

# Disordered Materials:

## Lecture II

*Finding and refining a structural  
model*

*Alan Soper*

*Disordered Materials Group*

*ISIS*

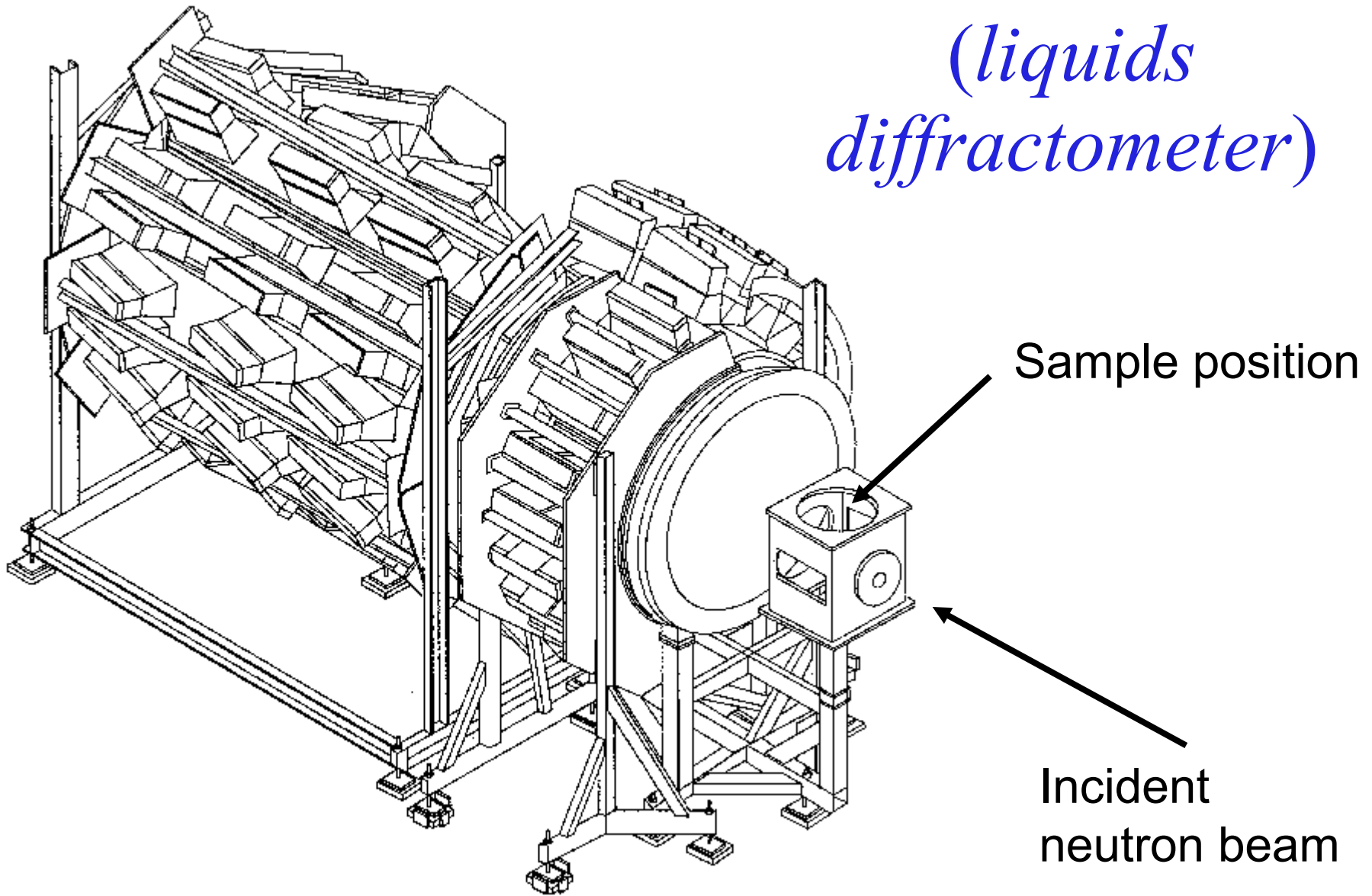
# *Summary of Lecture I*

- Discussion of disorder in our world.
- Concept of correlation in disordered systems.
- Use of radial distribution function to characterise the correlations in a disordered system.
- Use of diffraction to count atoms as a function of distance.
- How to characterise structure in molecular systems:
  -

# *Summary of lecture II*

- Extracting the structure factor from the diffraction experiment.
- Computer simulation as a tool to model disordered materials
- Molecular systems:
  - SDF, bond angle distributions, OPCF
- Use of computer simulation to go from measurements ( $D(Q)$ ,  $g(r)$ ) to SDF, bond angle distribution, OPCF, etc.
- Some case studies: molten alumina, water, amorphous phosphorus, silica, silicon...

*ISIS SANDALS*  
(*liquids*  
*diffractometer*)



# The liquid structure factor:

The partial structure factors,  $H_{\alpha\beta}(Q)$

The site-site radial distribution functions,  $g_{\alpha\beta}(r)$

$$F_d(Q) = \sum_{\alpha, \beta \geq \alpha} (2 - \delta_{\alpha\beta}) c_\alpha c_\beta b_\alpha b_\beta \left\{ 4\pi\rho \int r^2 (g_{\alpha\beta}(r) - 1) \frac{\sin Qr}{Qr} dr \right\}$$

Atomic fraction of component “ $\alpha$ ”

The atom scattering factor or “form factor”

*A much more tricky question:  
how do we interpret the data?*

- For many years the next step was to simply invert our scattering equation:

$$\begin{aligned} d(r) &= \frac{1}{2\pi^2 \rho} \int_0^\infty Q^2 D(Q) \frac{\sin Qr}{Qr} dQ \\ &= \sum_{\alpha, \beta \geq \alpha} \left( 2 - \delta_{\alpha\beta} \right) c_\alpha c_\beta b_\alpha b_\beta \left( g_{\alpha\beta}(r) - 1 \right) \end{aligned}$$

## *This leads to many problems*

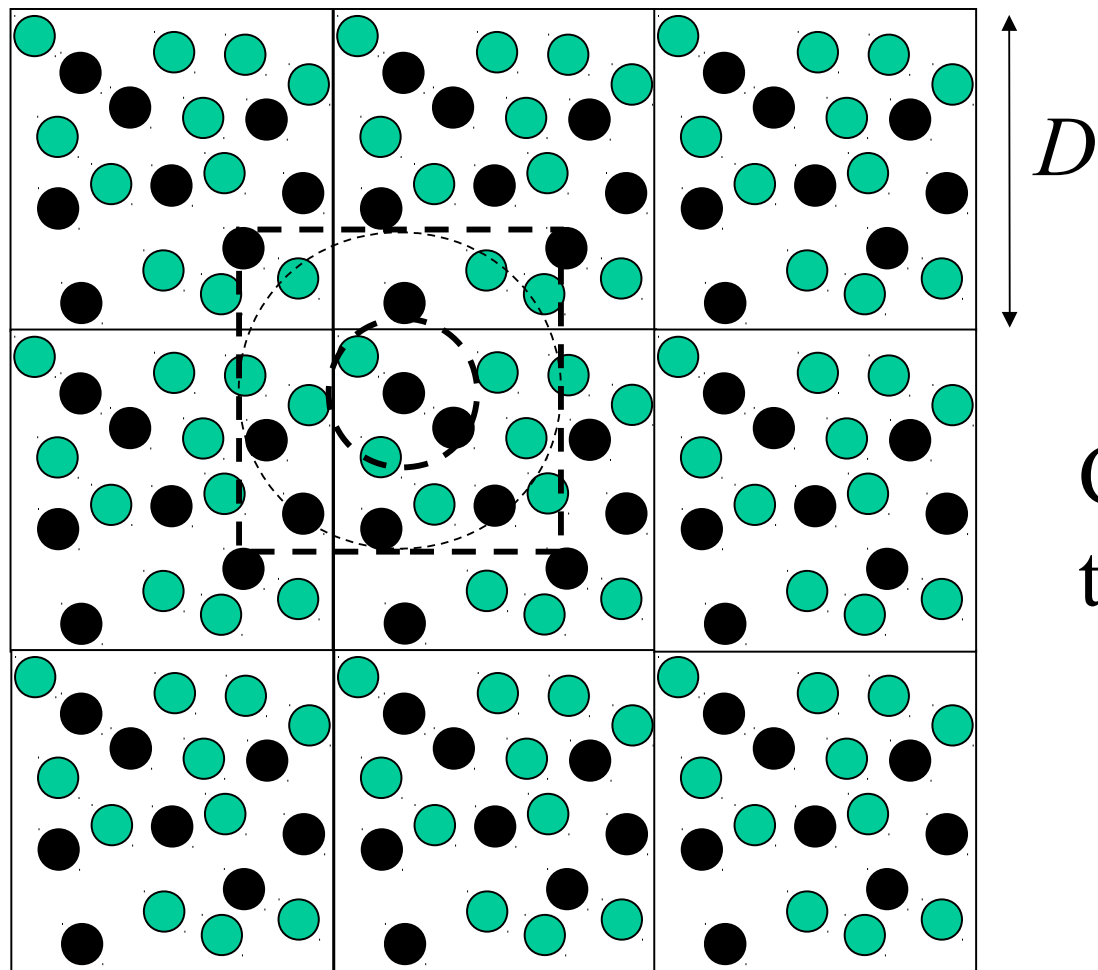
- Truncation errors.
- Systematic errors.
- Finite measuring statistics.
- Some site-site terms are more strongly weighted than others.
- These all make interpretation of the data unreliable.
- Radial distribution functions ( $g(r)$ ) do not yield the Orientational Pair Correlation Function (OPCF).

## *Introduce: computer simulation*

- Requires an atom-atom potential energy function.
- Place computer atoms in a (parallelepiped) box at same density as experiment.
- Apply periodic boundary conditions
  - the box repeats itself indefinitely throughout space.
- Apply minimum image convention.



# *Minimum image convention*



Count atoms out  
to  $D/2$

# *Monte Carlo computer simulation*

1. Using the specified atom-atom potential function, calculate energy of atomic ensemble.
2. Displace one atom or molecule by a random amount in the interval  $\pm\delta$ .
3. Calculate change in energy of ensemble,  $\Delta U$ .
4. Always accept move if  $\Delta U < 0$
5. If  $\Delta U > 0$ , accept move with probability  $\exp[-\Delta U/kT]$ .
6. Go back to 2 and repeat sequence.

*But there is a problem:*

We don't know the potential energy  
function!

# *Introduce Reverse Monte Carlo, RMC*

1. Build a box of atoms as before. Calculate  $\chi^2 = [D(Q) - F(Q)]^2 / \sigma^2$
2. Displace one atom or molecule by a random amount in the interval  $\pm\delta$ .
3. Calculate change in  $\chi^2$  of ensemble,  $\Delta\chi^2$ .
4. Always accept move if  $\Delta\chi^2 < 0$
5. If  $\Delta\chi^2 > 0$ , accept move with probability  $\exp[-\Delta\chi^2]$ .
6. Go back to 2 and repeat sequence.

*This approach has problems,  
particularly with molecules.*

- Molecules are usually introduced via unphysical coordination constraints.
- Especially with molecules the ensemble of atoms can get “stuck” i.e. it does not sample phase space correctly.
- Various reasons why this can occur.

# *Introduce Empirical Potential Structure Refinement, EPSR*

- Use harmonic constraints to define molecules.
- Use an existing “reference” potential for the material in question taken from the literature (or generate your own if one does not exist).
- Use the diffraction data to perturb this reference potential, so that the simulated structure factor looks like the measured data.

## Introducing the data

$$F(Q) = \sum_{\alpha, \beta \geq \alpha} (2 - \delta_{\alpha\beta}) c_{\alpha} c_{\beta} b_{\alpha} b_{\beta} H_{\alpha\beta}(Q)$$

- $M$  measured datasets,  $N$  partial structure factors: (Usually  $M < N$ )
- Assign a “feedback” factor  $f$  for the data:

$$w'_{ij} = f w_{ij}, \quad 1 \leq i \leq M$$

- and  $(1 - f)$  for the simulation:

$$w'_{ij} = (1 - f) \delta_{(i-M),j}, \quad M < i \leq M+N$$

- Form inversion of  $w'_{ij}, 1 \leq i \leq M+N, 1 \leq j \leq N$

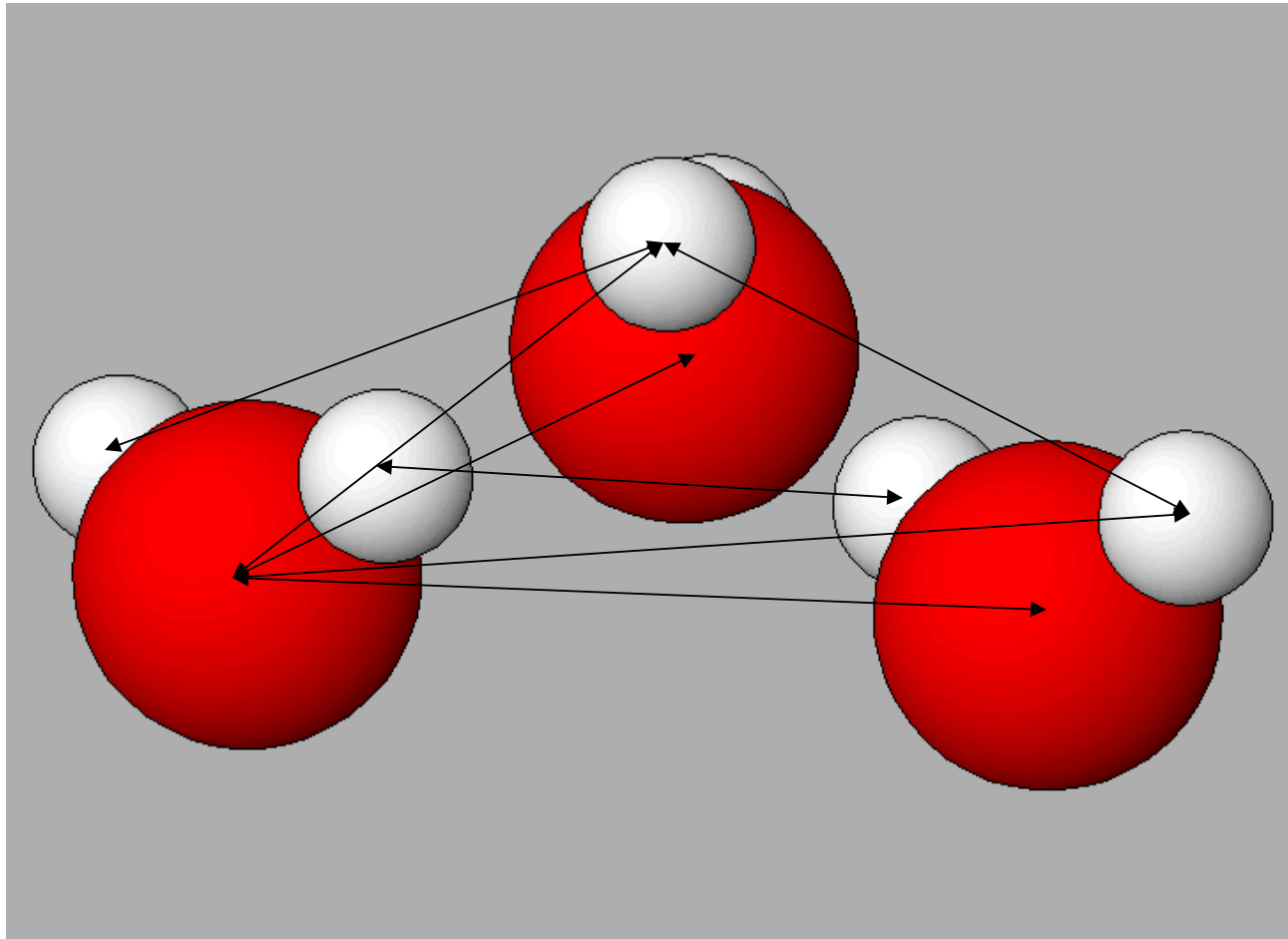
# *Refining the potential: $M$ datasets, $N$ partial structure factors*

$$F_{i(=1, M+N)}(\mathcal{Q}) = \begin{array}{c} \text{Data} \\ \dots \\ \text{Simulation} \end{array} \begin{array}{cccccccc} fw_{11} & fw_{12} & \dots & & \dots & & fw_{1N} \\ fw_{21} & fw_{22} & \dots & & \dots & & fw_{2N} \\ \dots & \dots & & & & & \dots \\ \dots & \dots & & & & & \dots \\ fw_{M1} & fw_{M2} & & & & & fw_{MN} \\ (1-f) & 0.0 & 0.0 & \dots & & \dots & 0.0 \\ 0.0 & (1-f) & 0.0 & \dots & & \dots & \dots \\ 0.0 & 0.0 & (1-f) & \dots & & & \dots \\ \dots & \dots & \dots & \dots & & & \dots \\ & & & \dots & & & \dots \\ & & & & \dots & & \dots \\ & & & & & \dots & \dots \\ \dots & & & & \dots & (1-f) & 0.0 & 0.0 \\ \dots & \dots & & & \dots & 0.0 & (1-f) & 0.0 \\ 0.0 & \dots & \dots & & \dots & 0.0 & 0.0 & (1-f) \end{array} \times \begin{array}{c} S_1 \\ S_2 \\ \dots \\ S_N \end{array}$$

$$\Delta U_j(r) = \text{Fourier Transform of } \left\{ \sum_{i=1, M} w'_{ij}^{-1} (D_i(\mathcal{Q}) - F_i(\mathcal{Q})) \right\}, \quad j=1, N$$



*What do we measure if there are molecules present?*



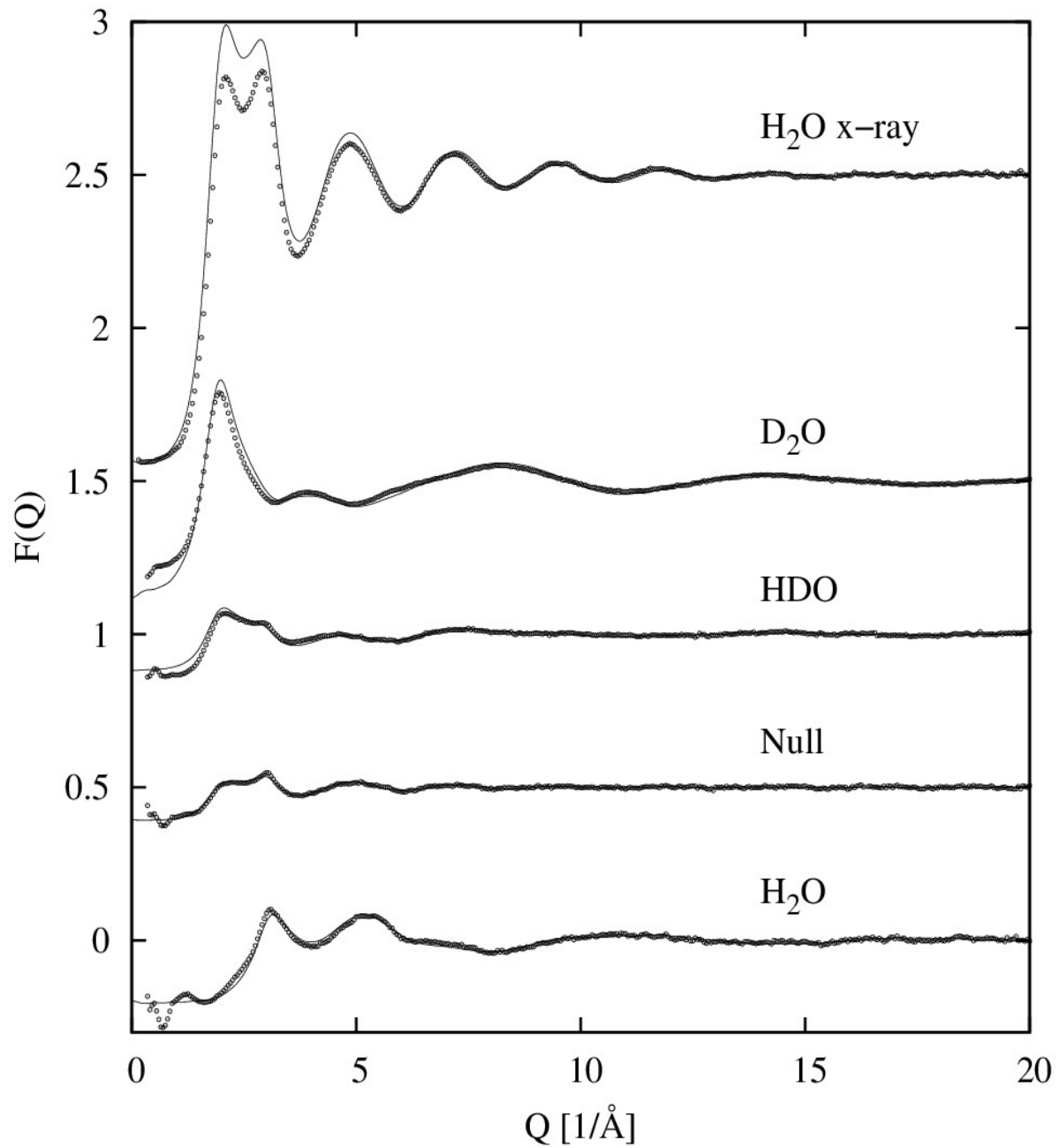
*However, two issues need to be addressed:-*

- *Issue 1: Often not possible to measure all partial structure factors.*
- *Issue 2: Even if we could, what do they mean?*

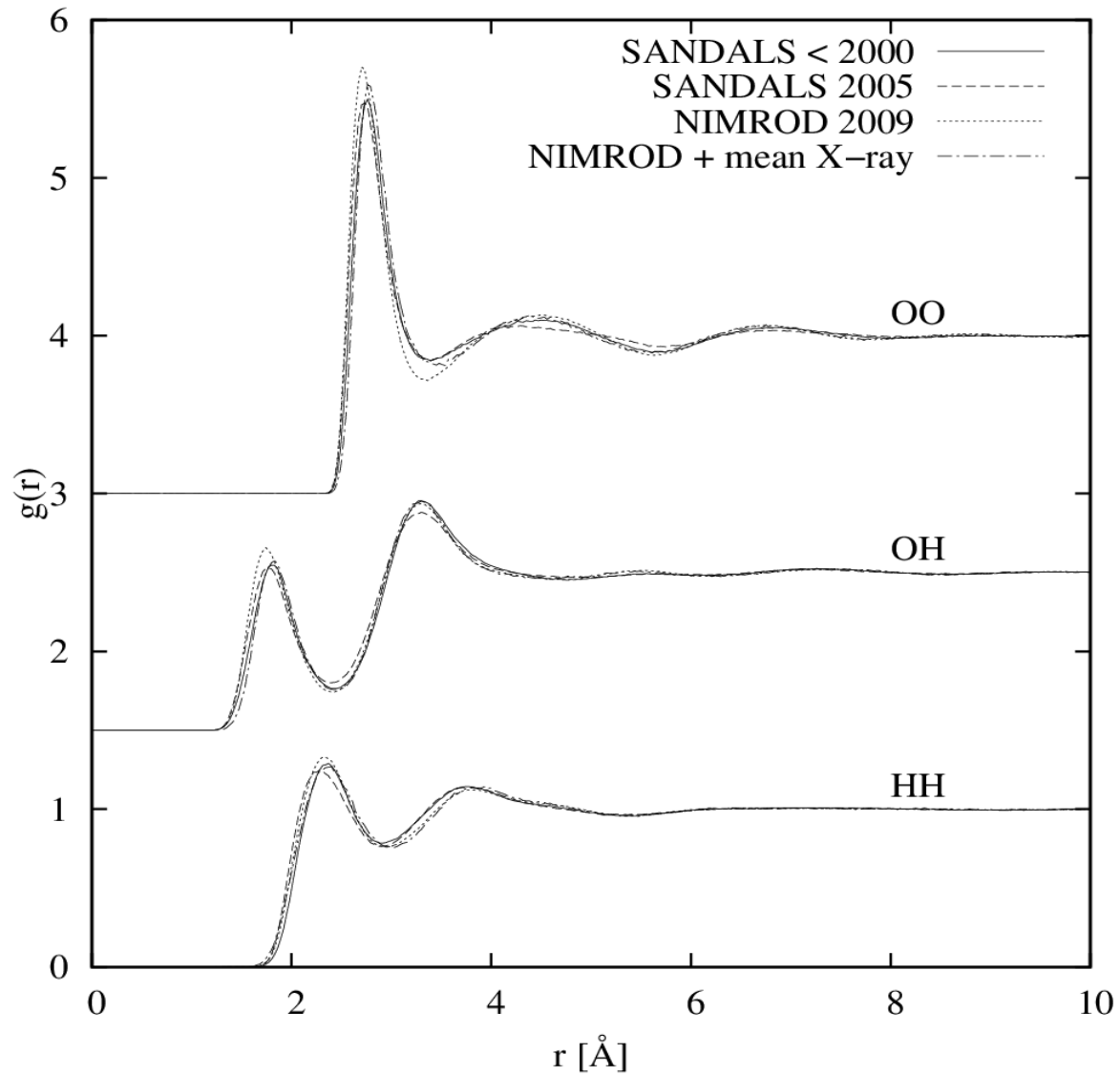
*Structure refinement of liquid  
water*

*Water  
data*

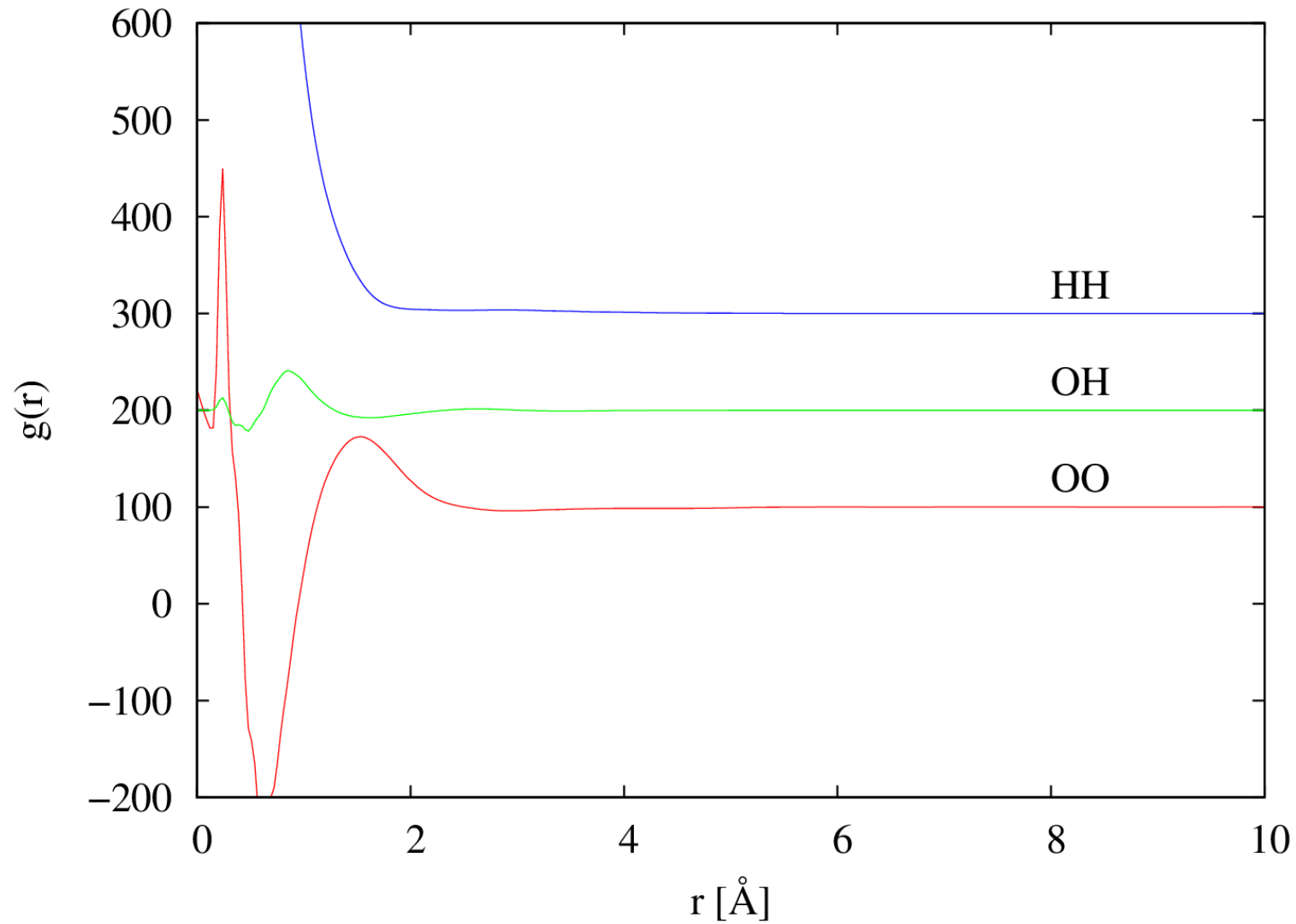
*After  
structure  
refinement*



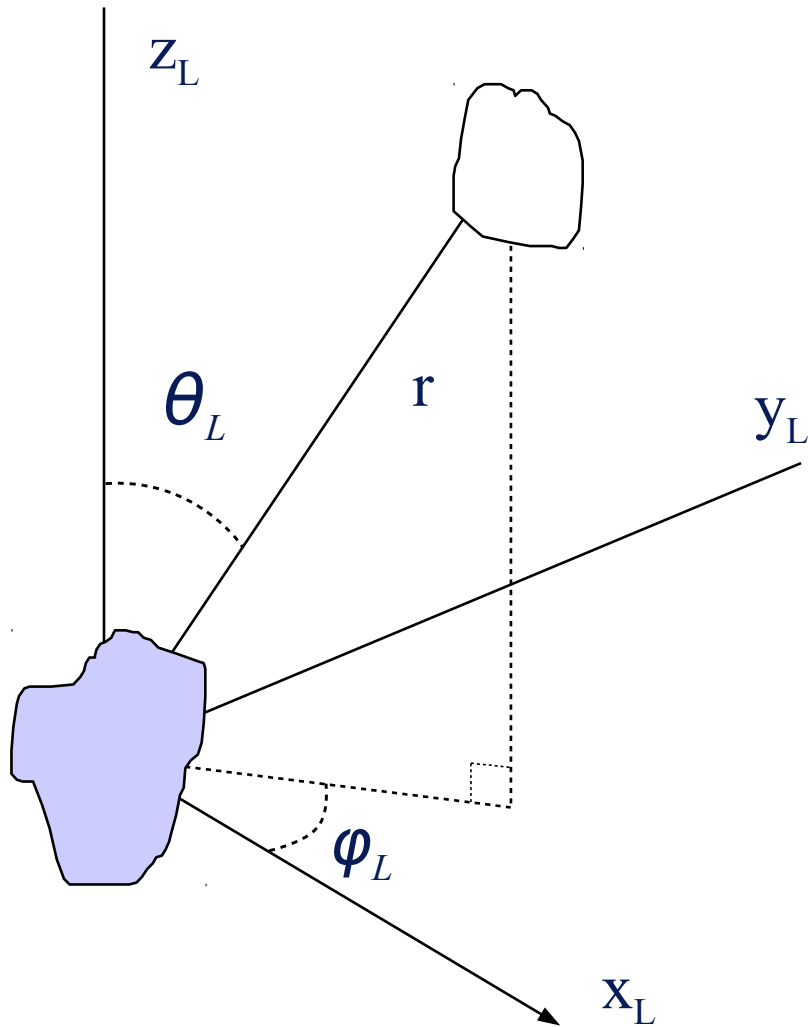
# *Water partial $g(r)$ 's*



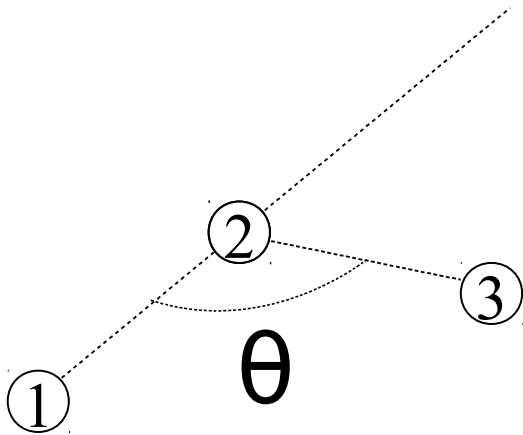
# *Water empirical potentials*



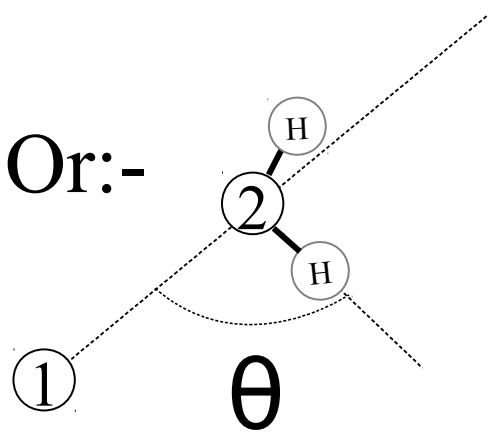
# *Beyond $g(r)$ : the spatial density function*



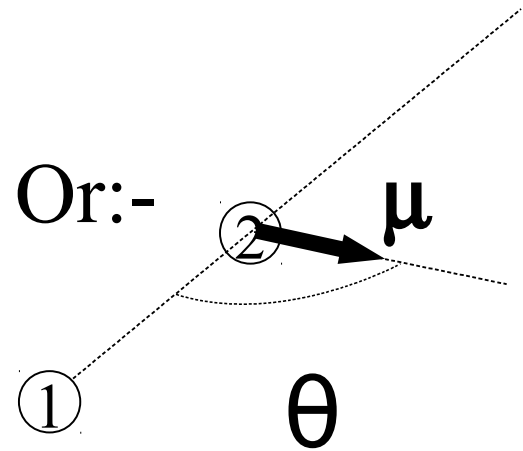
# *Bond angle distributions*



Or:-

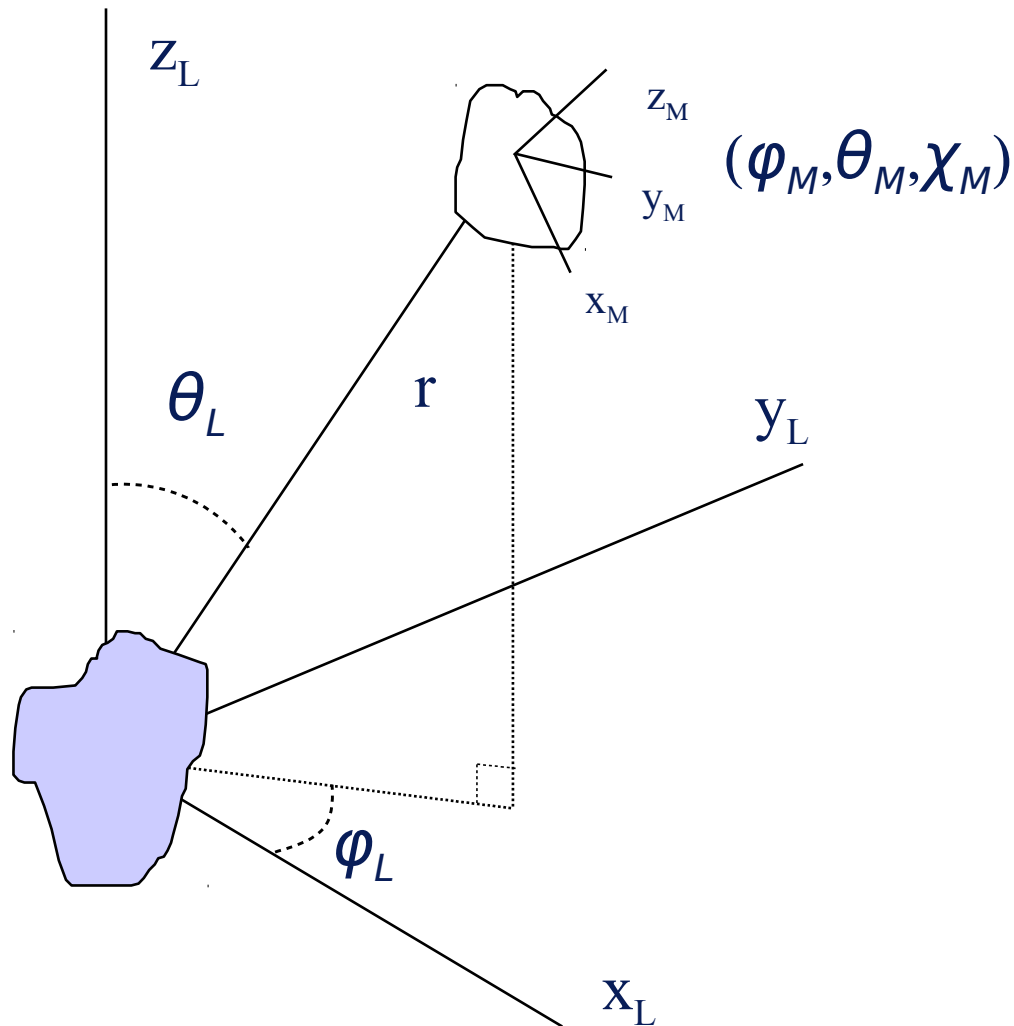


Or:-



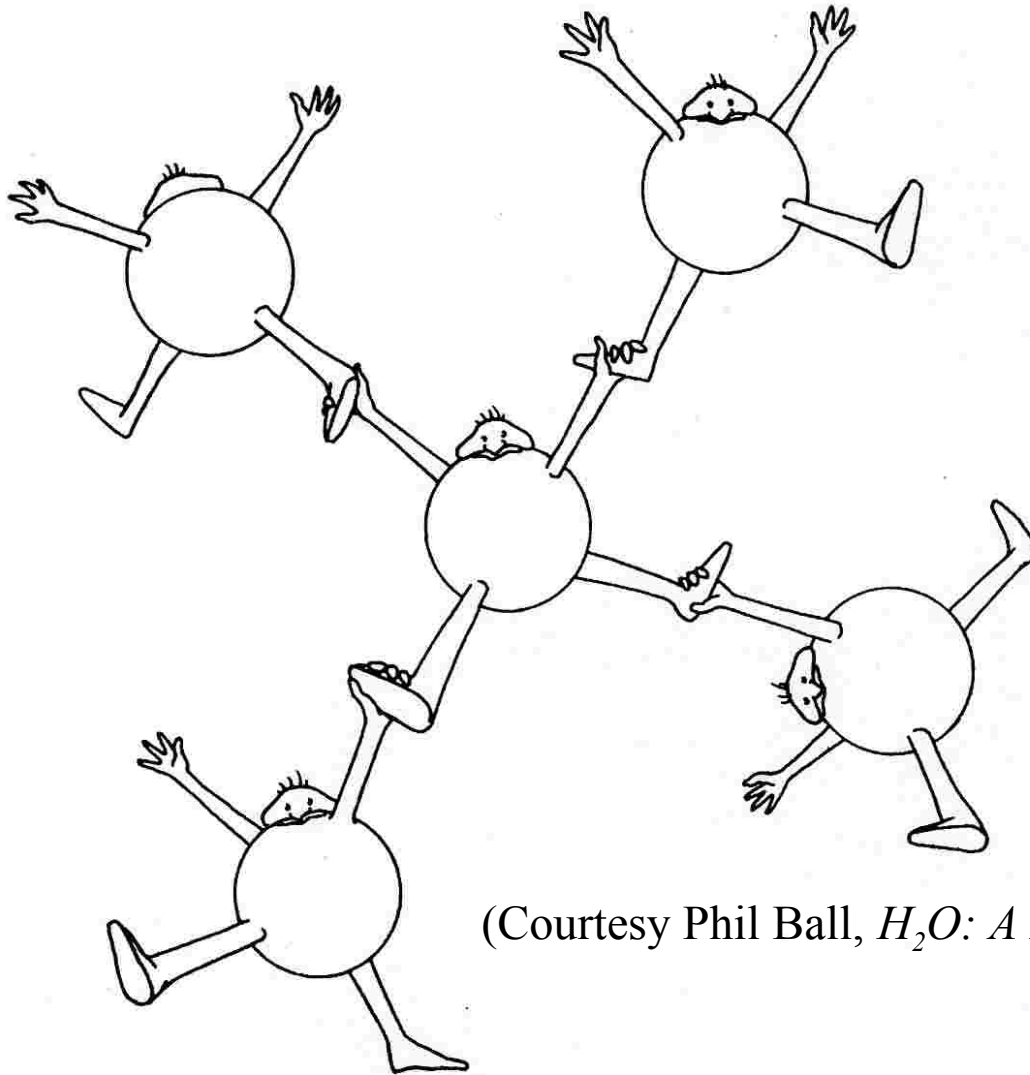


*A step further: the orientational pair correlation function*



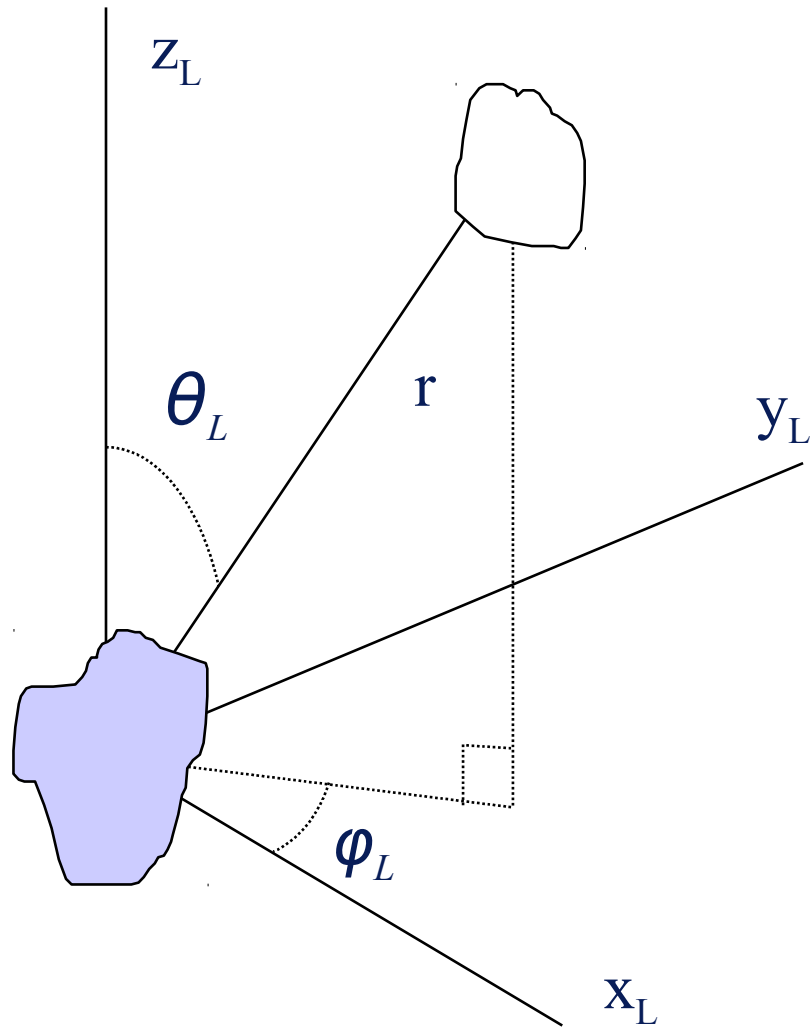
*The spatial density function of  
water...*

# *Water structure*



(Courtesy Phil Ball, *H<sub>2</sub>O: A Biography of Water*)

# *Beyond $g(r)$ : the spatial density function*

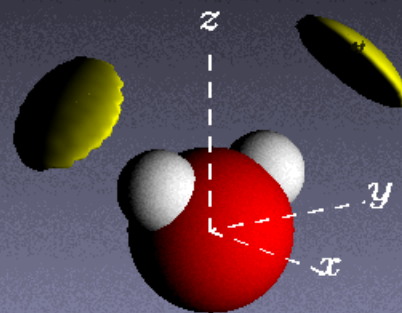
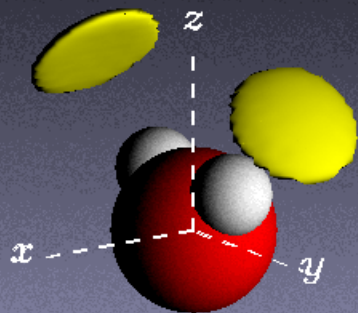


Choose distance range (0-5.7 Å)

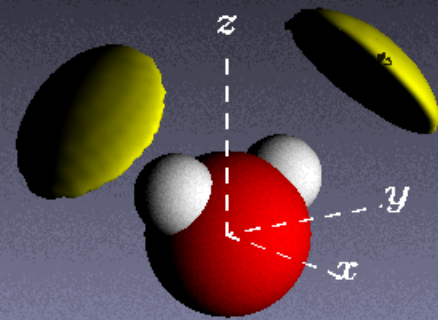
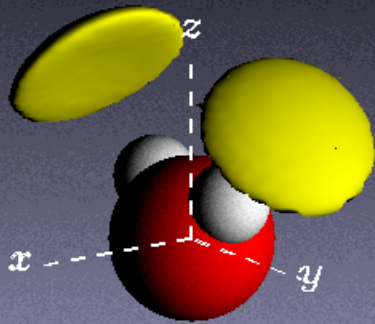
and a contour level

(% of all molecules in distance range)

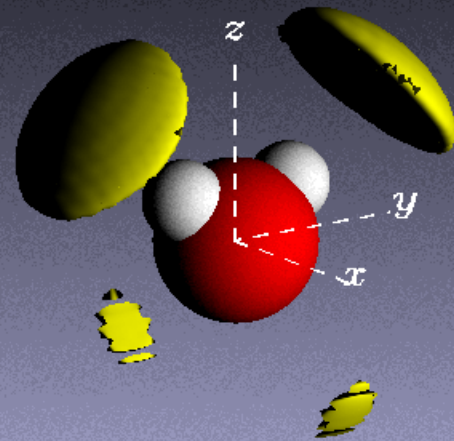
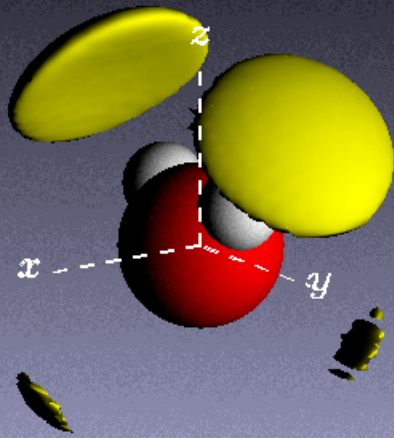
1%



2%

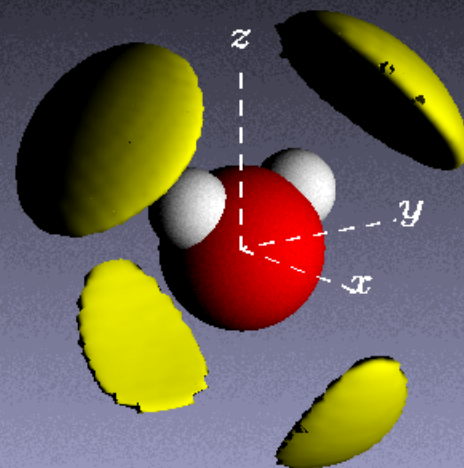
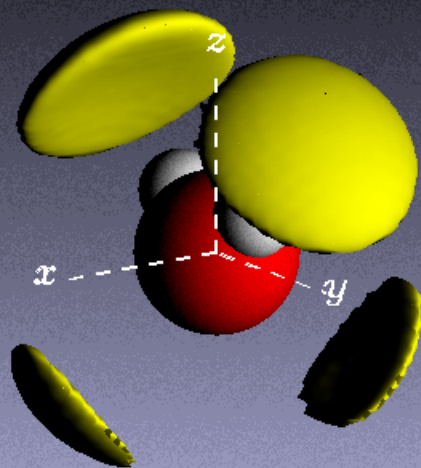


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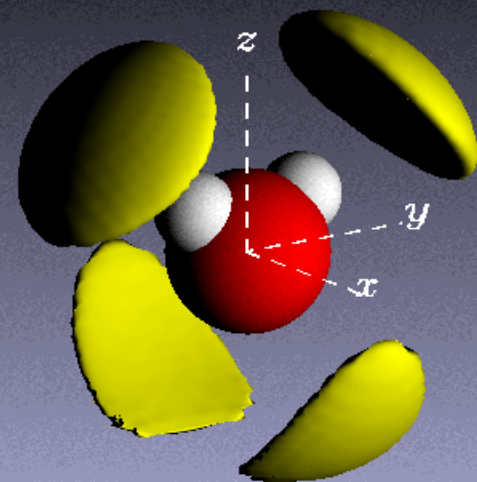
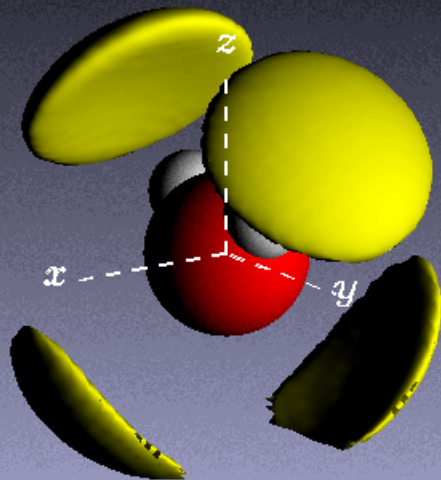




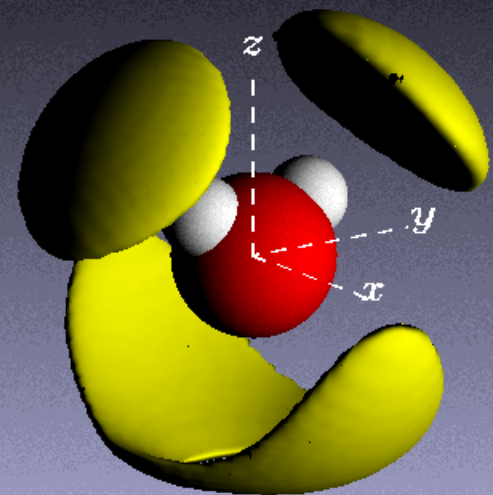
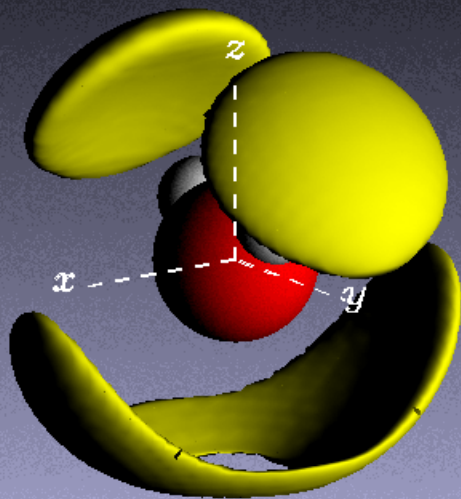
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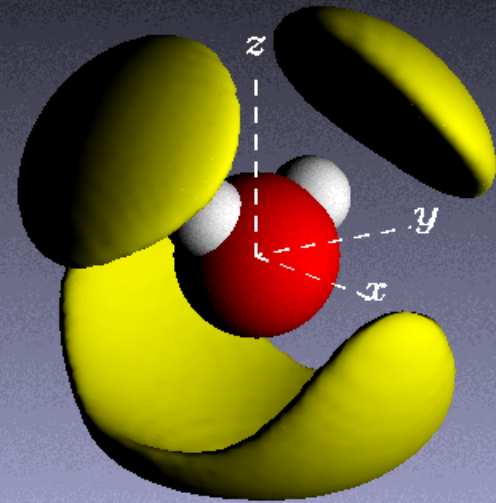
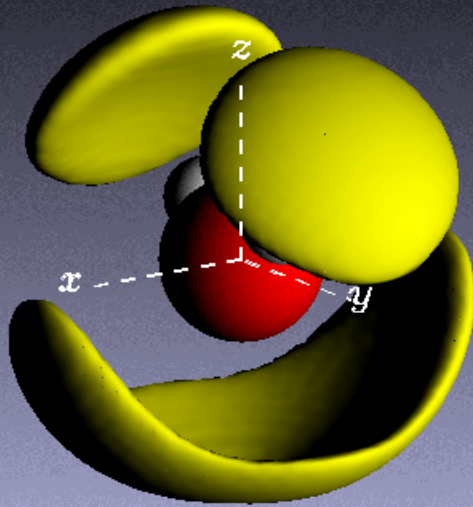
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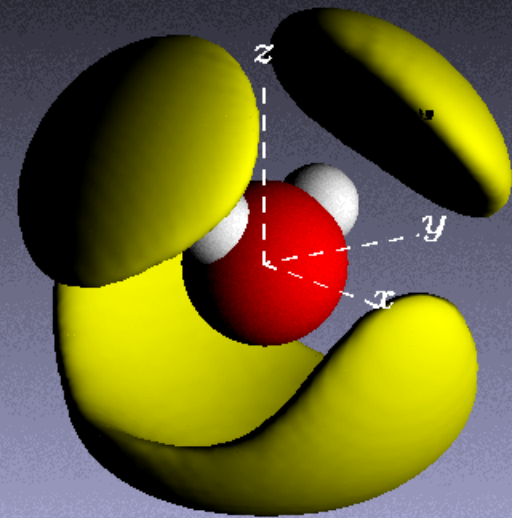
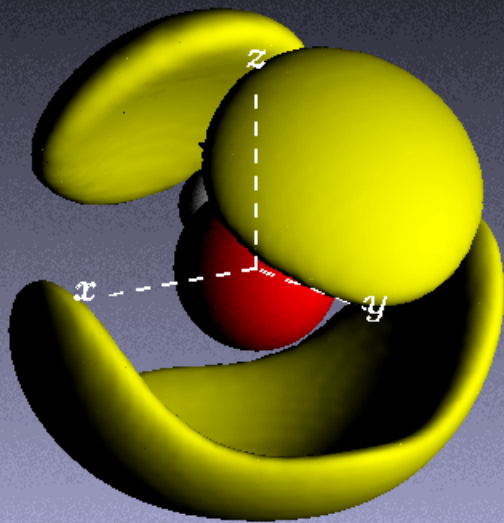
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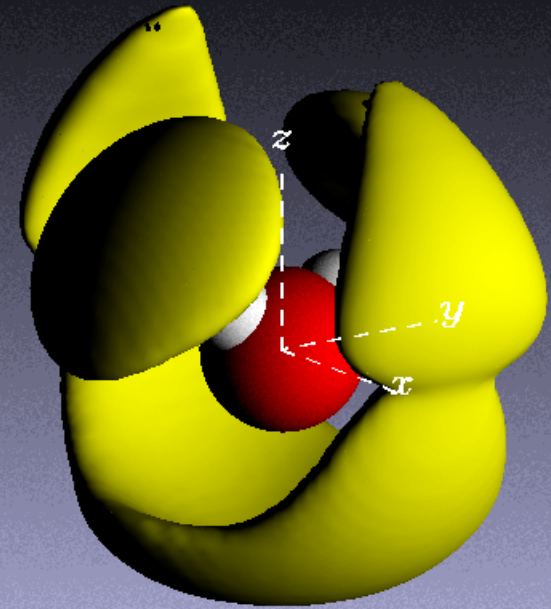
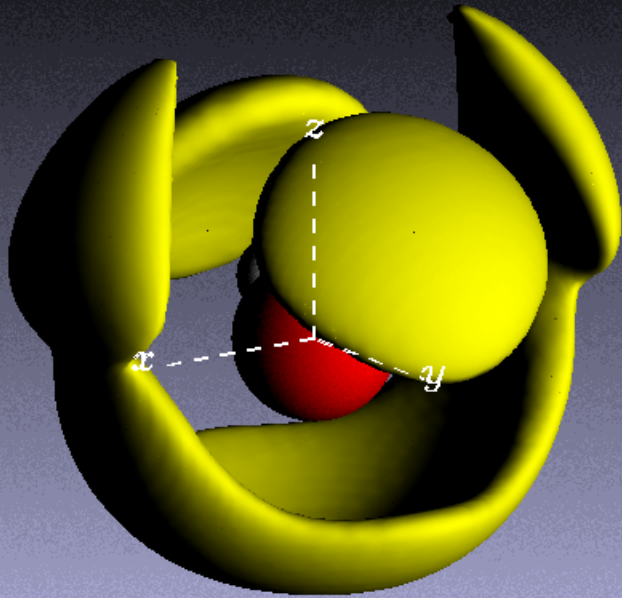
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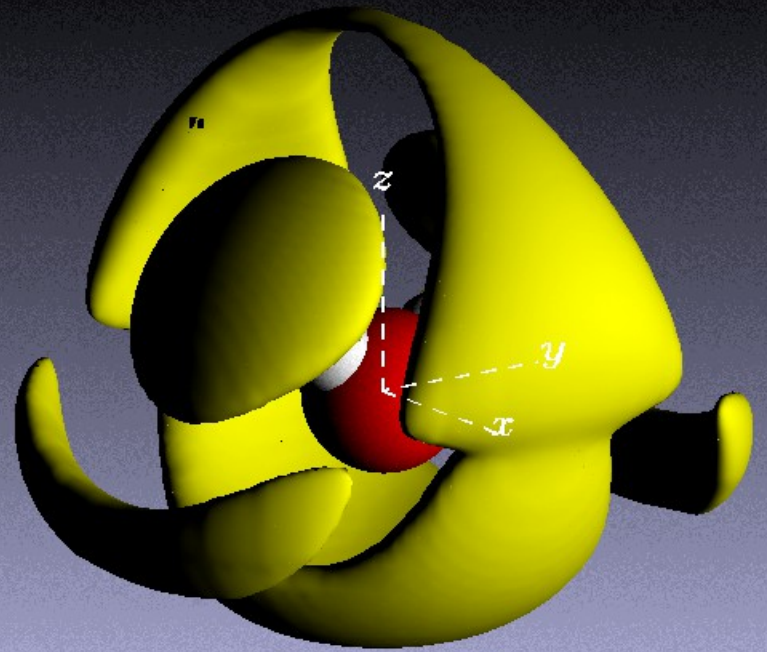
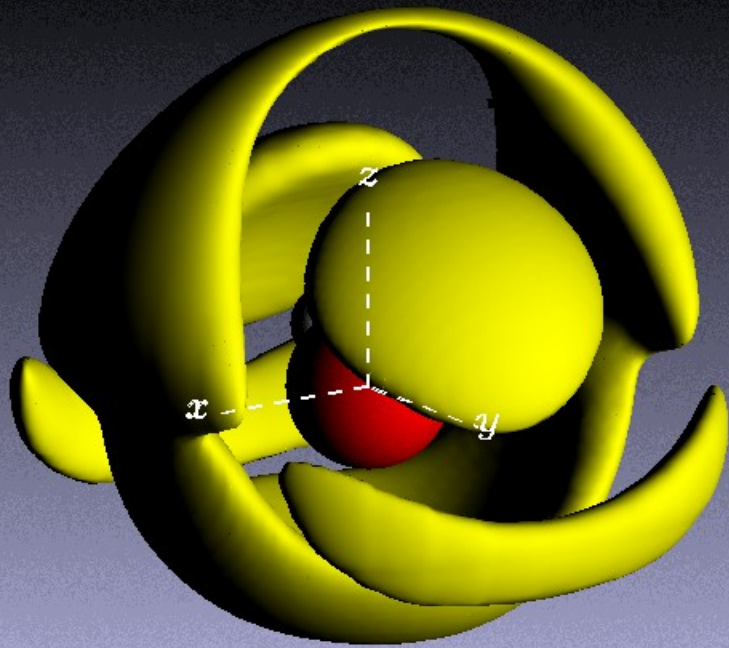
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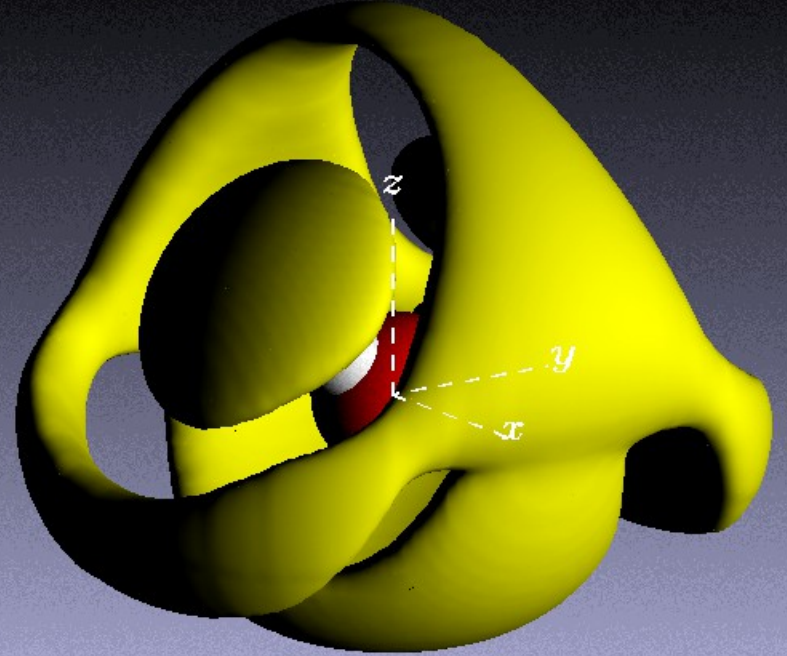
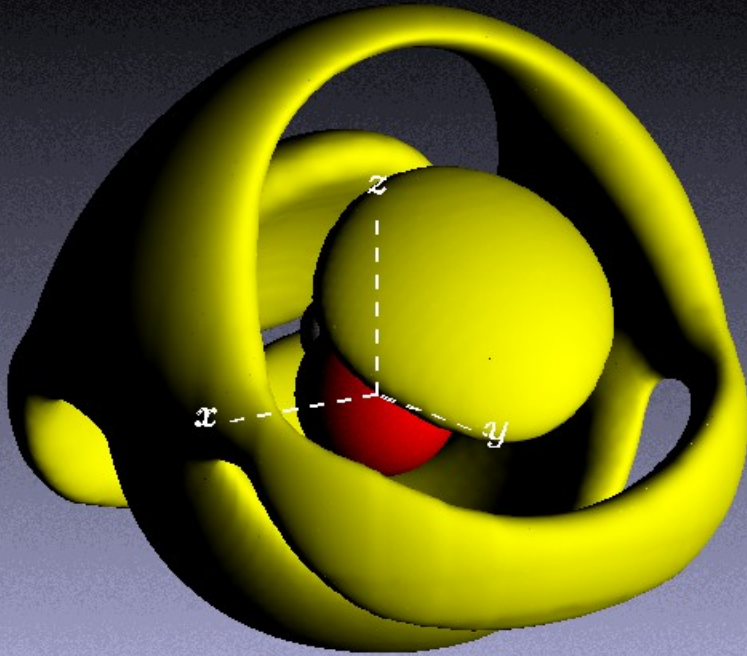
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18%

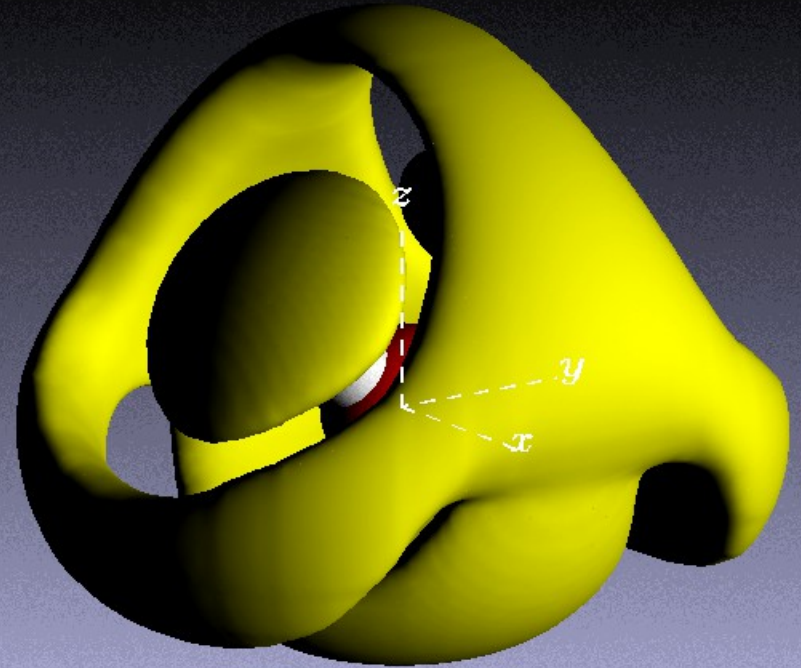
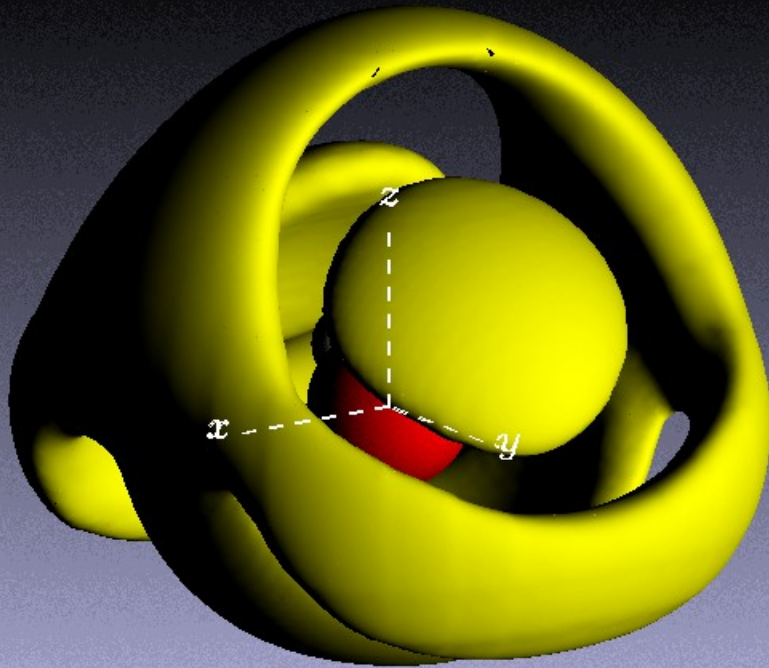


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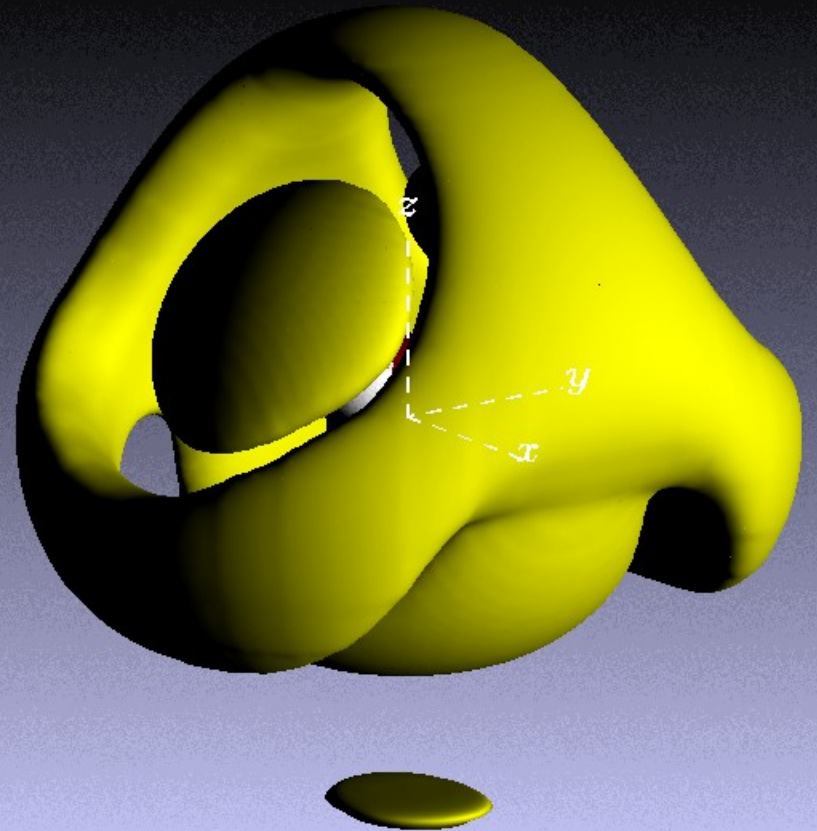
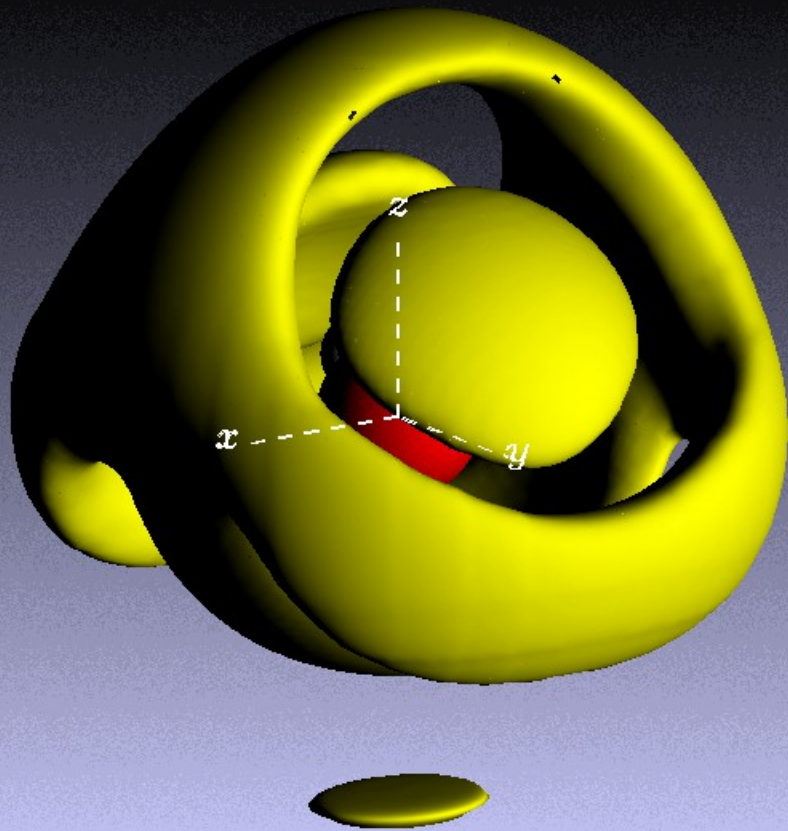




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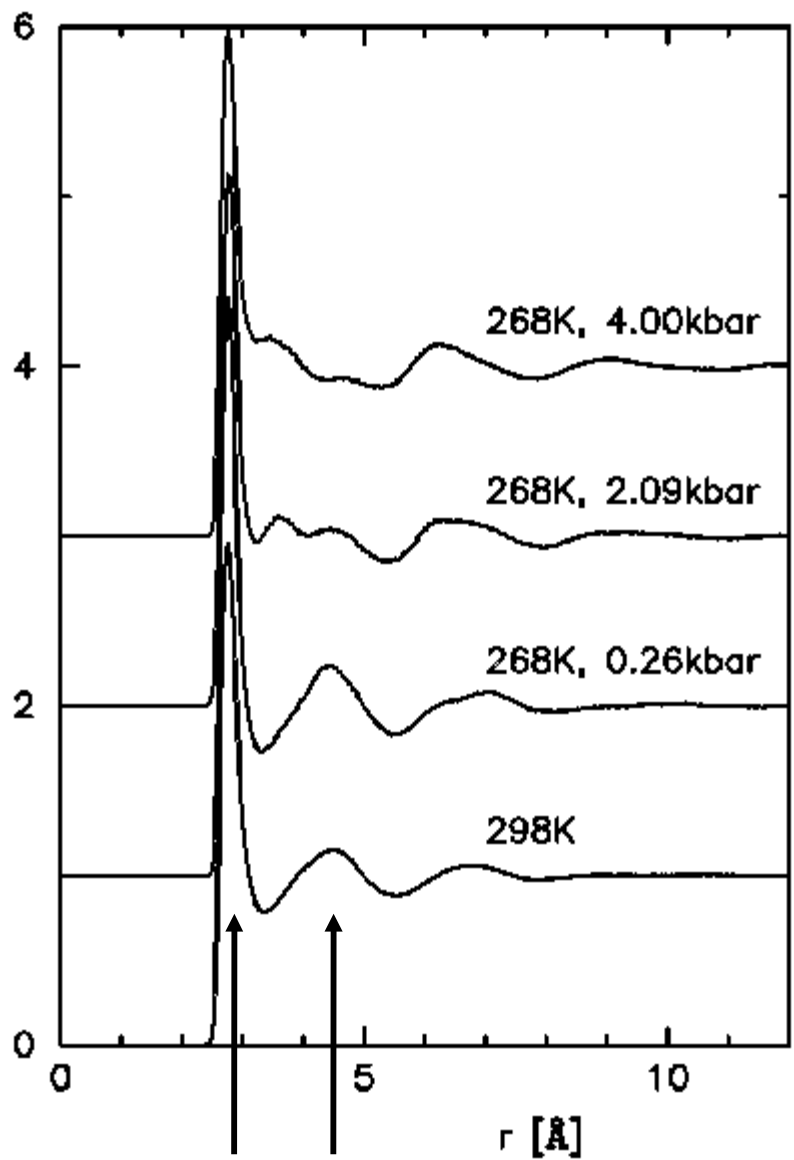


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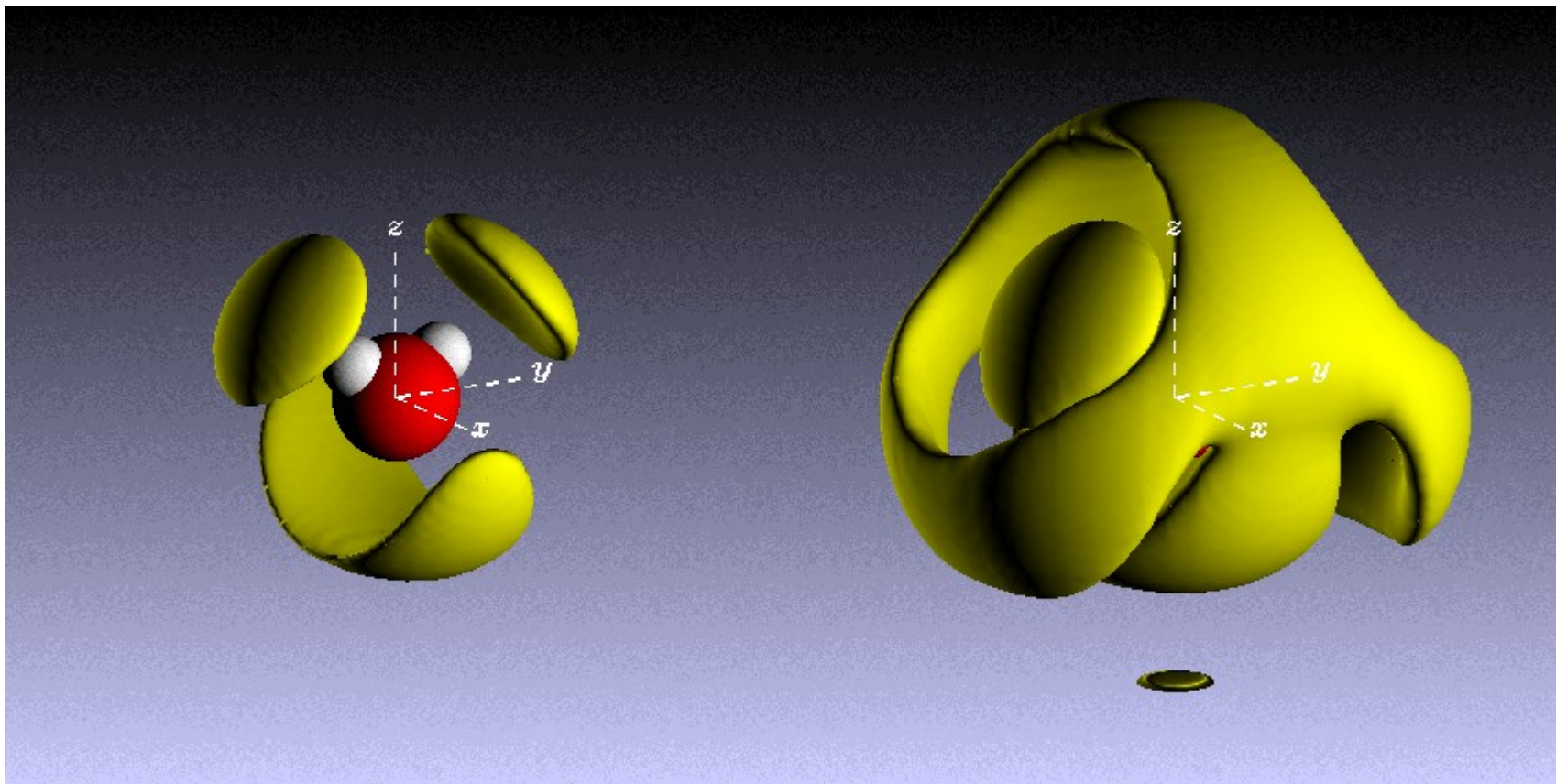


# *Water under pressure*

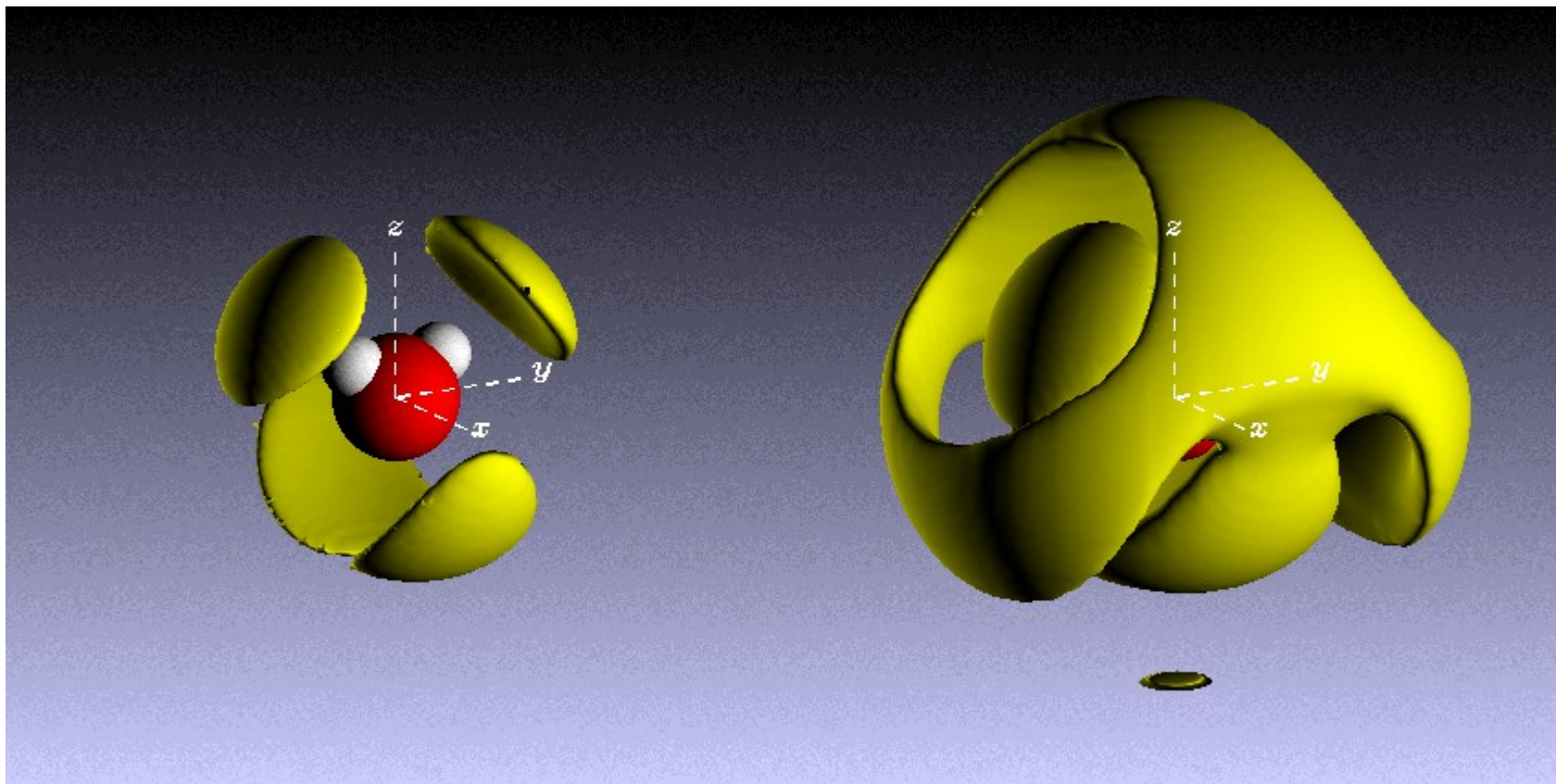
$g_{OO}(r)$ 's for water at 268K



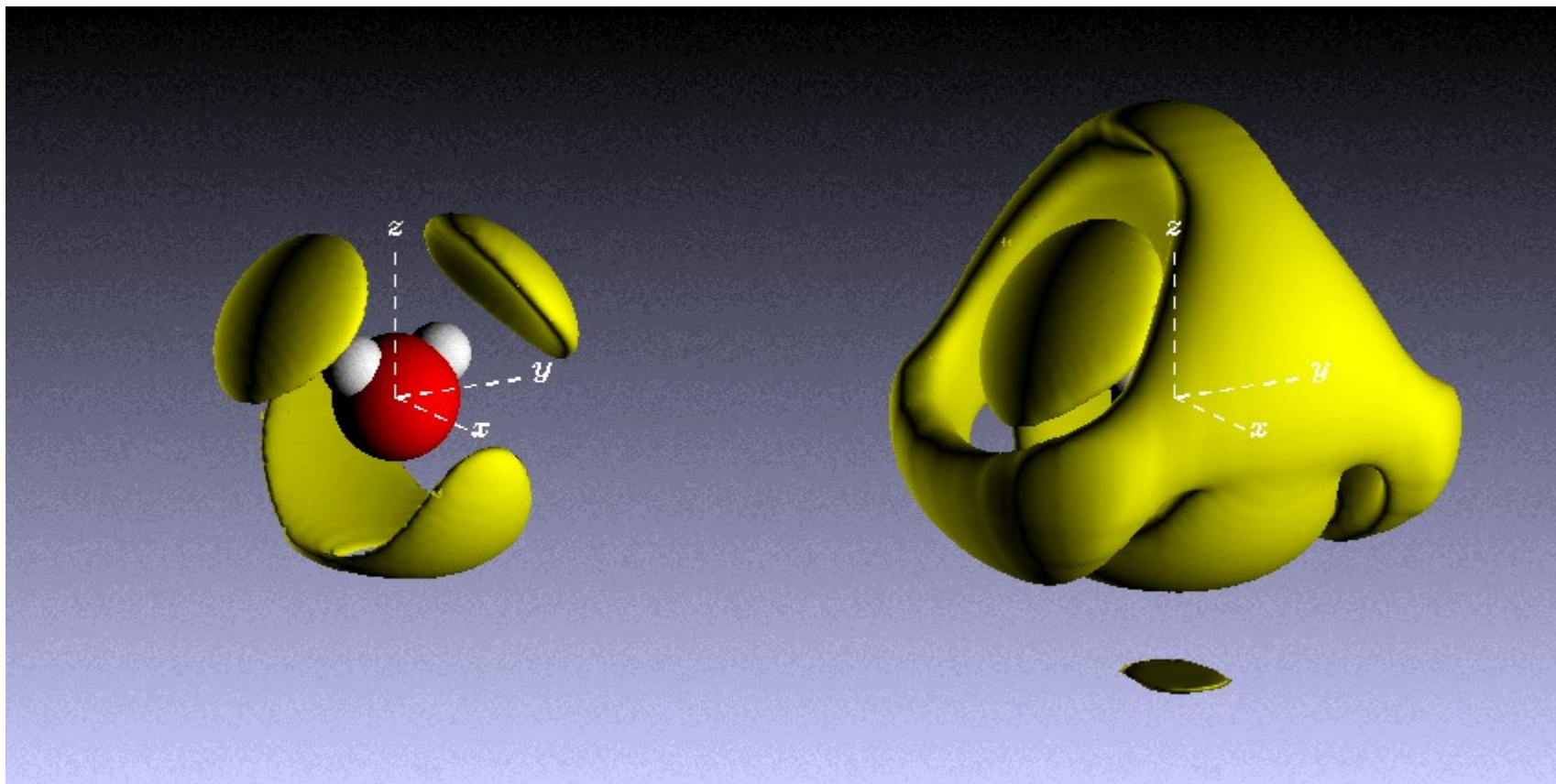
*Water at 298K, 0kbar*



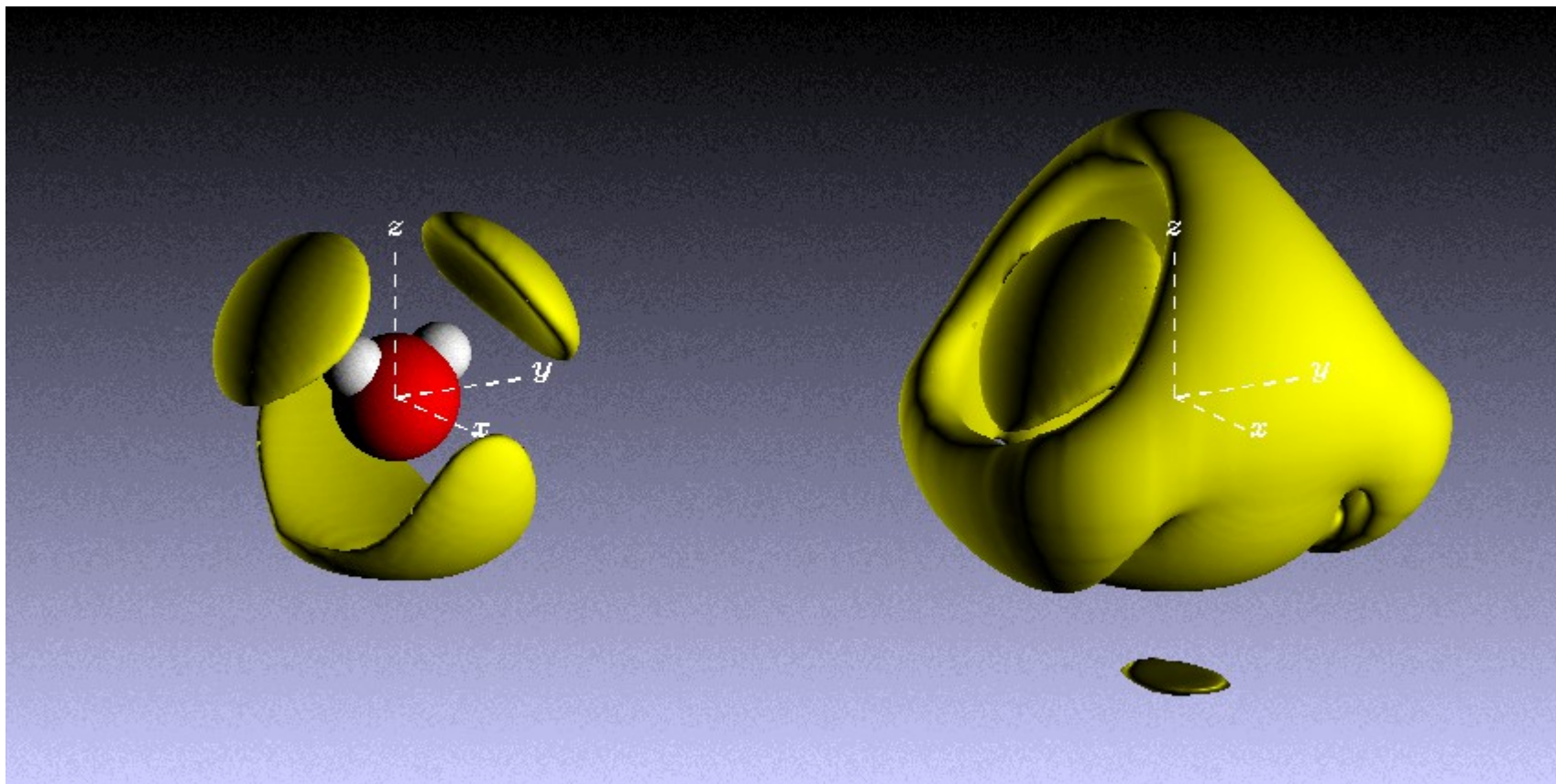
*Water at 268K, 0.26kbar*



*Water at 268K, 2.09kbar*

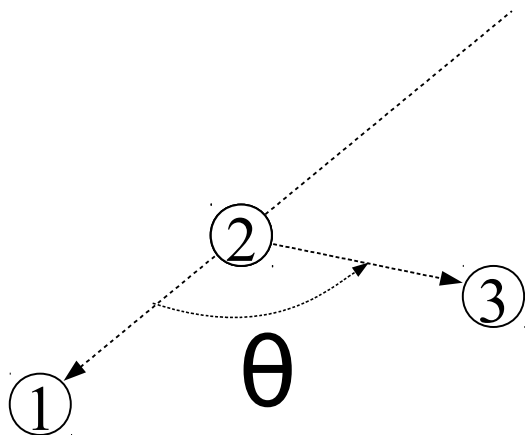


*Water at 268K, 4.00kbar*

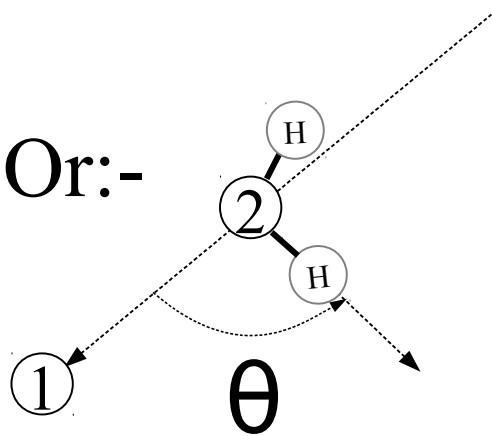




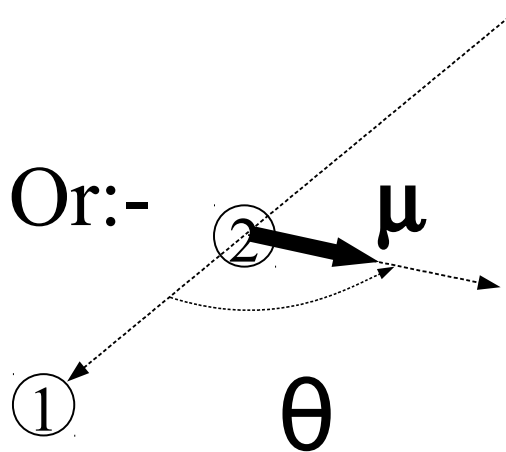
# *Bond angle distributions*



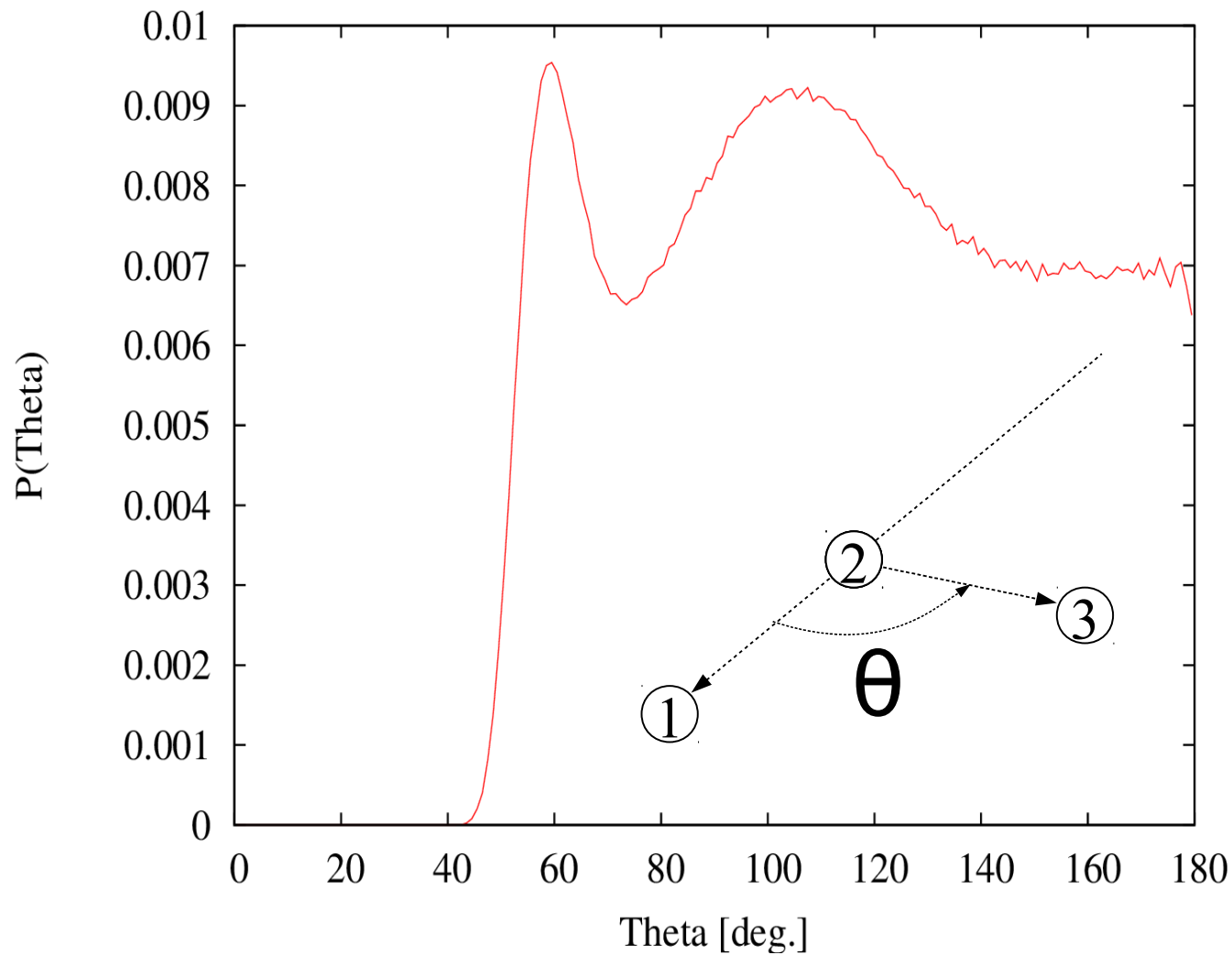
Or:-



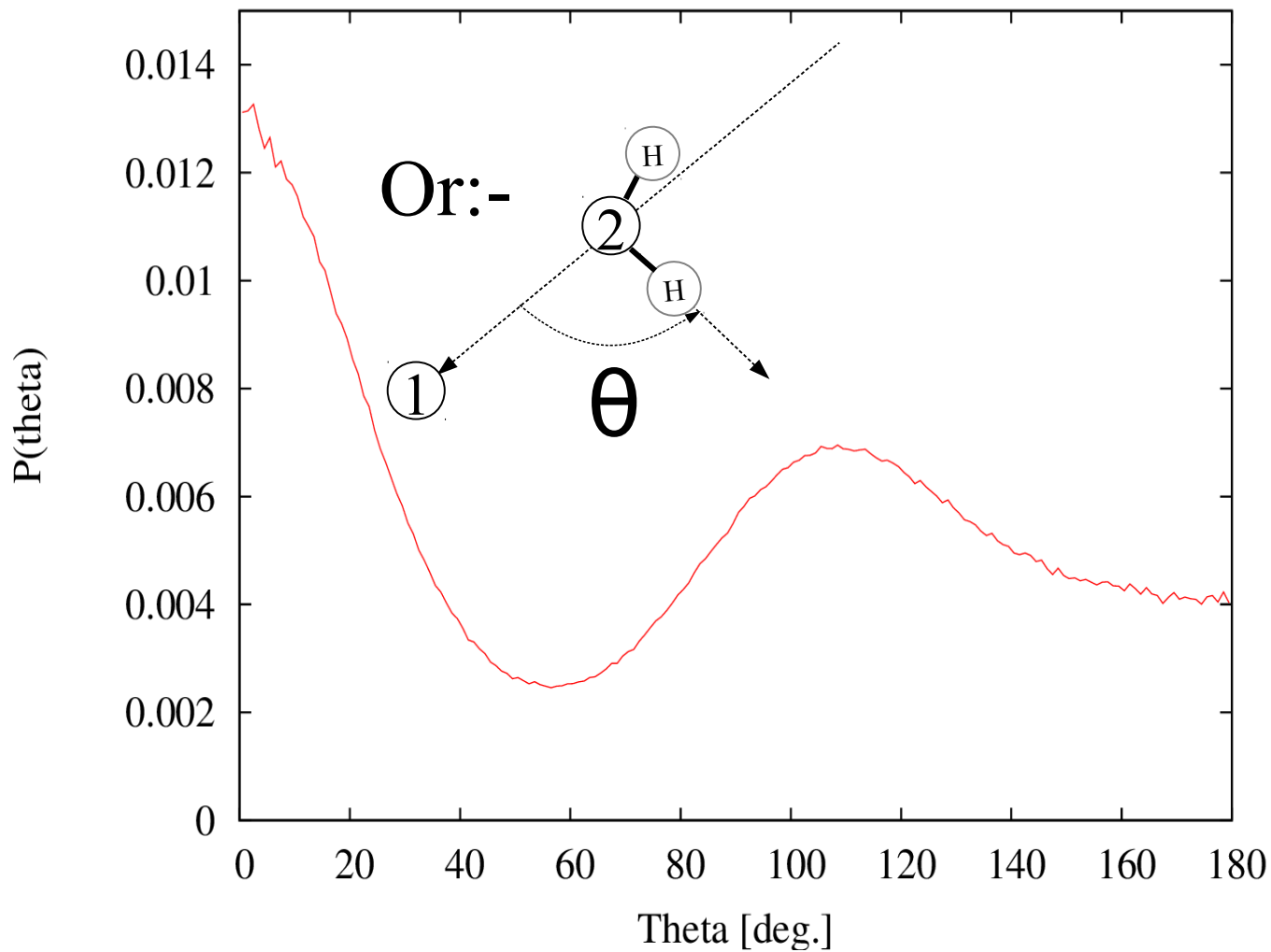
Or:-



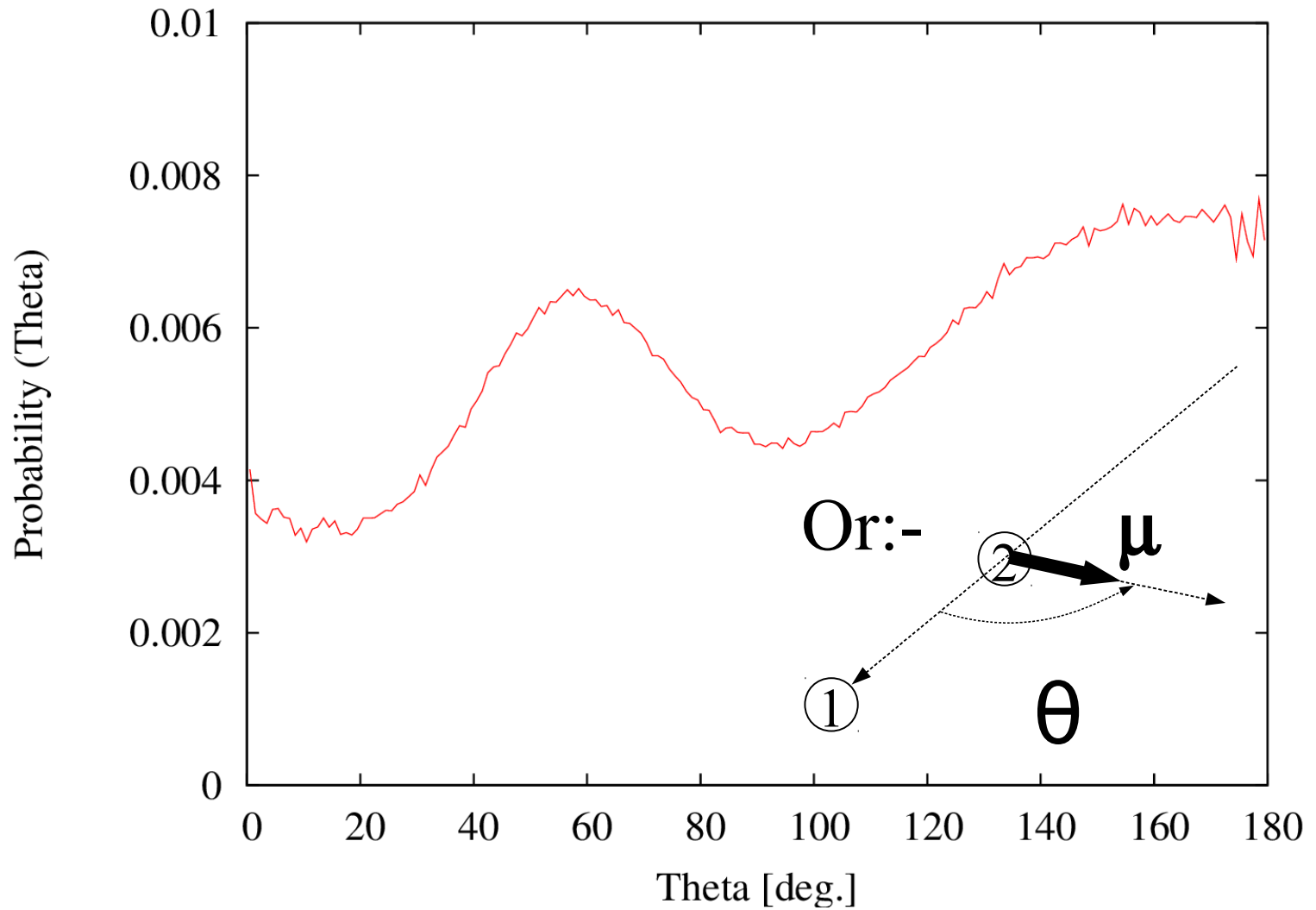
# *O-O-O angle distribution*



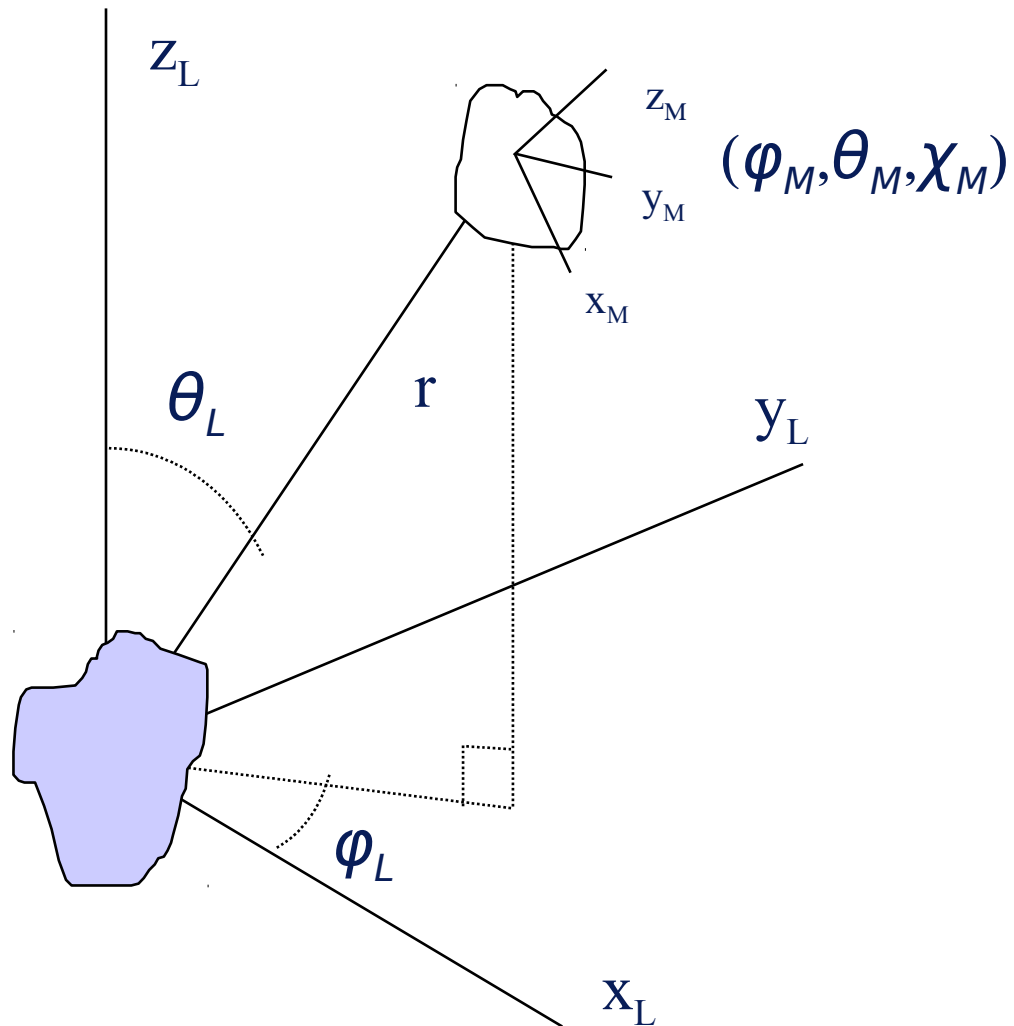
# *O-O-H angle distribution*



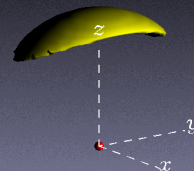
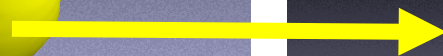
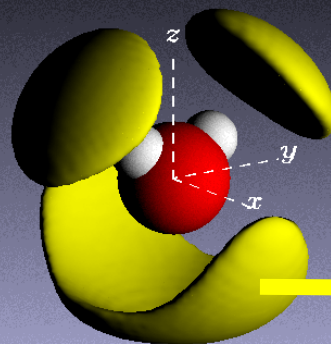
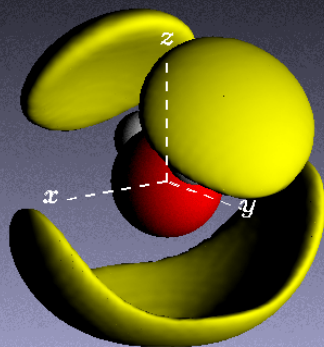
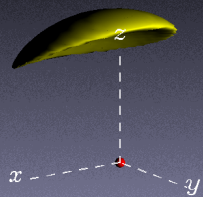
# *O- $\mu$ angle distribution*



*A step further: the orientational pair correlation function*

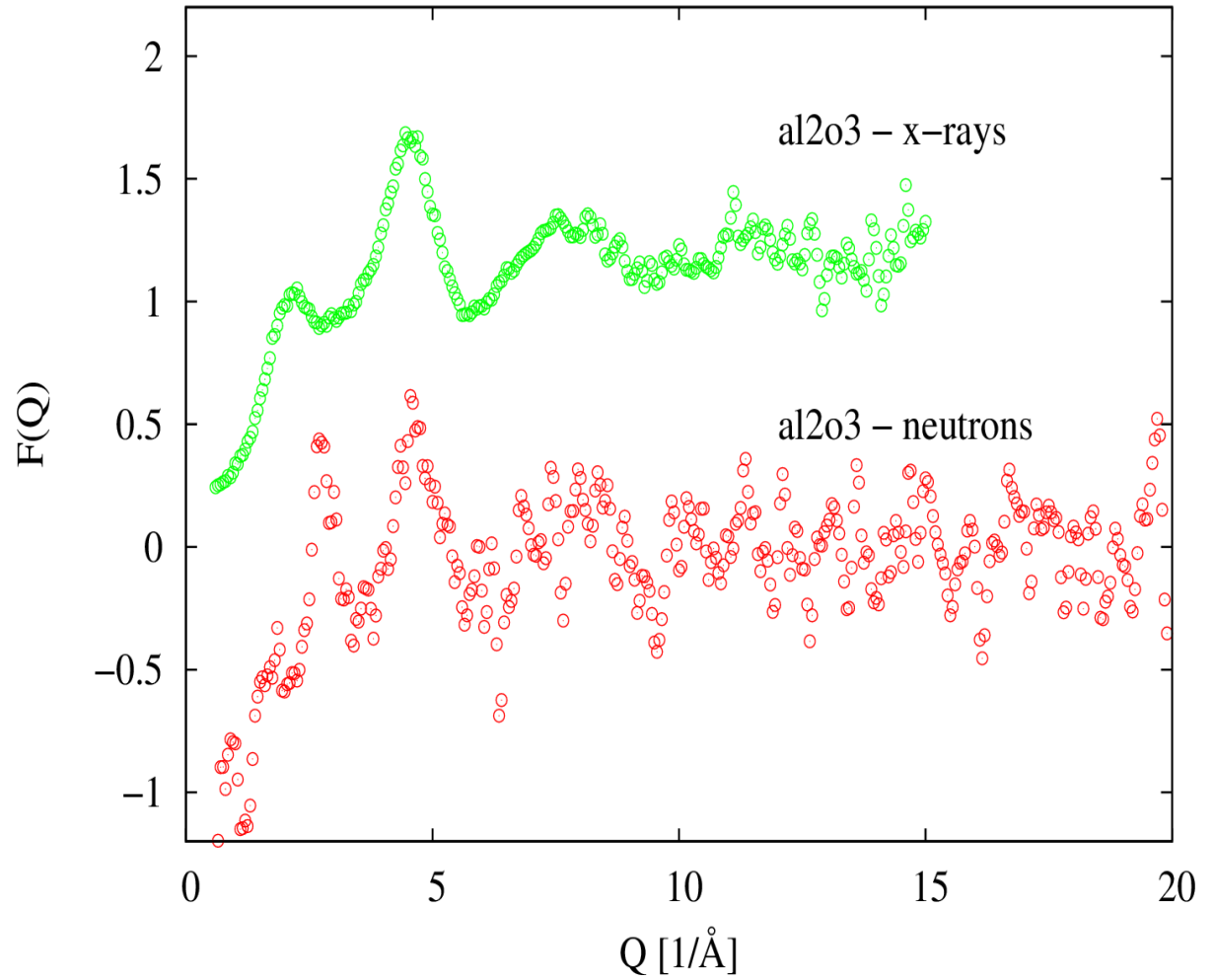


# Dipole orientations in water



*Another  
example:*

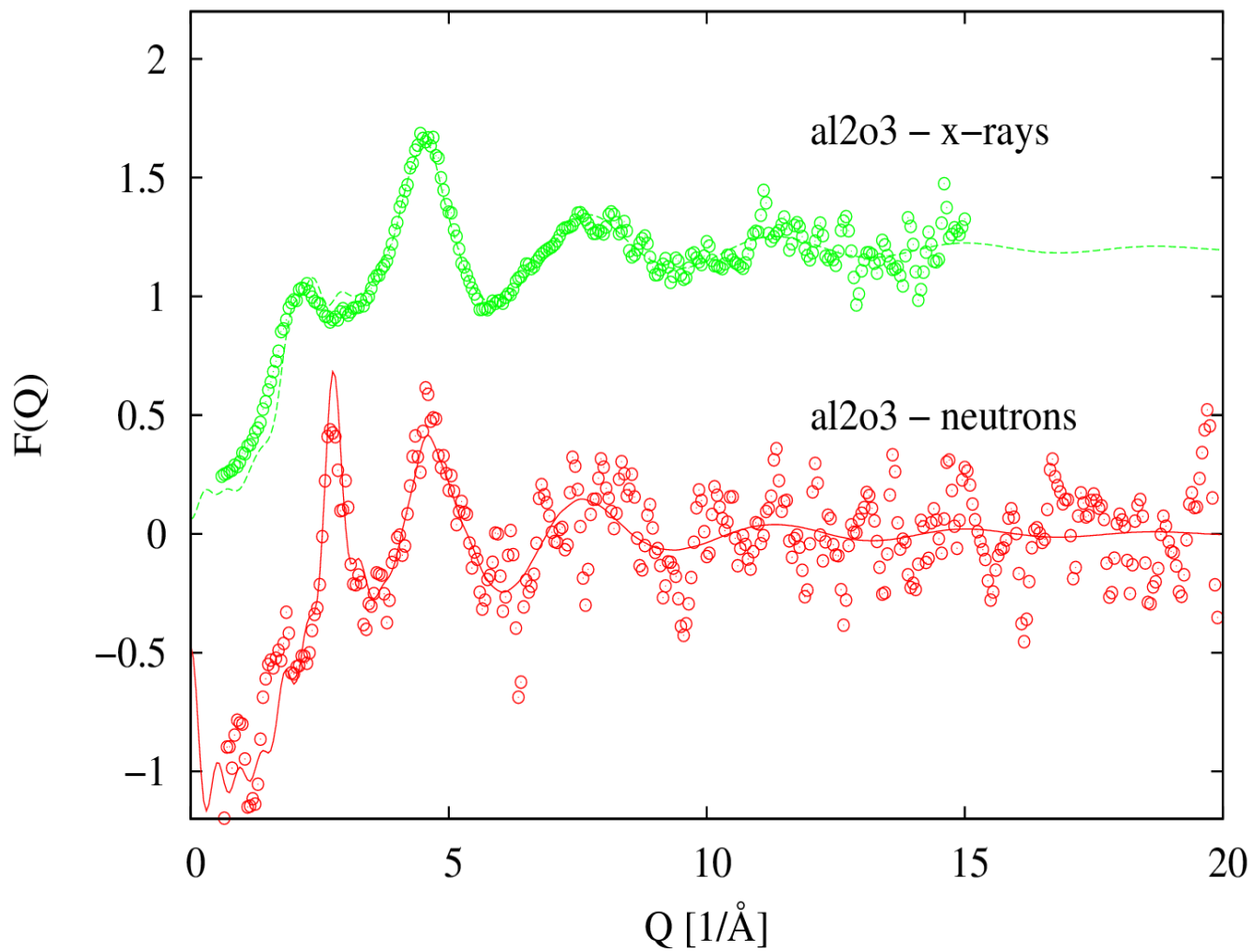
*Molten  
 $Al_2O_3$*



[Courtesy of  
Neville Greaves  
(Aberystwth)  
and  
Claude Landron  
(Orleans)]

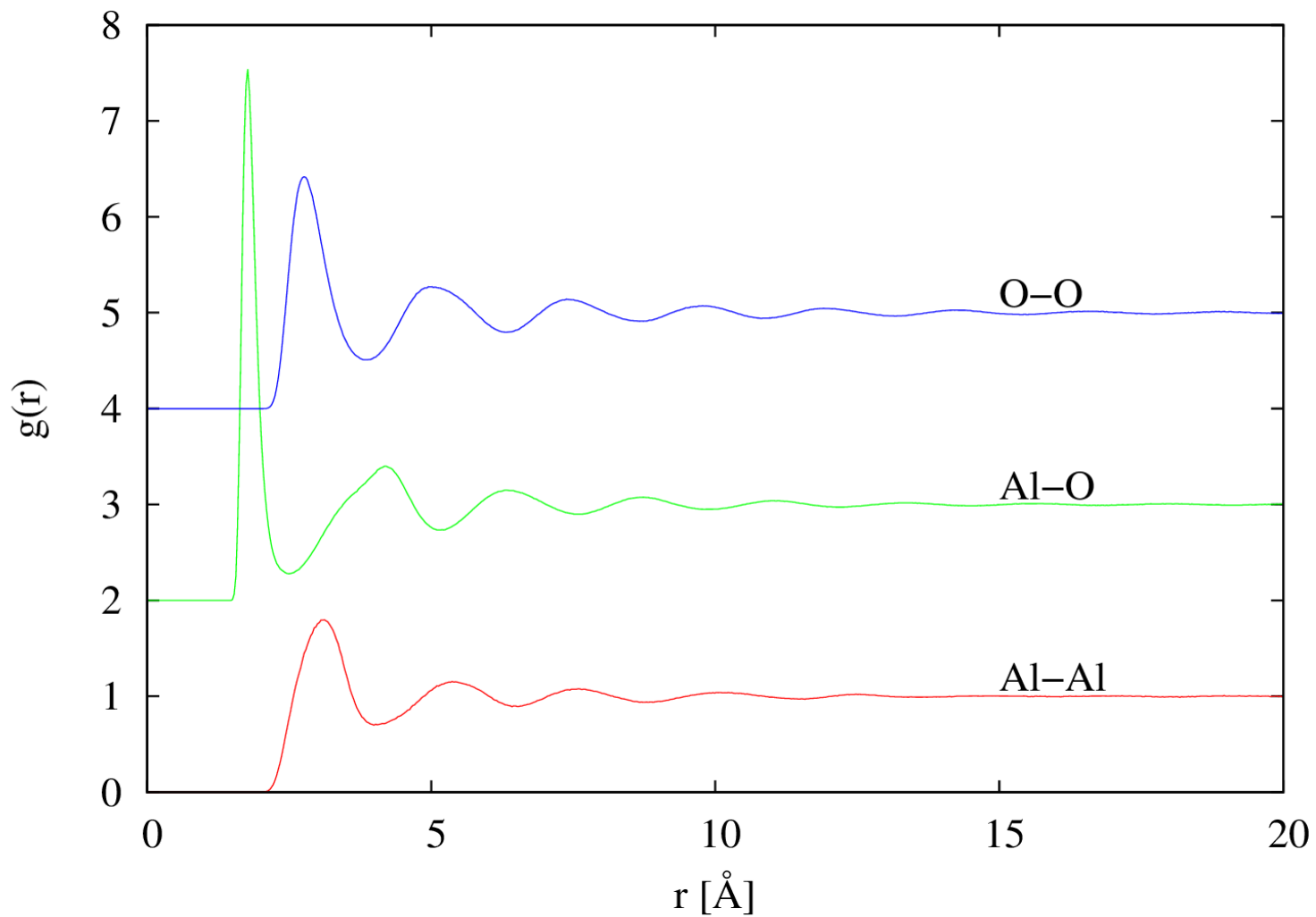
*Molten  $Al_2O_3$*

*Final  
fit  
after  
Empirical  
Potential  
Structure  
Refinement*





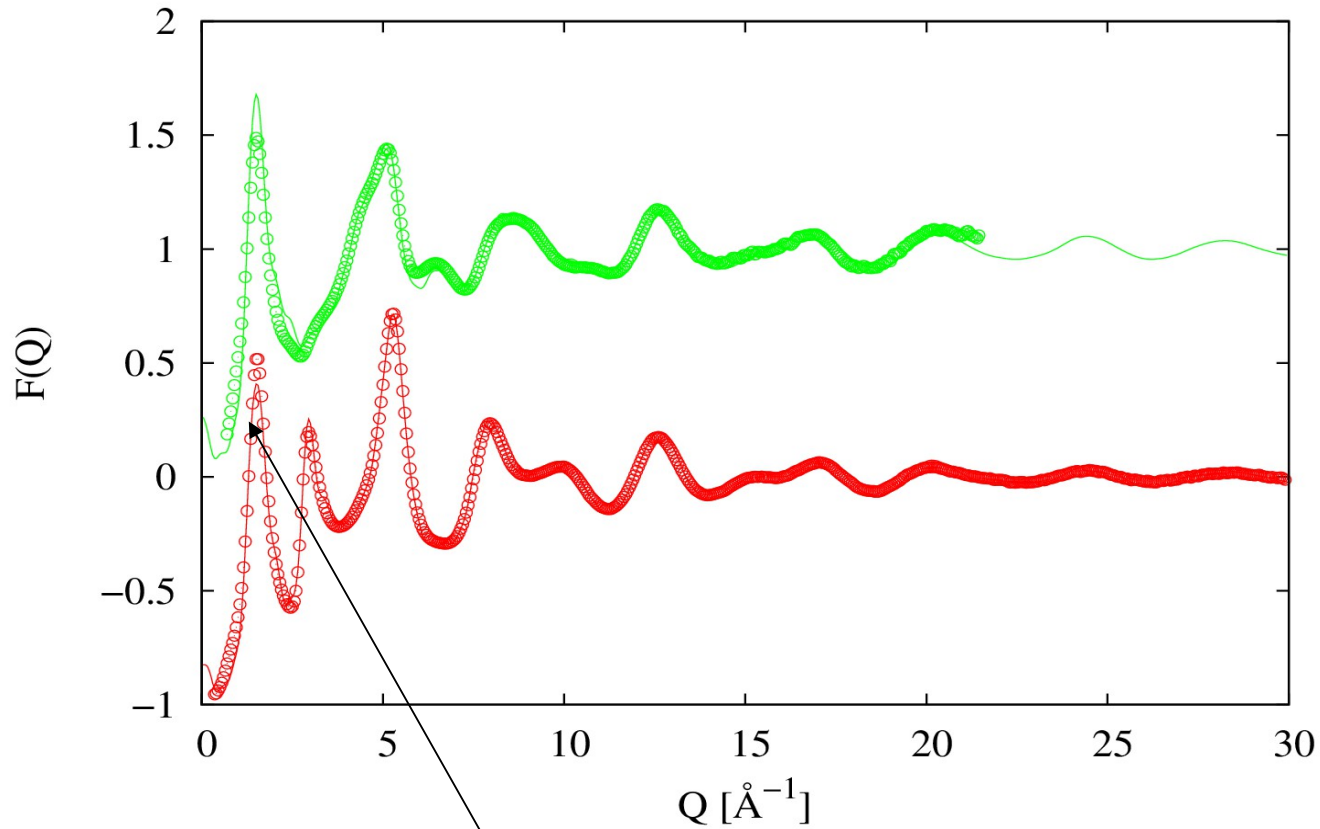
# *Partial $g(r)$ 's for $Al_2O_3$*



*The problem of tetrahedrally  
coordinated glasses and liquids*

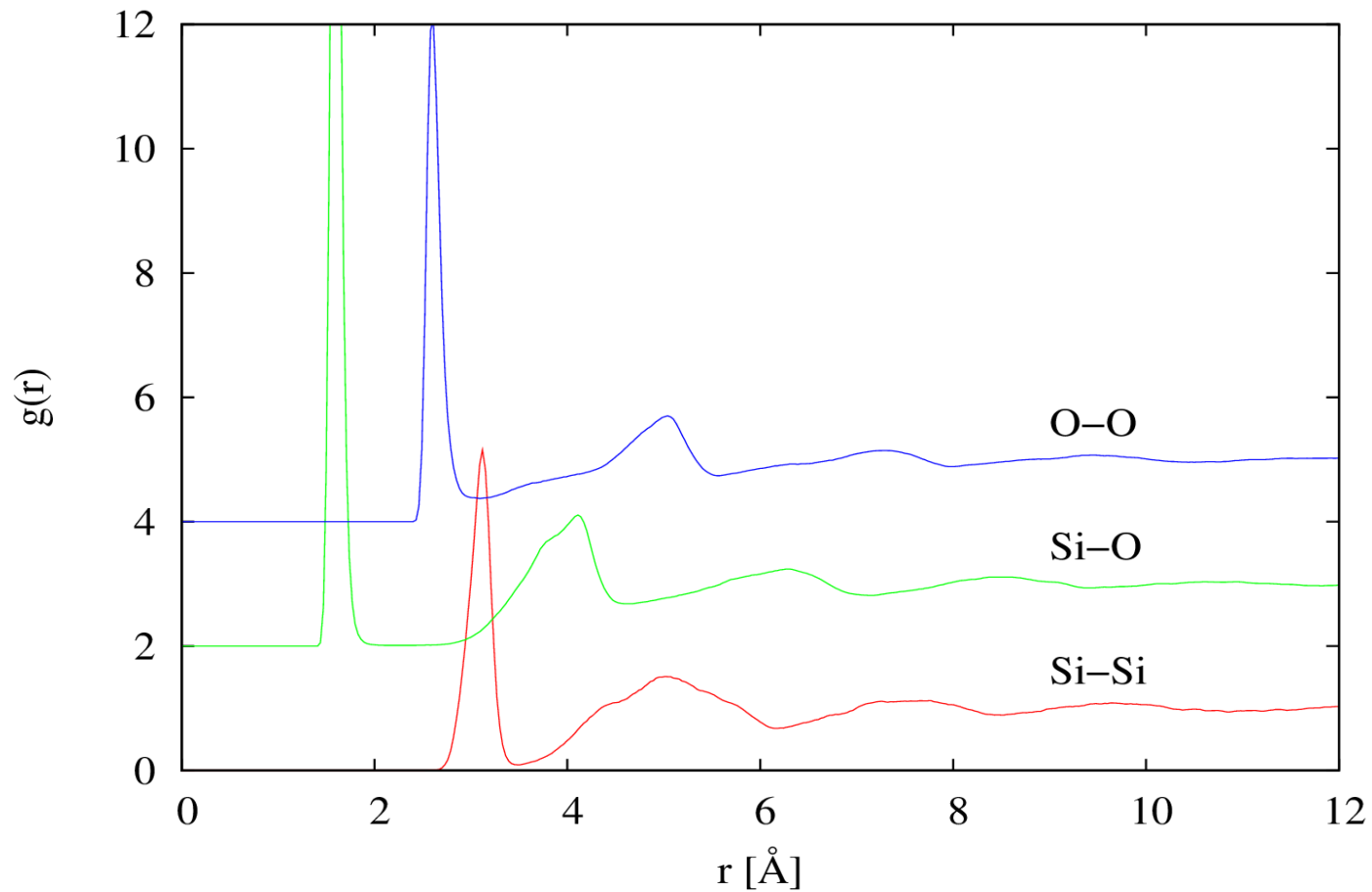
*(water,  $\alpha$ - $MX_2$ ,  $\alpha$ -Si,  $\alpha$ -Ge)*

# *Amorphous SiO<sub>2</sub>*

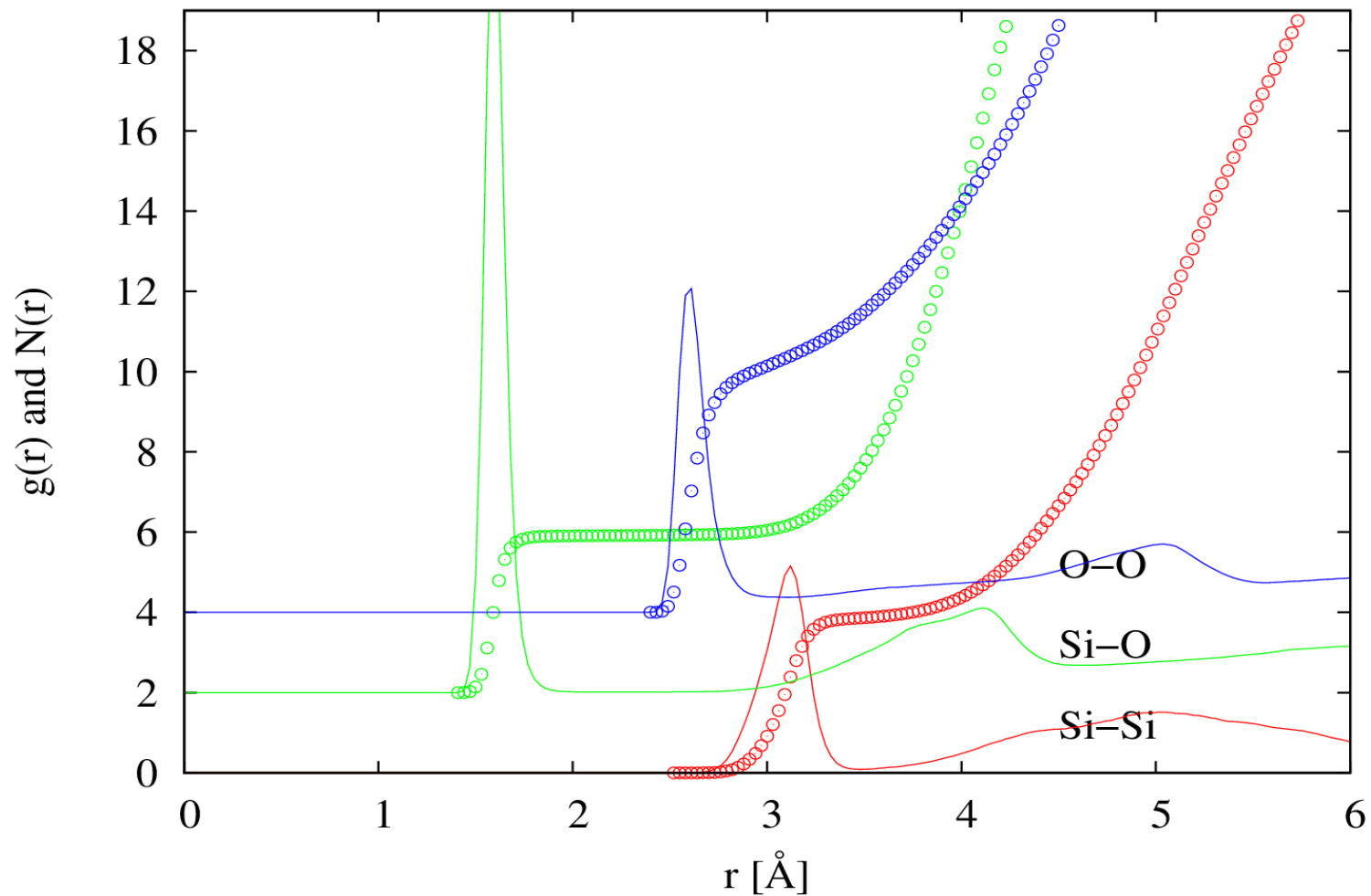


*“First sharp diffraction peak” - FSDP*

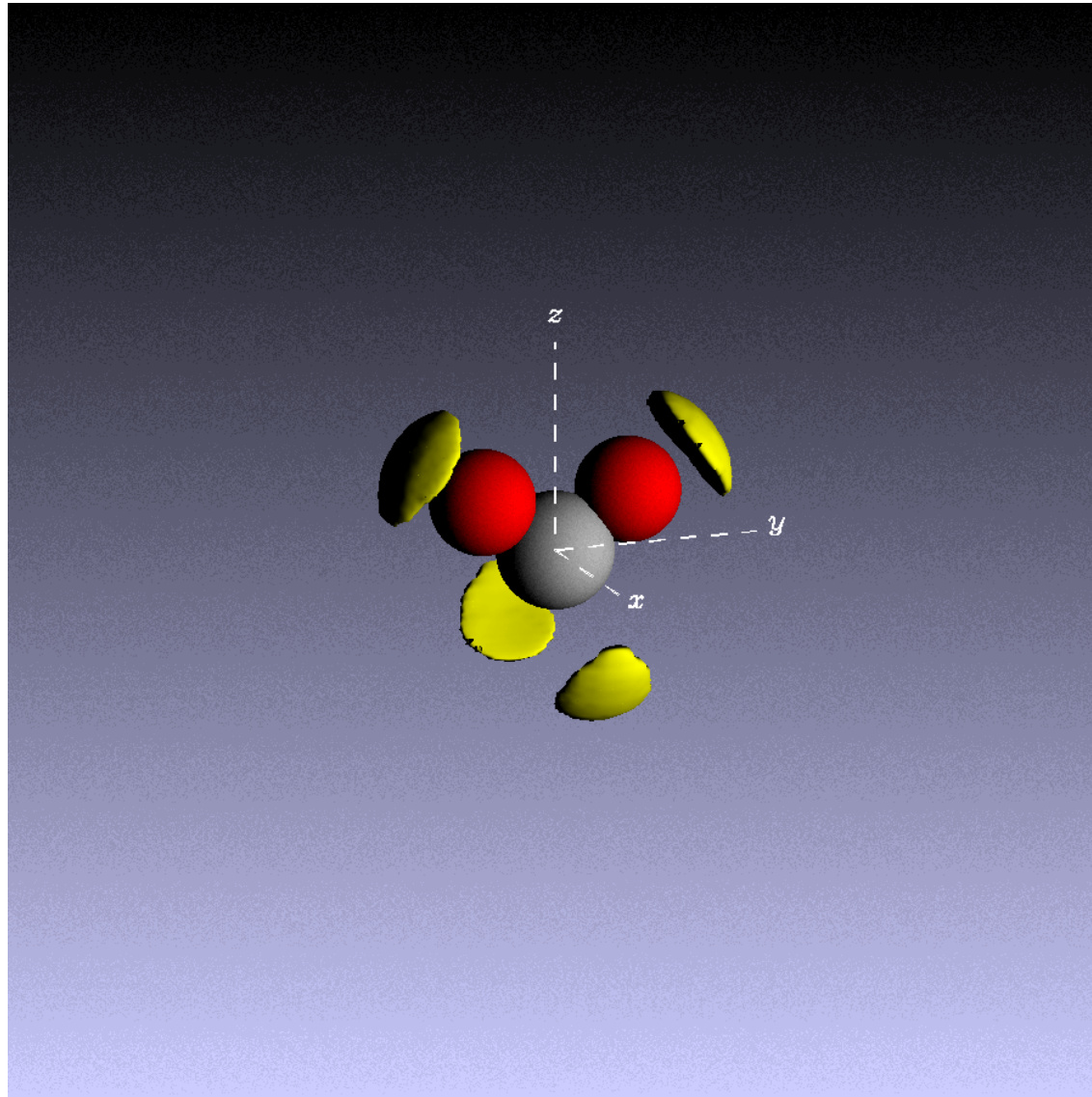
# *Radial distribution functions:*



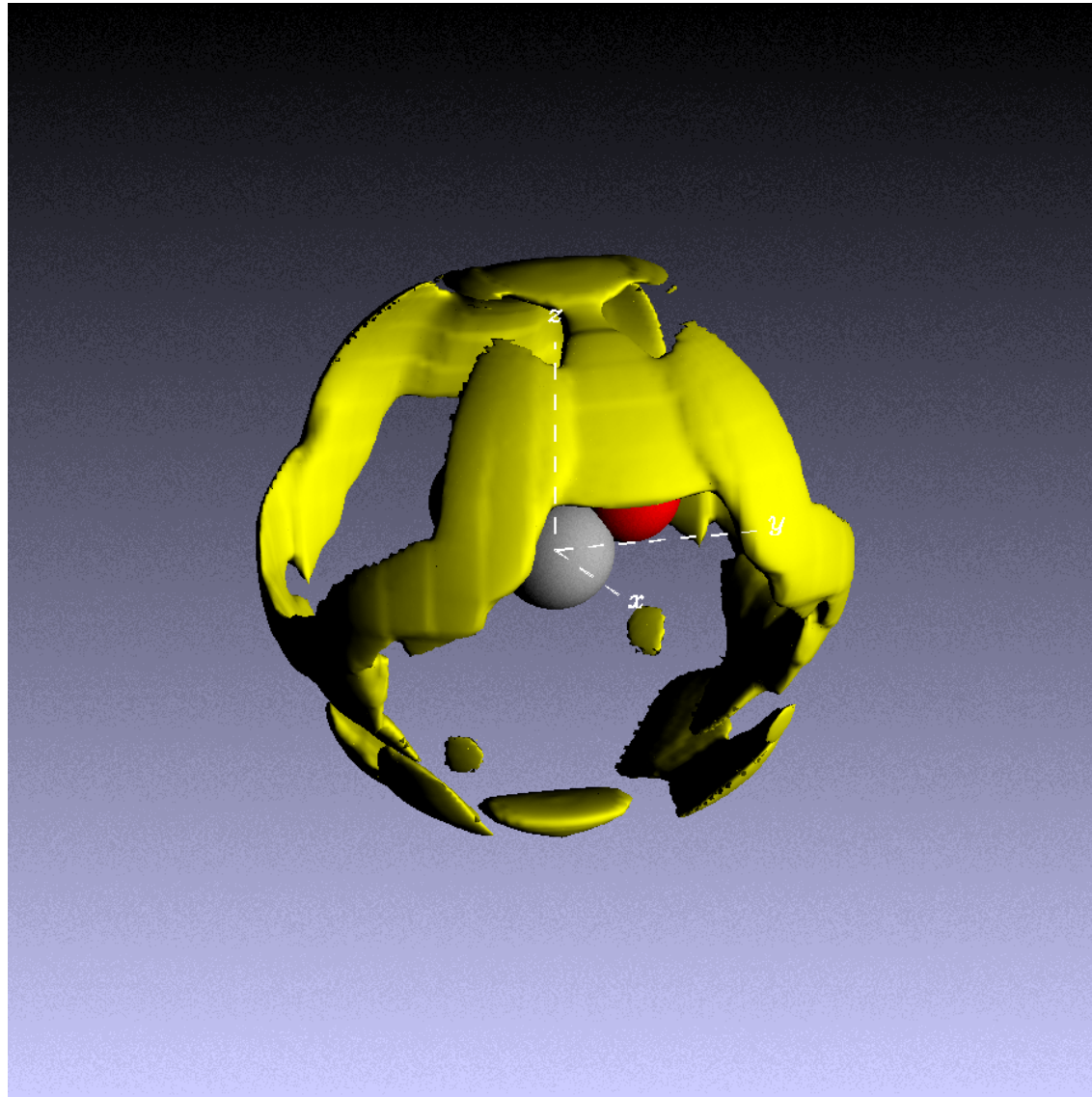
# Coordination numbers:



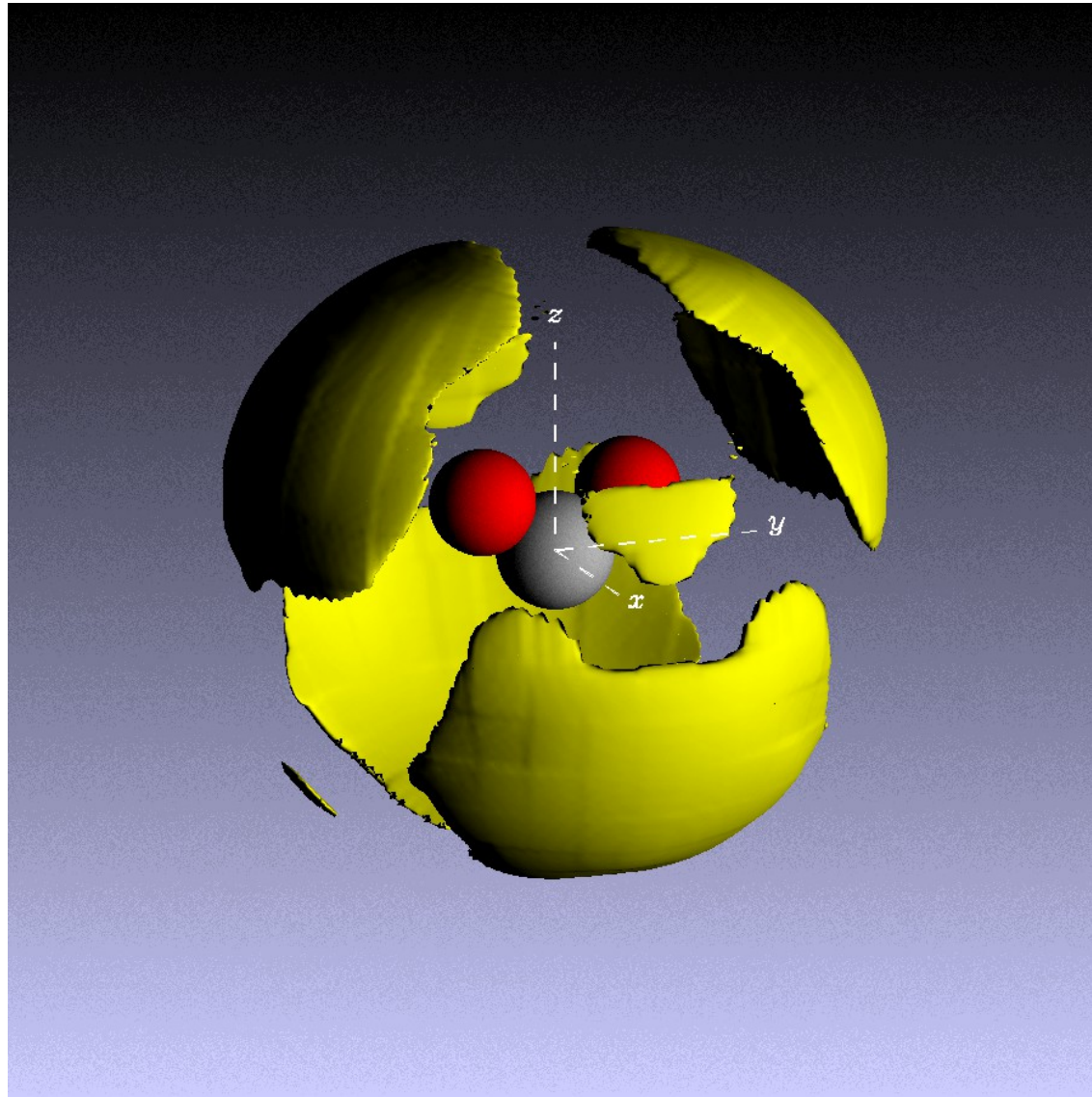
# *Spatial density function for $\alpha$ -SiO<sub>2</sub>:*



*Spatial density function for  $\alpha$ -SiO<sub>2</sub>:*

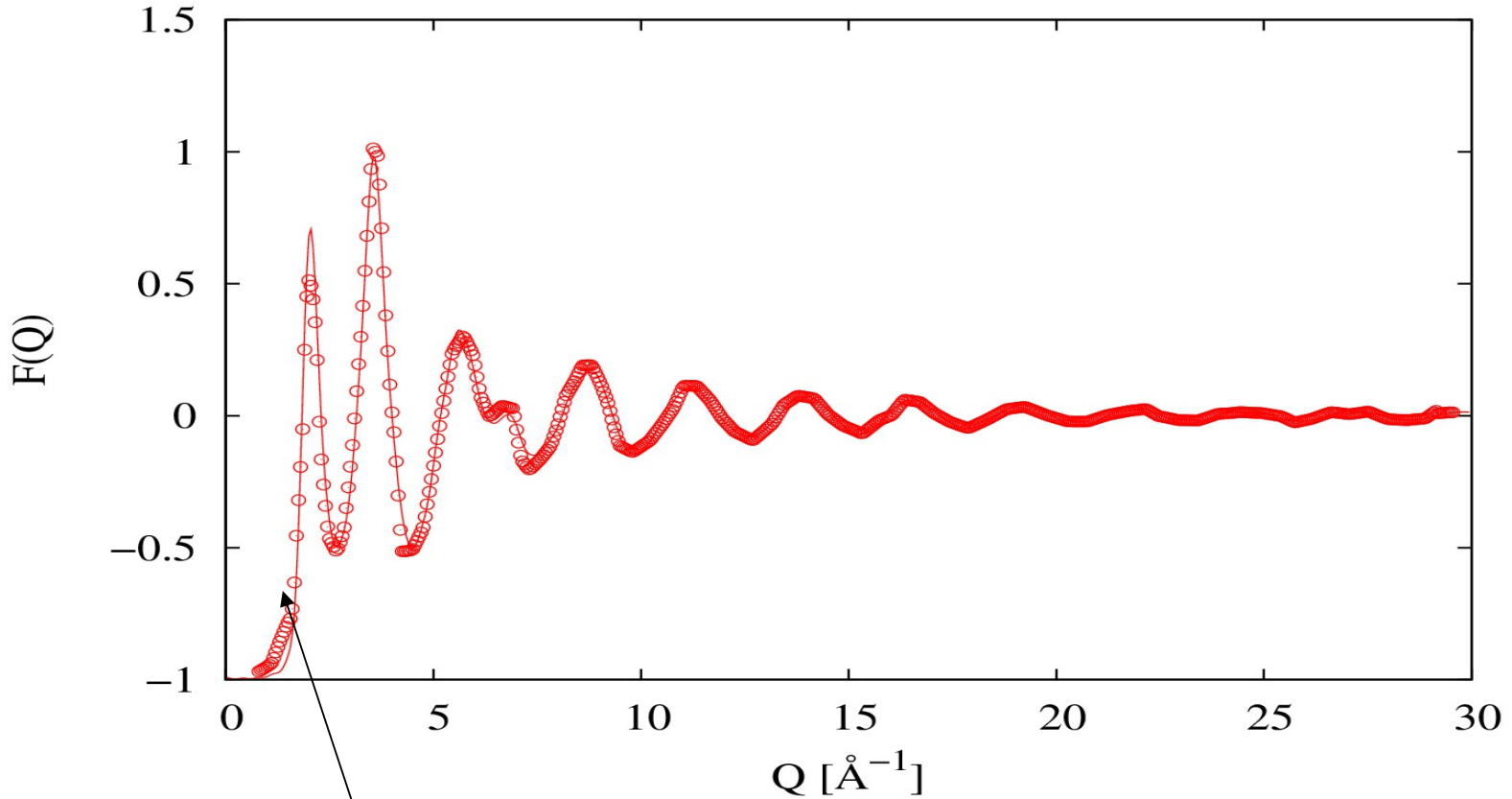


*Spatial density function for  $\alpha$ -SiO<sub>2</sub>:*



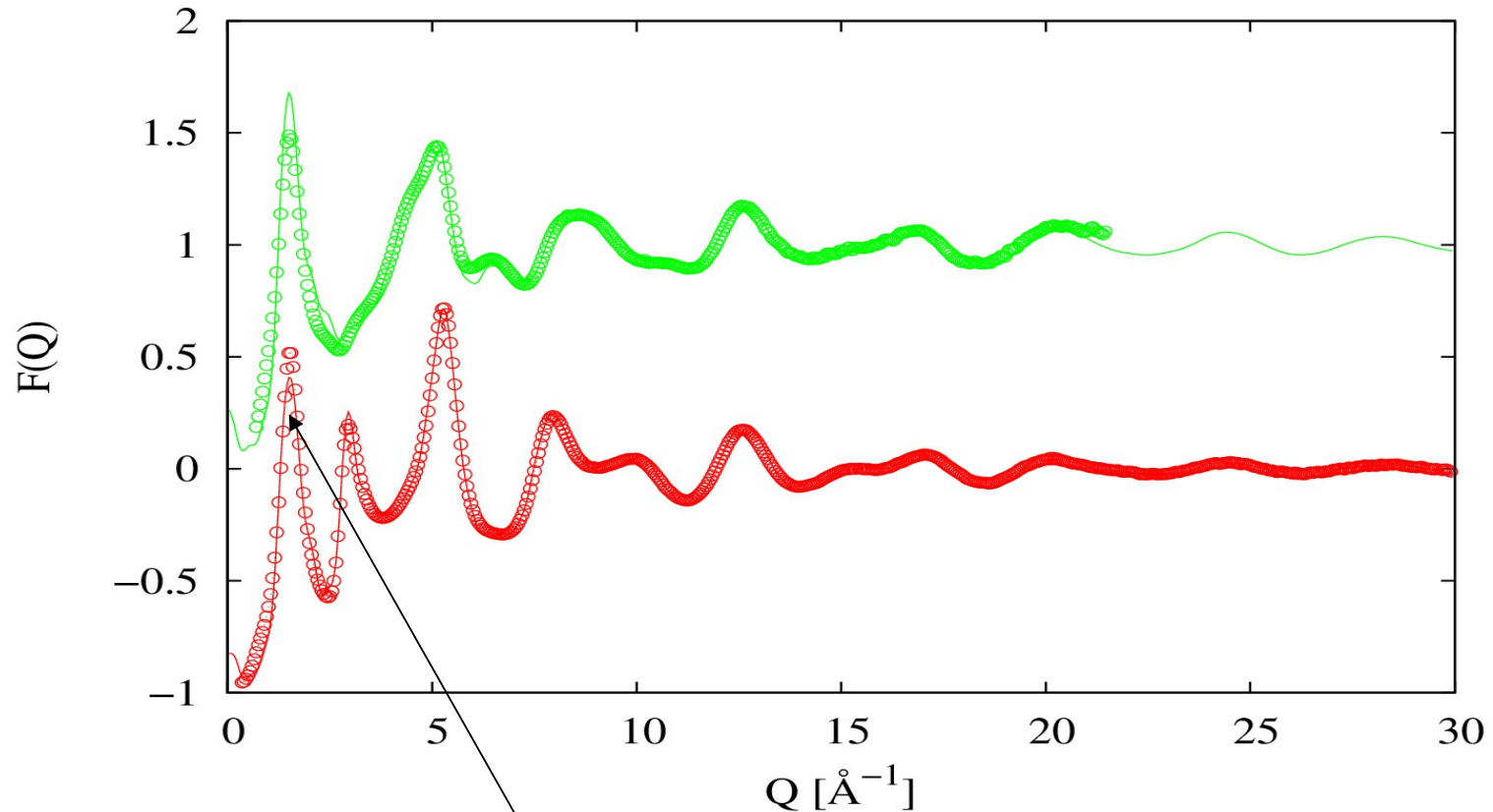


# *Compare with amorphous Si*



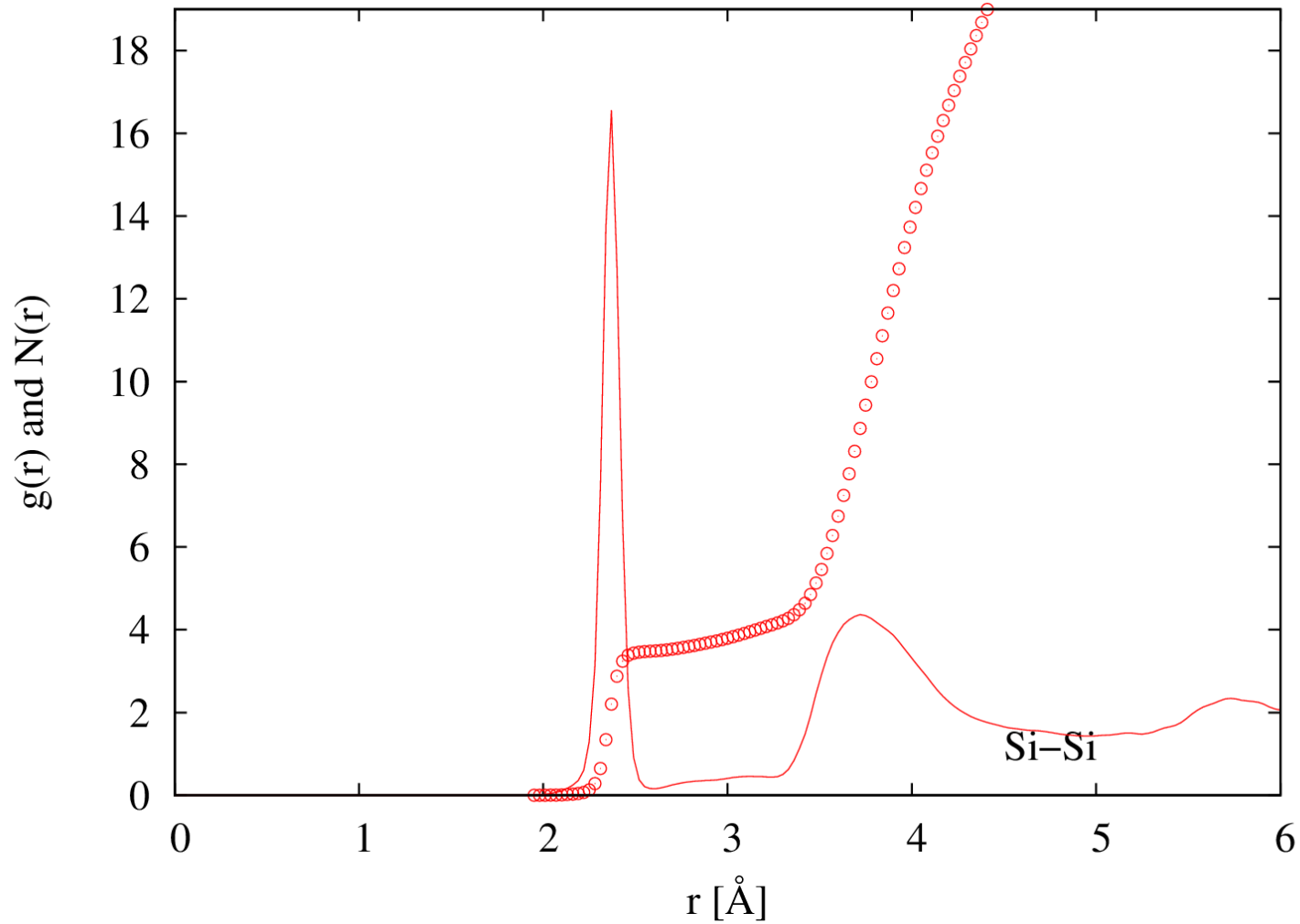
*FSDP is absent!*

# *Amorphous SiO<sub>2</sub>*

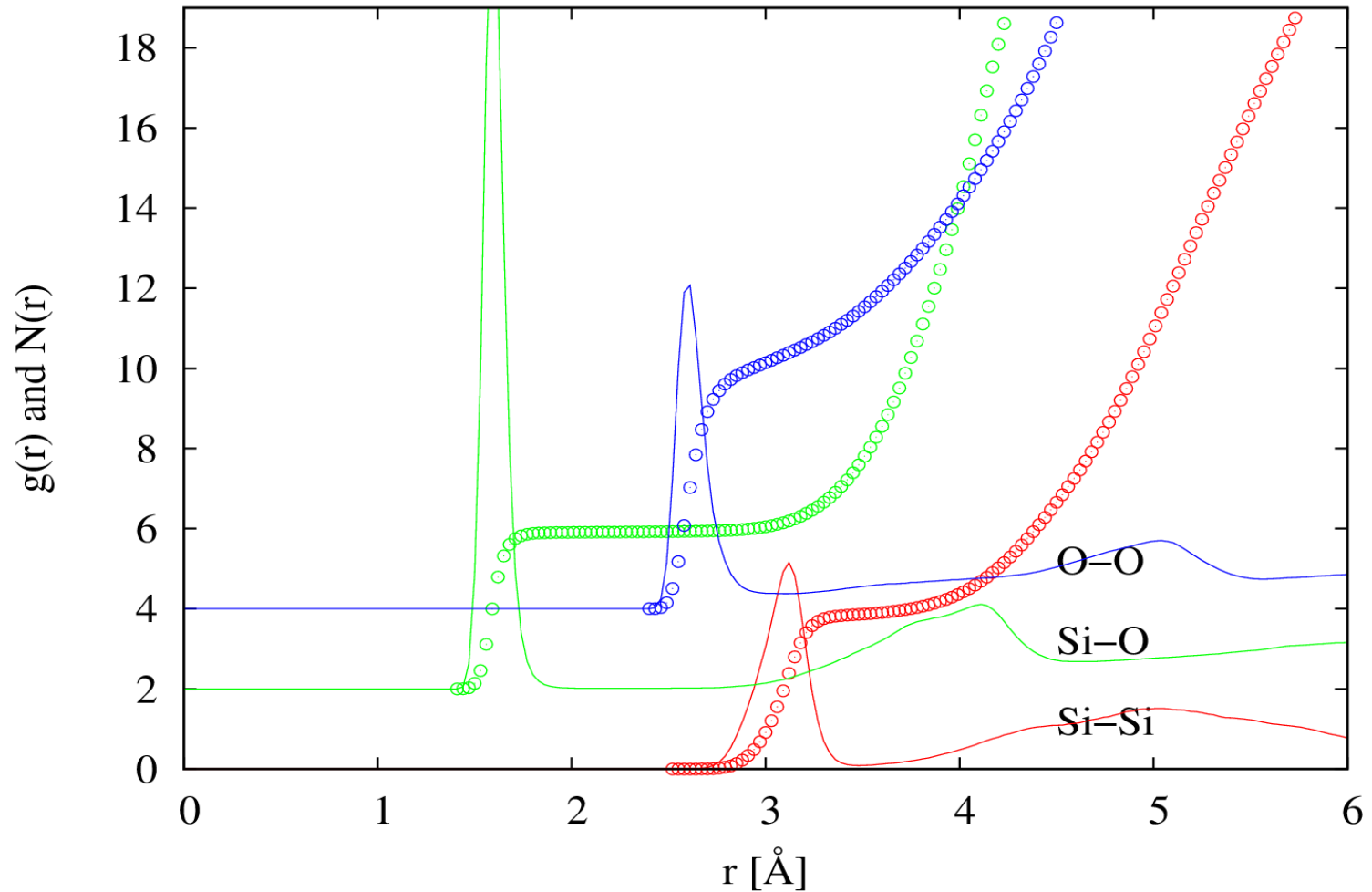


*“First sharp diffraction peak” - FSDP*

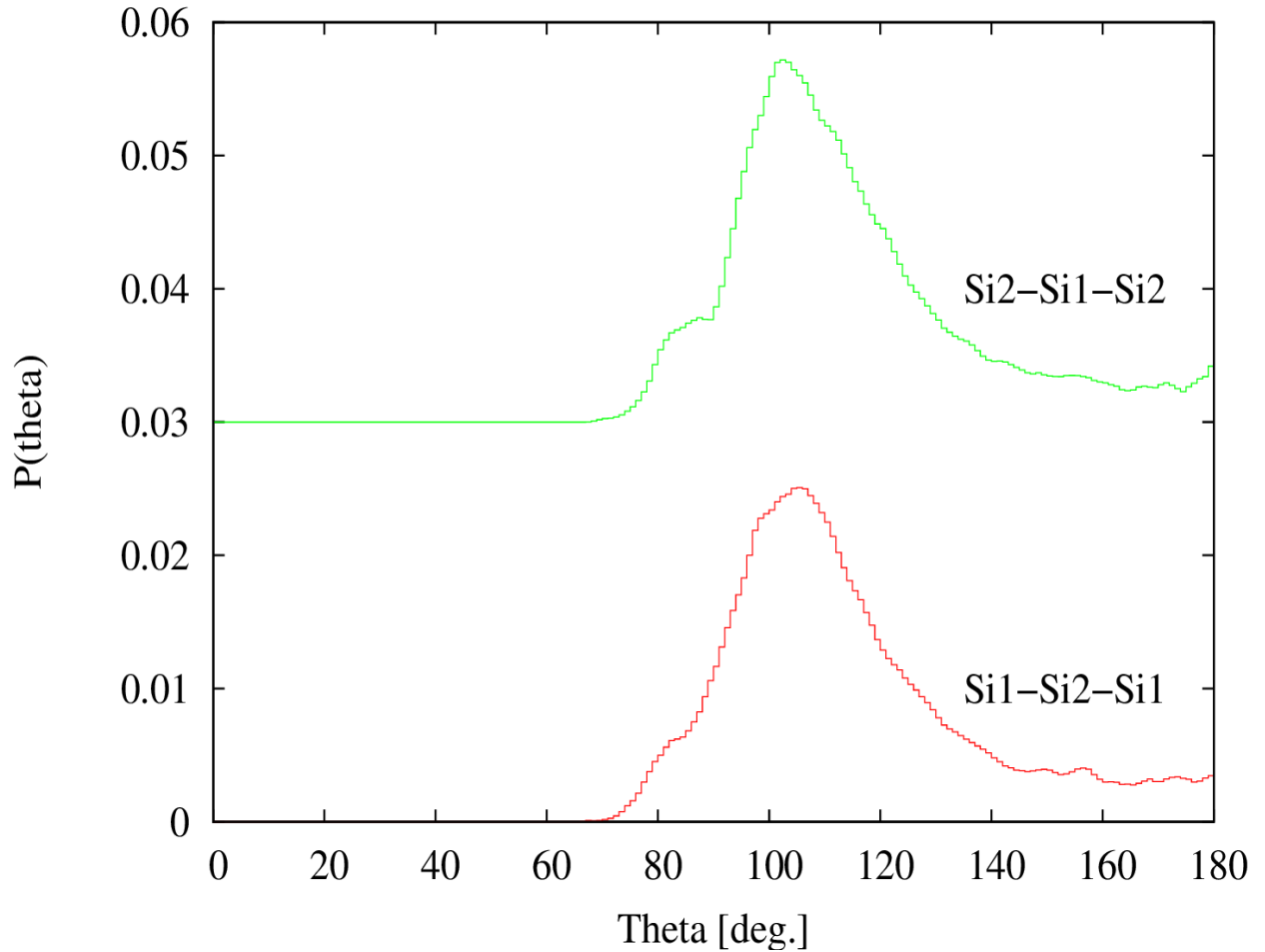
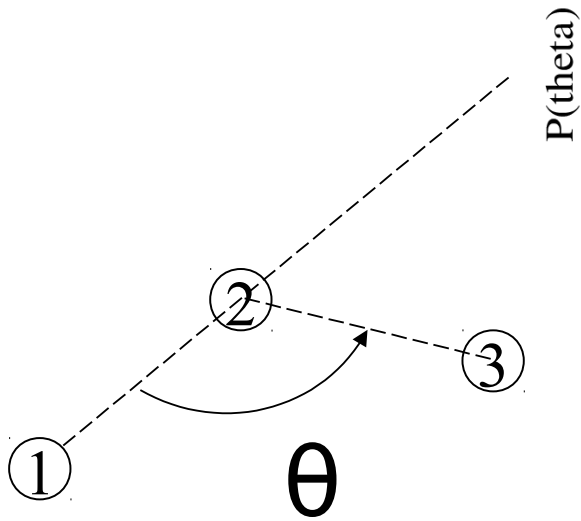
# *Coordination number- $\alpha$ -Si:*



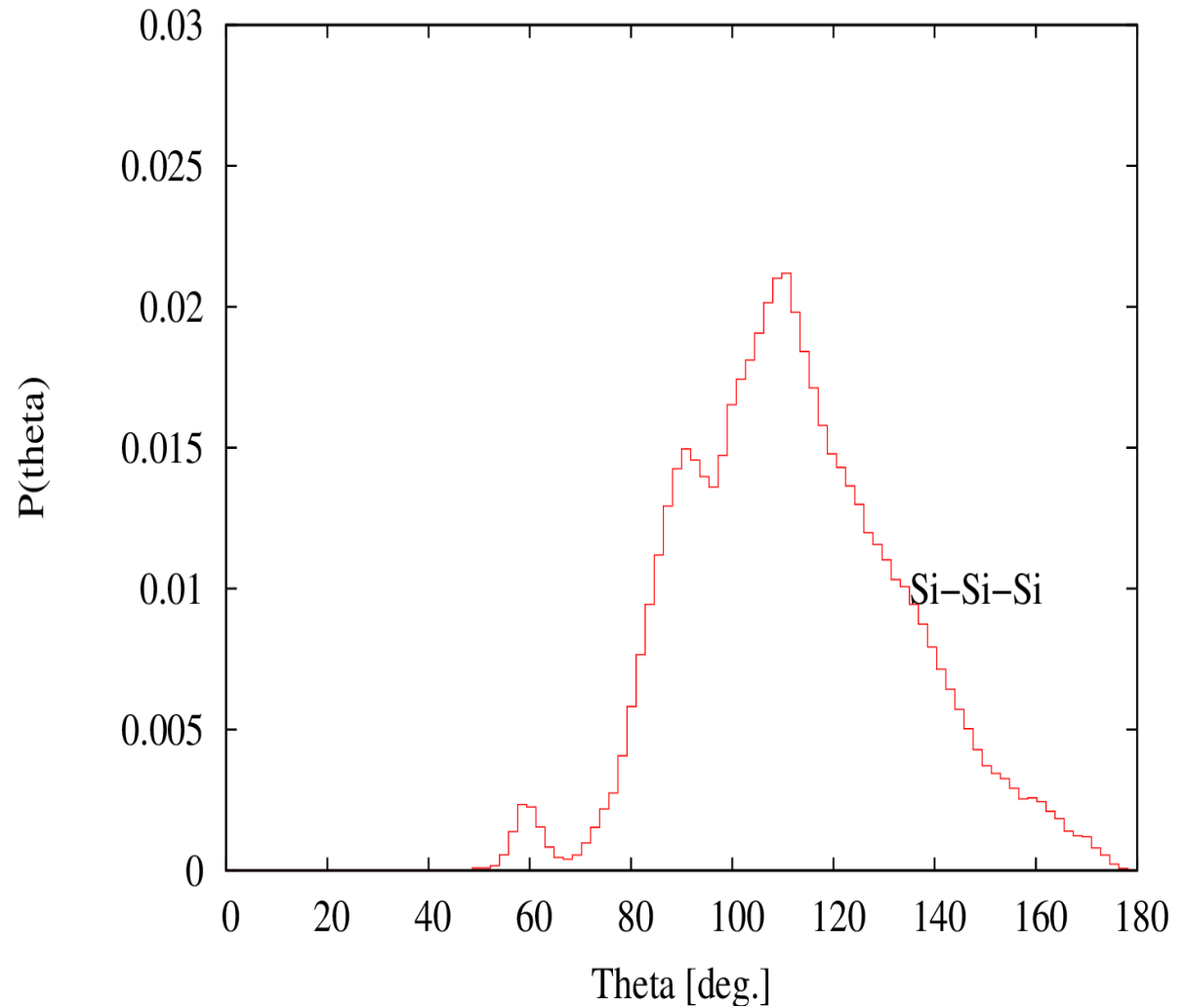
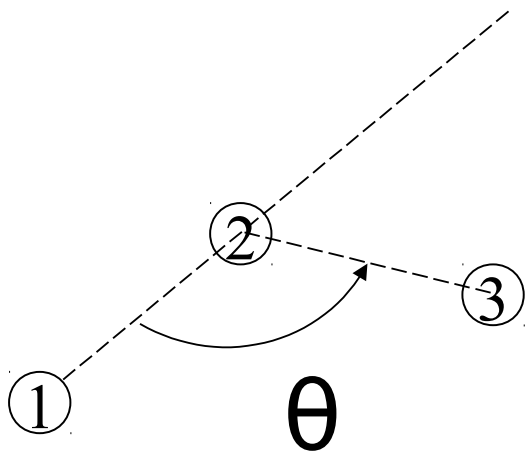
# Coordination numbers – $\alpha$ - $\text{SiO}_2$ :



# *Triangle or “bond angle” distributions, $\alpha$ -Si:*

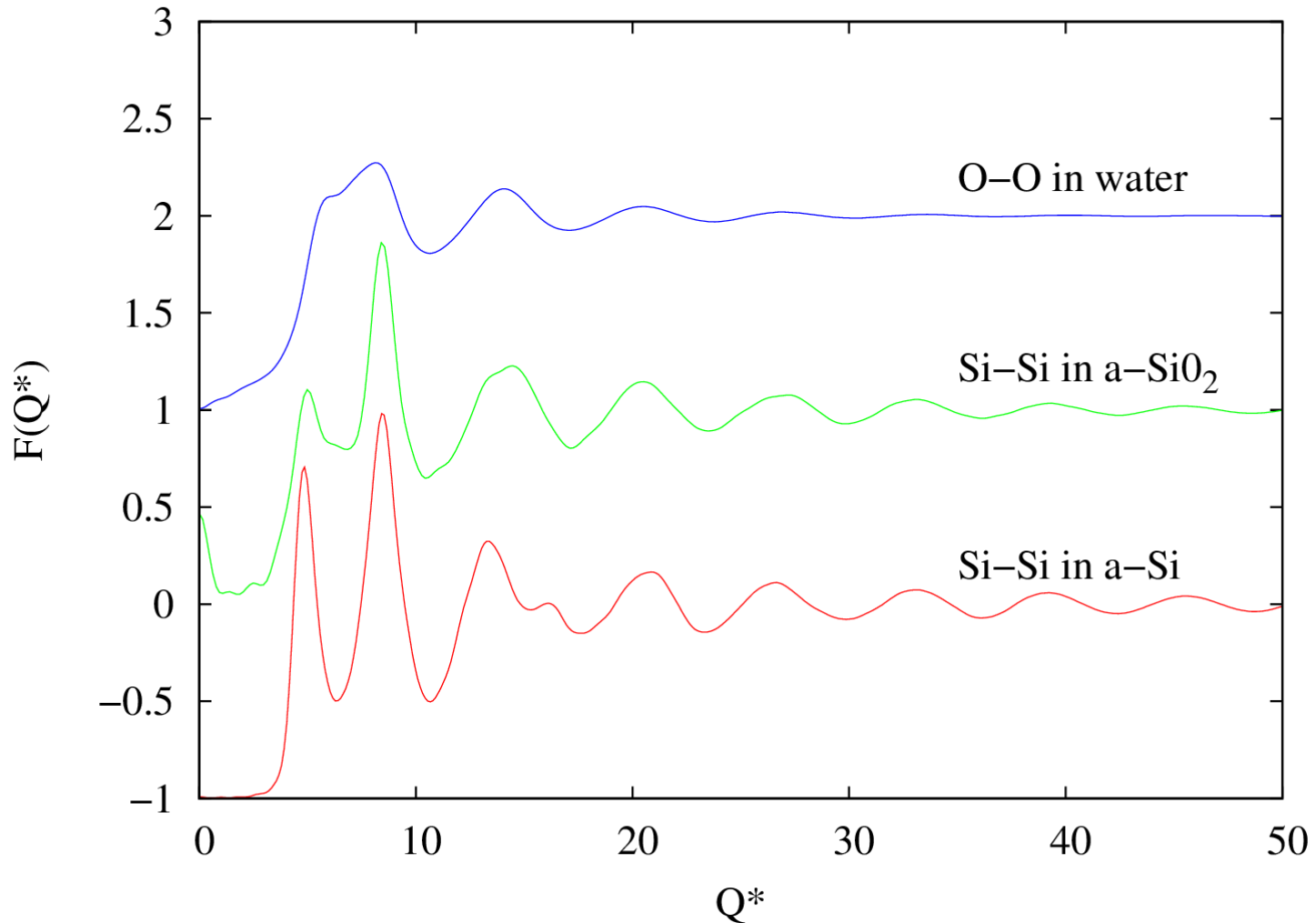


# Triangle or “bond angle” distributions, $\alpha$ - $\text{SiO}_2$ :

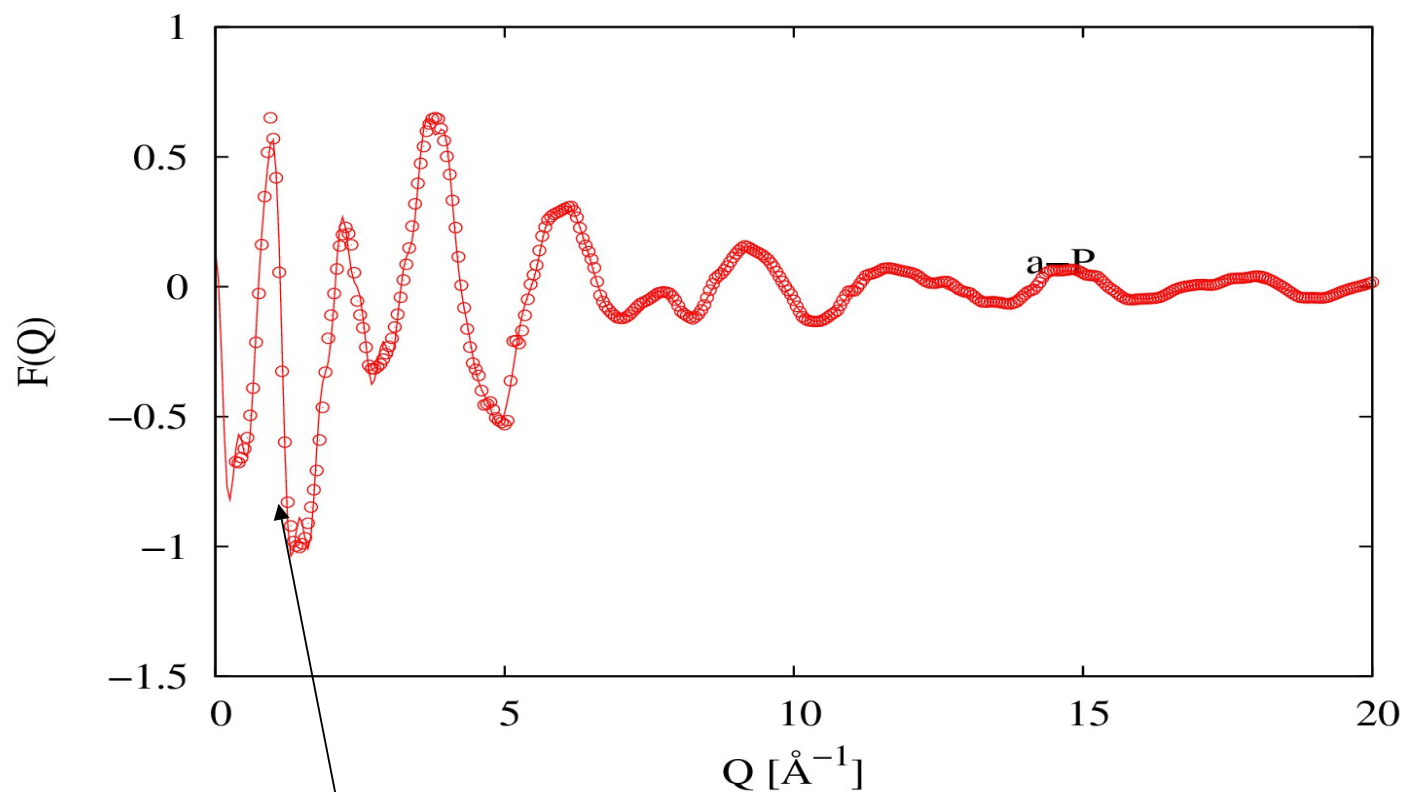


# *Compare structure factors...*

*(renormalise  $Q$  to near-neighbour distance)*



# *A puzzle: a-(red)P*



*FSDP is present!*



# Summary (1)

- Disorder is intrinsic to our existence, and occurs over a very wide range of length scales.
- We quantify disorder at the atomic level via the pair correlation function. For molecules this is the *orientational* PCF, which contains more information than the radial distribution functions,  $g(r)$ .
- Structure factors measured in diffraction experiments derive from the site-site radial distribution functions.

## *Summary (2)*

- Computer simulation is used to generate a model of the scattering system.
- Diffraction data are introduced either
  - via  $\chi^2$  (RMC),or
  - via an empirical potential, (EPSR).
- Simulated ensembles are used to calculate a number of distribution functions not accessible directly from the experiment.

## *Summary (3)*

- Tetrahedrally bonded glasses and liquids show structural similarities.
- Relevance/role of the “FSDP” is unclear.
- We can only really study these properties by forming structural models consistent with the data.

Thank you for your attention!