

INSTITUTE OF SOLID STATE PHYSICS University of Latvia



# Solving EXAFS puzzle using reverse Monte Carlo simulations

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## Acknowledgements



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Dr. Matthias Krack



#### Dr. Janis Timoshenko



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# **Talk Outline**

- History of synchrotron radiation research in Latvia
  - Experiments  $\rightarrow$  Effects  $\rightarrow$  Data analysis
- Advanced methods for X-ray absorption spectra interpretation
  - Effect of disorder & multiple-scattering (MS)
- Reverse Monte Carlo (RMC) simulations
  - Capabilities and limitations
  - Crystalline germanium
  - Lattice dynamics in 2D compounds
- RMC applications to multicomponent materials
  - NiWO<sub>4</sub>-ZnWO<sub>4</sub> solid solutions
  - medium-entropy (MnNiCuZn)WO<sub>4</sub> and a high-entropy (MnCoNiCuZn)WO<sub>4</sub> tungstates
- Conclusions





## Synchrotron radiation research in Latvia (I)







## Synchrotron radiation research in Latvia (II)



DEC VAX / Intel 8086/286

#### Intel 386/486

Intel<sup>®</sup> Core<sup>™</sup> i5-2400

Intel<sup>®</sup> XEON





## XAS data analysis in Latvia

#### **EXAFS** analysis



A. Kuzmin, Physica B 208&209 (1995) 175-176.





Preface

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X-ray absorption spectroscopy (XAS) at synchrotron radiation sources is a structural tool providing information on the local atomic and electronic structure around an atom of a particular type. Today XAS is successfully applied to a study of crystalline, nanocrystalline and disordered solids, liquids and gases in a wide range of external conditions defined by temperature, pressure, etc. The size of the region, probed by XAS, depends on the degree of thermal and static disorder present in a material and is limited by the mean-free path of the excited photoelectron. Typically the information reach region extended up to 3-10 A around the absorbing atom.

An advantage of the XAS method is its sensitivity to many-atom distribution functions, giving rise to multiple-scattering (MS) contributions, and to correlation effects in atom dynamics. Note that accurate account of both effects is still challenging.

The time-scale (about 10<sup>-15</sup>-10<sup>-16</sup> s) of the X-ray absorption process is much shorter than the characteristic time (about 10<sup>-13</sup>-10<sup>-14</sup> s) of thermal vibrations. Therefore, the atoms may be considered as frozen at their instantaneous positions during a single photoabsorption process, and the total experimentally measured X-ray absorption spectrum corresponds to the configurational average of all atomic positions over the time of the experiment. This situation can be straightforwardly modelled combining the molecular dynamics (MD) simulation with the extended X-ray absorption fine structure (EXAFS) calculations, known as the MD-EXAFS approach.

Finally, the agreement between the experimental and configuration-averaged EXAFS spectra can be used to validate the accuracy of the interatomic potential (force-field) models employed in the MD simulations.

#### A. Kuzmin and R.A. Evarestov, J. Phys.: Condens. Matter 21 (2009) 055401.

#### **Reverse Monte Carlo (RMC) with Evolutionary Algorithm**



This web-page is a home for a novel simulation-based scheme, developed to probe the local structural and thermal disorder in crystalline and nanocrystalline materials by analyzing fine structure of X-ray absorption spectra (EXAFS). We believe that the proposed method improves the accuracy of currently available approaches for EXAFS analysis, especially in the case of strongly distorted local environment. The method is implemented in freely available EvAX code (see Downloads section).

#### WHY TO TRY EVAX?





specified precision.

EVOLUTIONARY ALGORITHM WAVELET TRANSFORM The representation of EXAFS employs the power of evolutionar spectra in k- and R-spaces algorithm allows much more simultaneously using Morlet efficient exploration of the possible wavelet transform allows one to configuration space and makes obtain more information from the feasible advanced analysis of

READ MORE

same experimental data and to have much better control over the difference between the EXAFS data



ANALYSIS OF EXAFS AT

EvAX code allows to construct an

unambiguous single structure

model consistent with EXAES

data, acquired at several

SEVERAL EDGES

J. Timoshenko, A. Kuzmin, J. Purans, J. Phys.: Condens. Matter 26 (2014) 055401.

symmetry even with only decent

computational resources available





# Advanced methods for X-ray absorption spectra interpretation







## **Basics of X-ray absorption spectroscopy (XAS)**









## How local is X-ray absorption spectroscopy? The case of NiO: $T = \sim 10 \text{ K}$



A. Anspoks, A. Kalinko, R. Kalendarev, A. Kuzmin, Phys. Rev. B 86 (2012) 174114.





# **EXAFS challenges: analysis of distant coordination shells**

NiO

Space group Fm-3m

 $a_0 = 4.1773 \text{ Å}$ 

Ni

The analysis of the distant coordination shells must take into account the multiple-scattering (MS) and disorder effects.



**2** A number of parameters in the model increases rapidly upon an increase of analyzed region size around the absorbing atom.

This problem is especially relevant for <u>disordered</u> and <u>nanocrystalline</u> materials.



A. Kuzmin and J. Chaboy, IUCrJ 1 (2014) 571.

A. Anspoks and A. Kuzmin, J. Non-Cryst. Solids 357 (2011) 2604.





## Why do we need advanced methods of EXAFS analysis?

- To account properly for disorder effects.
- To perform reliable analysis of distant coordination shells.
- To determine bond-angle distribution functions.
- To extract structural information in some specific cases (nanoparticles).
- To validate other theoretical simulations as molecular dynamics or DFT calculations.

<sup>[1]</sup> A. Kuzmin and J. Chaboy, EXAFS and XANES analysis of oxides at the nanoscale, IUCrJ 1 (2014) 571.

<sup>[2]</sup> A. Kuzmin, J. Timoshenko, A. Kalinko, I. Jonane, A. Anspoks, Treatment of disorder effects in X-ray absorption spectra beyond the conventional approach, Rad. Phys. Chem. 175 (2020) 108112.





## Advanced methods of XAS analysis using atomistic simulations





amorphous materials. It also has other advantages in multicomponent systems and as a tool for experi-

mental data analysis.



## **Reverse Monte Carlo (RMC) method:** 1<sup>st</sup> paper



Figure 1 Radial distribution function g(r) for liquid argon; comparison of experiment [3] (solid line) and RMC calculation (broken line).

Figure 2 Structure factor A(O) for liquid argon; comparison of experiment [3] (solid line) and RMC calculation (broken line).

8 9 10 11

R. L. McGreevy & L. Pusztai, Reverse Monte Carlo Simulation: A New Technique for the Determination of Disordered Structures, Molecular Simulation, 1 (1988) 359-367.



S J Gurman† and R L McGreevy‡



## **RMC-EXAFS** approach: Earlier works

#### Reverse Monte Carlo simulation for the analysis of EXAFS data



#### High temperature EXAFS experiments on liquid KPb alloys analysed with the reverse Monte Carlo method

W. Bras <sup>a,b,\*</sup>, R. Xu <sup>c</sup>, J.D. Wicks<sup>d,1</sup>, F. van der Horst <sup>c</sup>, M. Oversluizen <sup>a,b</sup>, R.L. McGreevy <sup>c</sup>, W. van der Lugl <sup>c</sup>

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Studscik Neutron Research Laboratory, Uppsala University, S-61182 Nyköping, Sweden



Fig. 4. EXAFS data,  $F_E(Q)$ , for molten KPb (solid line) compared to the RMC fit with 100% Zintl ions maintained (dotted line)

#### Modelling the Structure and Ionic Conduction of $(AgI)_x(AgPO_3)_{1-x}$ Glasses

J. D. Wicks,1 L. Börjesson,2 G. Bushnell-Wye,3 W. S. Howells4 and R. L. McGreevy5

<sup>1</sup> Department of Physics and Astronomy, Usiversity Collage Landon, Gower Street, Lendon WCIE 68T, U.K.
<sup>2</sup> Department of Physics, Royal Institute of Hetonology, S104 Okohahm, Sweden
<sup>3</sup> SIS Divensity Laboratory, Wenrington, Chabiter W44AD, U.K.
<sup>4</sup> ISIS Science Division, Routerfold Applient Laboratory, Chillino, Didot, Oxen OX11 OQX, U.K.
<sup>5</sup> Studiek Nettern Routerick Laboratory, S-611 82 Nyklopieg, Sweden
<sup>5</sup>



Experimental data (solid curves) and RMC fits (broken curves) for  $(AgI)_x(AgPO_3)_{I-x}$  (top to bottom) x = 0.5, 0.3 and 0.0. EXAFS at (c) the Ag K-edge and (d) the I L<sub>3</sub>-edge.

#### [1] S.J. Gurman and R.L. McGreevy, J. Phys.: Condens. Matter 2 (1990) 9463-9473.

[2] W. Bras, R. Xu, J.D. Wicks, F. van der Horst, M. Oversluizen, R.L. McGreevy, W. van der Lugt, Nucl. Instrum Meth. Phys. Res. A 346 (1994) 394-398.
[3] J.D. Wicks, L. Borjesson, G. Bushnell-Wye, W.S. Howells, R.L. McGreevy, Physica Scripta. T57 (1995) 127-132.





## Available software for RMC-EXAFS simulations

#### RMC-GNXAS [1], RMCprofile [2], RMC++/RMC\_POT++ [3], EvAX [4]

A. Di Cicco, A. Trapananti, J. Phys. Condens. Matter 17 (2005) S135.
 M.G. Tucker, D.A. Keen, M.T. Dove, A.L. Goodwin, Q. Hui, J. Phys.: Condens. Matter 19 (2007) 335218.
 O. Gereben, L. Pusztai, J. Computat. Chem. 33 (2012) 2285.
 J. Timoshenko, A. Kuzmin, J. Purans, J. Phys.: Condens. Matter 26 (2014) 055401.

#### SpecSwap-RMC [5], EPSR-RMC [6]

[5] M. Leetmaa, K.T. Wikfeldt, L.G.M. Pettersson, J. Phys.: Condens. Matter 22 (2010) 135001.
[6] D.T. Bowron, Pure Appl. Chem. 80 (2008) 1211.

rmcxas [7]

[7] M. Winterer, J. Appl. Phys. 88 (2000) 5635.





## **Publications on reverse Monte Carlo simulations of EXAFS**









# Reverse Monte Carlo simulations of EXAFS spectra (RMC-EXAFS)



R.L. McGreevy and L. Pusztai, Mol. Simul. 1 (1988) 359.
 J. Timoshenko, A. Kuzmin, J. Purans, J. Phys.: Condens. Matter 26 (2014) 055401.





## **Reverse Monte Carlo method with Evolutionary Algorithm**

EvAX code was developed by Dr. Janis Timoshenko

J. Timoshenko, A. Kuzmin, J. Purans, J. Phys.: Condens. Matter 26 (2014) 055401. J. Timoshenko, A. Kuzmin, J. Purans, Comp. Phys. Commun. 183 (2012) 1237-1245.



Multiple-scattering approximation

Reliable analysis of distant shells, PDF and BADF



Evolutionary algorithm for optimization

Fast with good convergence



Wavelet transform for spectra comparison in k and R space

More reliable solution



**EXAFS spectra at several edges** 

**One structural model** 

http://www.dragon.lv/evax/





Evolutionary Algorithm for EXAFS analysis

## **Reverse Monte Carlo (RMC) simulation using the EvAX code**

http://www.dragon.lv/evax/







## Fourier and wavelet transforms of EXAFS $\chi(k)$

## Fourier transform:

$$FT(R) = \sqrt{\frac{2}{\pi}} \int_{k_{min}}^{k_{max}} k^n \chi(k) W(k) e^{-2ikR} dk$$

W(k) is the window function

#### Wavelet transform:

$$WT(k,R) = \left(\frac{R}{R_0}\right)^{1/2} \int_{k_{min}}^{k_{max}} (k')^n \chi(k') \phi\left(\frac{k'-k}{R_0/R}\right) dk$$
$$\phi(k) = e^{-2ikR_0} e^{-k^2/\sigma_0^2} \qquad \text{is the Morlet wavelet}$$



Fourier transform is a 1-dimensional integral transformation providing information on the EXAFS signal behavior in *R*-space.

Wavelet transform is a 2-dimensional integral transformation providing information on the EXAFS signal behavior in both k and R spaces.

J. Timoshenko and A. Kuzmin, Wavelet data analysis of EXAFS spectra, Comp. Phys. Commun. 180 (2009) 920-925.





## **RMC** simulations using the EvAX code for crystalline Ge

Calculation time for this example is about 6 min on 6-core CPU.







#### Unraveling the interlayer and intralayer coupling in two-dimensional layered MoS<sub>2</sub>



I. Pudza, D. Bocharov, A. Anspoks, M. Krack, A. Kalinko, E. Welter, A. Kuzmin, Mater. Today Commun. 35 (2023) 106359.





#### Unraveling the interlayer and intralayer coupling in two-dimensional layered MoS<sub>2</sub>



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#### Unraveling the interlayer and intralayer coupling in two-dimensional layered MoS<sub>2</sub>



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## Dimerization of nickel ions in NiWO<sub>4</sub> and Zn<sub>c</sub>Ni<sub>1-c</sub>WO<sub>4</sub> solid solutions

**RDF** 



X-ray absorption spectrum of microcrystalline  $Zn_{0.6}Ni_{0.4}WO_4$  spanning across the range of the Ni and Zn K-edges and W  $L_3$ -edge at 300 K.

Antiferromagnetic NiWO<sub>4</sub> T<sub>Néel</sub> = 60-67 K

#### P2/c (13) monoclinic





Experimental (black dots) and simulated (solid lines) extended X-ray absorption fine structure (EXAFS) spectra  $\chi(k)k^2$  of  $Zn_{0.6}Ni_{0.4}WO_4$  solid solution at the Ni and Zn K-edges and W L<sub>3</sub>-edge (top row), their Fourier transforms (FTs) (middle row) and wavelet transforms (bottom row) at 300 K.

G. Bakradze, A. Kalinko, A. Kuzmin, Evidence of dimerization of nickel ions in NiWO<sub>4</sub> and Zn<sub>c</sub>Ni<sub>1-c</sub>WO<sub>4</sub> solid solutions probed by EXAFS spectroscopy and reverse Monte Carlo simulations, Acta Mater. 217 (2021) 117171.





## Dimerization of nickel ions in NiWO<sub>4</sub> and Zn<sub>c</sub>Ni<sub>1-c</sub>WO<sub>4</sub> solid solutions



- Dimerization of Ni<sup>2+</sup> ions within quasi-one-dimensional zigzag chains of [NiO<sub>6</sub>] octahedra was evidenced in NiWO<sub>4</sub> in the whole studied temperature range. It manifests itself as the splitting of the Ni–Ni radial distribution function into two separate peaks.
- The effect is further preserved in solid solutions Zn<sub>c</sub>Ni<sub>1-c</sub>WO<sub>4</sub> for c≤0.6, which is related to the probability to find two Ni<sup>2+</sup> ions in neighbouring positions.

G. Bakradze, A. Kalinko, A. Kuzmin, Evidence of dimerization of nickel ions in NiWO<sub>4</sub> and Zn<sub>c</sub>Ni<sub>1-c</sub>WO<sub>4</sub> solid solutions probed by EXAFS spectroscopy and reverse Monte Carlo simulations, Acta Mater. 217 (2021) 117171.





## Medium- and High-Entropy Tungstates AWO<sub>4</sub> (A=Mn, Co, Ni, Cu, Zn)



G. Bakradze, E. Welter, A. Kuzmin, Peculiarities of the local structure in new medium- and high-entropy, low-symmetry tungstates, J. Phys. Chem. Solids 172 (2023) 111052.





## Medium- and High-Entropy Tungstates AWO<sub>4</sub> (A=Mn, Co, Ni, Cu, Zn)



Table 1. Jahn–Teller distortion parameter,  $\sigma_{\rm JT}$  (Å), for different octahedra in medium–entropy tungstate (MET) (MnNiCuZn)WO<sub>4</sub> and high–entropy tungstate (HET) (MnCoNiCuZn)WO<sub>4</sub> at 10 K.

	MET	HET
[MnO <sub>6</sub> ]	$0.163\pm0.092$	$0.152\pm0.090$
[CoO <sub>6</sub> ]	-	$0.102\pm0.052$
[NiO <sub>6</sub> ]	$0.091\pm0.057$	$0.085\pm0.056$
[CuO <sub>6</sub> ]	$0.140\pm0.051$	$0.131\pm0.049$
[ZnO <sub>6</sub> ]	$0.122\pm0.046$	$0.115 \pm 0.043$
[WO <sub>6</sub> ]	$0.159\pm0.033$	$0.161\pm0.038$

#### **Conclusions:**

CuWO.

2.6

CuWO.

HET

2.0 2.2 2.4

MET

1.8 2.0 2.2 2.4

2.4

2.0 2.2

2.0 2.2 2.4 2.6

Distance r (Å)

Distance r (Å)

- Ni<sup>2+</sup> ions have regular octahedral environment.
- Mn<sup>2+</sup>, Co<sup>2+</sup>, and Zn<sup>2+</sup> ions have distorted octahedral environment.
- [Cu<sup>2+</sup>O<sub>6</sub>] octahedra are less distorted than expected for a Jahn-Teller centre.

G. Bakradze, E. Welter, A. Kuzmin, Peculiarities of the local structure in new medium- and high-entropy, low-symmetry tungstates, J. Phys. Chem. Solids 172 (2023) 111052.





# Conclusions

#### Advantages of the RMC method:

- A natural way to include disorder (static and dynamic, also anharmonic) into EXAFS simulations taking into account multiple-scattering effects.
- Reliable interpretation of EXAFS far beyond the first coordination shell is possible.
- Analysis at several absorption edges is possible in multicomponent compounds.
- Information on atom-atom and bond-angle distributions and correlations can be obtained.
- Constraints can be easily incorporated to account for information from other experiments (diffraction, total scattering, etc) or chemical/geometrical information (bond-lengths, bonding angles, coordination, energetics, etc).

#### Peculiarities of the RMC method:

- RMC gives the most disordered solution.
- Several simulations are often required for good statistics.
- RMC is sensitive to noise.
- One should be careful with the size of the simulation box.





# **Thank you for your attention!**



#### https://www.facebook.com/EXAFSLab/





The work was supported by the Latvian Council of Science project No. lzp-2022/1-0608.







## https://www.cost.eu/actions/CA22143/

The new COST program "European Materials Informatics Network" (EuMINe) is dedicated to the development, engineering and improvement of materials based on materials informatics, artificial intelligence (AI) and data-centric technologies.

#### The action period is from 24/10/2023 to 23/10/2027.