

### Imaging with Neutrons

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### Imaging is a Growing Part of the ORNL Neutron Sciences Program



### High Flux Isotope Reactor (HFIR)

Intense steady-state neutron flux and a high-brightness cold neutron source

Dedicated Imaging Instrument (MARS) Steadily improving capabilities Expanded support



### **Spallation Neutron Source (SNS)**

World's most powerful accelerator-based neutron source

# VENUS is under construction (start of commissioning in July 2024)



Future CUPI<sup>2</sup>D beamline at STS (Bragg edge and grating interferometry)



### The Neutron Imaging Team





Yuxuan Zhang, HFIR MARS Scientist



James Torres, HFIR MARS Scientist



Jean Bilheux, Computational Instrument Scientist



S. Venkat Venkatakrishnan, Adv. Reconstruction /Machine Learning



Shimin Tang, Artificial Intelligence, Machine Learning, Hyperspectral Imaging



Erik Stringfellow, Imaging Scientific Associate (SA) CAK RIDGE SPALLATION National Laboratory SOURCE



Mary-Ellen Donnelly, Imaging SA



Harley Skorpenske, SNS Group Leader



Jamie Molaison, SNS SNAP SA



Hassina Bilheux, SNS VENUS Scientist



### HFIR imaging has a broad scientific portfolio







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# Outline

- Imaging at the High Flux Isotope Reactor MARS beamline:
  - Principle of neutron radiography and computed tomography at a continuous source
  - The CG-1D imaging beamline
  - Examples

- Imaging at the Spallation Neutron Source:
  - Principle of neutron radiography at a pulsed source
  - Examples
  - The VENUS construction project
- Software tools for imaging

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## What is Neutron Imaging?



 Similar to X-ray Imaging, Neutron Imaging is a <u>non-destructive</u> technique that can <u>spatially resolve</u> the structure of a sample



(Figure source: aven.amritalearning.com,. (2013). Shadows and Pin Hole Camera.)

# Neutrons interact uniquely with matter (cont'd)





scattering

A. Tengattini, et al. Geomechanics for Energy and the Environment 27 (2021)

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5 mm

## Transmitted neutrons recorded as image







### From raw image to normalized image Lambert-Beer Law Sample thickness Transmission Normalized Image $T = - e^{-\mu x}$ Dark Current Raw Attenuation co. Avogadro 0 constant Transmission Density **Open Beam** Dark Current $\mu = \sigma_{tot} \frac{\rho N_A}{M}$ $\frac{Raw(x, y) - DC(x, y)}{OB(x, y) - DC(x, y)} =$ Normalized Image Total cross-section Molar mass

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### Example: visualize live root system







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(J. Warren (PI), H, Bilheux, M. Kang, S. Voisin, C. Cheng, J. Horita, E. Perfect, Plant Soil, 2013)

### Wicking exp. with yarn





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Y. Yuan,Y. Zhang, H. Bilheux, and S. Salmon. "<u>Biocatalytic yarn for peroxide decomposition with con-</u> <u>trolled liquid transport</u>," Advanced Materials Interfaces, 2021, DOI: 10.1002/admi.202002104

# Measures the composition gradient in graded superalloy



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Huang S., Shen C., An K., Zhang Y., Spinelli I., Brennan M., Yu D., Frontiers in Metals and Alloys, 1, 1070562 (2022)



# Measures molten salt densities at MSR operating temperatures



Moon J., Andrews H.B., Agca C., Bilheux J., Braatz A.D., McAlister A., McFarlane J., McMurray J.W., Robb K.R., Zhang Y., Industrial & Engineering Chemistry Research, 61, 17665-17673 (2022)



## Li distribution is heterogenous and faster C-rates lead to more non-uniformity after lithiation



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Y. ZHANG et al., Journal of Power Sources, vol. 376, pp. 125–130, Feb. 2018.

### Measures soot distri device

### lic Gas Reduction





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Gao Z., Zhang Y., Qian S., Yang W., Wu Z., Gluesenkamp K.R., Nawaz K., Gehl A., Chemical Engineering Journal, 454, 140099 (2023)

# Recently improved spatial resolution for finer details









Setup	Max. FOV	CT scan time	Spatial resolution	
Large FOV	80 x 80 mm <sup>2</sup>	≥7 hours	75-100 µm	
High-res	50 x 50 mm <sup>2</sup>	≥70 hours	20-25 µm	

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IPTS-27734, Y. Zhang, 2022



### Neutron Imaging Capabilities at Steady-State (HFIR) Sources



- Radiography
- Tomography
- Grating Interferometry
- Polarized Neutron Imaging
- Monochromatic Imaging





### (Sample credit: George Williams)

Type of detector	Field-of-view (FOV)	Pixel size (µm)	Highest spatial resolution (µm)	Typical acquisition time of 1 radiograph	Maximum speed @16 bit
High-res	50 x 49 mm <sup>2</sup>	7.63	20-25	360 s	1 image/second
High-speed	88 x 88 mm <sup>2</sup>	43	~100	_	74 image/second
Balanced	88 x 88 mm <sup>2</sup>	16	~50	30-90 s	1 image/second

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Jean

## Imaging at a pulsed source (SNS)





# Higher energy neutrons can also be used for imaging (neutrons of energies higher than 1 eV): Resonance Imaging







Zhang Y., Myhre K.G., Bilheux H.Z., Tremsin A.S., Johnson J.A., Bilheux J., Miskowiec A., Hunt R.D., Santodonato L., Molaison J.J., "<u>Neutron Resonance Radiography</u> and Application to Nuclear Fuel Materials", *Transactions of the American Nuclear Society*, (2018).

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(\*)Soil surveys in UK (1978-1983, 2000, 2011-2012)

#### Attenuation 900 800 800 0.8 Attenuation .0 0.4 0.2 0.2 0 0 100 200 300 400 500 600 700 800 900 1000 100 200 600 700 0 300 400 500 800 900 Neutron energy (eV) Neutron energy (eV)

### Simulated resonance for elements of interest(\*)

—Zn

-64-Zn

——65-Zn

1.2

1

- transmission through 0.01 mm thickness of <sup>nat</sup>Co (between 1 and 5 Å) = 99.5 %

• Soil surveys, contaminants in soil, etc.:

<sup>nat</sup>Co and <sup>nat</sup>Zn

1.2

1

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- transmission through 1 mm thickness of <sup>nat</sup>Zn (between 1 and 5 Å) = 96.4 \%

-Co

—Zn





1000

Zn isotopes

—\_\_\_\_67-Zn

— 68-Zn

-66-Zn



- Hg contamination in soil
  - Assumptions: 0.1 mm Hg (13.6 g/cm<sup>3</sup>) + 12.5 mm SiC (with 1.5 g/cm<sup>3</sup>)
    - Transmission (1 and 5 Å) = 66.4 %





Using epithermal neutrons (energy > 1 eV), resonance imaging can map the isotopic content in advanced nuclear fuel materials in 3D



Distribution of elements drive the performance of the novel advanced nuclear fuel materials





### Quantitative analysis is being developed using in-house open source Python package (ResoFit)

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Myhre K.G., Zhang Y., Bilheux H.Z., Johnson J.A., Bilheux J., Miskowiec A., Hunt R.D., "<u>Nondestructive Tomographic Mapping of Uranium and Gadolinium Using Energy-Resolved</u> <u>Neutron Imaging</u>", *Transactions of the American Nuclear Society*, (2018).

# Bragg edge imaging: how does it work?





# Principle of Bragg edge Transmission

✓ Utilizes thermal and cold neutrons (approximately between 1 and 10 Å) ✓ Obeys Bragg's Law  $\lambda_{hkl} = 2d_{hkl} \sin \theta_{hkl}$  simplifies:  $\lambda_{hkl} = 2d_{hkl}$ 





## The perfect case study: powders

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Song G., Lin J.Y., Bilheux J., Xie Q., Santodonato L., Molaison J.J., Skorpenske H.D., dos Santos A.M., Tulk C.A., An K., Stoica A.D., Kirka M.M., Dehoff R.R., Tremsin A.S., Bunn J.R., Sochalski-Kolbus L.M., Bilheux H.Z., "Characterization of Crystallographic Structures Using Bragg-Edge Neutron Imaging at the Spallation Neutron Source", Journal of Imaging, **3**, 4, 65 (2017). Materials Behavior: Monitoring residual strain relaxation and preferred grain orientation or additively manufactured Inconel 625 by in-situ neutron imaging



Fig. 8. Strain distribution (in microstrain) at the (111) Bragg edge measured at room temperature along the sample thickness direction X. SNAP beamline. The image integration time was about 2 h at SNAP.  $\lambda_0$  value is taken from the annealed sample #1–8 (average across the entire sample). The legend indicates the strain values in microstrain.





Engineered Materials: Monitoring residual strain relaxation and preferred grain orientation of additively manufactured Inconel 625 by in-situ neutron imaging (10 min measurements)







Modeled and experimental results.

AM Inconel 625 strain evolution as a function of temperature







Fig. 16. Variation of the standard deviation of the reconstructed strain as a function of image integration time. Three different sizes of the area used for pixel grouping are used for strain reconstruction, as indicated by the legend (in mm<sup>2</sup>).

Tremsin et al, Nuc. Instr. Methods in Phys. Res. A, 2021.



Tremsin et al, Additive Manufacturing, 2021.

### **Autonomous Hyperspectral Neutron CT Experiment** at ORNL

Detector Sample

Goniometers

Light scan and preselection of projection angles



HyperCT



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**Sample Adaptive Scanning Angles** (active learning)



### February 2020 to now







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- The VENUS construction project

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# Simple tasks that could be showstoppers because of the amount of files

- Renaming thousand of files (keep/don't keep part of the initial file name)

   <sup>1</sup>/<sub>1</sub>/<sub>2</sub>/<sub>2</sub>/<sub>3</sub>/<sub>3</sub>/<sub>4</sub>
- Binning pixels



- Combining images (tiff, fits) 2 by 2, 3 by 3, etc. using different algorithms
- Combining folders
- Dealing images
- Extract evenly spaced files





# More complicated tasks

- Create a list of file name vs time stamp
- Display and export images with metadata/time stamp
- Display the change of a given metadata over time on top of images
- Gamma filtering optimization tool
- Profiles

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- Linear
- Radial
- Calibrate transmission
- Normalization





### Advanced tasks





Acoustic facturing in shale samples. Richard Hale et al.

200

25 2.0

1.5

1.0

Water Intake Position (mm) vs Time Stamp (ms)

time stamp (m

### Solution: Jupyter notebooks







# Simple tasks fbathcondeteestks wstoppers



- Renaming thousand of files (keeping or not part of the initial file name)
- Binning pixels



- Combining images (tiff, fits) 2 by 2, 3 by 3, etc. using different algorithms
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# Simple tasks for the notebooks



- Renaming thousand of files (keeping or not part of the initial file name)
- Binning pixels



- Combining images (tiff, fits) 2 by 2, 3 by 3, etc. using different algorithms
- Combining folders
- Dealing images
- Extract evenly spaced files



### Simple tasks for the notebooks







Extract from list of files every n spaced files



### Simple tasks for the notebooks



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### Extract evenly spaced files



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#### Neutron Imaging > Tutorials > Notebooks Tutorials > Extract Evenly Spaced...

### EXTRACT EVENLY SPACED FILES

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Notebook name: extract\_evenly\_spaced\_files.ipynb

### Description

This notebook allows you to copy into a new folder (extract) 1 every n files from the source folder. You will need to provide the skipping factor n in the notebook. You will also have the option to rename those files, as they are copied, in order to keep a linear increasing index starting at index 0.

#### Example:

🚳 Extract Evenly Spaced Files :: 🛙 🗙 🔫

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Neutron Imagi

let's pretend you selected a folder (/Users/j35/my\_data/) containing the following 21 images

#### Input

image_001.fits	
image 002.fits	
• image 003.fits	
image_004.fits	
image 005.fits	
image_006.fits	
image_007.fits	
image_008.fits	
image_009.fits	
image_010.fits	
image_011.fits	
image_012.fits	
• image_013.fits	
• image_014.fits	
• image_015.fits	
• image_016.fits	
• image_017.fits	
• image_018.fits	
• image_019.fits	
<ul> <li>image_020.fits</li> </ul>	
• image_021.fits	
and you decided to extract 1 every 5 files in the Desktop.	
The notabook will create the folder called ///sers/i25/Deskton/my, data 1 every 5 files and will convithe following fi	ile



### Advanced tasks

### Bragg Edge



### Images and Metadata Extrapolation Matcher





### Registration





Courtesy of Charles Finney and Frederik Ossler.



### Registration







### How to access all those tools?



- Go to analysis.sns.gov
- Select Applications > Analysis-Imaging

### PROS

- Nothing to install
- You always get the latest up-to-date version of the software
- No need to move the data (fast access)
- Availability of many other tools (Matlab, IDL, ImageJ, ...)





### How to access all those tools?





View HFIR Virtual Tour



View SNS Virtual Tour

### Experiment planning tools: *NEUIT* (*NEUtron Imaging Toolbox*)





### Introduction

Here we present a toolbox to provide interactive and user-friendly applications that can be used for Neutron Imaging related calculations.

Tools available here are build upon open source libraries, such as *ImagingReso*, *periodictable*, *braggedgemodeling*, *diffpy.structure*, etc., using <u>Dash</u> framework.

Detailed functionality description is available inside each application.

### Disclaimer

The energy dependent cross-section data used are from <u>National Nuclear Data Center</u>, a published online database. <u>Evaluated</u> <u>Nuclear Data File</u>, <u>ENDF/B-VII.0</u> and <u>ENDF/B-VII.1</u> are currently supported. More evaluated database will be added in the future.

Please note that the energy dependent cross-section of hydrogen in ENDF/B database is for a free H atom. When interacting with slow neutrons in the cold range, the cross-section of a bonded H could be underestimated when using this tool. In a recent update to support *ImagingReso (v1.7.4)*, some experimentally measured cross-sections (ref1 and ref2) of a bonded H are now available.

### Cite this work

1.Yuxuan Zhang, Jean Bilheux, Hassina Bilheux and Jiao Lin, (2019) "<u>An interactive web-based tool to guide the preparation of</u> <u>neutron imaging experiments at oak ridge national laboratory</u>", *Journal of Physics Communications*, 3(10), 103003.

2.Yuxuan Zhang and Jean Bilheux, (2017), "ImagingReso: A Tool for Neutron Resonance Imaging", Journal of Open Source Software, 2(19), 407.

### Contact us

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( iNEUIT v0.0.25 )



- Nuclear database supported
  - ENDF/B-VIII.0 (BNL)
  - ENDF/B-VII.1 (BNL)
- Elemental/isotopic info
  - PeriodicTable 1.5.0 (NIST)

#### **NEU**tron Imaging Toolbox (*NEUIT*) https://neuit.ornl.gov 한 숲 🕈 🖬 💐 💐 🖓 🖓 🌦 ㅎ 🗋 🌧 🗆 🤹 iNEU tron maging Toolbox Home Cold neutron transmission **Bragg Edge Simulator** Neutron resonance More about this tool **Global parameters:** Temperature (K) Source-to-detector (m) Delay (µs) 19.855 Step (Å): Min. (Å) Max. (Å) Energy range: 0.05 5.5 0.005 Input elements 1e-05 eV 0.0001 0.001 eV 0.01 eV 0.1 eV 1 eV 10 eV 100 eV 1000 eV 10000 eV 100000 1000000 Structure #1 Structure #2 Structure #4 Structure #3 Wavelength (Å) Speed (m/s) Time-of-flight (us) Neutron classification Energy (eV) Drag & Drop or Select File (.cif or previously exported structure from this page Add row 0.286 13832.93 1189.1914 Epithermal 100 0.0286 138329.29 118.9191 Epithermal Texture Source-to-detector (optional): Energy step: 0.01 (eV) (m) 16.45 Grain size (mm) 0.001 NOTE: Pick a suitable energy step base on NOTE: Please ignore the above input field if NOT ь (Å) c (Å) 3.5238 3.5238 the energy range selected. interested in display of time-of-flight (TOF). 3.5238 beta (\*) gamma (\*) 90 Sample info Export structure #1 Submit Density (g/cm<sup>3</sup>) **Chemical formula** Thickness (mm) Ag 1

### Bragg edge simulator

Select a Tool \*

Structure #5

beta (rad)

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Resonance

## Thank you

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The portion of this research used resources at the SNS and HFIR, DOE Office of Science User Facilities operated by the Oak Ridge National Laboratory.



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