The Porous Microstructure Analysis (PuMA) software for high-temperature microscale modeling

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May 6<sup>th</sup>, 2019





- Quick Description
- Motivation
- Capabilities
- Conclusions and Outlook



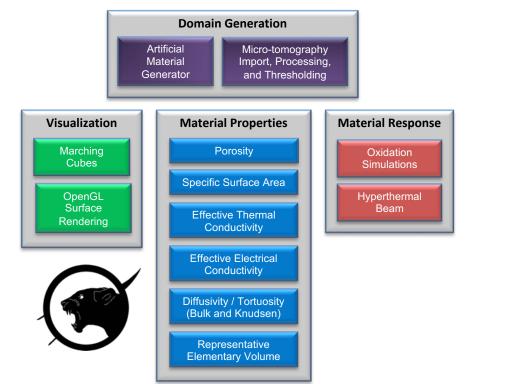
# What is PuMA?



# A collection of tools for the analysis of porous materials and generation

## of material microstructures

#### Porous Microstructure Analysis (PuMA)



#### **Technical Specifications**



- Written in C++
- GUI built on QT
- Visualization module based on OpenGL
- Parallelized using OpenMP for shared memory systems

File Visualization Oxidation Help       Domain Generation Material Properties REV Analysis Oxidation Simulation       Micro-tomography Import     Generate Artificial Geometry       Image Import       Load 3D Tiff Image       Subdomain Extraction       X-max     800       X1     200       Y1     200	
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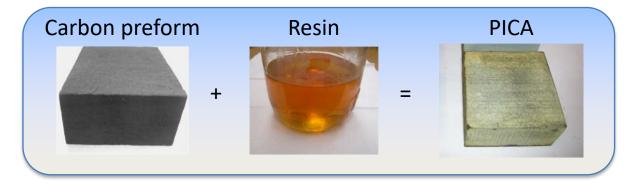
## Motivation

#### Thermal Protection Systems (TPS) 10-7 FAR SOLAR United States C SYSTEM MARS 10-6 RETURN RETURN 300 90 SHUTTLE 10-5 # 250 75 10-3 10 **REUSABLE TPS ABLATIVE TPS** 200 ALTITUDE X1 ¥, DENSIT 45 150 10-2 APOLLO 30 15 50 ٥L 40 50 20 30 60 10 0 VELOCITY × 10<sup>-3</sup>, ft/sec (APPROXIMATE MACH NUMBER) 15 18 20 3 12 6 9 n km/sec P-MISP-061708-01

NASA TM 101055, 1989

#### Ablative Thermal Protection Systems



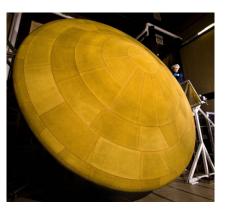




Stardust Capsule



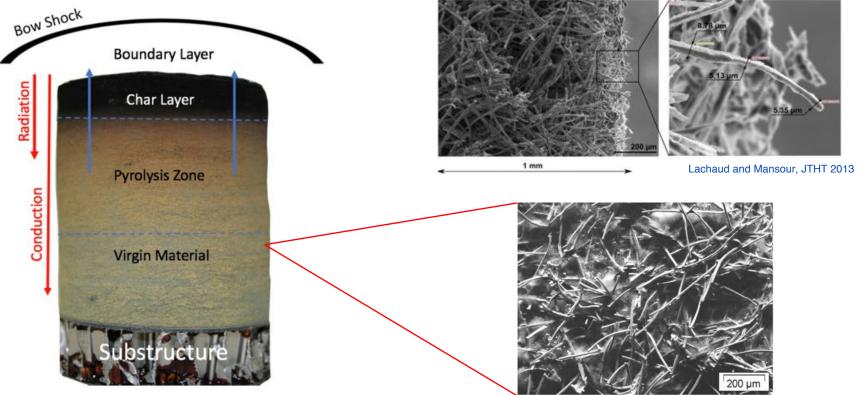
Dragon V1 & V2



Mars Science Laboratory

## Material Design and Modeling Bow Shock **Boundary Layer** Radiation Char Layer **Pyrolysis Zone** Conduction Virgin Material

# Material Design and Modeling



Lawson et. al. 2010

### Material Design and Modeling



#### P. Agrawal et. al. 2016.



Virgin PICA Sample

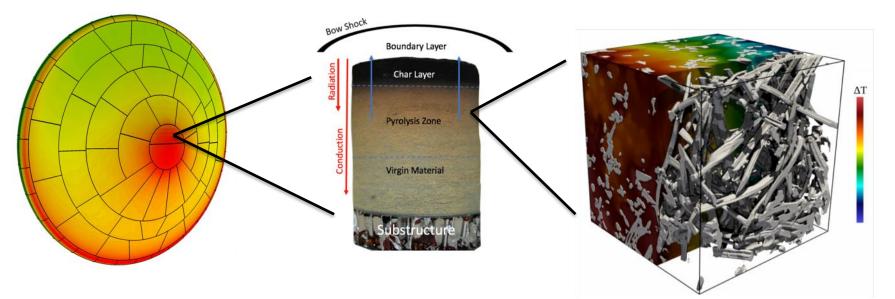


**Charred PICA Sample** 



## Micro-scale modeling





- 1. Material Properties
  - 1. Phenomenological Properties
  - 2. Thermal transport
  - 3. Mass transport

- 2. Material Decomposition
  - 1. Oxidation
  - 2. Sublimation
  - 3. Spallation



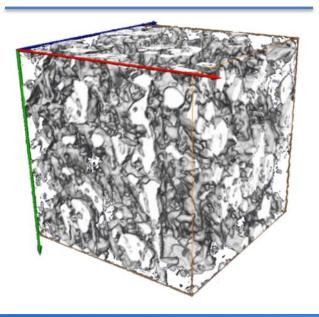
# High fidelity characterization of heat shield materials in extreme environments is needed

## **Cannot be achieved with experiments alone**

## Other applications

 Main impact derives from the ubiquity of the underlying physics.

#### **Plastic/Copper Composites**

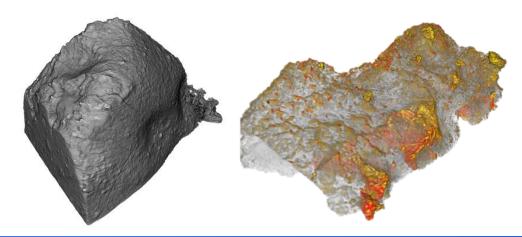


#### **Parachute Materials**





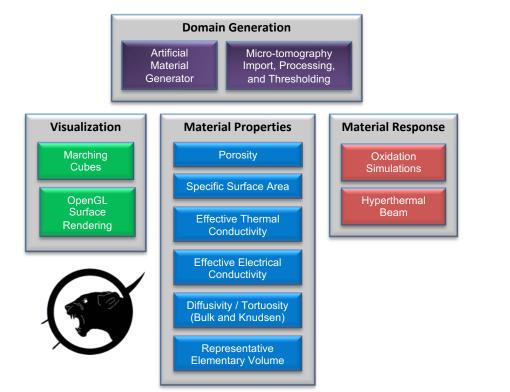
#### **Meteorite Samples**





# Capabilities

#### Porous Microstructure Analysis (PuMA)

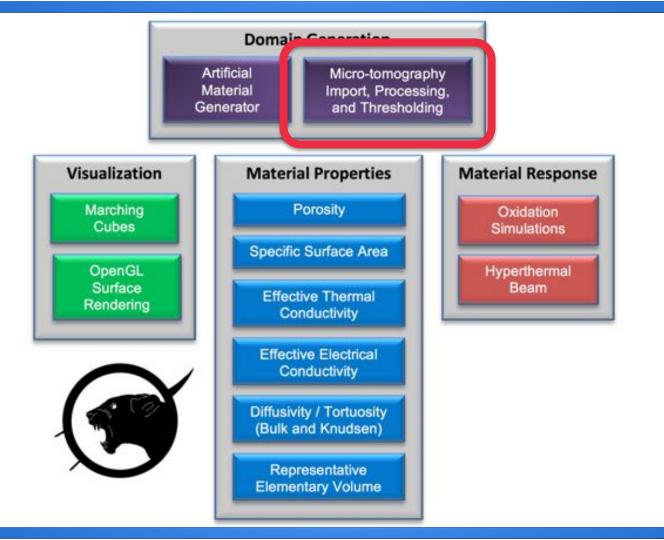


#### **Technical Specifications**



- Written in C++
- GUI built on QT
- Visualization module based on OpenGL
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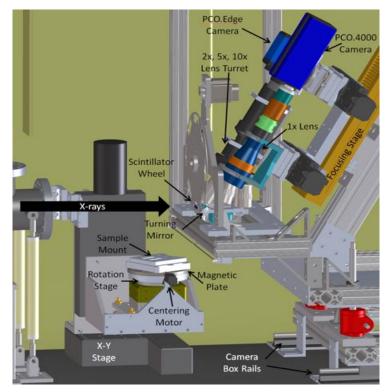


## X-ray micro-tomography





- Advanced Light Source (ALS) at the Lawrence Berkeley Natl. Laboratory
- Synchrotron electron accelerator used to produce 14Kev X-rays
- Used for many research areas, including optics, chemical reaction dynamics, biological imaging, and X-ray micro-tomography.



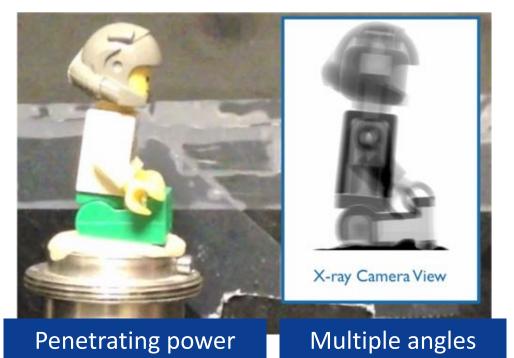
#### http://www2.lbl.gov/MicroWorlds/ALSTool

Mansour et. al, A new approach to light-weight ablators analysis: from micro-tomography measurements to statistical analysis and modeling, 44<sup>th</sup> AIAA Thermophysics. (2013)

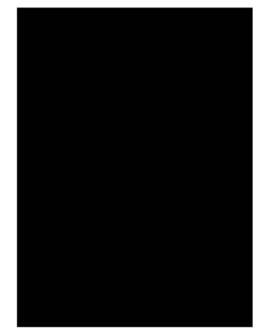
### X-ray micro-tomography



## Collect X-ray images of the sample as you rotate it through 180°

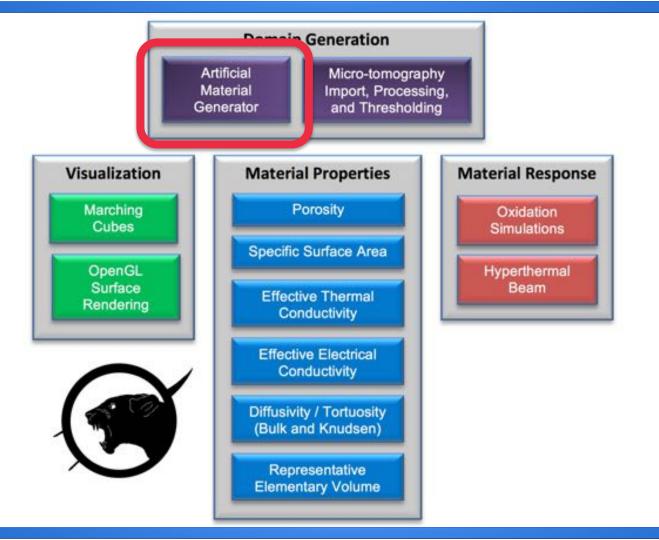


#### Use this series of images to "reconstruct" the 3D object



Courtesy of D. Parkinson (ALS)

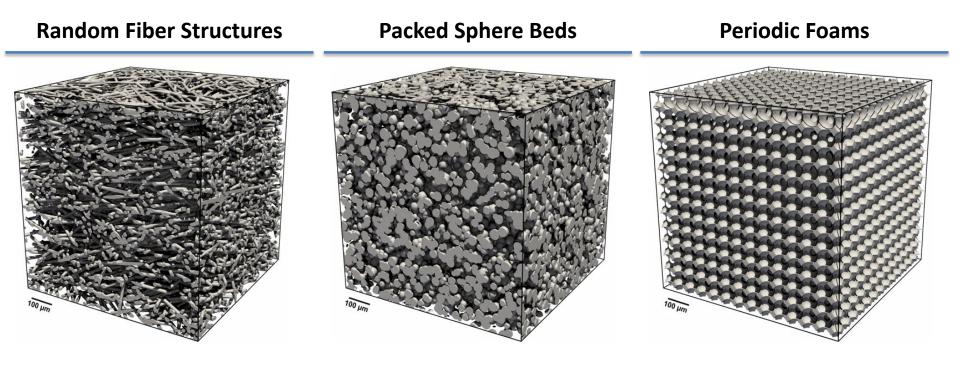




NASA

#### **Material Generation**





## **Complex Fiber Generation**



- Under Development for PuMA V3
- Capable of generating:
  - Curved fibers
  - Hollow fibers
  - Fibers with complex cross sections
- Degree of randomness can be specified to each of these parameters

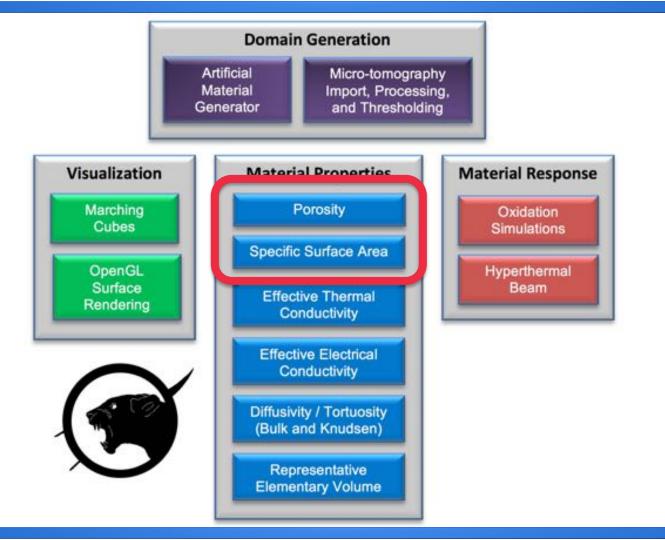


#### Weave Generation



- Under Development for PuMA V3
- TexGen library fully integrated







### **Effective Material Properties**



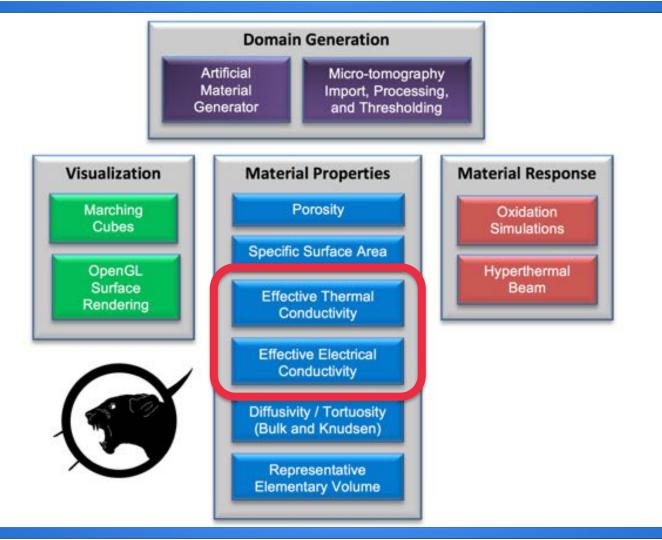
#### Porosity

- Based on the grayscale threshold
- Sum of all void voxels over the total volume

#### **Specific Surface Area**

- Based on the Marching Cubes algorithm
- Overall surface area computed as a sum of individual triangle areas



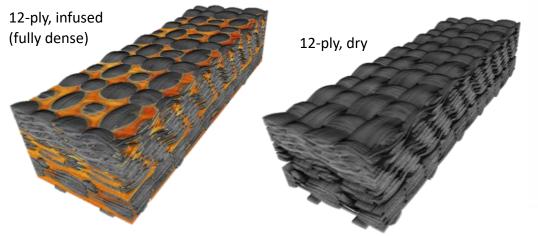


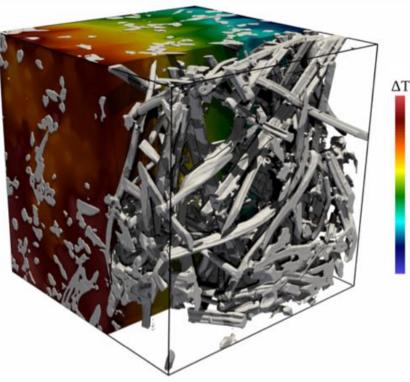


## **Effective Thermal Conductivity**



- Computes effective thermal conductivity using a finite difference method [Weigmann, 2006]
- BicGStab iterative method and FFTW used to solve linear system of equations [Sleijpen, 1993]
- Parallelized based on OpenMP
- Verified against complex analytical solutions

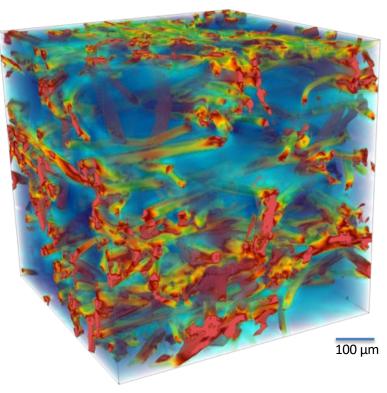




## **Effective Electrical Conductivity**



- Computes effective electrical conductivity using a finite difference method [Weigmann, 2006]
- 1V voltage differential applied; solved with periodic boundary conditions
- BicGStab iterative method and FFTW used to solve linear system of equations [Sleijpen, 1993]
- Parallelized based on OpenMP
- Verified against complex analytical solutions
- Steady state current flow through a material can be determed

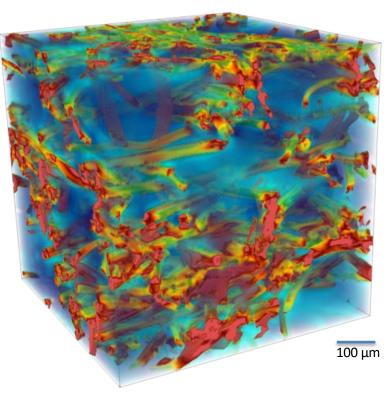


Steady state current flow through a carbon fiber material with an imposed voltage differential

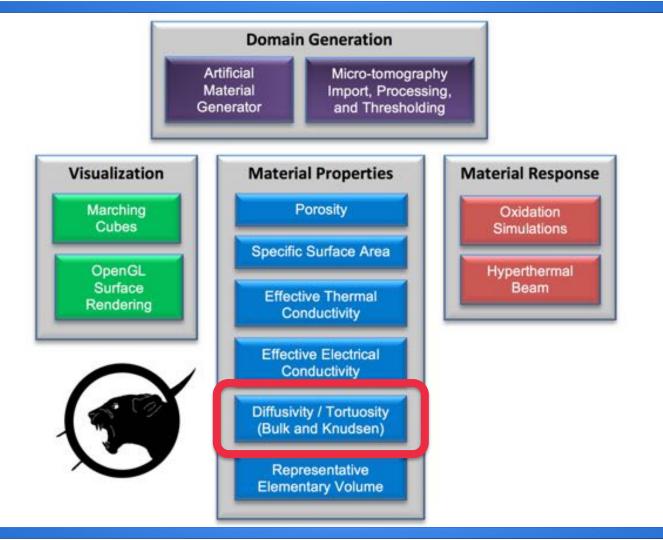
## Anisotropic Thermal/Electrical Conductivity



- Allows for constituents with anisotropic thermal conductivites
- Method uses Multi-Point Flux Approximation (MPFA) which involves integrating over a control volume and enforcing continuity across separate interaction volume
- Solved with periodic boundary conditions
- Parallelized based on OpenMP
- Verified against complex analytical solutions



Steady state current flow through a carbon fiber material with an imposed voltage differential



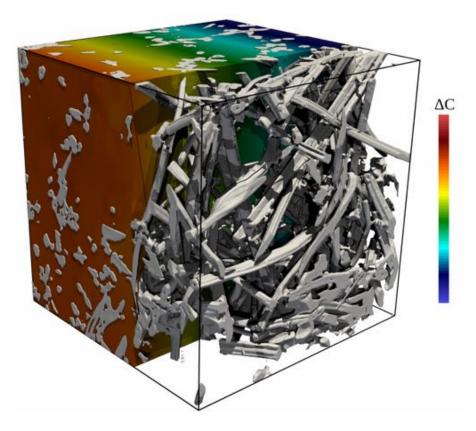


## Diffusivity / Tortuosity



#### Continuum

- Quantifies a materials resistance to a diffusive flux
- Solves for effective diffusivity using a finite difference method
- Valid for Kn << 1
- Solves diffusion equation using periodic boundary conditions



## Diffusivity / Tortuosity – Random Walk

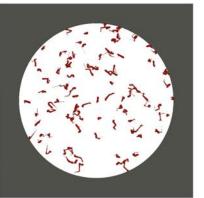
#### Transitional/Rarified

- Random walk method to simulate diffusion
- Mean square displacement method used to solve effective diffusion
- Valid for all Knudsen numbers.
- Knudsen number is varied by changing the molecular mean free path

 $Kn = \frac{\bar{\lambda}}{\bar{d}} = \frac{mean\;free\;path}{characteristic\;length}$ 

• Surface collisions based on marching cubes triangles with diffuse reflections used

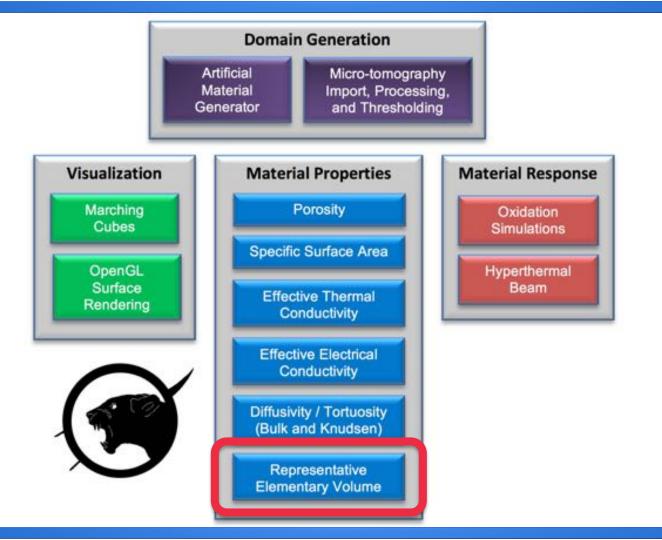






High Knudsen

Low Knudsen

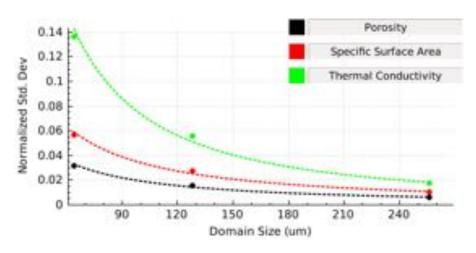


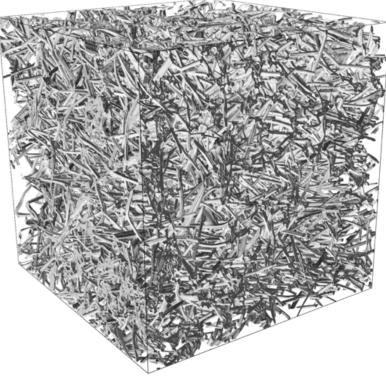


## **Representative Elementary Volume**

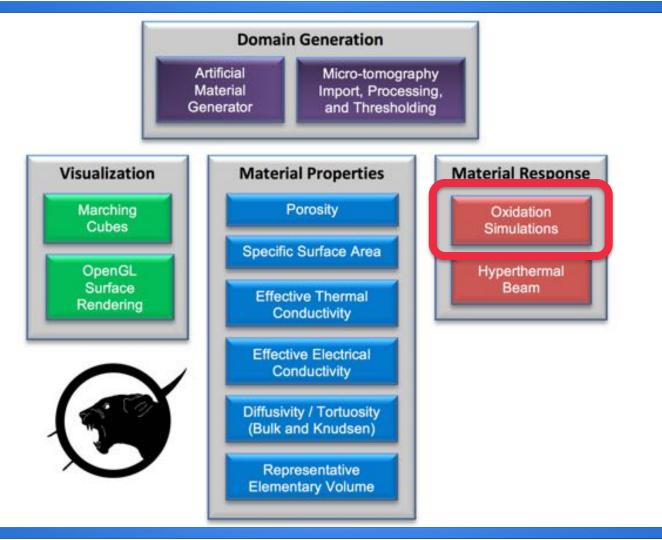


- Defined in PuMA V2.1 as the size for which the std. dev. in a given property falls below a given threshold, usually 2%
- Power law used to interpolate/extrapolate REV
- Provides std. dev. of a given property as a function of sample size, helping to quantify the uncertainty in a calculation





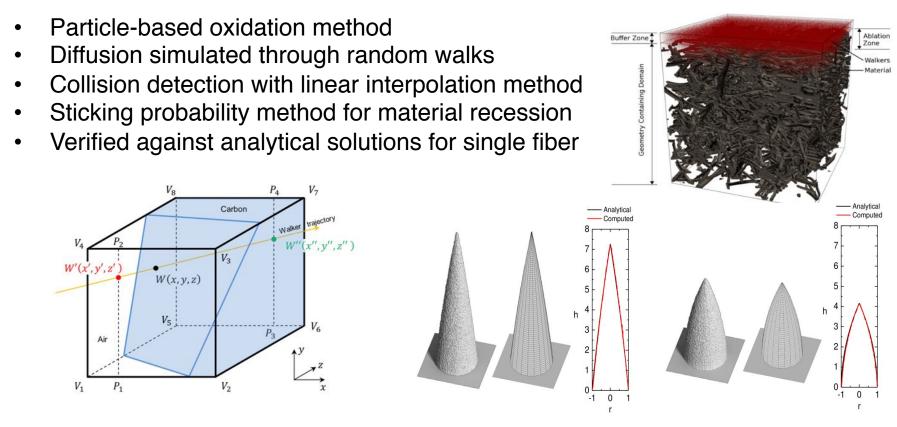
Surface rendering of FiberForm tomography in PuMA V2.1. Visualization contains ≈ 500 million triangles.





## **Micro-Scale Oxidation Simulations**





Ferguson et. al, Modeling the oxidation of low-density carbon fiber materials based on micro-tomography, Carbon. (2016).



#### **Micro-Scale Oxidation Simulations**









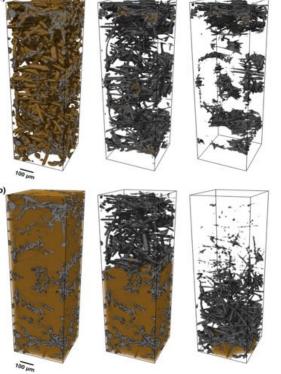
Ferguson et. al, Modeling the oxidation of low-density carbon fiber materials based on micro-tomography, *Carbon. (2016).* Ferguson et. al, Theoretical study on the micro-scale oxidation of carbon fiber materials, *Carbon. (2017).* 

#### **Micro-Scale Oxidation Simulations**





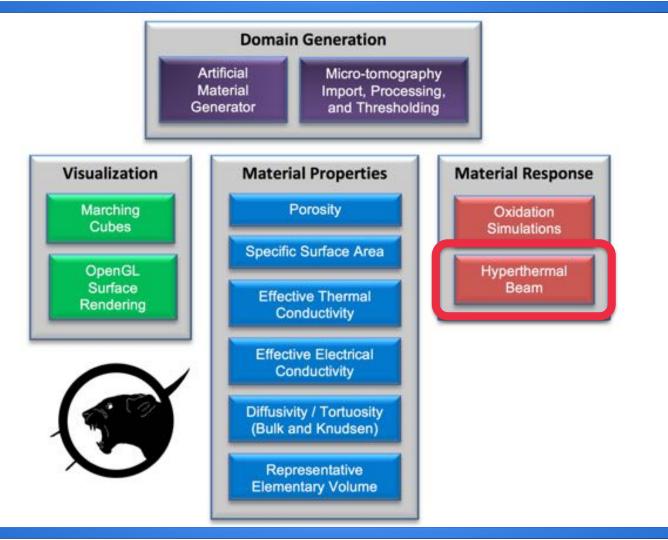
Surface Ablation





Volume Ablation

Ferguson et. al, Theoretical study on the micro-scale oxidation of carbon fiber materials, Carbon. (2017).





## **Molecular Beam Simulations**

- Used in conjunction with molecular beam experiments [1] to calibrate finite rate chemistry models
- Particle-based method to solve transport of gas reactants and products
- Simulation of gas-surface collisions with complex, customizable reaction models
- Since particle-particle collisions are negligible, it provides a significant speed increase over DSMC simulations [2].



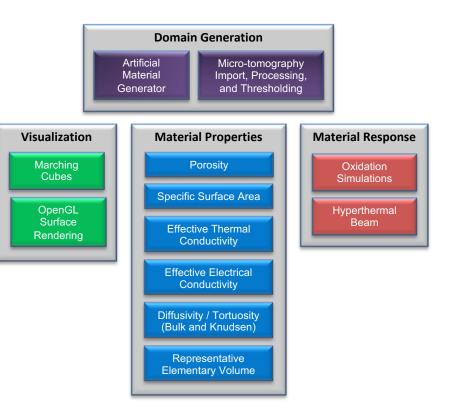
[1] Murray V J., et al. Inelastic and Reactive Scattering Dynamics of Hyperthermal O and O2 on Hot Vitreous Carbon Surfaces. *The Journal of Physical Chemistry* C 119.26 (2015). [2] Swaminathan-Gopalan K et. al. Development and validation of a finite-rate model for carbon oxidation by atomic oxygen, *Carbon* 137 (2018).



## **Conclusion and Outlook**



- Future work will expand the material properties to include permeability and structural analysis
- Material generation will be expanded to allow realistic materials to be computationally designed, optimized over a set of characteristics
- <u>Need for good quality experimental</u> <u>data for model verification</u>



### Microscale Modeling Research Group



#### **Principle Investigator:**



**NN Mansour** 





F Panerai

#### **PuMA Development:**





**F** Semeraro



J Ferguson

X-Ray Microtomography:

**J** Thornton

**DSMC Development:** 



A Borner





A MacDowell D Parkinson



**H** Barnard



## **Questions?**

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May 6<sup>th</sup>, 2019 InterPore 2019