

The determination of magnetic structures by simulated annealing using the FullProf Suite

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Structure Determination by Global Optimisation Methods Simulated Annealing and Genetic Algorithms

Classically, crystal structure determination is considered as a process to determine the “phases” of the structure factors

$$\rho(\mathbf{r}) = \sum_{\{\mathbf{h}\}} F_{\mathbf{h}} \exp\{-2\pi i \mathbf{h} \mathbf{r}\}$$

$$\rho(\mathbf{r}) = \sum_{\{\mathbf{h}\}} |F_{\mathbf{h}}| \exp\{-2\pi i (\mathbf{h} \mathbf{r} + \Phi_{\mathbf{h}})\}$$

For a centrosymmetric structure $\Phi_{\mathbf{h}}$ is 0 or 1/2

The knowledge of all phases for the measured structure factors provides a density map from which the structure is derived (chemically recognised).

The determination of magnetic structures by simulated annealing using the FullProf Suite

The resolution of the “phase problem” is the goal of the crystal structure determination methods

Direct Methods tackle the problem looking for phase relations (tangent formula) between structure factors of different reflections

Direct methods need a high number of reflections
and good resolution (powders)

Direct methods are generally very efficient

But ...
sometimes direct methods fail in
solving particular structures
or
**cannot be applied because poor
data quality (low resolution)**

Structure factor calculations

$$F(\mathbf{h}) = \sum_{j=1}^n O_j f_j(\mathbf{h}) T_j \sum_s \exp \{2\pi i [\mathbf{h} \{S|\mathbf{t}\}_s \mathbf{r}_j]\}$$

If the chemical composition and the space group are known we have to determine just the 3n variables

$$F_{obs}(\mathbf{h})_r \approx \left| \sum_{j=1}^n O_j f_j T_j \sum_s \exp \{2\pi i [\mathbf{h} \{S|\mathbf{t}\}_s \mathbf{r}_j]\} \right|_r$$

$$\mathbf{h}_r = (h, k, l)_r \quad (r = 1, 2, \dots, N)$$

$$\mathbf{r}_j = (x_j, y_j, z_j) \quad (j = 1, 2, \dots, n)$$

Direct space methods:

- Look directly for atom positions explaining the experimental data
- Minimise a reliability factor with respect to the “configuration vector” or “chromosome”

$$\varpi = \left| x_1, y_1, z_1, x_2, y_2, z_2, \dots, x_n, y_n, z_n \right\rangle$$

$$R(\varpi) = c \sum_{r=1}^N \left| F_{obs}^2(\mathbf{h}_r) - F_{calc}^2(\mathbf{h}_r, \varpi) \right|$$

Solving Crystal structures by Powder diffraction and direct space methods

(1) *Indexing the powder diffraction pattern: **DICVOL**, **TREOR**, **ITO**, ...*
(**WinPLOTR**)

(2) *Extracting integrated intensities*
(**FullProf**)
Space Group determination

(3) Use **ExPo** to solve the structure

(4) If **ExPo** fails then
Use Simulated Annealing (**FullProf**,
GLOpSAnn)

What is Simulated Annealing?

Simulated Annealing:

The SA method is a general purpose optimisation technique for large combinatorial problems introduced by:

Kirpatrick, Gelatt and Vecchi, *Science* **220**, 671-680 (1983).

Minimize a cost function, energy $E(\omega)$, with respect to the configuration vector ω .

Origin: Monte Carlo methods for simulating properties of liquids (Metropolis algorithm)

Algorithm trying to mimic the process of annealing a sample to obtain a good crystalline state (ground state):

A temperature schedule (starting high temperature + cooling rate) is needed.

Procedure to generate new configurations (Markov chains) and a Boltzmann probability to explore the phase space (importance sampling)

What is Simulated Annealing?

Simulated Annealing (SA):

The SA method applied to structural problems:

- J. Pannetier, J. Bassas-Alsina, J. Rodríguez-Carvajal and V. Caignaert, *Nature* **346**, 343-345 (1990)
- J.M. Newsam, M.W. Deem and C.M. Freeman, Accuracy in Powder Diffraction II. NIST Special Publ. No. **846**, 80-91 (1992)
- J. Rodríguez-Carvajal, *Physica B* **192**, 55-69 (1993)

The Simulated Annealing Algorithm

begin

Initialize (set to zero useful quantities, do preliminary calculations)

$\tau = 1$

do

do

Perturb the system:

$\omega_{\text{old}} \rightarrow \omega_{\text{new}}, \Delta = E(\omega_{\text{new}}) - E(\omega_{\text{old}})$

if $\Delta \leq 0$ **then** **accept**, **else**

if $\exp(-\Delta/T_\tau) > \text{random}[0,1]$ **then** **accept**

if **accept** **then** **Update** (replace ω_{old} by ω_{new})

until equilibrium is approached closely enough (Ncyc)

$T_{\tau+1} = f(T_\tau)$ (decrease temperature, usually $T_{\tau+1} = q T_\tau, q \approx 0.9$)

$\tau = \tau + 1$

until stop criterion is true (maximum τ , convergence, low % accepted...)

end

Examples of Crystal Structure Determination by Simulating Annealing (SAnn)

COMM Ab initio structure solution of PbSO4 (Simulated Annealing, data D1A-ILL)

! Files => DAT-file: pb_san, PCR-file: pb_san

!Job	Npr	Nph	Nba	Nex	Nsc	Nor	Dum	Iwg	Ilo	Ias	Res	Ste	Nre	Cry	Uni	Cor	Opt	Aut
1	0	1	0	0	0	0	0	0	0	0	0	0	12	3	0	0	0	0

!Ipr	Ppl	Ioc	Mat	Pcr	Ls1	Ls2	Ls3	Syo	Prf	Ins	Rpa	Sym	Hkl	Fou	Sho	Ana
0	0	1	0	1	0	0	0	0	1	0	0	0	0	0	0	0

!

!NCY	Eps	R_at	R_an	R_pr	R_gl	Thmin	Step	Thmax	PSD	Sent0
1	0.10	1.00	1.00	1.00	1.00	15.0000	0.0200	120.0400	0.000	0.000

!

12 !Number of refined parameters

!-----

! Data for PHASE number: 1 ==> Current R_Bragg for Pattern# 1: 7.86

!-----

PbSO4

!

!Nat	Dis	Mom	Pr1	Pr2	Pr3	Jbt	Irf	Isy	Str	Furth	ATZ	Nvk	Npr	More
5	0	0	0.0	0.0	1.0	0	4	0	0	0	0.00	0	7	0

!

P n m a <--Space group symbol

!Atom	Typ	X	Y	Z	Biso	Occ	In	Fin	N_t	Poi	/Codes
Pb	PB	0.81174	0.23348	0.83479	1.42124	0.50000	0	0	0	0	

		11.00	21.00	31.00	0.00	0.00					
--	--	-------	-------	-------	------	------	--	--	--	--	--

S	S	0.93358	0.23348	0.32454	0.41603	0.50000	0	0	0	0	
---	---	---------	---------	---------	---------	---------	---	---	---	---	--

		41.00	21.00	51.00	0.00	0.00					
--	--	-------	-------	-------	------	------	--	--	--	--	--

O1	O	0.80418	0.23348	0.45910	1.99182	0.50000	0	0	0	0	
----	---	---------	---------	---------	---------	---------	---	---	---	---	--

		61.00	21.00	71.00	0.00	0.00					
--	--	-------	-------	-------	------	------	--	--	--	--	--

O2	O	0.59257	0.23348	0.09417	1.47906	0.50000	0	0	0	0	
----	---	---------	---------	---------	---------	---------	---	---	---	---	--

```

! Sc1      Sc2      Sc3      Sc4      Sc5      Sc6
  1.531     0.000     0.000     0.000     0.000     0.000
    0.00     0.00     0.00     0.00     0.00     0.00
!      a      b      c      alpha     beta     gamma
  8.485130  5.402066  6.964059  90.000000  90.000000  90.000000
    0.00000  0.00000  0.00000  0.00000  0.00000  0.00000

```

! Limits for selected parameters (+ steps & BoundCond for SA) :

```

  1      0.0000      1.0000      0.0500      1      x_Pb
  2      0.0000      1.0000      0.0500      1      y_Pb_SO1
  3      0.0000      1.0000      0.0500      1      z_Pb
  4      0.0000      1.0000      0.0500      1      x_S
  5      0.0000      1.0000      0.0500      1      z_S
  6      0.0000      1.0000      0.0500      1      x_O1
  7      0.0000      1.0000      0.0500      1      z_O1
  8      0.0000      1.0000      0.0500      1      x_O2
  9      0.0000      1.0000      0.0500      1      z_O2
 10      0.0000      1.0000      0.0500      1      x_O3
 11      0.0000      1.0000      0.0500      1      y_O3
 12      0.0000      1.0000      0.0500      1      z_O3
! T_ini    Anneal    Accept    NumTemps    NumThCyc    InitConf
  8.000     0.900     0.008         60         0         0
! NCyclM    Nsolu    Num_Ref    Nscalef     Algor
  150         1         71         1         2

```

Magnetic structure determination in complex systems Simulating Annealing (SAnn)

Steps for magnetic structure determination using powder diffraction

Step

Input

Propagation vector(s)
SuperCell <> K_search

*Peak positions of
⇐ magnetic reflections
Cell parameters*

Symmetry Analysis
*BasIreps, MODY,
SARAh*

*Propagation vector
⇐ Space Group
Atom positions*

Extraction of integrated intensities
Le Bail fit with FullProf

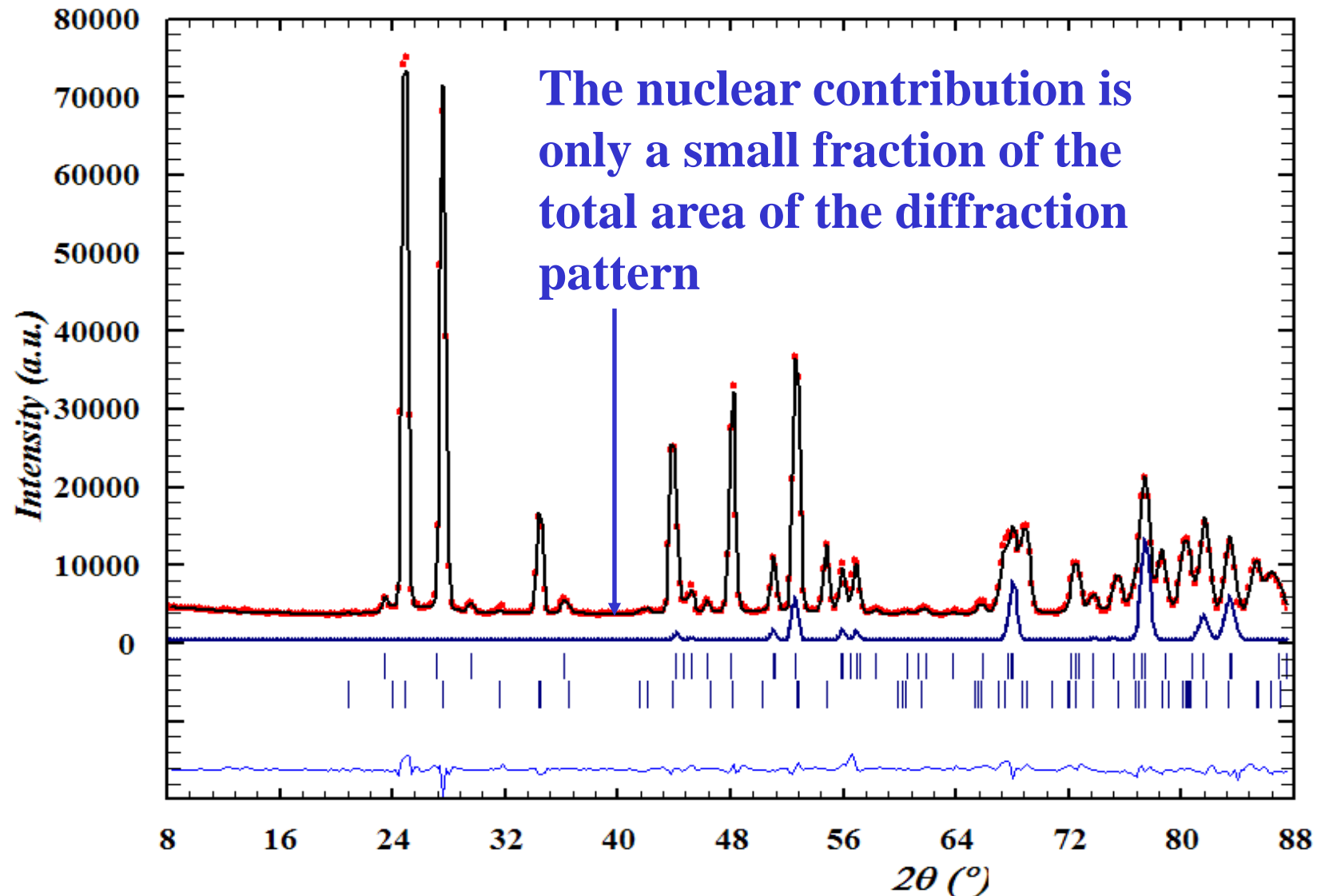
*Experiment profile
⇐ Fixed nuclear structure
propagation vector(s)*

Magnetic structure solution (Sim. Ann.)
FullProf

*Integrated intensities
⇐ Atomic components
of basis functions*

Magnetic Structure of $\text{Ho}_2\text{Cu}_2\text{O}_5$

$\text{Ho}_2\text{Cu}_2\text{O}_5$ at 5K + Nuclear contribution



Magnetic Structure of $\text{Ho}_2\text{Cu}_2\text{O}_5$

- **First step: Indexing** in this case is trivial: All magnetic reflections can be indexed using the propagation vector $\mathbf{k}=(0,1/2,0)$
- **Second step: Extraction** of integrated intensities using a Le Bail fit with **FullProf**. It is supposed that the crystal structure has been refined with a high resolution powder diffraction pattern.

```

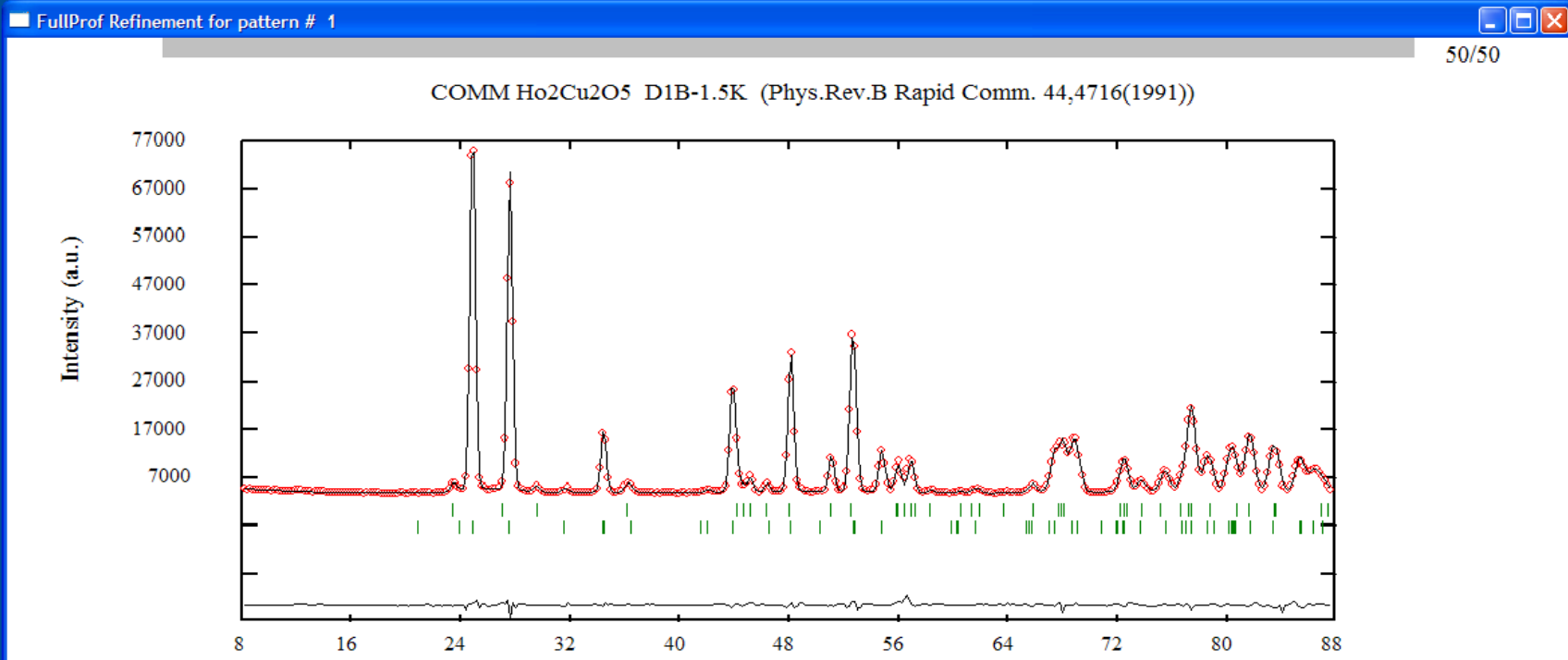
FullProf.2k_Multi_Pattern
=> Pattern: 1 hocu
=> Ordering reflections contributing to each point for pattern: 1
=> Calculation of Yi for all points + Normal Matrix & Vector...
=> Calculation for pattern: 1
=> Writing results for cycle 50
=> R-Factors: 2.47 3.79 Chi2: 10.2 DW-Stat.: 1.2567 Patt#: 1
=> Expected: 1.19 1.6864
=> Conventional Rietveld R-factors for Pattern: 1
=> Rp: 5.51 Rwp: 6.73 Rexp: 2.10 Chi2: 10.2
=> Global user-weighted Chi2 (Bragg contrib.): 11.63
=> -----> Pattern# 1
=> Phase: 1
=> Bragg R-factor: 4.933
=> RF-factor: 3.225
=> Phase: 2
=> Bragg R-factor: 0.7364E-01
=> RF-factor: 0.9981E-01
=> Normal end, final calculations and writing...

=> CPU Time: 6.437 seconds
=> 0.107 minutes

=> END Date:22/05/2005 Time => 14:03:32.184

=> Data Files :
=> - hocu
=> PCR File : hocu-pm

```



GUI for BasIreps

BasIreps Gui Interface

File Run Results Help Exit

BasIreps (May-2004, JRC-LLB)
Irreducible representations of Space Groups
Basis functions of polar & axial vector properties

Code of files:

Working Directory:

Title:

SpaceGroup (HM/Hall symbols) or generators separated by ";":

K-Vector: Brillouin Zone Label:

☐ Polar Vector ☒ Axial Vector

Number of Atoms:

☐ Explicit Sublattices ☒ Atoms in unit cell

	Symbol	x/a	y/a	z/a
Atom # 1	Tb3+	0.00000	0.00000	0.50000
Atom # 2	Tb4+	0.00000	0.50000	0.25000

Code of files

Title

k-vector

Axial/polar

Number of atoms

Working directory

Space group symbol or generators

Brillouin Zone label

Atoms in Unit Cell

Atoms positions

Output of BasIreps

BasIreps provides the basis functions (normal modes) of the irreducible representations of the wave-vector group G_k

$$\mathbf{m}_{ljs} = \sum_{\{\mathbf{k}\}} \mathbf{S}_{\mathbf{k}js} \exp \{ -2\pi i \mathbf{k} \mathbf{R}_l \}$$

$$\mathbf{S}_{\mathbf{k}js} = \sum_{n\lambda} C_{n\lambda}^{\nu} \mathbf{S}_{n\lambda}^{\mathbf{k} \nu} (js)$$

Output of *BasIreps* \Rightarrow Basis Functions (constant vectors)

$$\mathbf{S}_{n\lambda}^{\mathbf{k} \nu} (js)$$

Magnetic Structure of $\text{Ho}_2\text{Cu}_2\text{O}_5$

- **Third step: Symmetry analysis** is not of much help. There is only a single Irrep of dimension 2 and the magnetic representation contains 6 times the Irrep, so $6 \times 2 = 12$ basis functions exist for each site. A total of 48 degrees of freedom defines the magnetic structure: all moments are independent!
- One can reduce a little bit this number by considering only constant moment magnetic structures, but it is tedious to try all combinations.

Magnetic Structure of $\text{Ho}_2\text{Cu}_2\text{O}_5$

Irreducible representation of $Pna2_1$ for $\mathbf{k}=(0,1/2,0)$

$Pna2_1$	1	2_{1z}	a	n
	(x, y, z)	$(-x, -y, z + 1/2)$	$(x + 1/2, -y + 1/2, z)$	$(-x + 1/2, y + 1/2, z + 1/2)$
Γ	$\begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix}$	$\begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}$	$\begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$	$\begin{pmatrix} 0 & -1 \\ 1 & 0 \end{pmatrix}$

Basis Functions for the general position:

$\mathbf{S}_k(1): (u+d, v+e, w+f)$

$\mathbf{S}_k(2): (-u+d, -v+e, w-f)$

$\mathbf{S}_k(3): (-p-a, q+b, -r-c)$

$\mathbf{S}_k(4): (-p+a, q-b, r-c)$

$u, v, w, p, q, r, a, b, c, d, e, f$ are real numbers

Constant moment Magnetic Structures

1	d=e=f=0	a=b=c=0	u = p	v = q	w = r	(+ - - - ; + - + + ; + + - +)
2	d=e=f=0	a=b=c=0	u = -p	v = -q	w = -r	(+ - + + ; + - - - ; + + + -)
3	d=e=f=0	a=b=c=0	u = -p	v = q	w = r	(+ - + + ; + - + + ; + + - +)
4	d=e=f=0	a=b=c=0	u = p	v = -q	w = r	(+ - - - ; + - - - ; + + - +)
5	d=e=f=0	a=b=c=0	u = p	v = q	w = -r	(+ - - - ; + - + + ; + + + -)
6	d=e=f=0	a=b=c=0	u = -p	v = -q	w = r	(+ - + + ; + - - - ; + + - +)
7	d=e=f=0	a=b=c=0	u = p	v = -q	w = -r	(+ - - - ; + - - - ; + + + -)
8	d=e=f=0	a=b=c=0	u = -p	v = q	w = -r	(+ - + + ; + - + + ; + + + -)
9	u=v=w=0	p=q=r=0	d = a	e = b	f = c	(+ + - + ; + + + - ; + - - -)
10	u=v=w=0	p=q=r=0	d = -a	e = -b	f = -c	(+ + + - ; + + - + ; + - + +)
11	u=v=w=0	p=q=r=0	d = -a	e = b	f = c	(+ + + - ; + + + - ; + - - -)
12	u=v=w=0	p=q=r=0	d = a	e = -b	f = c	(+ + - + ; + + - + ; + - - -)
13	u=v=w=0	p=q=r=0	d = a	e = b	f = -c	(+ + - + ; + + + - ; + - + +)
14	u=v=w=0	p=q=r=0	d = -a	e = -b	f = c	(+ + + - ; + + - + ; + - - -)
15	u=v=w=0	p=q=r=0	d = a	e = -b	f = -c	(+ + - + ; + + - + ; + - + +)
16	u=v=w=0	p=q=r=0	d = -a	e = b	f = -c	(+ + + - ; + + + - ; + - + +)
17	d=e=f=0	p=q=r=0	u = a	v = b	w = c	(+ - - + ; + - + - ; + + - -)
18	d=e=f=0	p=q=r=0	u = -a	v = -b	w = -c	(+ - + - ; + - - + ; + + + +)
19	d=e=f=0	p=q=r=0	u = -a	v = b	w = c	(+ - + - ; + - + - ; + + - -)
20	d=e=f=0	p=q=r=0	u = a	v = -b	w = c	(+ - - + ; + - - + ; + + - -)
21	d=e=f=0	p=q=r=0	u = a	v = b	w = -c	(+ - - + ; + - + - ; + + + +)
22	d=e=f=0	p=q=r=0	u = -a	v = -b	w = c	(+ - + - ; + - - + ; + + - -)
23	d=e=f=0	p=q=r=0	u = a	v = -b	w = -c	(+ - - + ; + - - + ; + + + +)
24	d=e=f=0	p=q=r=0	u = -a	v = b	w = -c	(+ - + - ; + - + - ; + + + +)
25	u=v=w=0	a=b=c=0	d = p	e = q	f = r	(+ + - - ; + + + + ; + - - +)
26	u=v=w=0	a=b=c=0	d = -p	e = -q	f = -r	(+ + + + ; + + - - ; + - + -)
27	u=v=w=0	a=b=c=0	d = -p	e = q	f = r	(+ + + + ; + + + + ; + - - +)
28	u=v=w=0	a=b=c=0	d = p	e = -q	f = r	(+ + - - ; + + - - ; + - - +)
29	u=v=w=0	a=b=c=0	d = p	e = q	f = -r	(+ + - - ; + + + + ; + - + -)
30	u=v=w=0	a=b=c=0	d = -p	e = -q	f = r	(+ + + + ; + + - - ; + - - +)
31	u=v=w=0	a=b=c=0	d = p	e = -q	f = -r	(+ + - - ; + + - - ; + - + -)
32	u=v=w=0	a=b=c=0	d = -p	e = q	f = -r	(+ + + + ; + + + + ; + - + -)



Simulated Annealing for magnetic structures

The Simulated Annealing method applied to magnetic structural problems from experimental data was treated for the first time in 1993

J. Rodríguez-Carvajal, Physica B **192**, 55-69 (1993)
(program MAGSAN)

Recent advances in magnetic structure determination by neutron powder diffraction

Juan Rodríguez-Carvajal

*Laboratoire Léon Brillouin (CEA-CNRS), Centre d'Etudes de Saclay, Gif sur Yvette, France and
Institut Laue-Langevin, Grenoble, France*

Simulated Annealing for magnetic structures

Look directly for coefficients of the expansion:

$$\mathbf{S}_{\mathbf{k}js} = \sum_{n\lambda} C_{n\lambda}^{\nu} \mathbf{S}_{n\lambda}^{\mathbf{k}\nu}(js)$$

or components of $\mathbf{S}_{\mathbf{k}}$ and phases, explaining the experimental data

Minimize a reliability factor with respect to the “configuration vector”

$$\boldsymbol{\omega} = |C_1, C_2, C_3, C_4, C_5, \dots, C_m\rangle$$

$$R_m(\boldsymbol{\omega}) = c \sum_{r=1}^N \left| G_{obs}^2(\mathbf{h}_r) - G_{calc}^2(\mathbf{h}_r, \boldsymbol{\omega}) \right|$$

Magnetic Structure of $\text{Ho}_2\text{Cu}_2\text{O}_5$

- **Fourth step: Simulated annealing** in this case is a useful tool to explore the possible constant magnetic moment structures. Hidden symmetries can be found empirically.

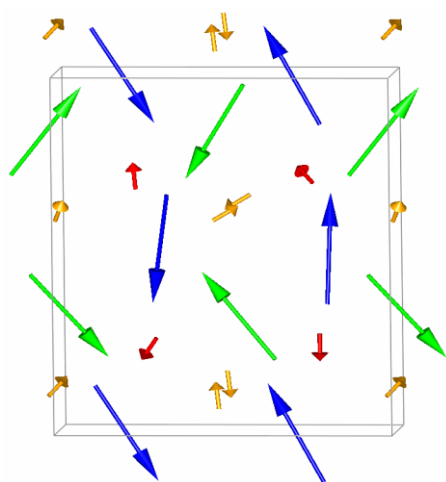
One can try to solve the magnetic structure running a long Simulated Annealing job constraining the magnetic moments of the like ionic species to have the same magnitude

$$m(\text{Ho1}) = m(\text{Ho2}), \quad m(\text{Cu1}) = m(\text{Cu2})$$

This gives 2 magnetic moment parameters and $4 \times 4 \times 2 = 32$ angular parameters, so a maximum of 34 parameters

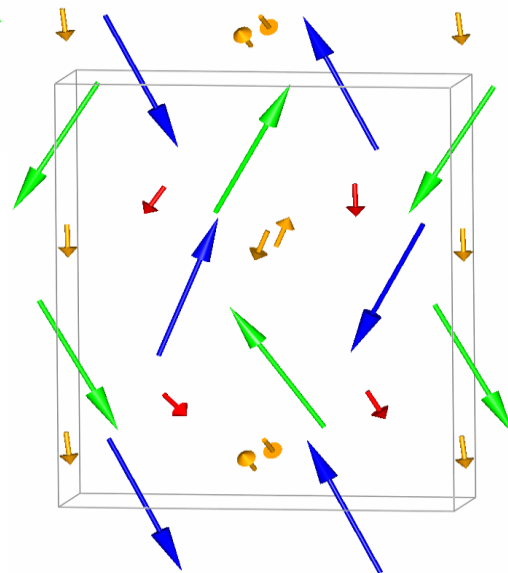
Some simulated annealing results

All runs have been performed using 2 moment parameters and 32 angular parameters (34 parameters)



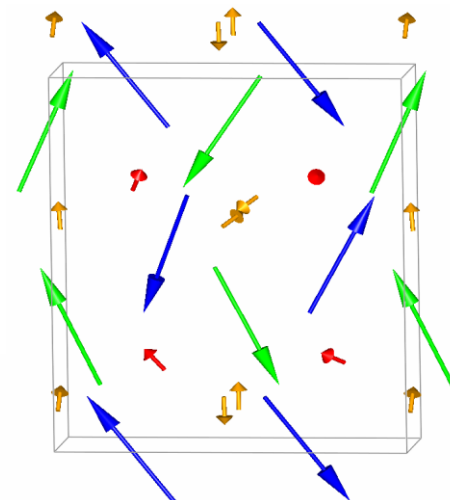
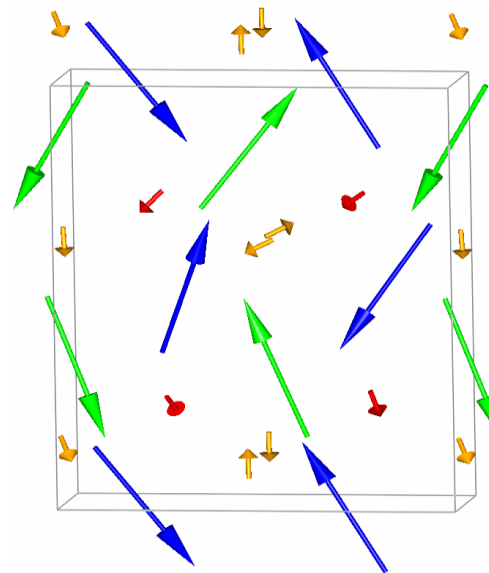
$R(F^2) = 4.20\%$

$R(F^2) = 2.83\%$



$R(F^2) = 3.28\%$

$R(F^2) = 2.92\%$



Some simulated annealing results

One of the results obtained without symmetry constraints is the following:

It is clear that the coupling mode of the Ho sublattices along x and z is

S_x (+ + - +)
S_z (+ - - -)

The coupling mode along y is not clear, but looking in the symmetry table it must be
(+ + + -)

Sol#: 1 RF2= 2.926 ::			
Atom	Rx	Ry	Rz
Ho11	-4.4034	0.2361	7.5183
Ho12	-3.5360	-1.0080	-7.9026
Ho13	3.4545	1.1668	-7.9168
Ho14	-3.2197	1.6990	-7.9194
Ho21	-3.2673	-0.6635	8.0532
Ho22	-4.7332	-0.3892	-7.3086
Ho23	4.8049	-0.3962	-7.2612
Ho24	-4.9525	-1.4590	-7.0224
Cu11	0.0353	0.4925	0.7774
Cu12	-0.0833	-0.0805	-0.9137
Cu13	0.1932	0.1403	-0.8895
Cu14	-0.0846	-0.8771	-0.2680
Cu21	-0.8461	-0.2405	0.2730
Cu22	-0.0024	-0.0187	-0.9208
Cu23	0.4949	0.6256	-0.4604
Cu24	-0.5870	0.3512	-0.6168

Magnetic Structure of $\text{Ho}_2\text{Cu}_2\text{O}_5$

- **Fifth step: The analysis of SAnn results allows to find a hidden symmetry.**

The coupling mode of the Ho ions (when using the automatic numbering given by *BasIreps*) is given by the sequence:

$$\begin{array}{ccc} S_x & S_y & S_z \\ (+ & + & - & + & ; & + & + & + & - & ; & + & - & - & -) \end{array}$$

This corresponds to the basis function in which we put the conditions:

$$\mathbf{u}=\mathbf{v}=\mathbf{w}=0 \quad \mathbf{p}=\mathbf{q}=\mathbf{r}=0 \quad \mathbf{d} = \mathbf{a} \quad \mathbf{e} = \mathbf{b} \quad \mathbf{f} = \mathbf{c}$$

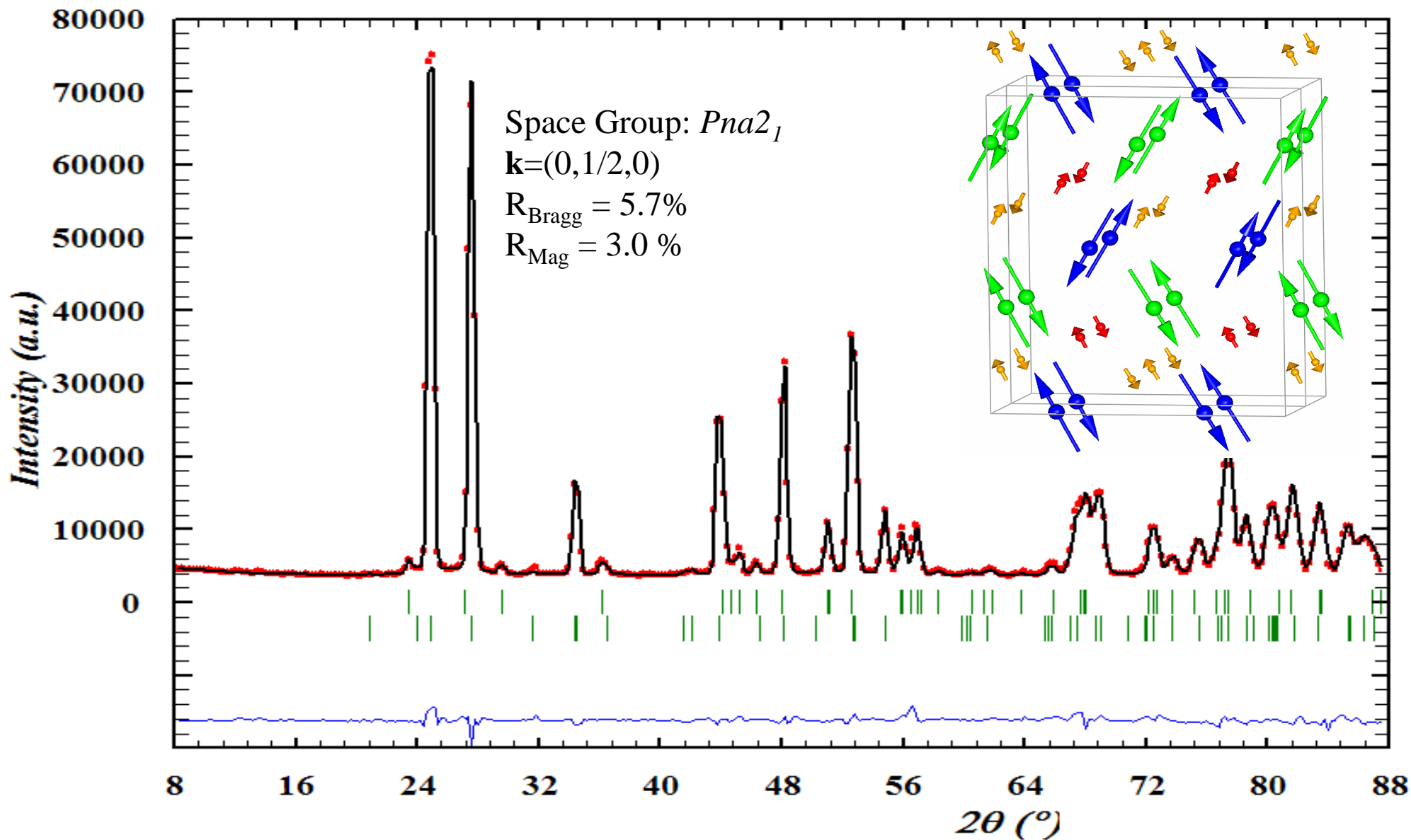
Refinement of the Magnetic Structure of $\text{Ho}_2\text{Cu}_2\text{O}_5$

- **Last step: The refinement** of the magnetic structure by the Rietveld method is perfectly stable if we select the proper free parameters

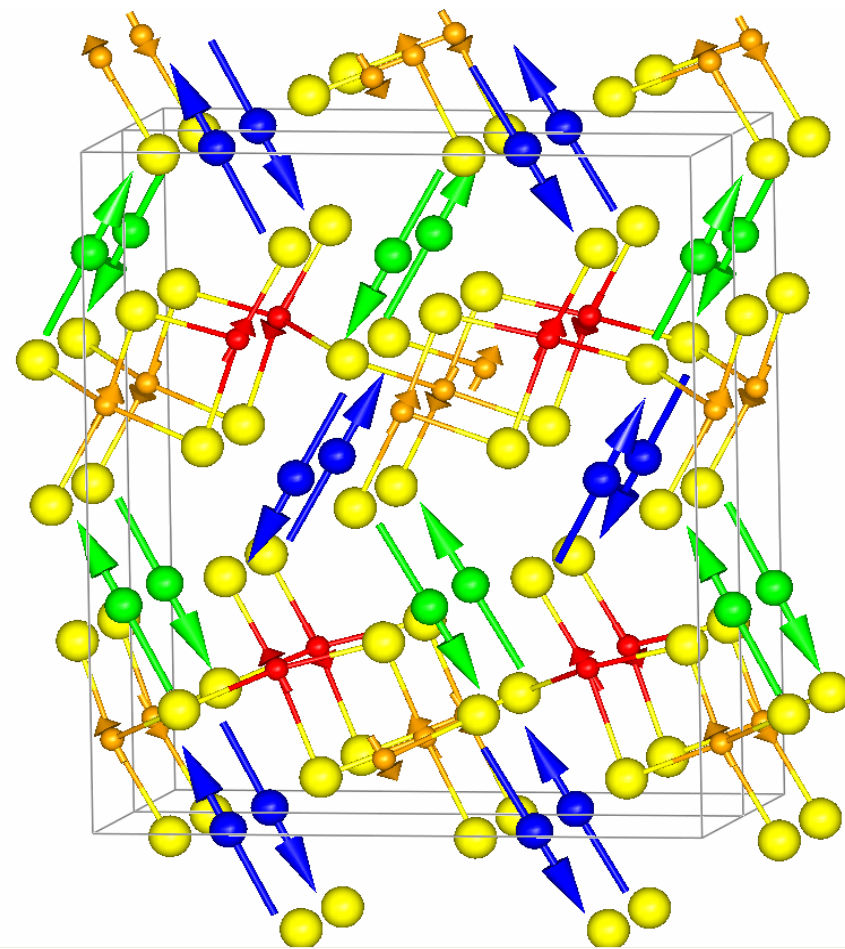
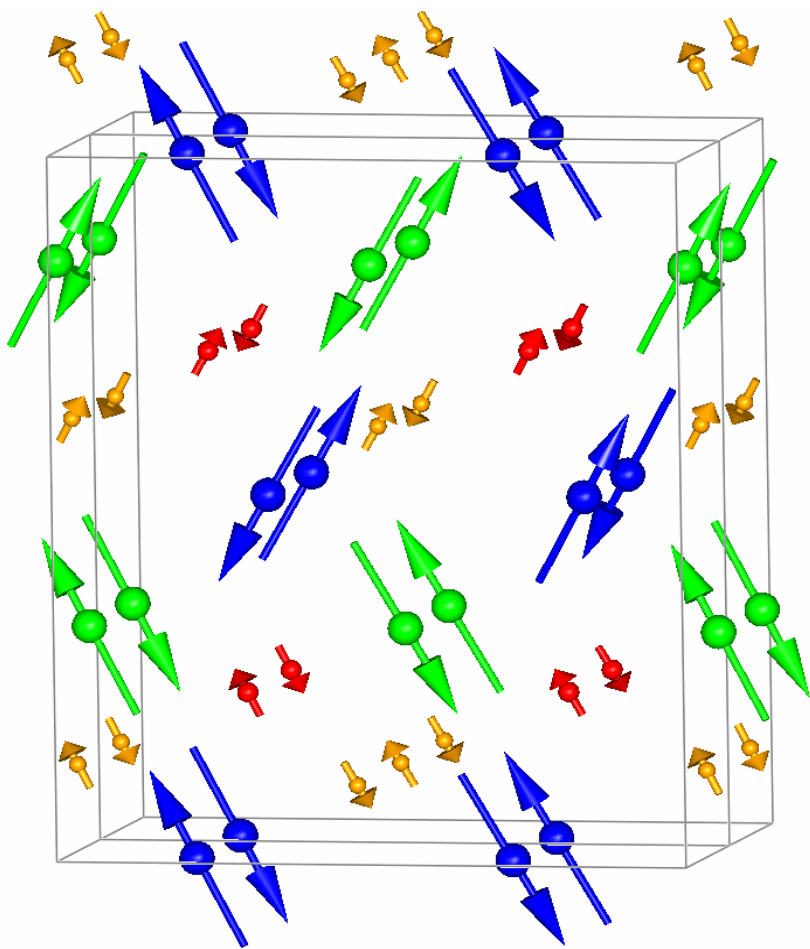
A part the fact that the coupling mode can be considered the same for all sites, we can see from SAnn that the Ho1 and Ho2 sites have also nearly the same components, so **only 3 free parameters can be selected for all Ho^{3+} ions.**

The Cu^{+2} ions contribution is much lower but we can consider (as seen in some SAnn results) that the moments are aligned to those of the Ho ions, so **only the amplitude of the Cu^{+2} magnetic moment** is the additional parameter to fix the magnetic structure

Magnetic Structure of $\text{Ho}_2\text{Cu}_2\text{O}_5$



Magnetic Structure of $\text{Ho}_2\text{Cu}_2\text{O}_5$



Conclusions about the determination of the magnetic structure of $\text{Ho}_2\text{Cu}_2\text{O}_5$

Symmetry Analysis:

The single irreducible representation involved in the magnetic phase transition, does not put enough constraints for the magnetic structure. This is quite usual when 2D representations and general positions are involved.

Simulated Annealing:

The magnetic structure can be obtained without symmetry constraints. Only putting constant moment constraints an analysis of the results of different runs helps to find a hidden symmetry that is consequence of the symmetry of the exchange Hamiltonian.

Refinement

A final structure with only 4 parameters can be refined to convergence. LSQ does not converge by freeing more parameters.

Refinement of magnetic structures using neutron powder diffraction

Input

Magnetic structure
Refinement
FullProf

*Complete structural
⇐ model should be
provided*

Different runs of SAnn jobs may give you an idea of the degeneracy of solutions for your particular problem.

In many cases the number of free parameters is too much high to be refined by LSQ: try to reduce the number of parameters or make soft constraints.

Use spherical components of Fourier coefficients in order to have better control of the amplitude of the magnetic moment

Genetic Algorithms

The method was developed by **John Holland**
over the course of 1960s and 1970s

Adaptation in Natural and Artificial Systems
Ann Arbor: The University of Michigan Press, 1975

Popularised by one of his students: **David Goldberg**
*Genetic Algorithms in Search, Optimization, and
Machine Learning*, New York: Addison-Wesley, 1989

Genetic Algorithms

- Optimises with continuous or discrete large number of parameters. Parallel computers.
- Doesn't require derivative information.
- Simultaneous searches from wide sampling of the cost hypersurface.
- Provides a list of optimum configurations, not just a single solution

Genetic Algorithms

The application of *GA* to crystal structure determination has been started by two groups:

- K. Shankland, W.I.F. David and T. Csoka,
Z. Kristallogr **212**, 550-552 (1997)
- B.M. Kariuki, H. Serrano-González, R.L. Johnston and
K.D.M. Harris, *Chem. Phys. Lett.* **280**, 189-195 (1997)

Continuous parameter GA

