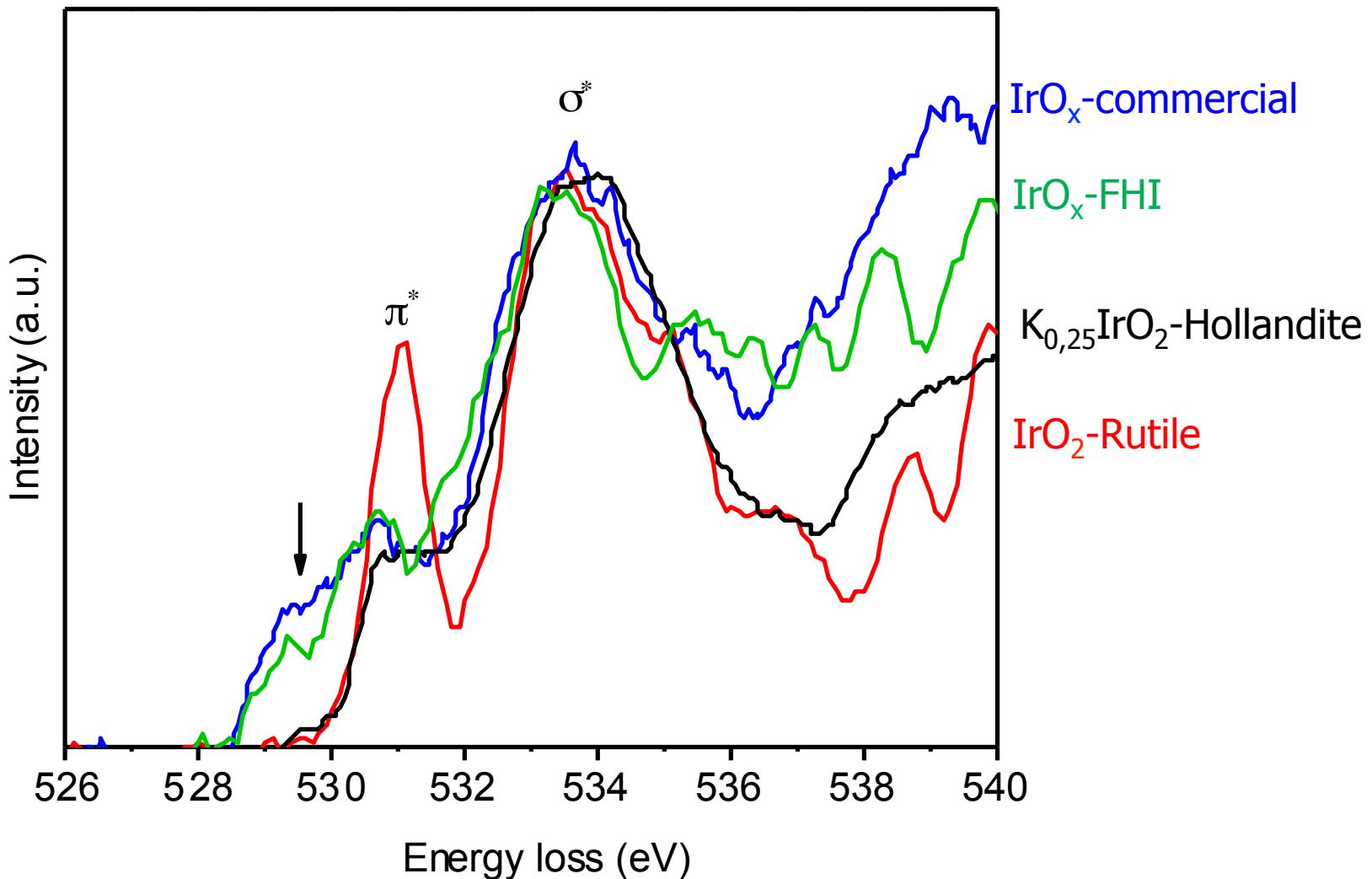
# EELS analysis



$\text{Ir O}_{2,3}$ -edge ( $5\text{p} \rightarrow 5\text{d}, 6\text{s}$  electron transitions)

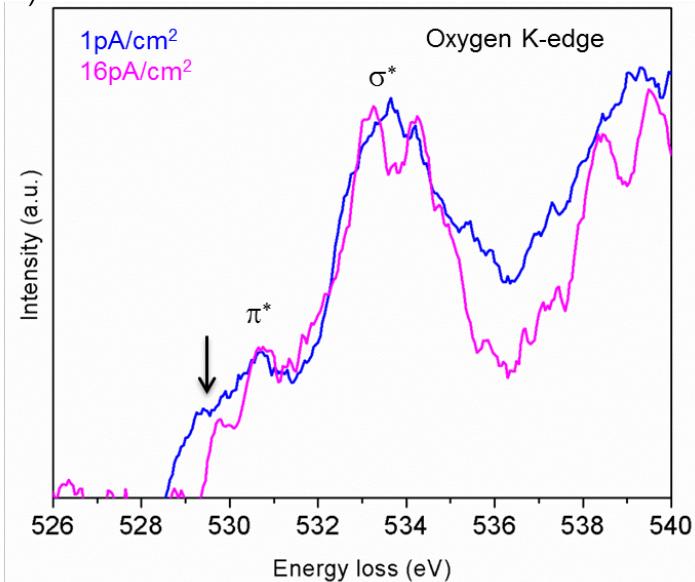
# EELS analysis

Oxygen K-edge

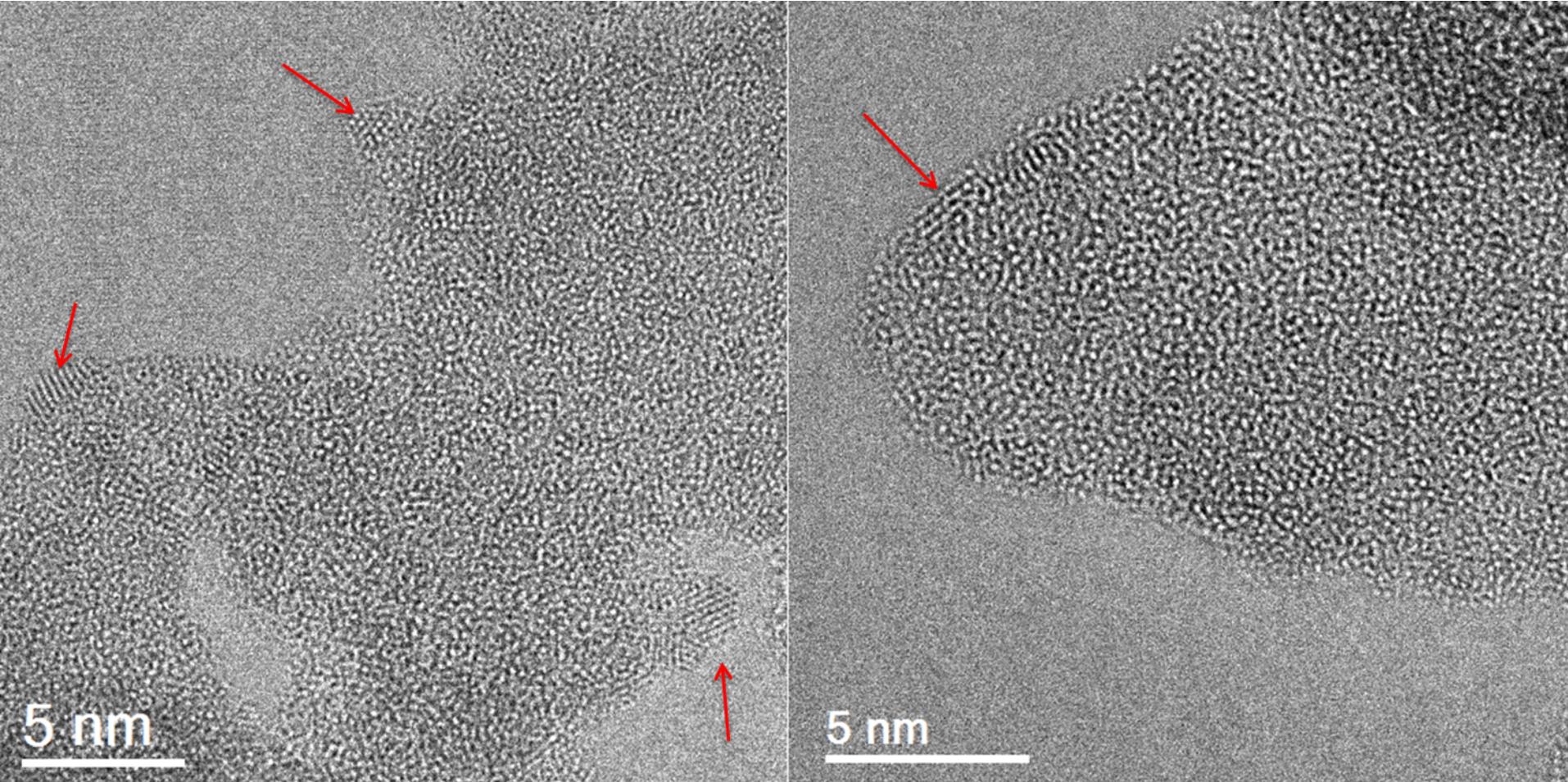


# E-beam effect

a)

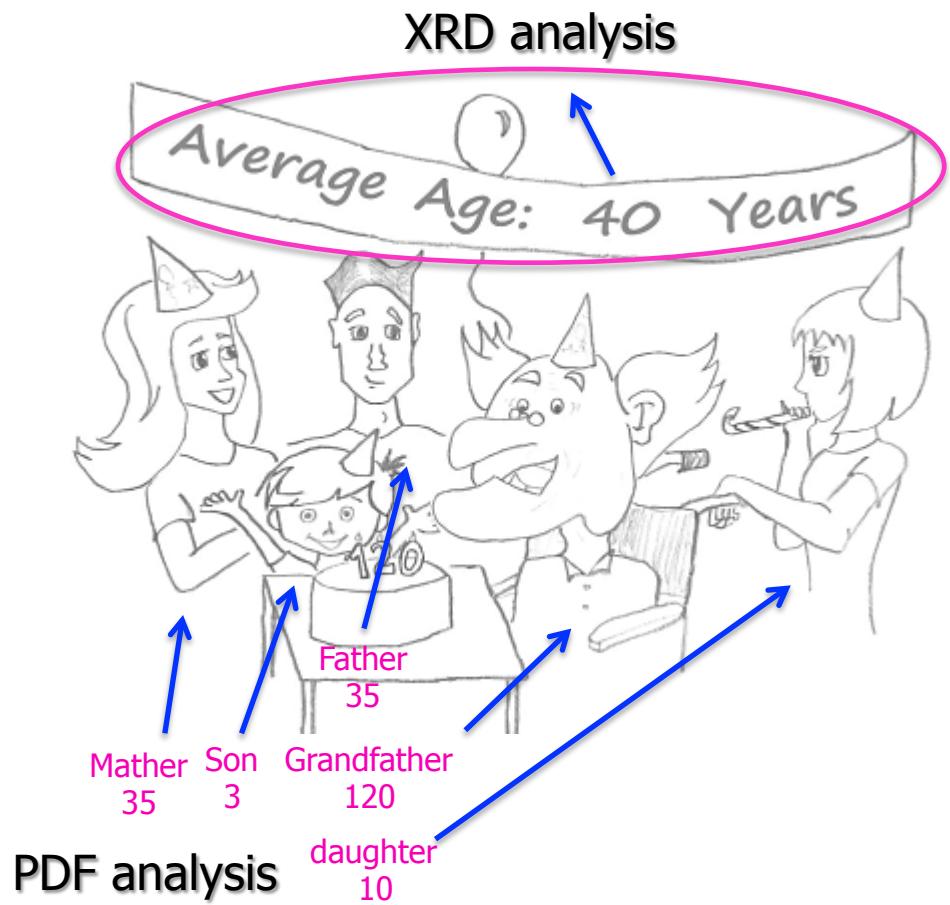
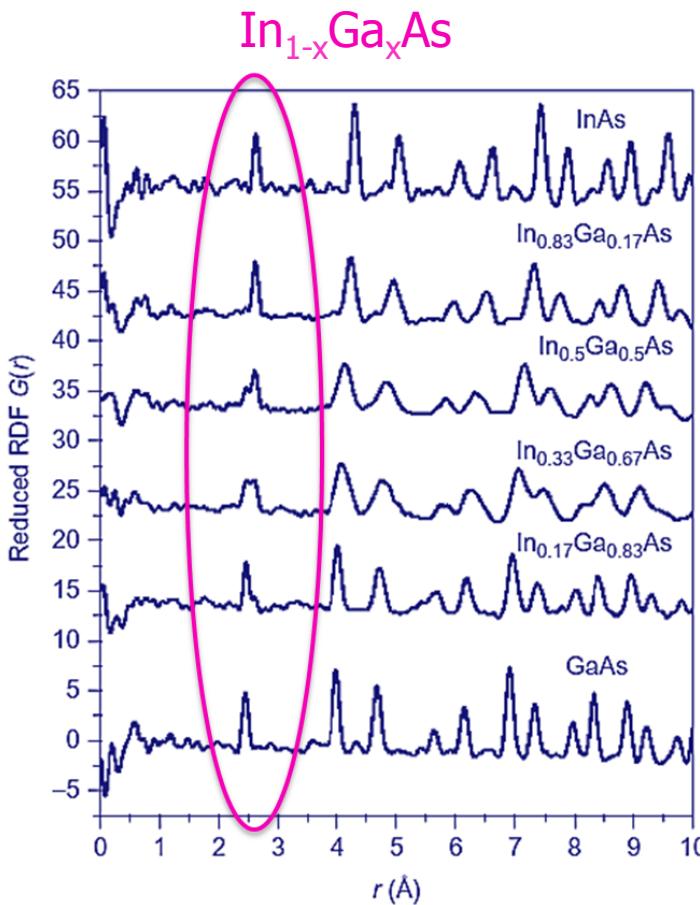


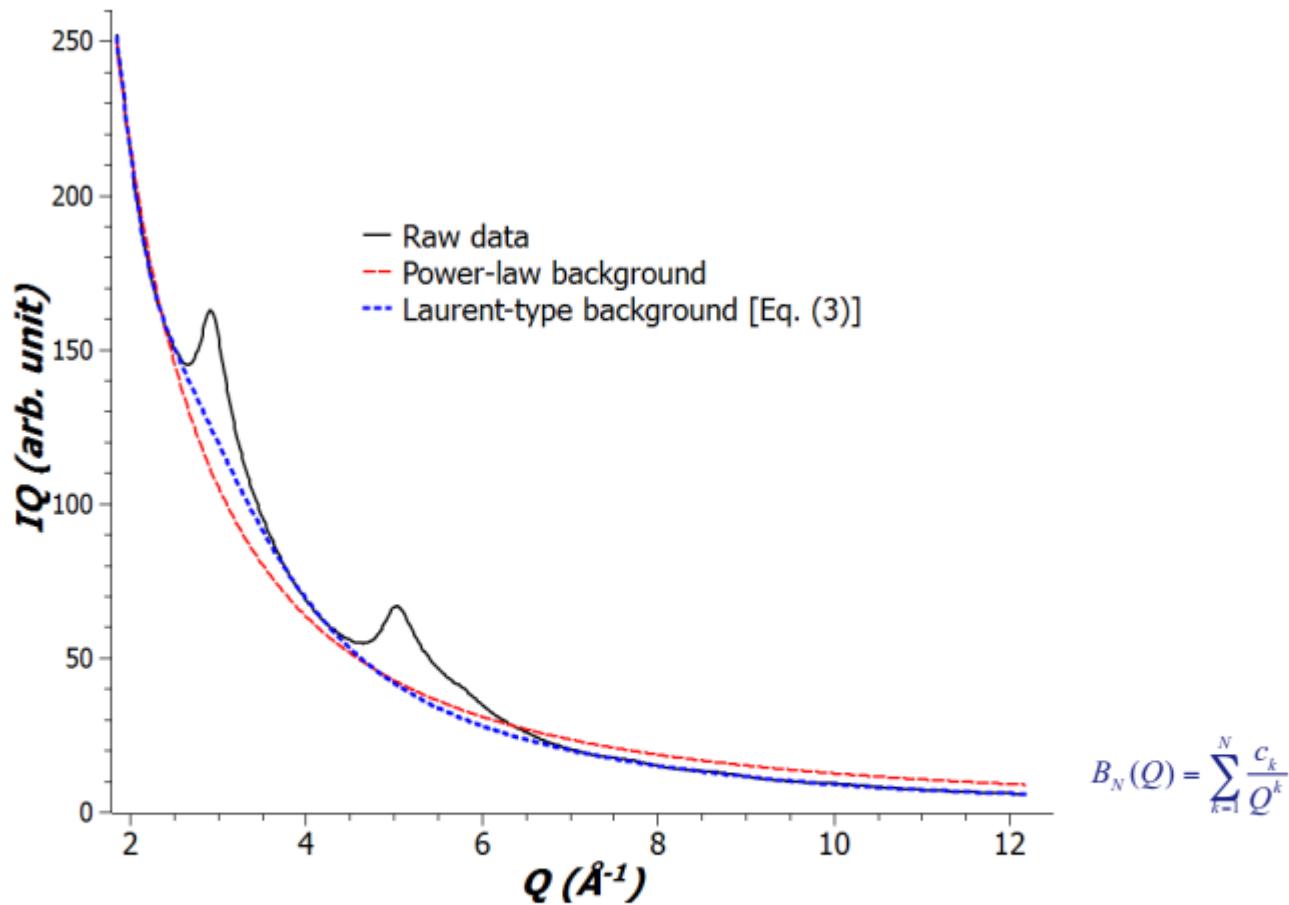
# E-beam effect



# Summary

The PDF allows to reveal the details of the local structure which is not available in the case of conventional structural analysis which deals with the average structure

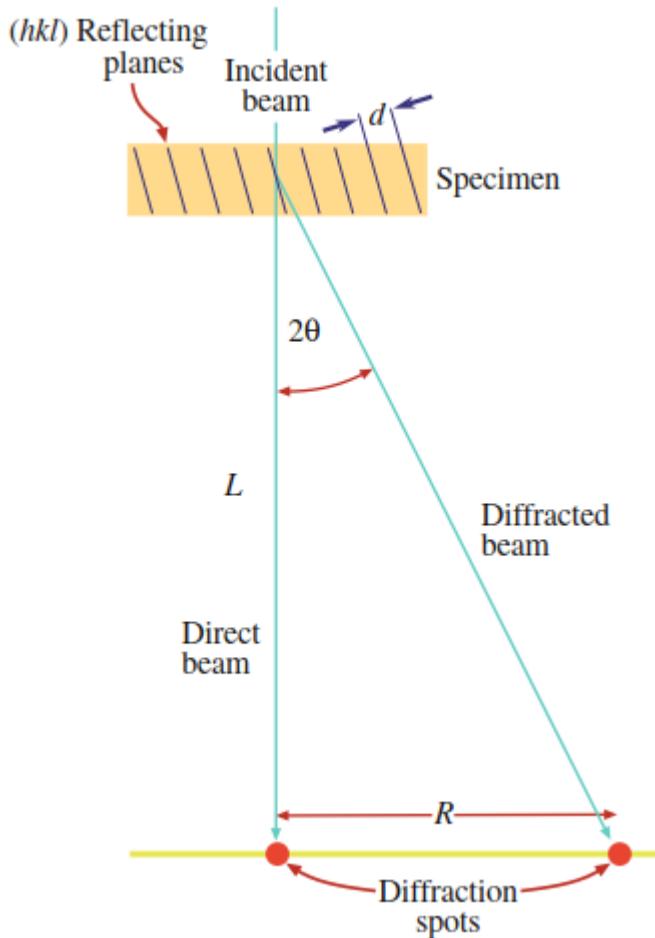




$$B_N(Q) = \sum_{k=1}^N \frac{c_k}{Q^k}$$

**Figure 1** Background modeling for electron powder diffraction data (solid-black) of nanoporous carbon: power-law model (dash-red) compared with Eq. (4) Laurent-type model (dot-blue) with  $N = 7$ .

# TEM



$$R/L = \tan 2\theta \sim \theta$$

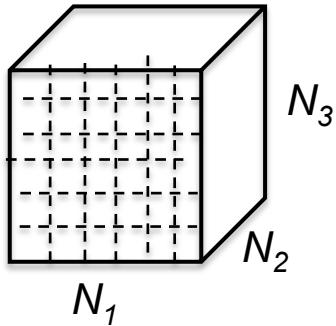
$$\theta \theta d = 2 \sin \theta \sim 2 \theta$$

$$Rd = \theta L$$

↓  
↓  
constant

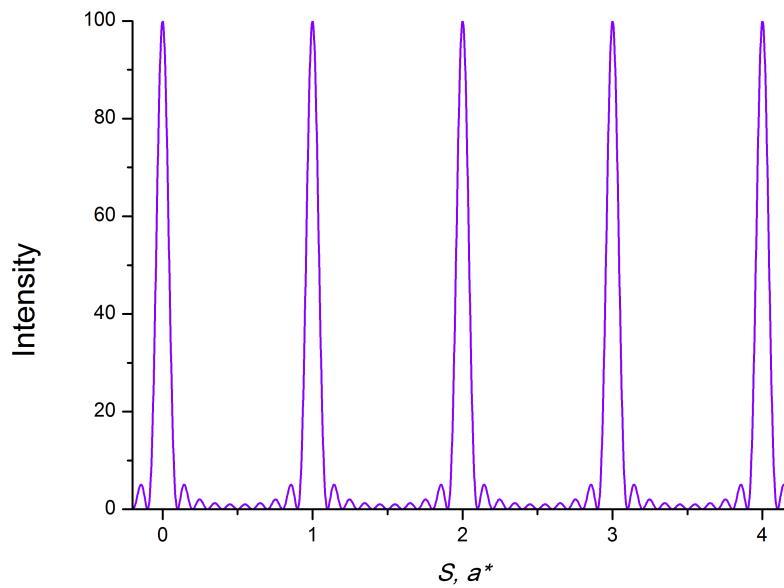
# X-ray scattering physics

*Finite crystal*



$$I \sim \sin \gamma_2 (N_1 \varphi_1) / \sin \gamma_2 \varphi_1 \cdot \sin \gamma_2 (N_2 \varphi_2) / \sin \gamma_2 \varphi_2 \cdot \sin \gamma_2 (N_3 \varphi_3) / \sin \gamma_2 \varphi_3$$

$$\varphi_1 = \pi (\mathbf{S} \cdot \mathbf{a}), \varphi_2 = \pi (\mathbf{S} \cdot \mathbf{b}), \varphi_3 = \pi (\mathbf{S} \cdot \mathbf{c})$$

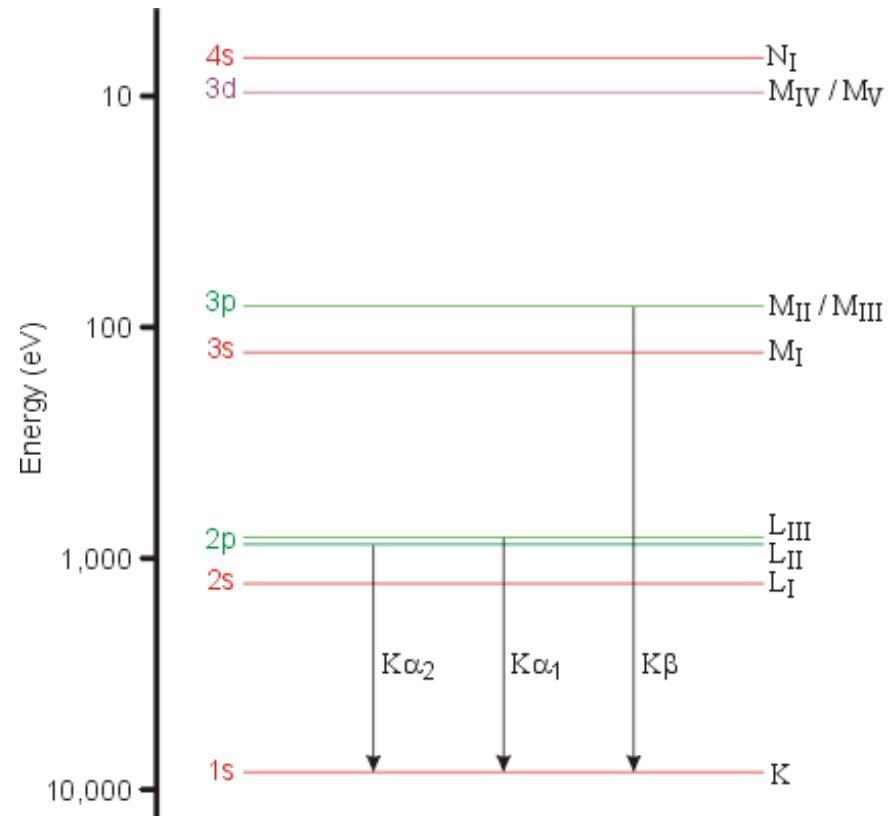
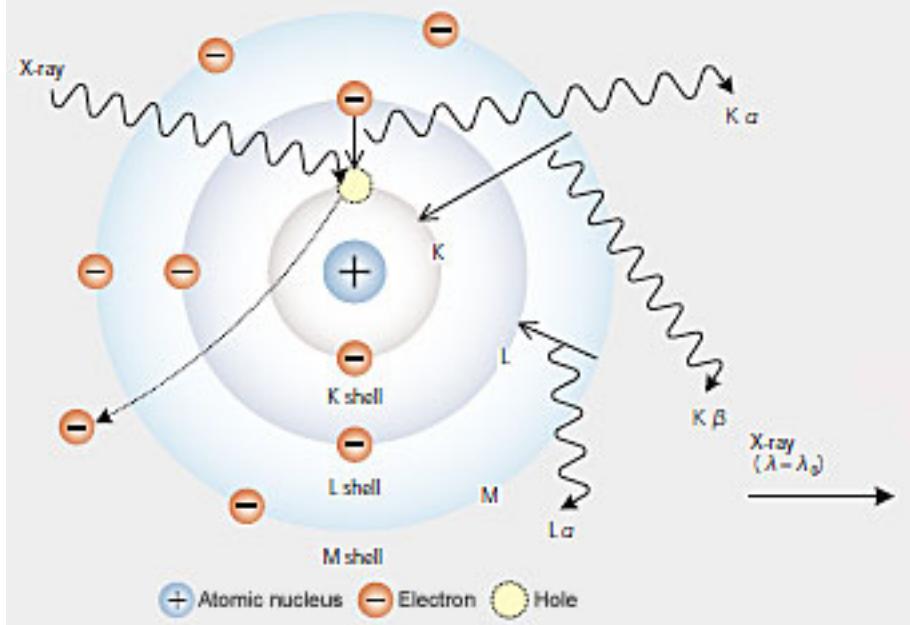


$N_1 = 10$   
*There are high peaks in  $I(S)$  when  $(\mathbf{S} \cdot \mathbf{a}^*)$  - integer*

$N \rightarrow \infty$

$$I \sim N_1^2 \cdot \delta(\mathbf{S} \cdot \mathbf{n} \cdot \mathbf{a}^*)$$

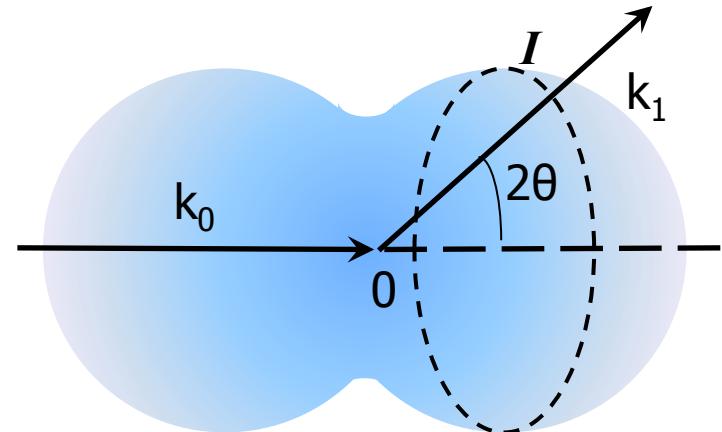
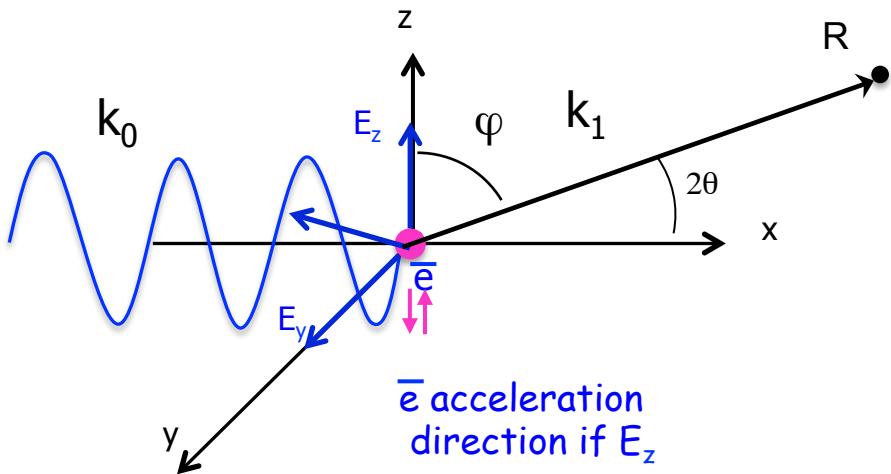
# Characteristic X-ray lines



Anode	$K\alpha$	$K\beta$
Cu	1.54184 Å	1.39222 Å
Mo	0.71073 Å	0.63229 Å

# Elementary scattering

Scattering intensity distribution

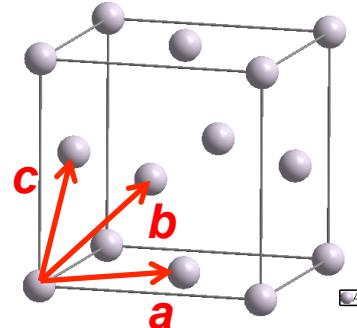
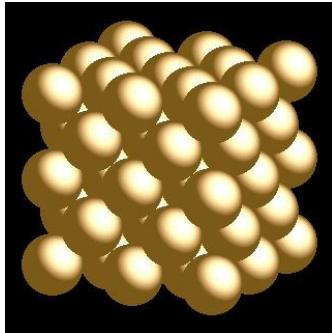


Thomson scattering formula

$$I = I_{00} e^{14} / r^{12} m^{12} c^{14} (1 + \cos^2 2 \theta / 2)$$

# X-ray scattering physics

X-ray scattering by crystalline (periodic) ensemble of atoms



$$\mathbf{R}_{mnp} = m\mathbf{a} + n\mathbf{b} + p\mathbf{c}$$

Periodic arrangement of atoms is given by lattice with the basis vectors  $\mathbf{a}, \mathbf{b}, \mathbf{c}$

$$\text{Scattering amplitude } A(\mathbf{S}) = A_e \sum f_j e^{-i2\pi(\mathbf{S} \cdot \mathbf{R}_j)} = -A_e f \sum e^{i2\pi(\mathbf{S} \cdot \mathbf{R}_{mnp})}$$

In general  $A(\mathbf{S}) \sim 0$  for infinite crystal, i.e.  $m, n$  and  $p \rightarrow \infty$

But if  $(\mathbf{S} \cdot \mathbf{R}_{mnp}) = (\mathbf{S} \cdot \mathbf{a})m + (\mathbf{S} \cdot \mathbf{b})n + (\mathbf{S} \cdot \mathbf{c})p = q$  – integer

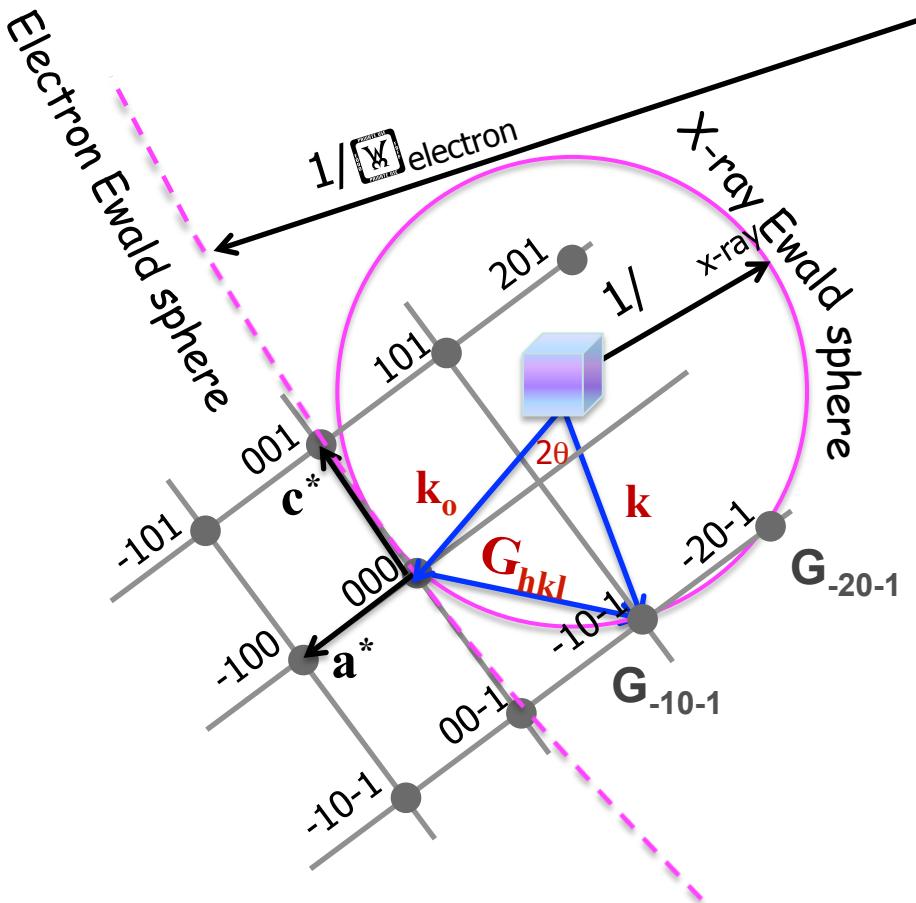
then  $e^{i2\pi(\mathbf{S} \cdot \mathbf{R}_{mnp})} = 1$  and  $|A(\mathbf{S})| = N A_e f(s)$ ,  $N$  – number of atoms,

There is the only solution:  $\mathbf{S} = \{\mathbf{G}_{hkl}\} = \{h\mathbf{a}^* + k\mathbf{b}^* + l\mathbf{c}^*\}$

with  $\mathbf{a}^* = [\mathbf{b} \times \mathbf{c}] / V$ ,  $\mathbf{b}^* = [\mathbf{c} \times \mathbf{a}] / V$ ,  $\mathbf{c}^* = [\mathbf{a} \times \mathbf{b}] / V$ ,  $V = (\mathbf{a} \cdot [\mathbf{b} \times \mathbf{c}])$

# Ewald construction

Space of wave vectors - Ewald construction

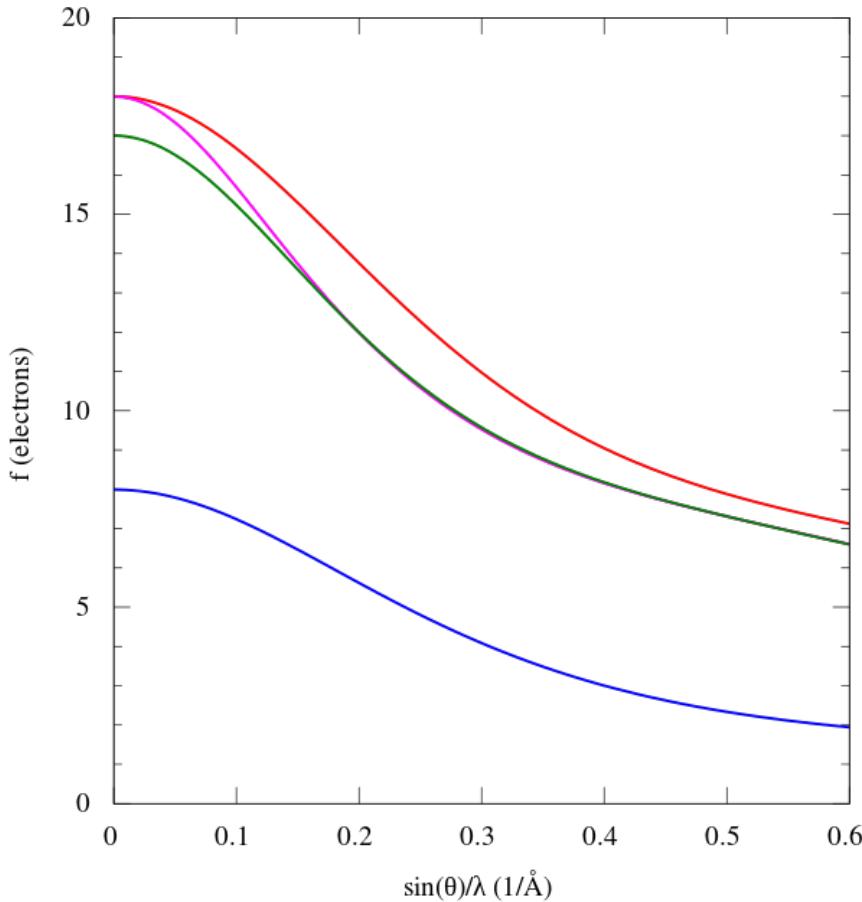


$$\mathbf{G}_{hkl} = h\mathbf{a}^* + k\mathbf{b}^* + l\mathbf{c}^*$$

$$|\mathbf{G}_{hkl}| = 2|\mathbf{k}| \sin \theta$$



# Atomic scattering factor



O, z=8, atomic radius =0.66

Cl, z=17, atomic radius=1

Cl-, z=18, radius= 1.81

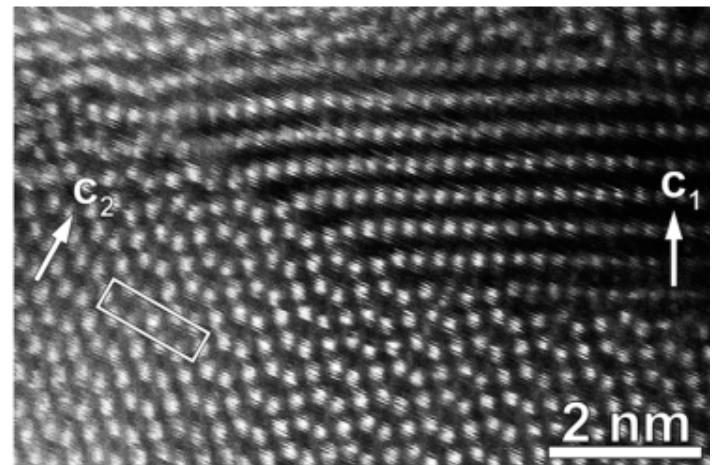
K, z = 19, atomic radius=2.02

K+ =18, radius= 1.33

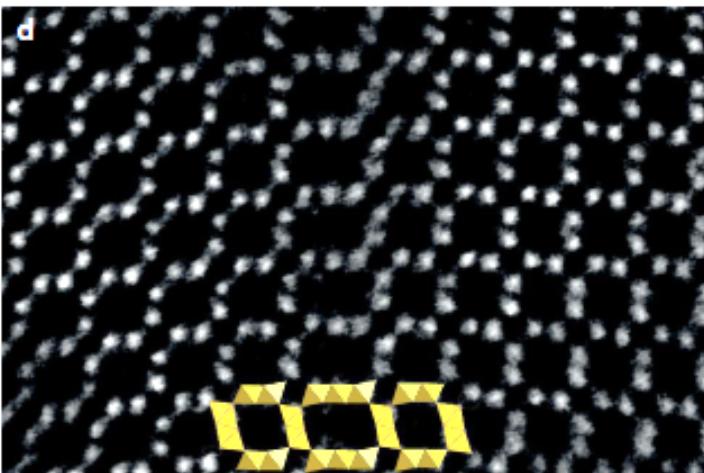
X-ray atomic factors of O, Cl , Cl- and K<sup>+</sup> ; smaller charge distributions have a wider atomic factor.

# Structural flexibility

HAADF of LiRhO<sub>2</sub>



HAADF of  $\text{W}-\text{MnO}_2$



Daria Mikhailova et al., Inorg. Chem. 2016, 55,  
7079–7089

Grangeon et al. Geochem Trans (2015) 16:12

