



# Morphological-informed Thermal Property Prediction in the Engineering Domain

November 2022

*Changing the World's Energy Future*

Jackson R Harter



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**Jackson R Harter**

**November 2022**

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11/30/2022  
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*INL/MIS-22-70358*

## Introduction

- Who am I?
- Not a good student growing up
- I went to culinary school after high school
  - Worked in restaurants for many years, taught culinary school
- Enrolled at Oregon State University in 2009 at 25, received doctorate in 2019
- Intern at INL summer 2015, 2016, 2018
  - Hired as staff January 2020



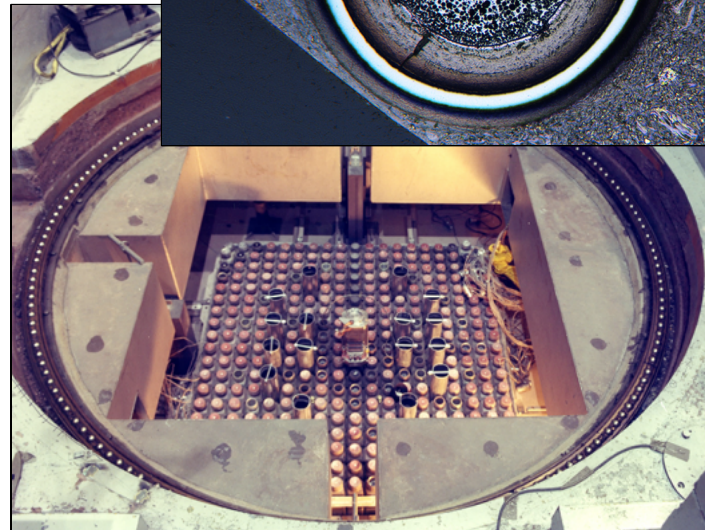
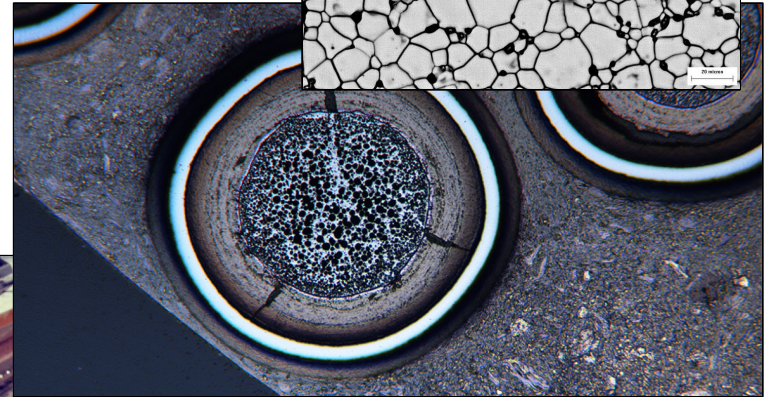
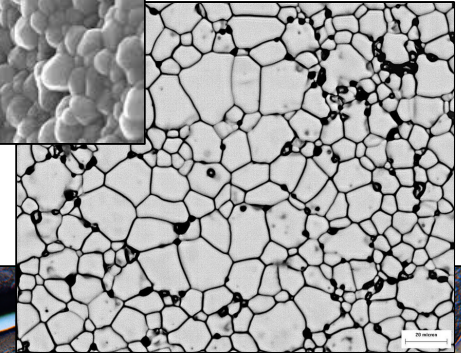
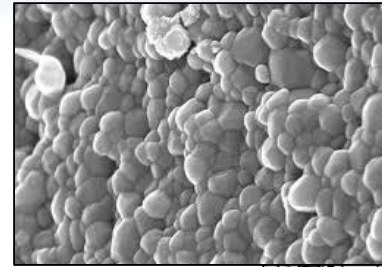
## *Outline*

- Motivation and applications of microscale heat transport
- Phonons and thermal electrons
  - Length scale dependence of thermal properties
  - Physics & methods of microscale heat transport
  - Thermal interface resistance
  - Code development
- Thermal properties from atomic scale to engineering scale
  - Importance
  - Precision multiphysics and multiscale methods

# Motivation

## Thermal properties

- Insights on thermal properties are critical to understanding thermal performance
- But these *macroscopic* quantities used in engineering applications are affected by changes at the *microstructural* and *atomic* level





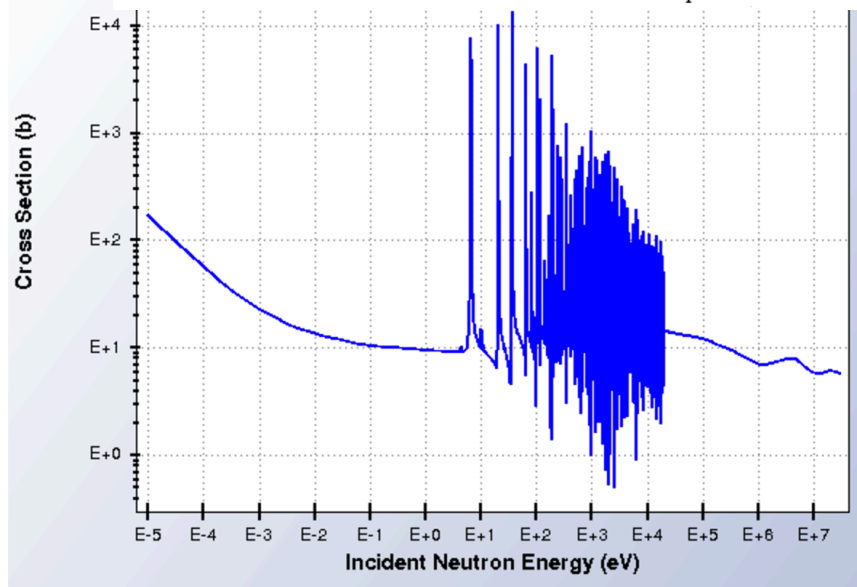
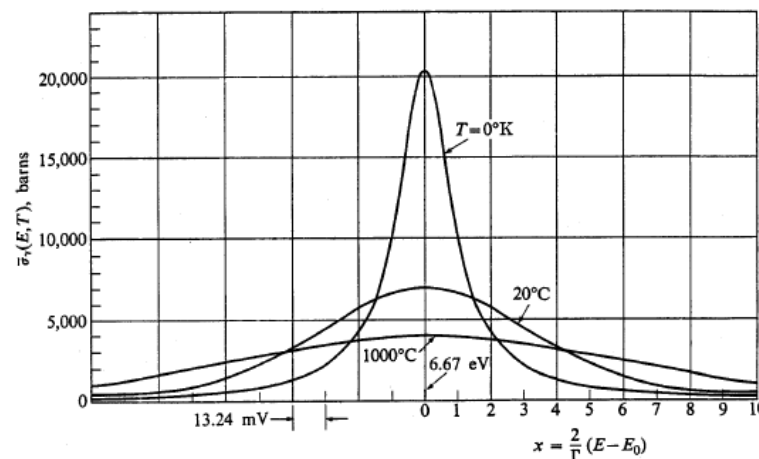
# Motivation

*Applications in nuclear science*

- The neutron interaction cross section is highly influenced by changes in temperature
  - Change in target size



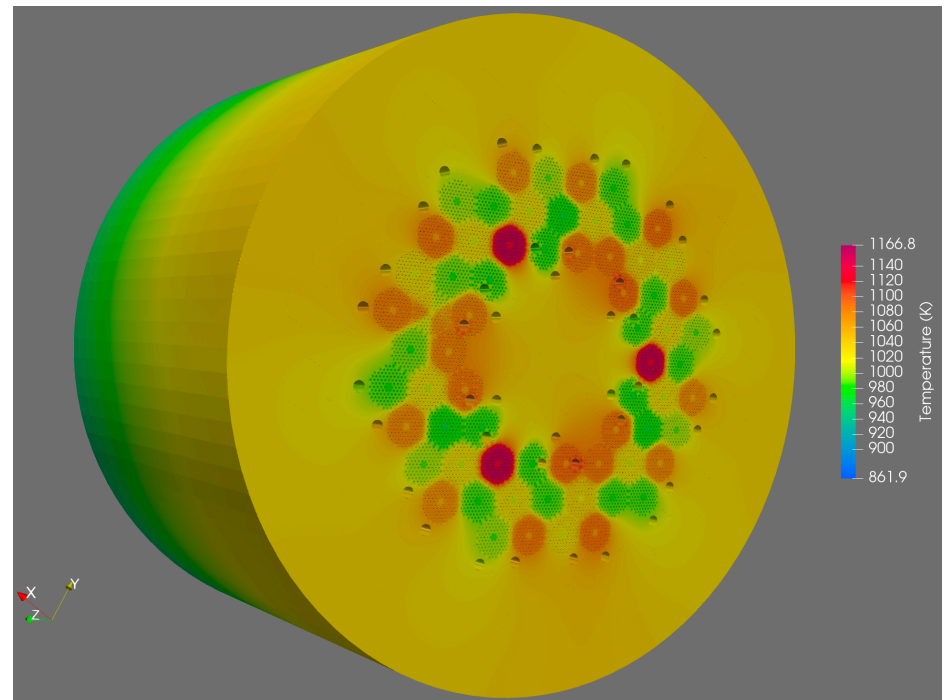
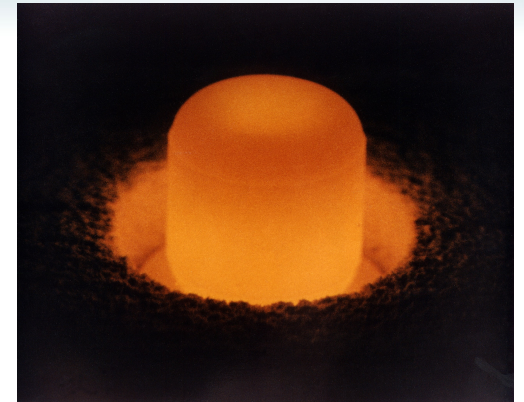
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# Motivation

## *Nuclear reactor fuel performance*

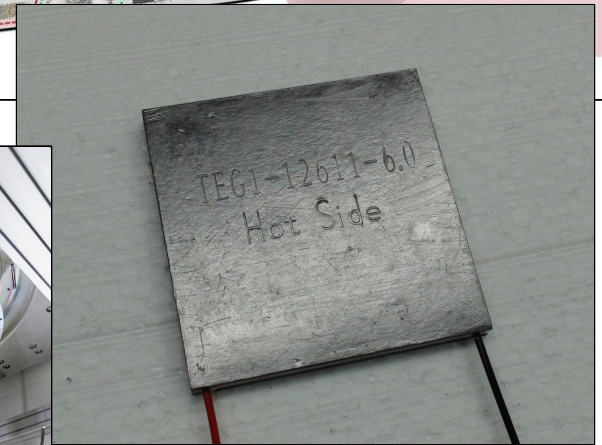
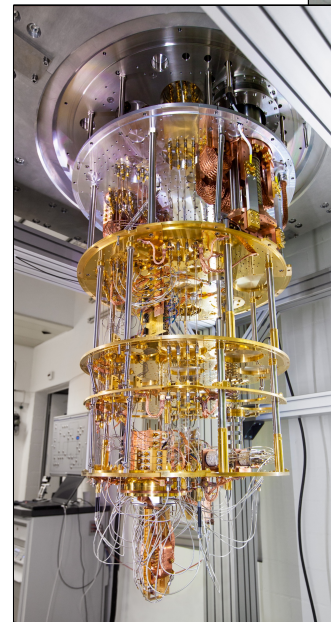
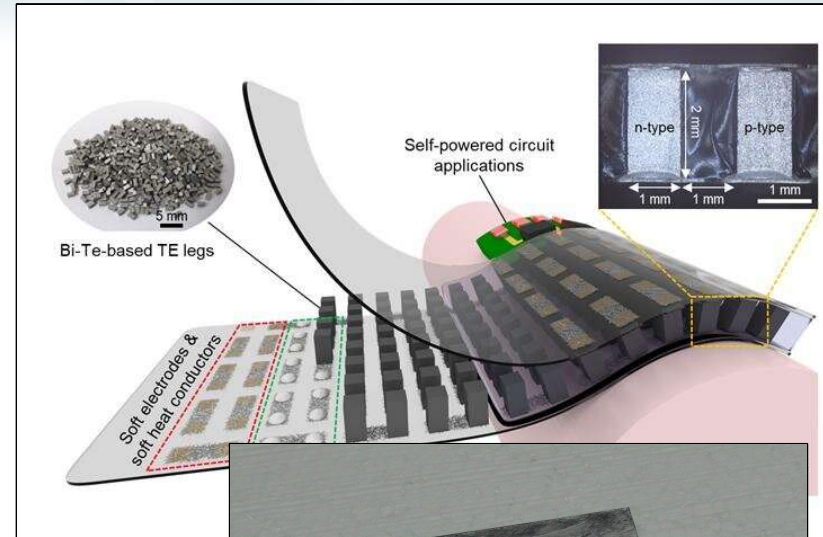
- Predicting fuel performance and reactor control is mission critical for Gen-IV technologies
  - $\text{UO}_2$ , USi, UC, UPuZr
  - Ceramic, metallic, or hybrid
- Neutron cross sections and fuel performance categorically different based on
  - Fuel material
  - Neutron spectrum
- What do we want? Safe nuclear power, efficient reactors
  - Accident tolerance



# Motivation

## *Thermoelectric devices and more*

- Thermoelectric devices
  - Seebeck effect
  - Recycling waste heat to produce electricity
  - Remote nanosensors
- Thermal management in traditional and quantum computing
  - Devices need to be kept at certain temperatures in order to perform

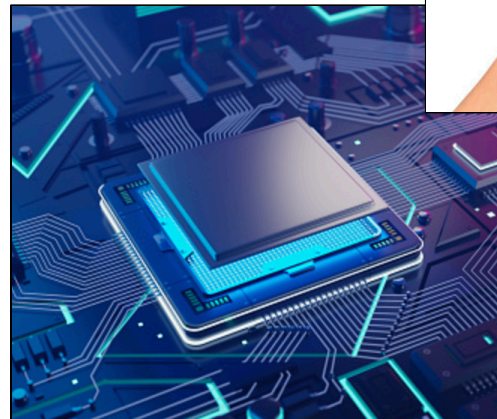




# Motivation

*Assisting new research and development*

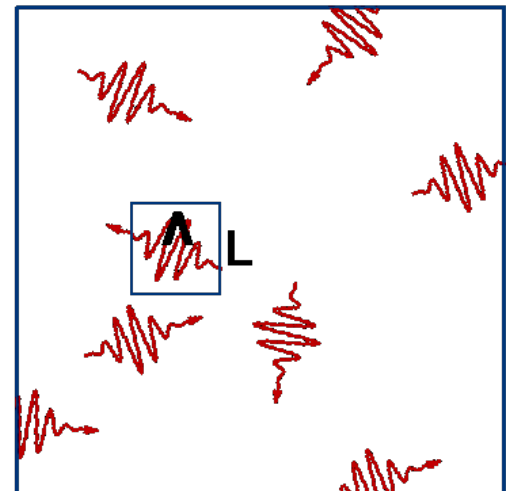
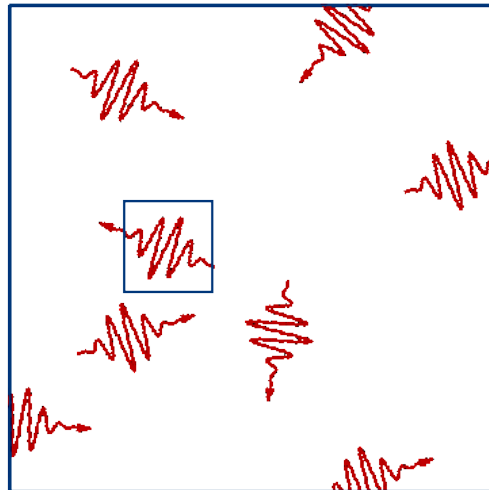
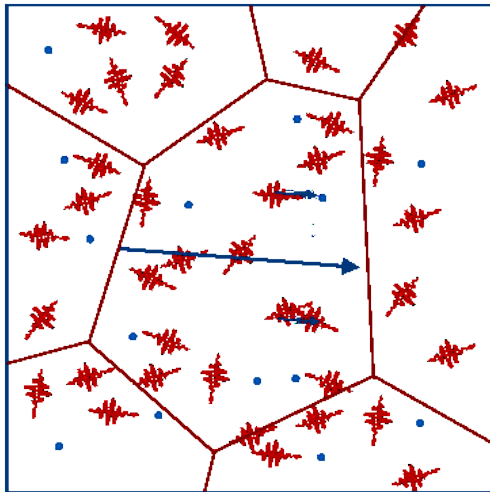
- Reduce the need for expensive experimentation
  - Work by Majumdar in 1990s on microscale thermal transport
- Increasing speed of development of new materials and devices
  - Narrow window of experimentation
  - Reduce costs, allow for less expensive fabrication
- How is this done?



# Mechanistic prediction of thermal properties

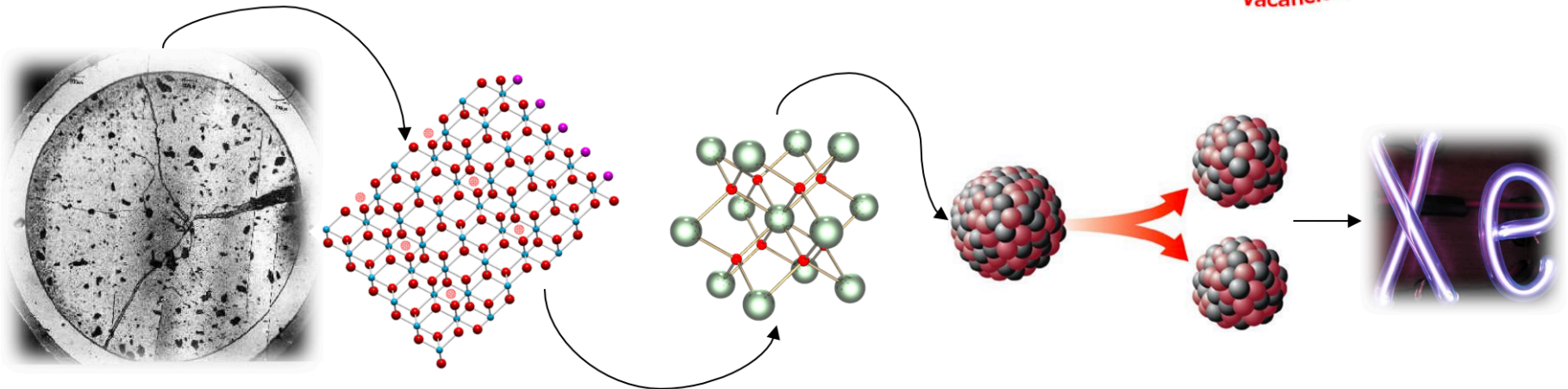
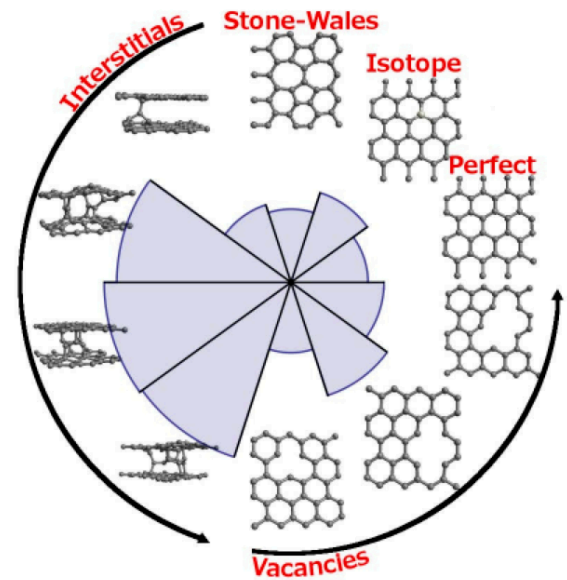
## Conduction at the atomic scale

- Transporters of thermal energy
  - Electrons (metallics)
  - Phonons (dielectrics and insulators)



## Defect influence on thermal transport

- What are defects?
  - Structural anomalies in the atomic lattice
- Defect presence causes increased phonon and electron scattering, lowering heat flux and thermal conductivity
- This is a complex, *multiphysics* challenge



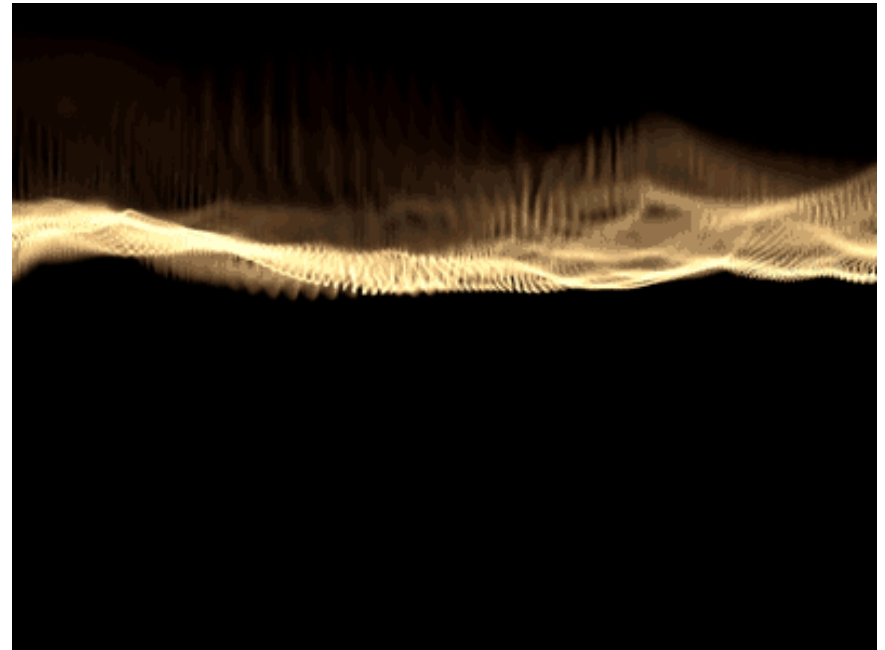
*Why should you care?*

***Our (lack of) understanding of materials behavior is a limiting factor in all engineering disciplines***

# Overview

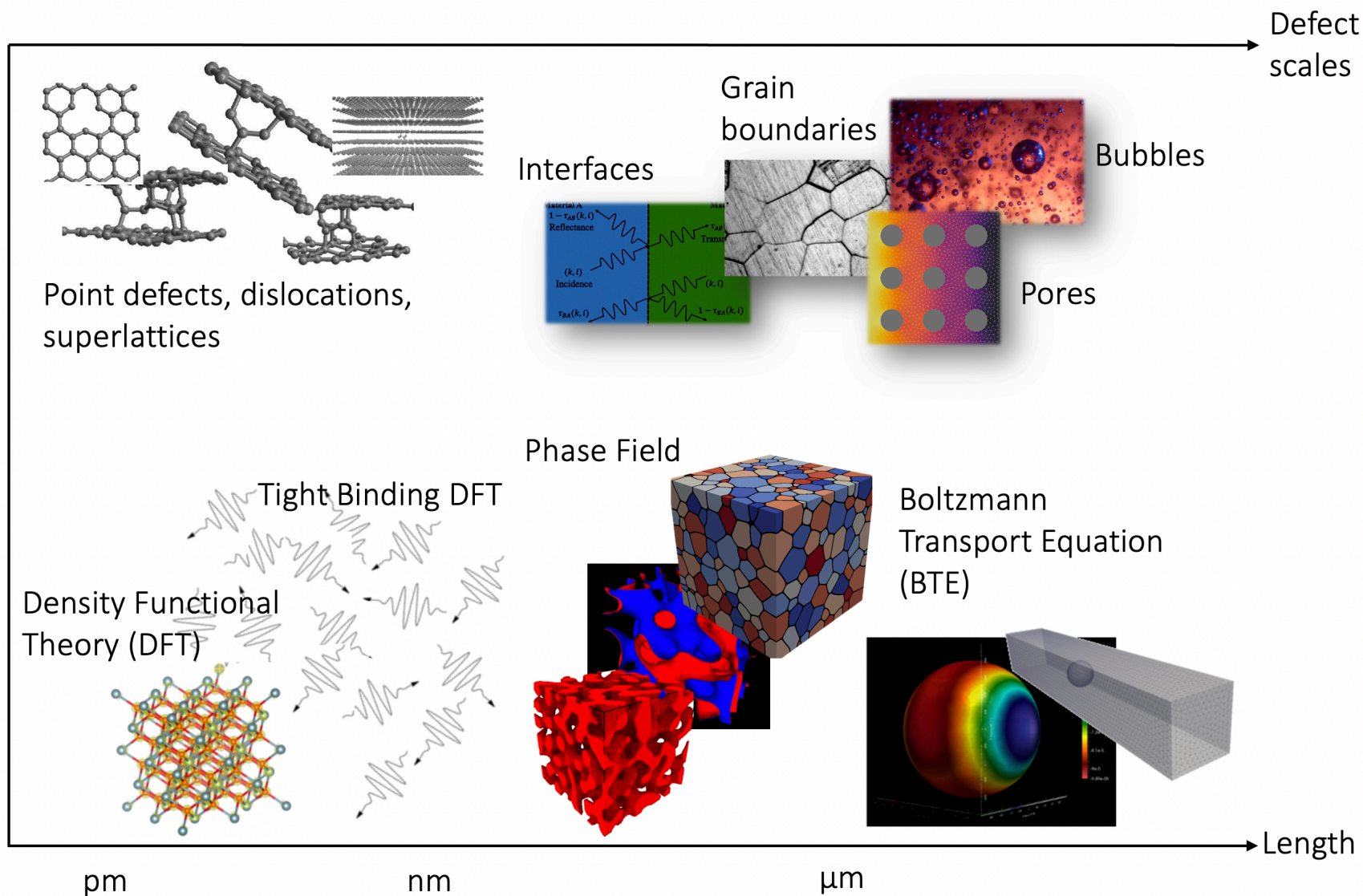
## *What are phonons and electrons?*

- For materials in the solid state a vibrational spectrum  $\omega$  exists
  - Phonons are generated via atomic displacements
  - Phonons are quantized waves, simulated as quasi-particles
  - Follow Bose-Einstein statistics
- Electrons are also simulated as quasi-particles
  - Not generated from displacements, but moved through thermal and electrical influence
  - Follow Fermi-Dirac statistics



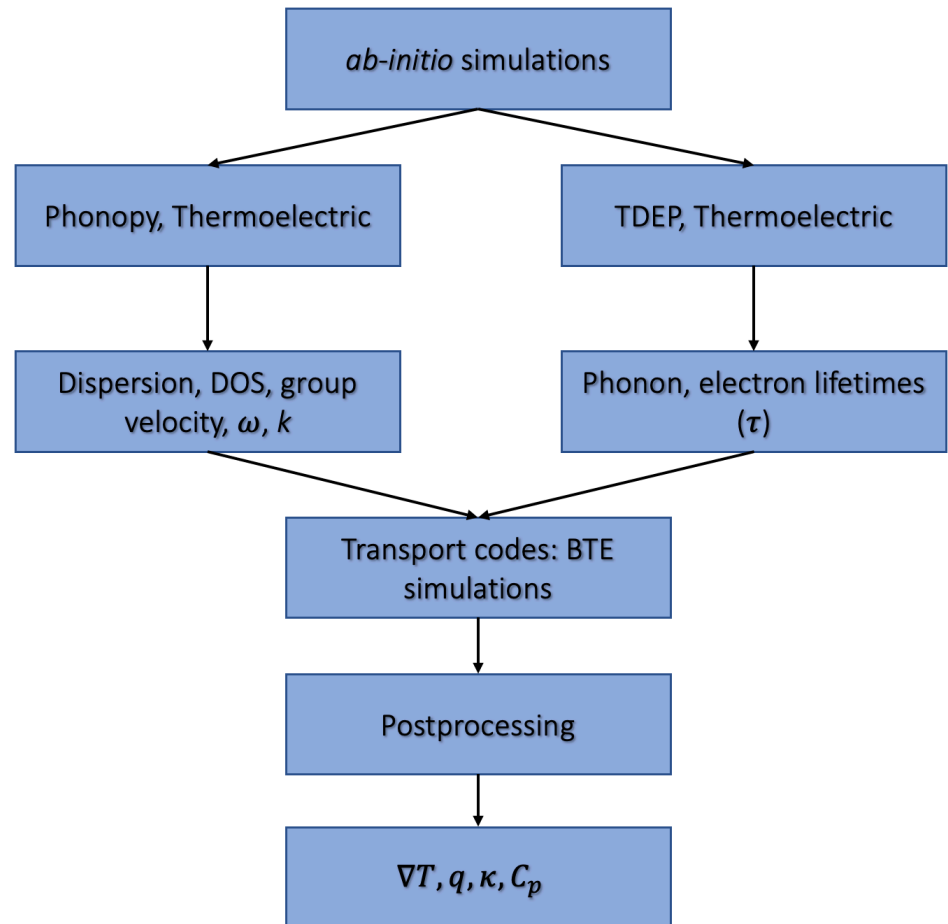


# Scale and defect regimes in heat transport

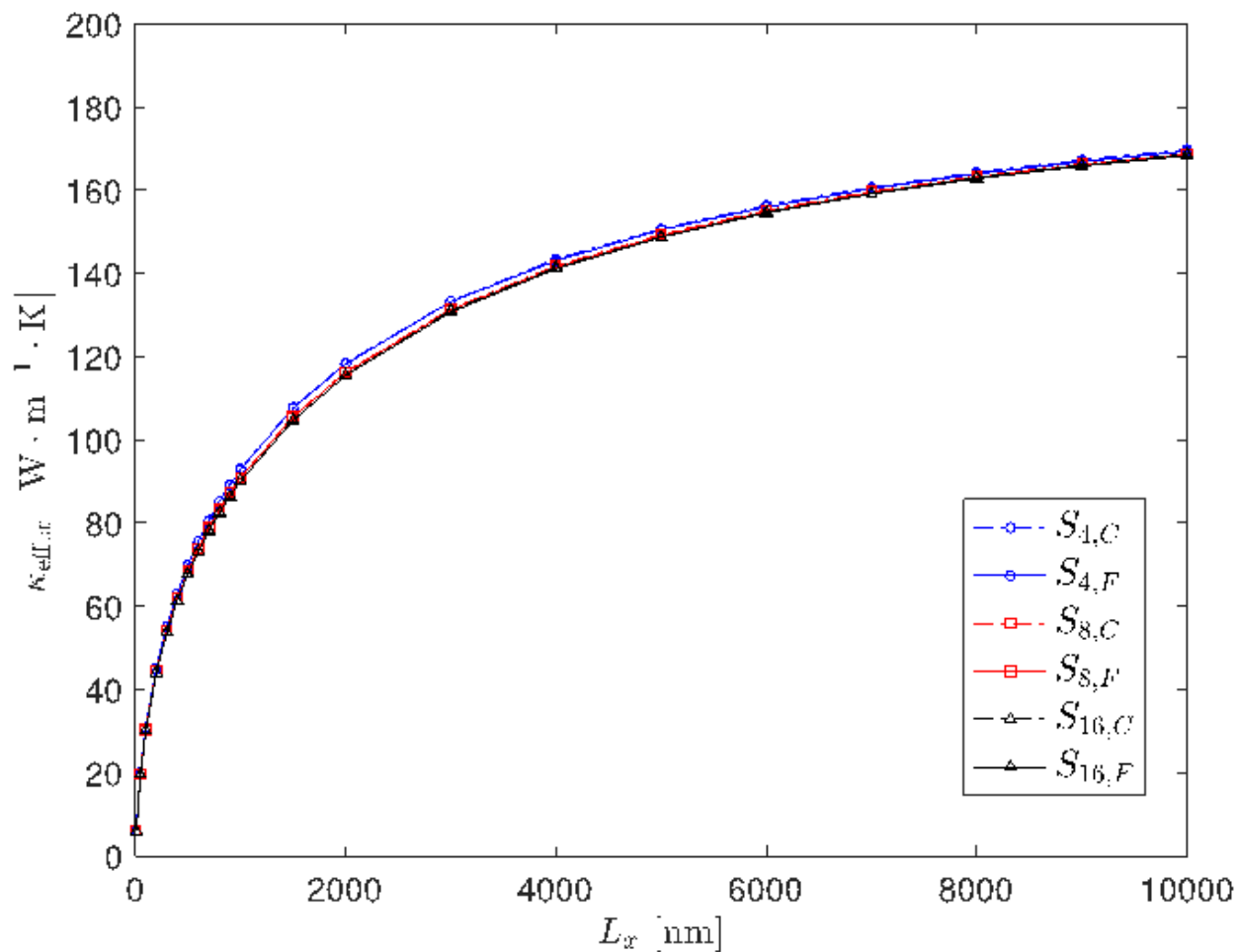


# Heat transport workflow

- *ab-initio* simulations
  - Phonon/electron dispersion
  - Density of states
  - Relaxation times
  - Everything at 0 Kelvin!
- Material properties into transport codes
- BTE simulations
- Results → heat flux, thermal conductivity, temperature distributions, heat capacity
  - Stop here or pass values to other code in multiphysics simulation
- Preprocessing, postprocessing

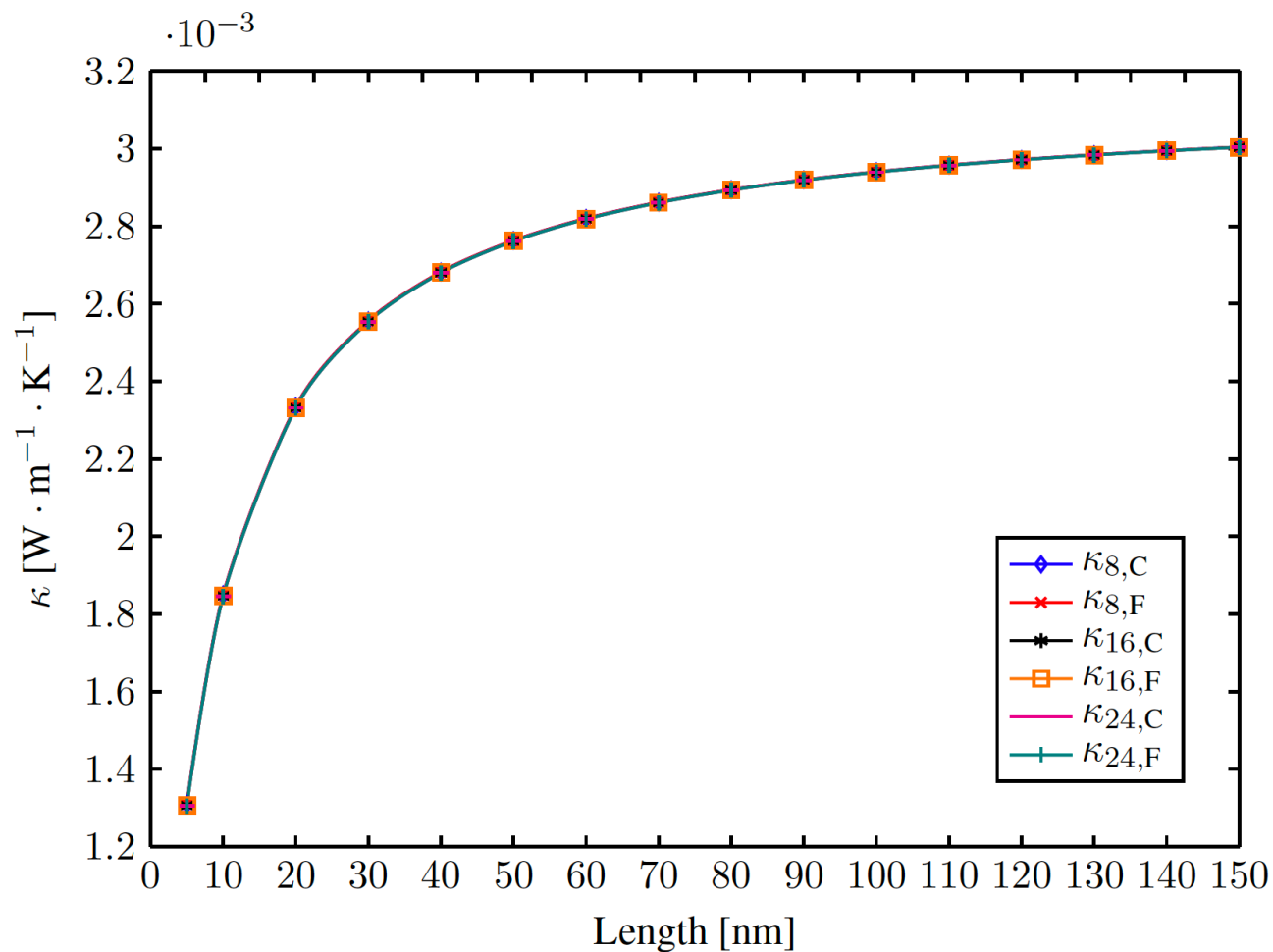


# Length scale dependence of Phonons





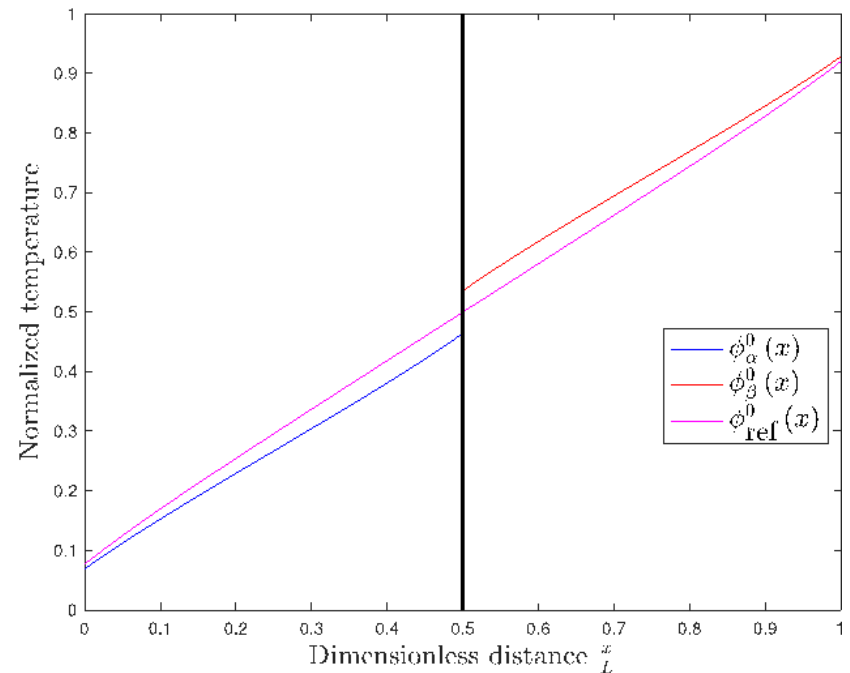
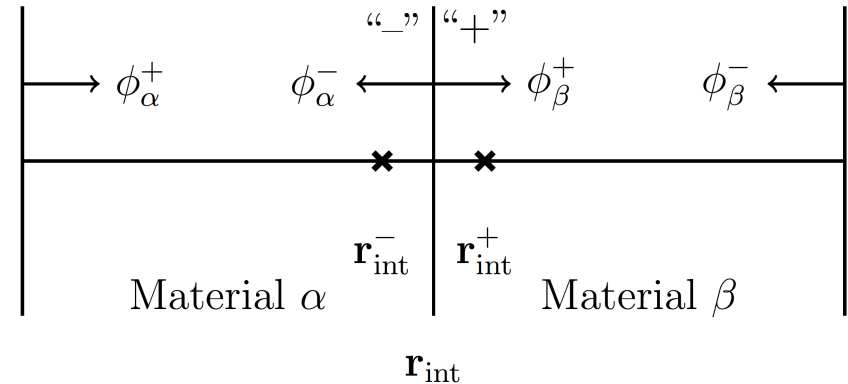
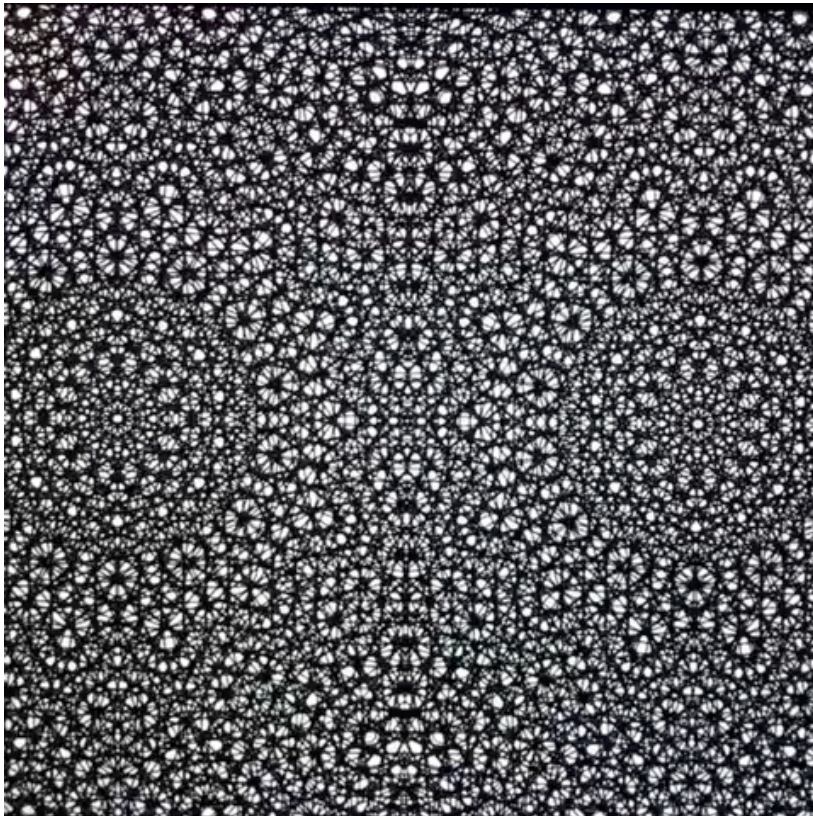
# Length scale dependence of Electrons



# Thermal interfacial resistance

## Interface physics

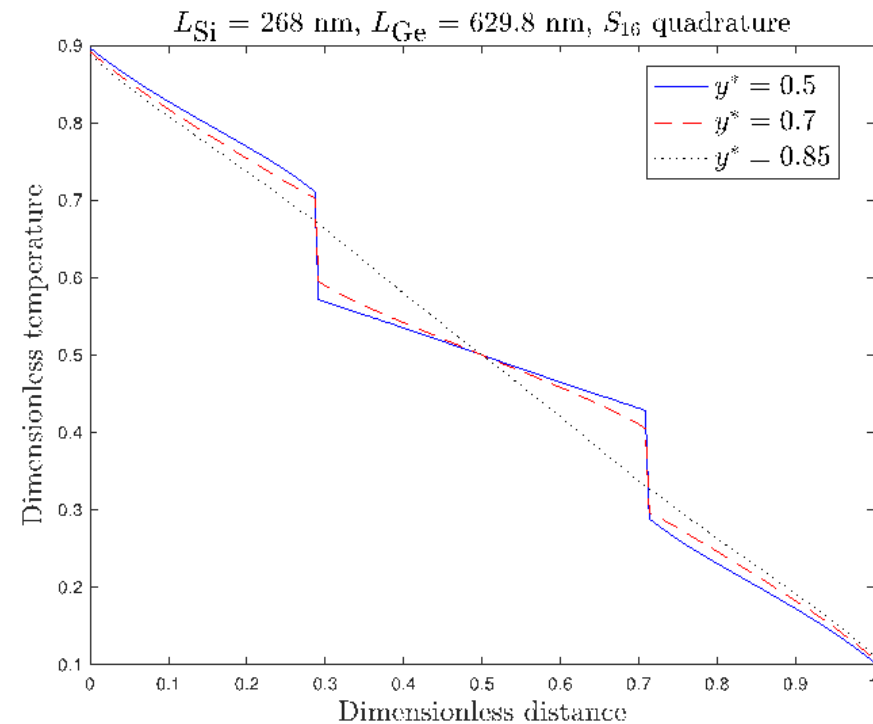
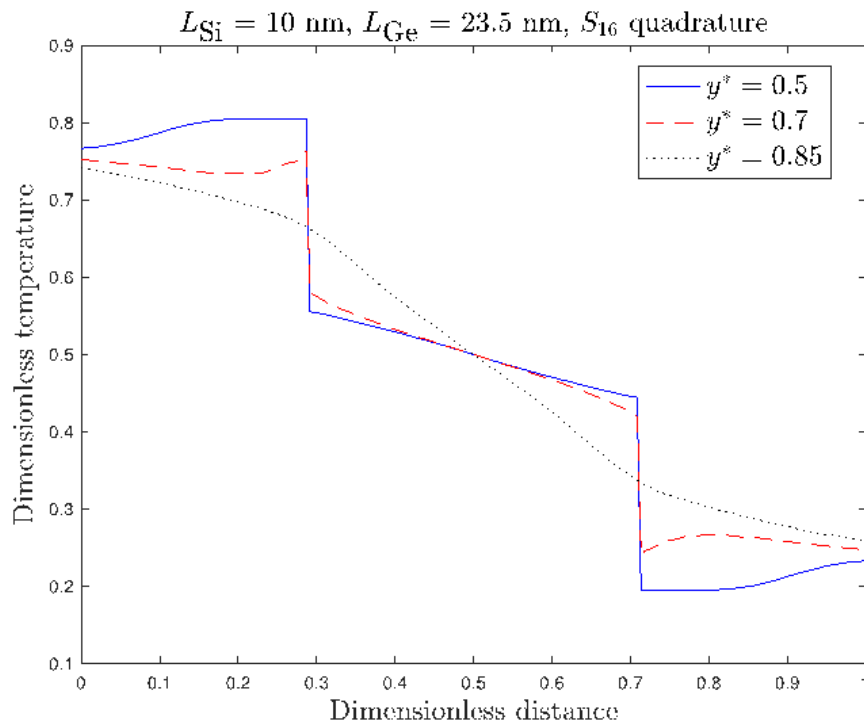
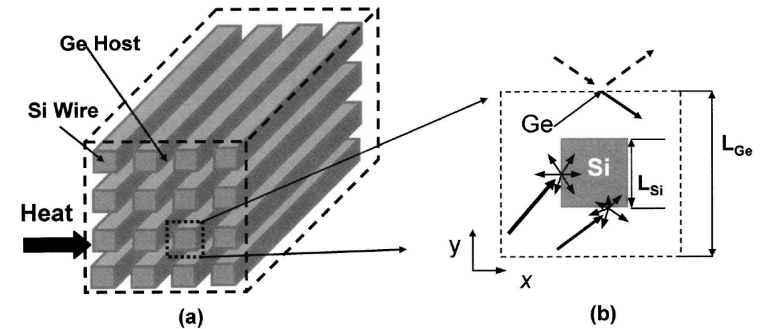
- Phonons experience resistive effects at physical interfaces in materials



# Thermal interfacial resistance

Code verification in Si-Ge system

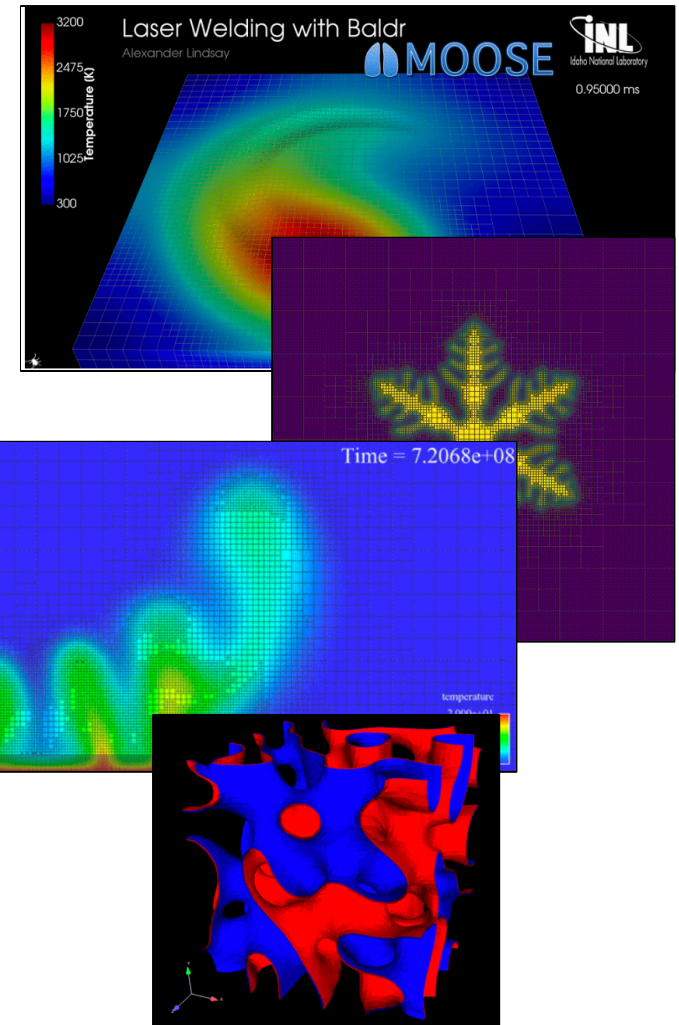
- Yang & Chen 2D simulations of Si nanowires in Ge host
  - Phys. Rev. B **69** (2014)
- Reproduces , ,



# Code development

## Creation of Boltzmann module

- *Boltzmann* combines phonon and electron transport with machinery designed and incorporated in *Griffin*, a radiation transport code
- These codes are built on the MOOSE framework, conceived and developed at Idaho National Laboratory





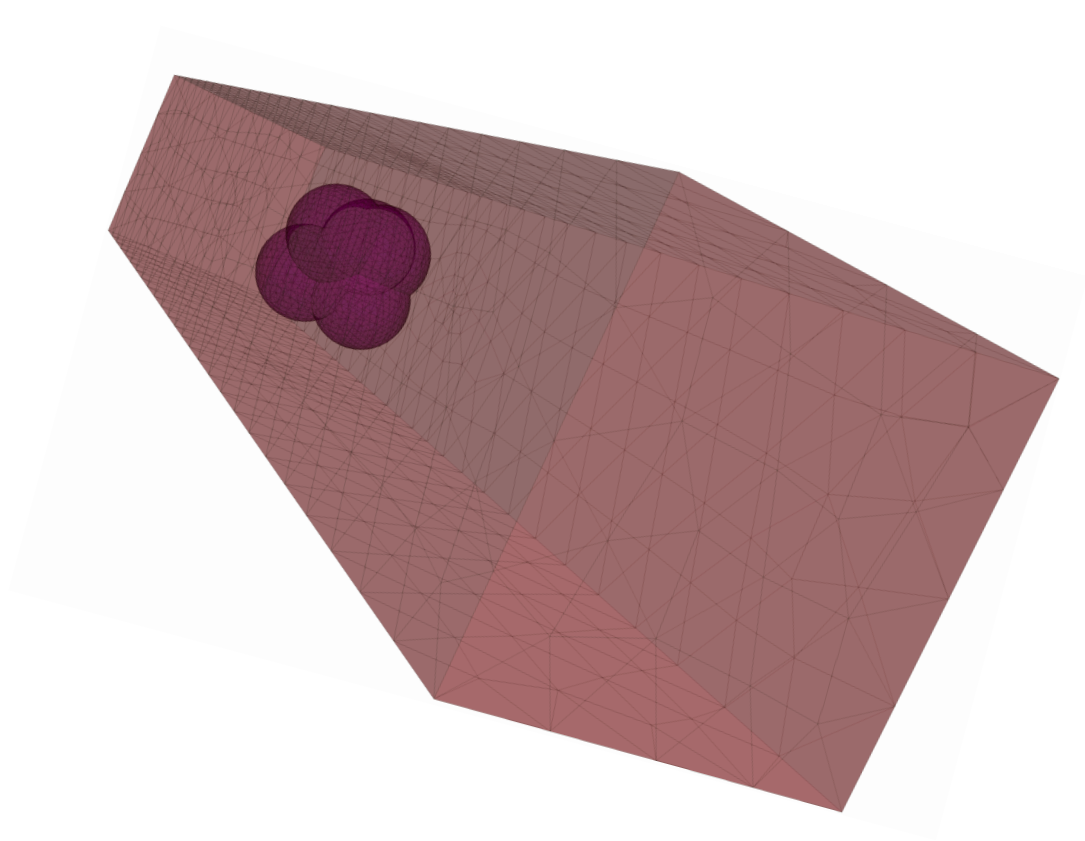
## *Funding sources*

- This work has been supported through
- **Seed LDRD 20A1049-012FP**: Multiscale thermal properties prediction in MOOSE via a general Boltzmann solver (FY20->FY21). **Role: PI**
- **LDRD 21A1050-052FP**: Accelerating pathways to actinide materials discovery through combinatorial deposition (FY21->FY23). **Role: Co-I**

## Examples of phonon transport

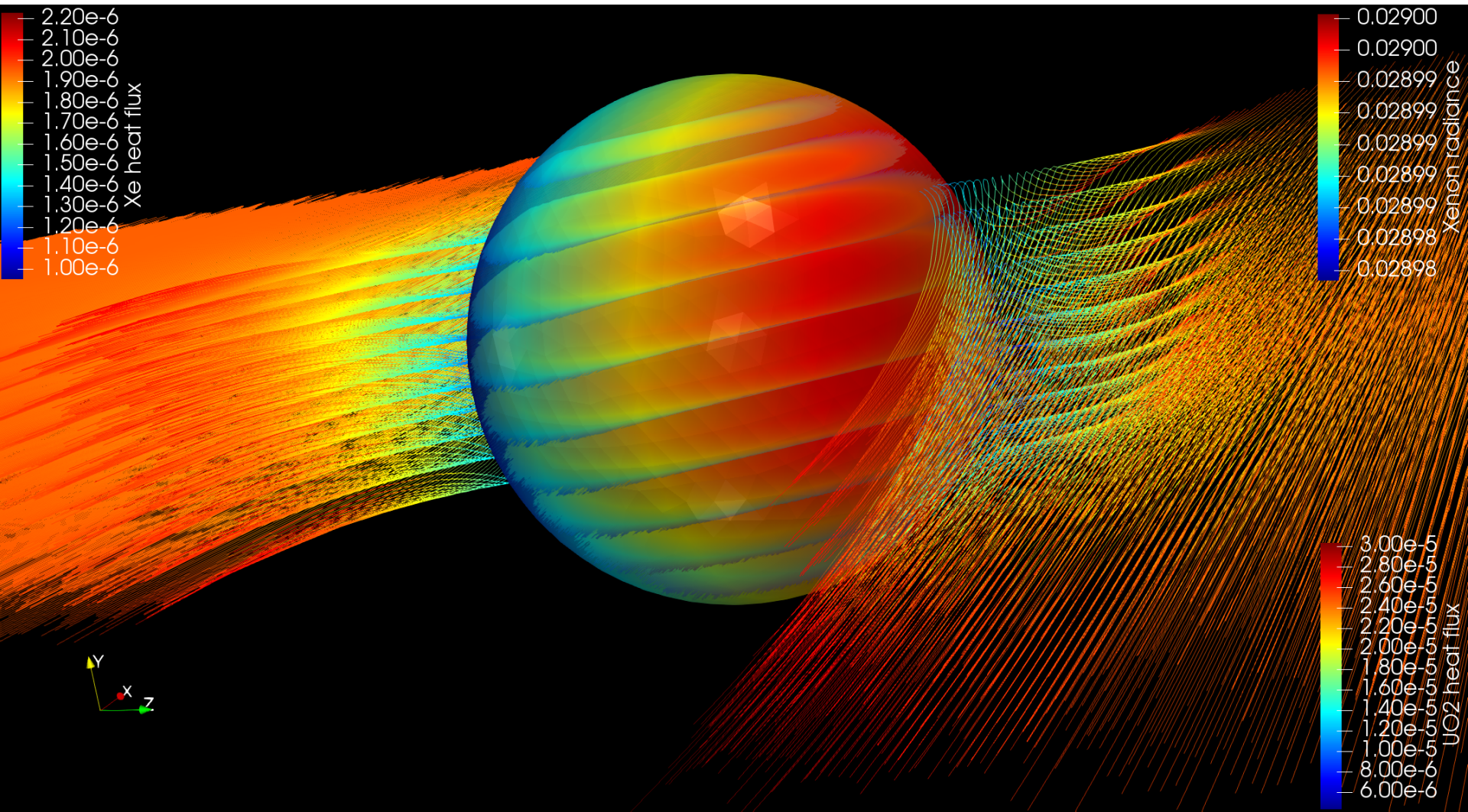
### *Phonon transport in $\text{UO}_2$ with Xe*

- Simulation of uranium dioxide with xenon atoms combining to form a bubble
- Investigating how phonons collide with xenon and scatter, affecting heat transport in the vicinity of the xenon
- Much work has been performed by leveraging geometric artifacts to tune the way heat moves
- How do we set this up?
- Material properties provided by Dr. Laura Rita de Sousa Oliveira of University of Wyoming



# Thermal interfacial resistance

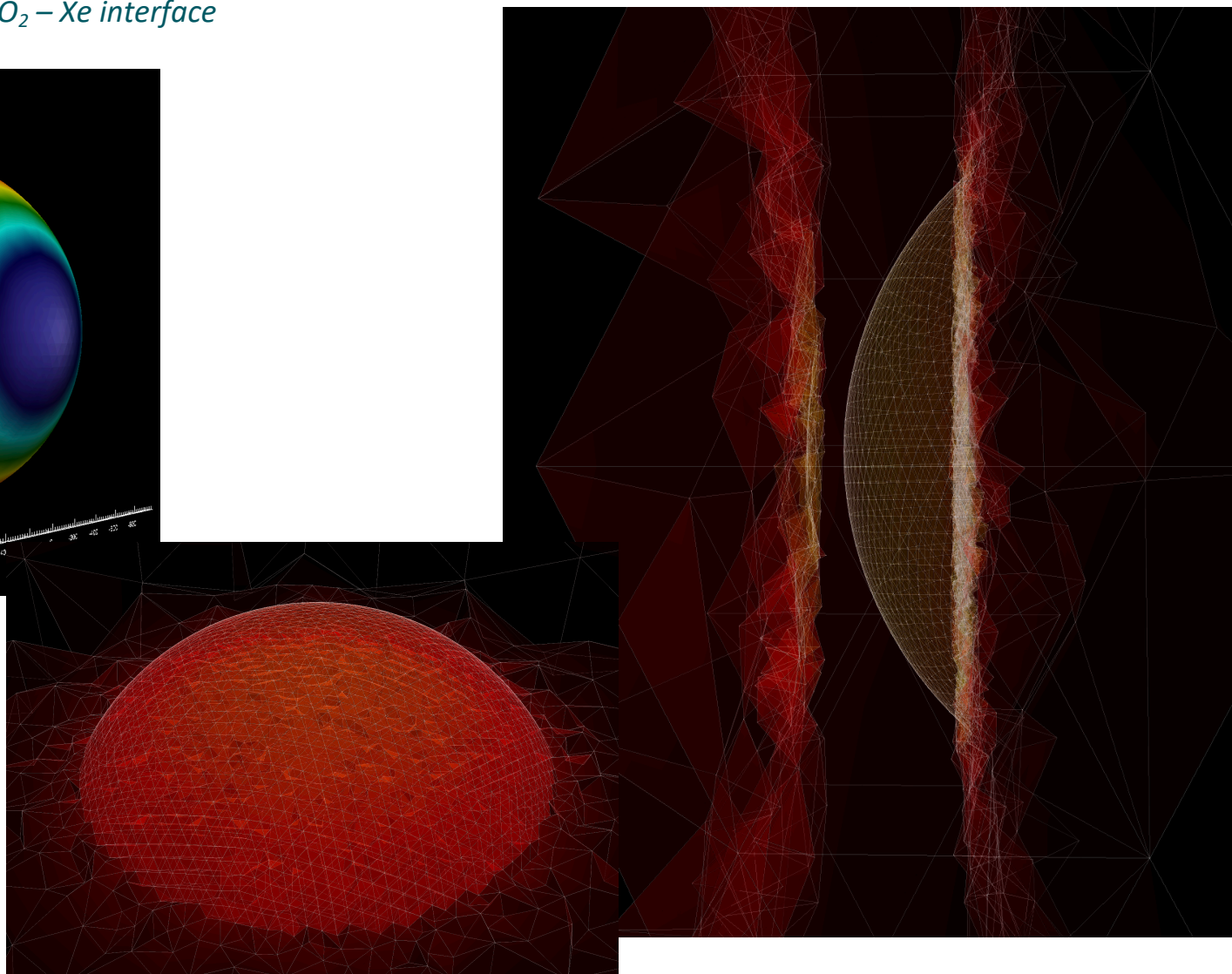
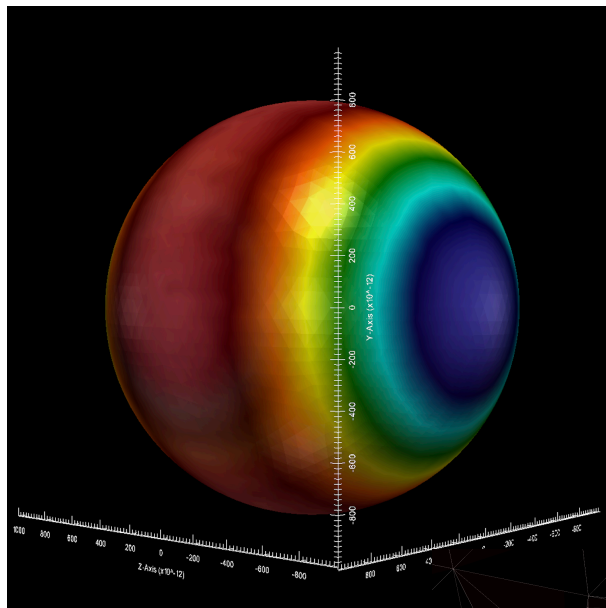
Phonon scattering at  $\text{UO}_2 - \text{Xe}$  interface





# Thermal interfacial resistance

Phonon scattering at  $\text{UO}_2 - \text{Xe}$  interface

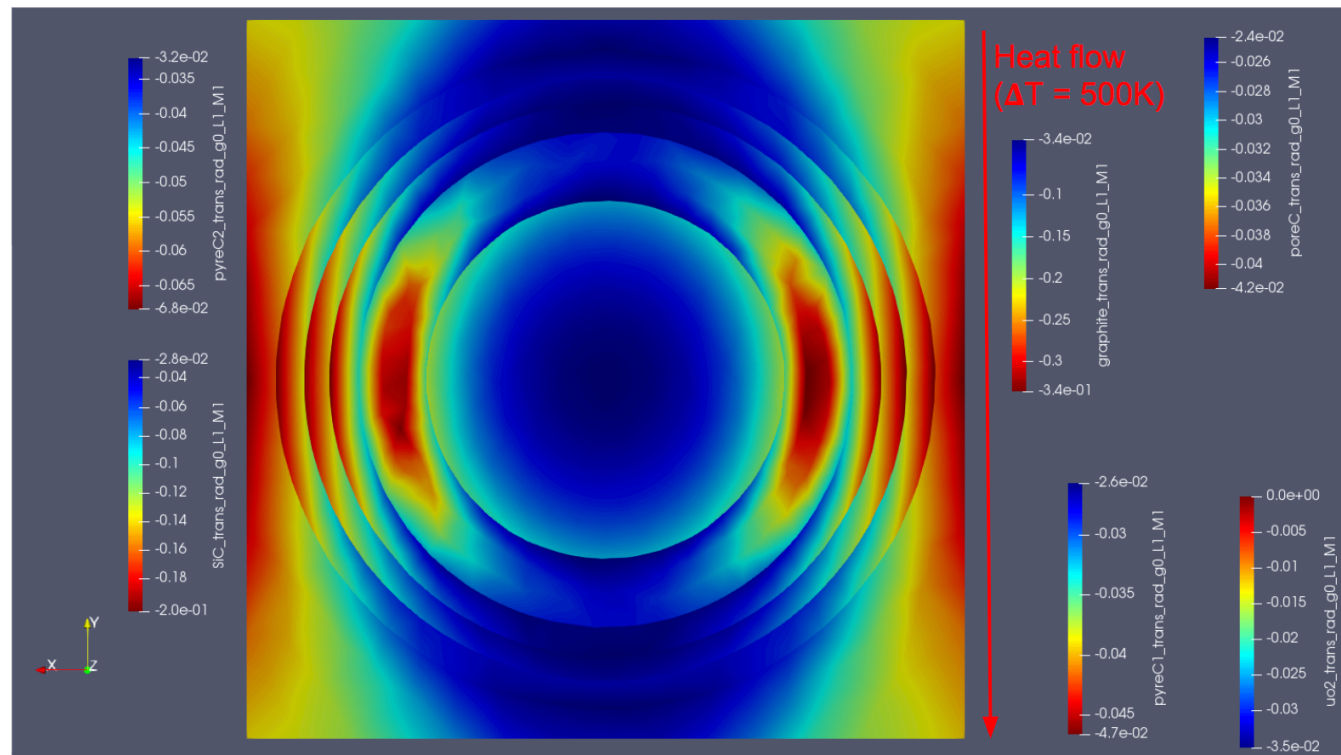
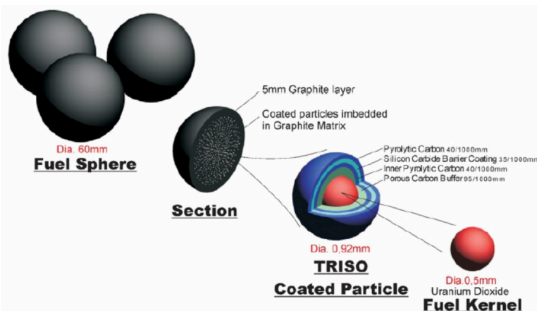
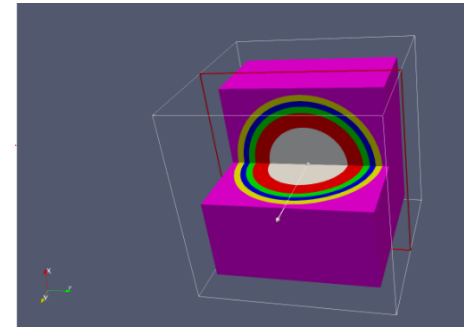




# Thermal interfacial resistance

Layered structures (2D/3D)

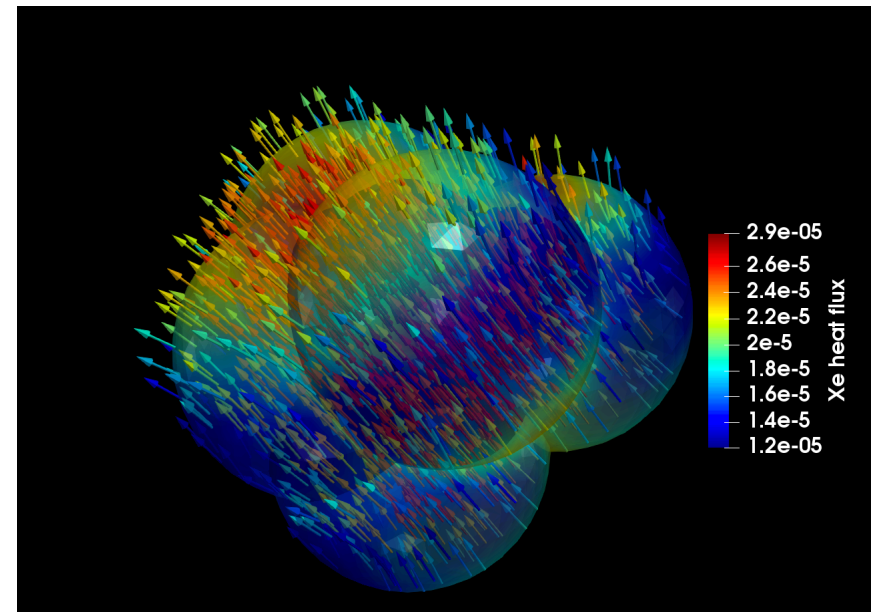
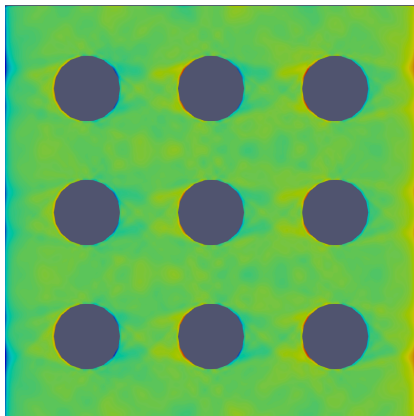
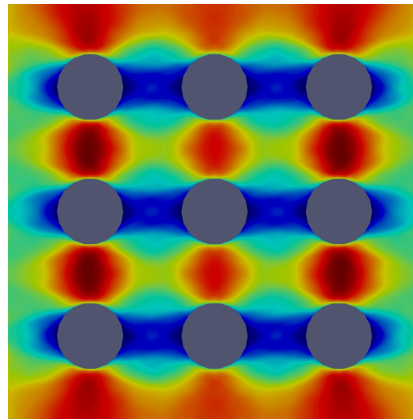
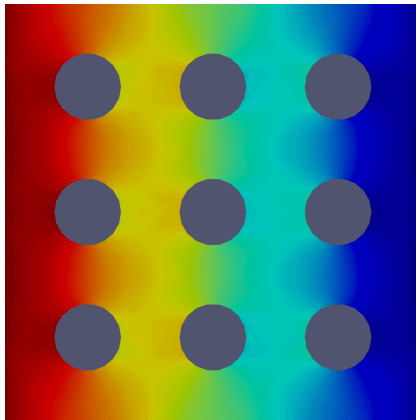
- Example: TRistructural ISOtropic (TRISO) fuel kernel. 5 layers,  $\text{UO}_2$  kernel in center and layers of pyrolytic carbon, silicon carbide, porous graphite to protect against release of fission products



# Explicit geometric simulation

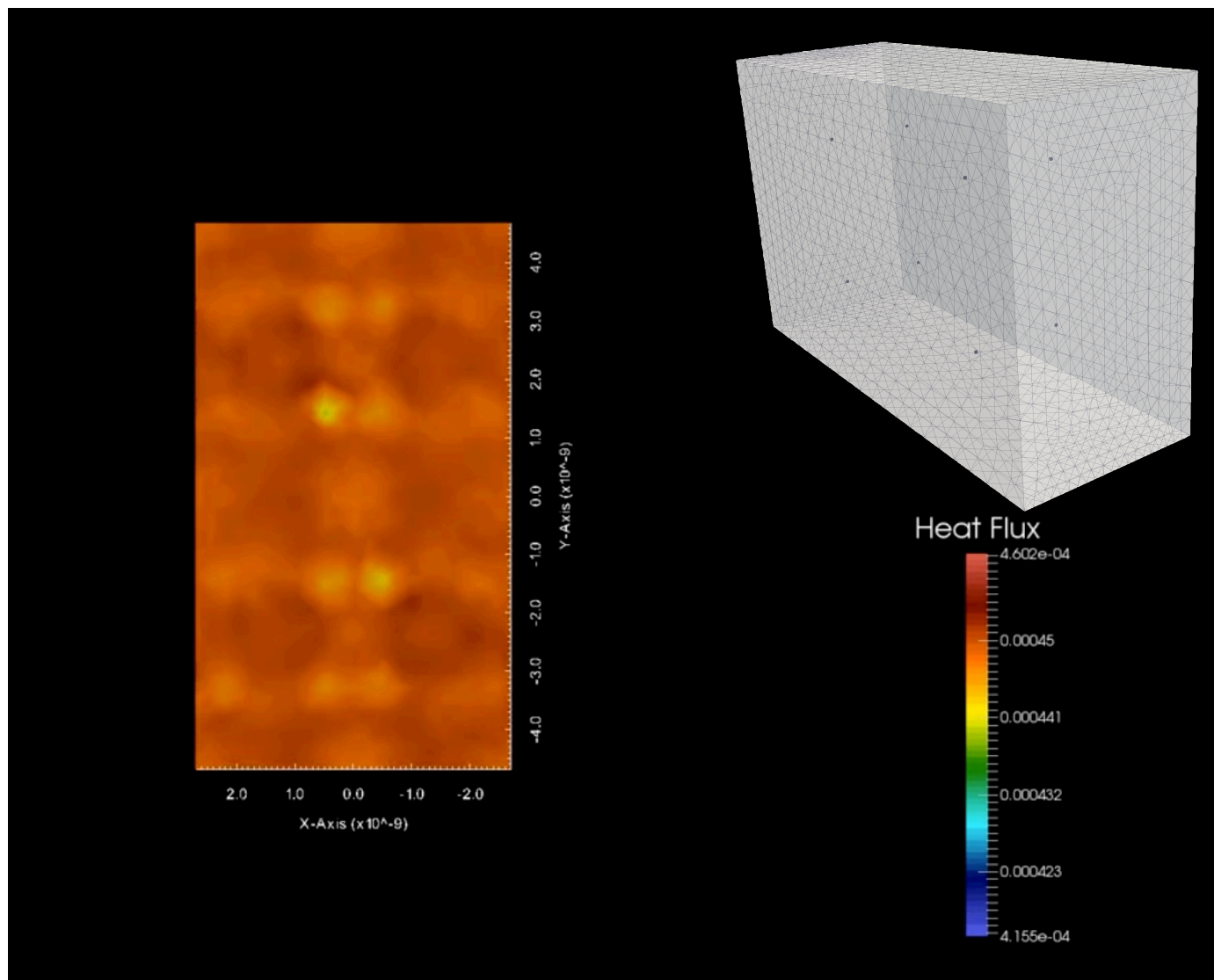
*Porous structures or bubbles (2D/3D)*

- Example: Si, explicit modeling of pores



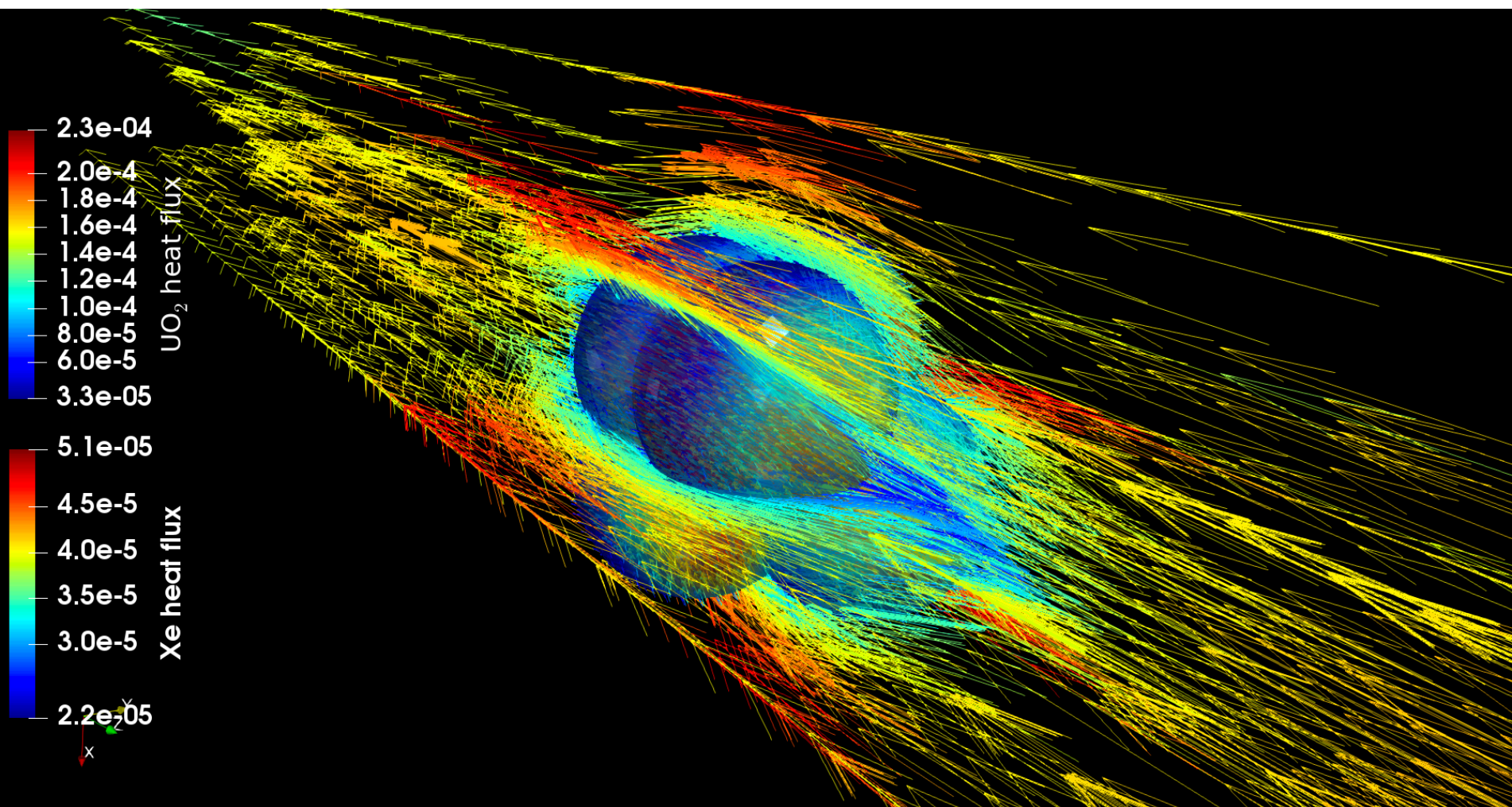
- Example:  $\text{UO}_2$  with Xe superstructure
- Heat current prediction

## *Heat flux fly-by in graphite with carbon defects*





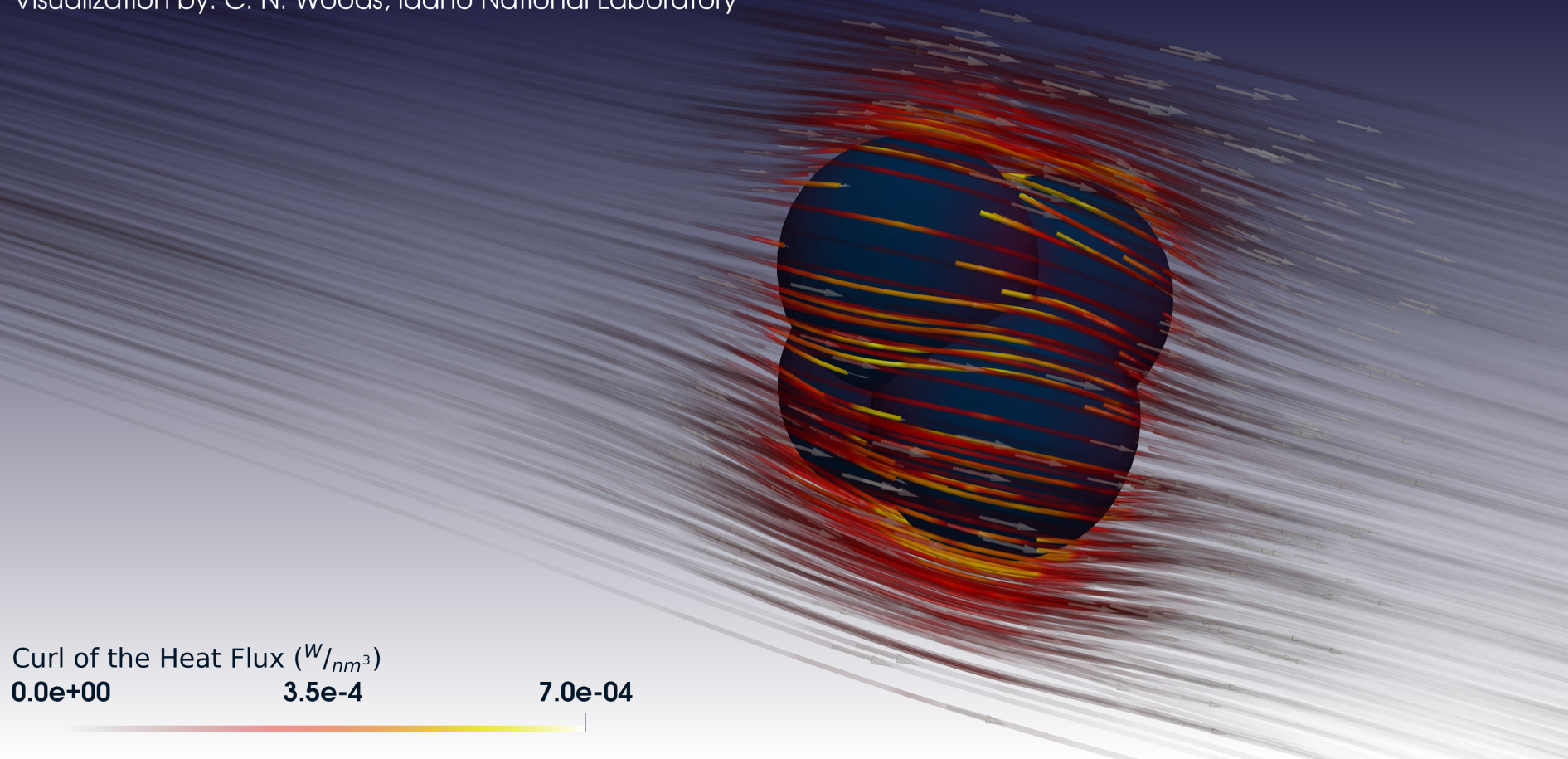
## *Heat flux vorticity in $UO_2$ with Xe*



## *Heat flux vorticity in $UO_2$ with Xe*

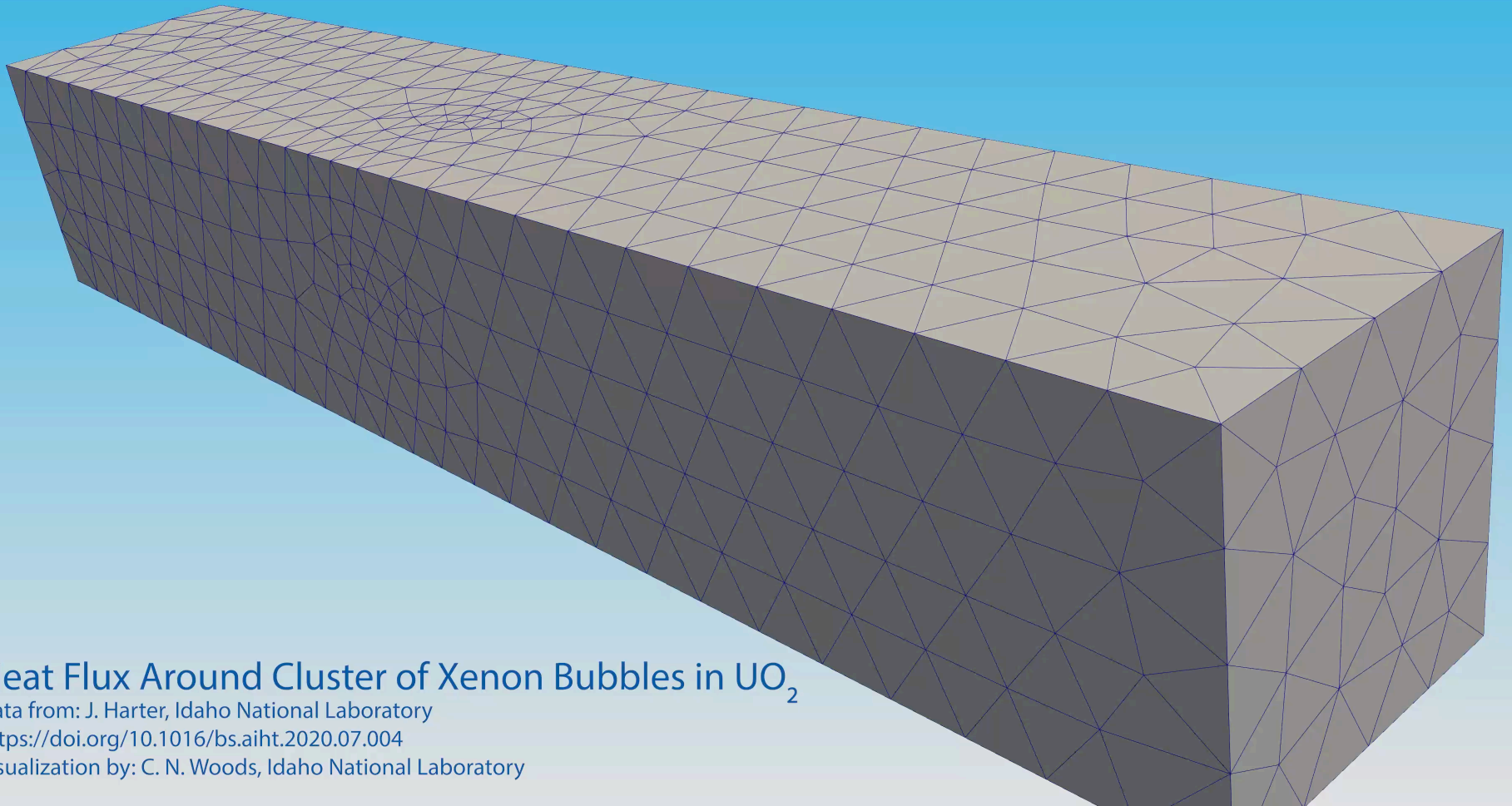
### Heat Flux Around Cluster of Xenon Bubbles in $UO_2$ Nuclear Fuel

Data from: J. Harter, Idaho National Laboratory  
<https://doi.org/10.1016/bs.aiht.2020.07.004>  
Visualization by: C. N. Woods, Idaho National Laboratory





## *Heat flux vorticity in $\text{UO}_2$ with Xe*



### Heat Flux Around Cluster of Xenon Bubbles in $\text{UO}_2$

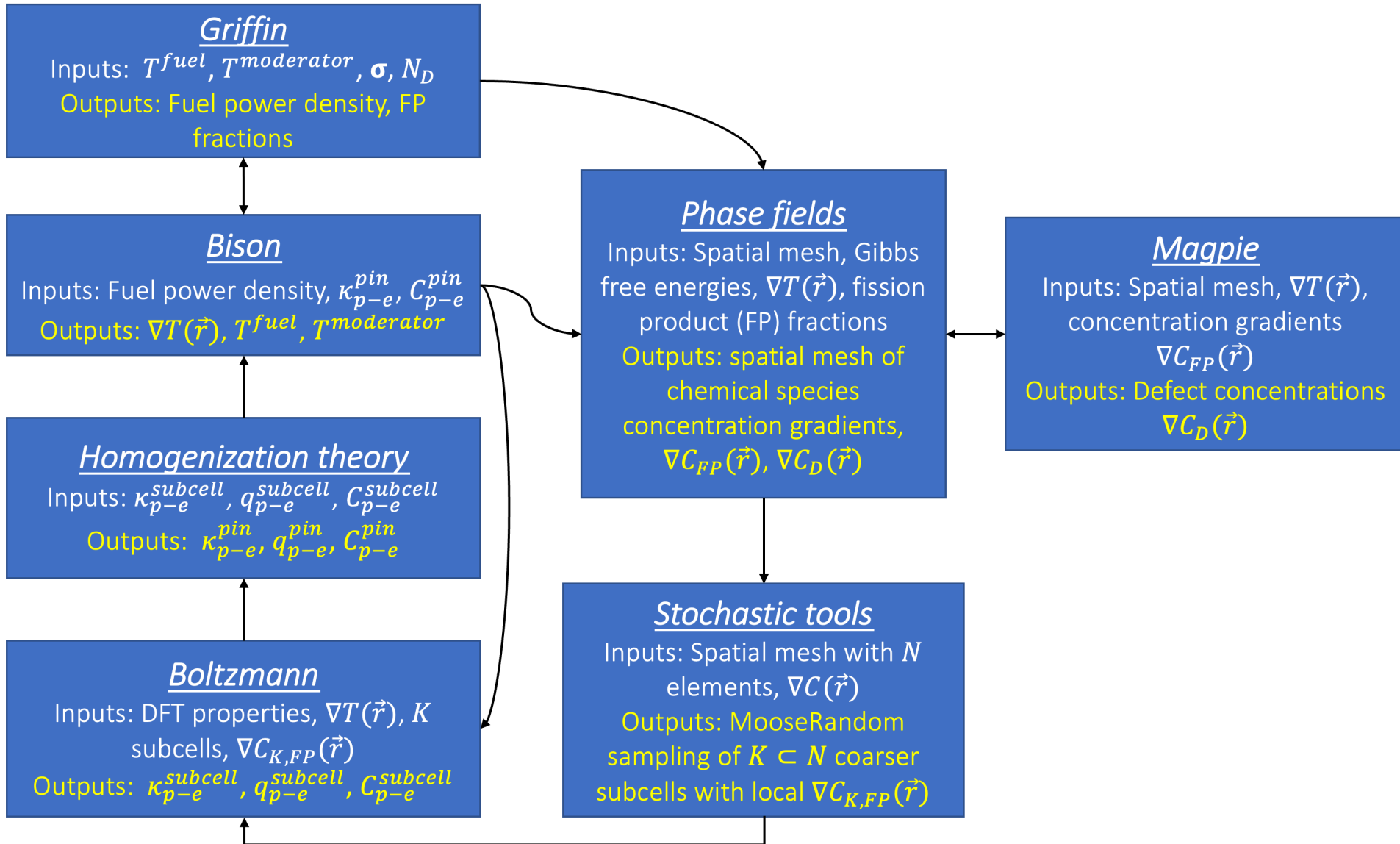
Data from: J. Harter, Idaho National Laboratory

<https://doi.org/10.1016/bs.aiht.2020.07.004>

Visualization by: C. N. Woods, Idaho National Laboratory

## *Precision multiscale, multiphysics methods*

- The nuclear industry has relied on correlations and empirical fitting for decades to perform its tasks. The result?
  - Large uncertainty prompts enormous conservatism
    - Nuclear cross sections
    - Thermal conductivity
    - Spatial temperature distribution
    - Radiation damage effects
    - Creep and mechanical degradation
  - Why?
  - What do these phenomena have in common?
- What is meant by “precision multiscale”?
  - Escape correlations, empiricism
- How do we model effects in a nuclear fuel pellet?





## *Precision multiscale, multiphysics methods*

- The answer? Elegant computational science
- HPC resources exist now
  - GPU
  - Artificial intelligence
  - Machine learning
  - Uncertainty Quantification
- What does the new “normal” look like?
  - Past: 1D, 2D, limited 3D nuclear reactor simulations
  - “Curse of dimensionality”
  - Full 3D reactor physics
- J. R. Harter, “White paper: *A comprehensive method for morphological-informed thermal property prediction in the engineering domain*,” Tech. Rep. MIS-22-02732, Reactor Physics Methods and Analysis, Idaho National Laboratory, Idaho Falls, Idaho, October 2022

## Conclusions

- Microscale heat transfer bridges the gap between the very small and very large
- In the next 10 years...
  - Extreme growth potential
    - Fundamental science
    - Computational and theoretical methods
    - Basic Energy Science (BES), National Science Foundation (NSF), Nuclear Engineering University Partnerships (NEUP), and more...
- How can we change the game?
  - We do the opposite of the current strategy
    - No correlation, no empiricism
    - Full 3D core models with multiphysics
    - Take advantage of the hardware and software tools we have
    - Uncertainty quantification
    - Validate, validate, validate

