

Process modeling of a hammer mill

# Experiment-informed computational models for granular feedstock preprocessing and handling unit operations

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2023 NREL Multiphase Flow Science Workshop



# Process Upsets & Downtime

## Relevance to TEA (Techno-Economic Analysis) and LCA (Life Cycle Assessment) :

- Commercial-scale conversion of biomass in biorefineries has remained limited.
- A primary challenge in the design of a biorefinery is the storage, transport, and reactor feeding of the biomass feedstocks.
- Milling and handling have been prone to process upsets such as jamming and clogging, resulting in increased downtime and ultimately higher costs.

Typical biomass materials



Loblolly pine particles

Typical feedstock feeding and preprocessing issues



Material clogging in screw conveyor



Corn stover particles



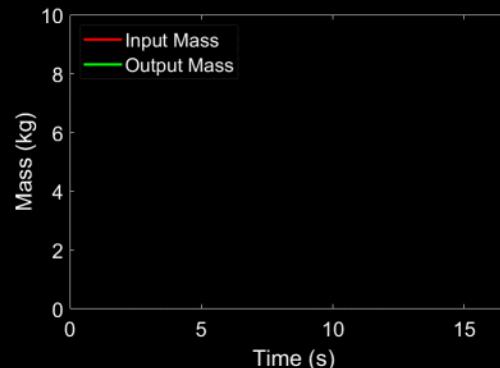
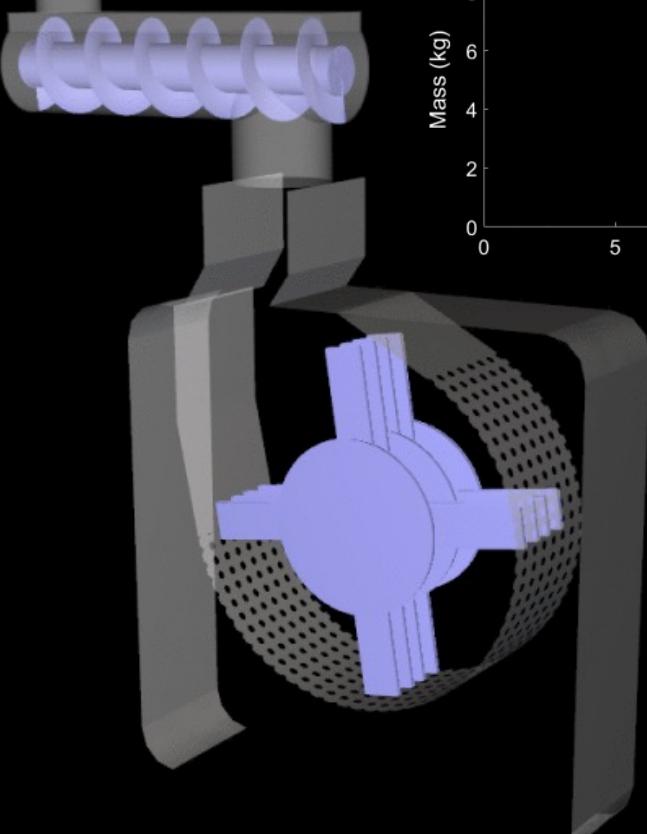
Material jamming in hammer mill grinder



# How Can Modeling Assist Quality-by-Design (QbD)?

## An experiment-informed hammer milling model

### Example



**Modeling facilitates massive testing for QbD**

- **CMA:** input PSD, particle shapes, etc.
- **CPP:** rotor speed, blade size, input mass rate, screen sieve size.
- **CQA:** output PSD, output mass rate etc.

Feedstock materials	Corn stovers Pine residuals
Morphology	shape & size
Water/moisture content	internal surface
Density	Intrinsic Envelope
Stiffness	Intrinsic Effective
Friction	Sliding Rolling
Adhesion	Other types

### Description

- Developed a hammer milling model (particle flow & deconstruction) for assisting QbD

### Value of new tool

- First-of-its-kind virtual laboratory
- Enabled fast massive testing and real-time performance diagnosis

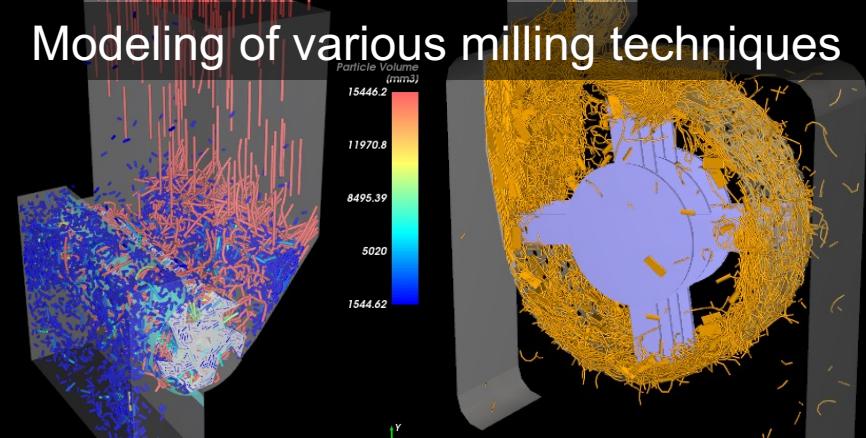
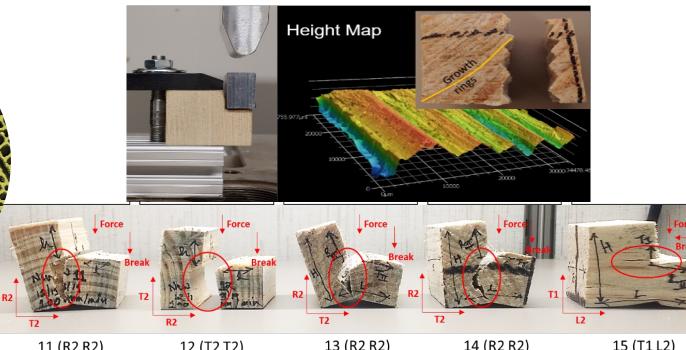
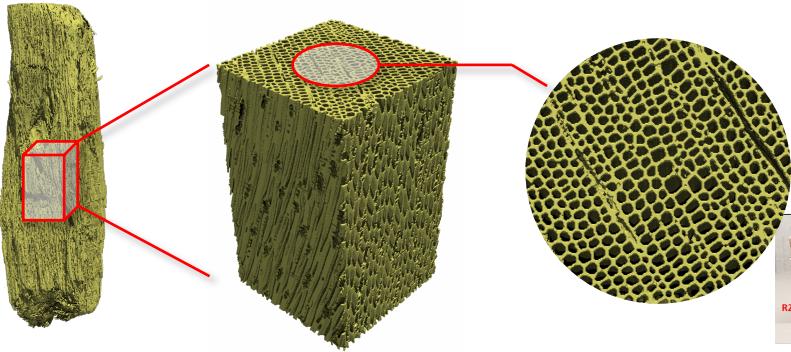
### Potential Customers & Outreach

- Feedstock preprocessing industry partner, biorefinery designers

# Virtual Feedstock Processing Laboratory Based on Multiscale Multiphysics



## XCT-informed microstructural deconstruction model and upscaling

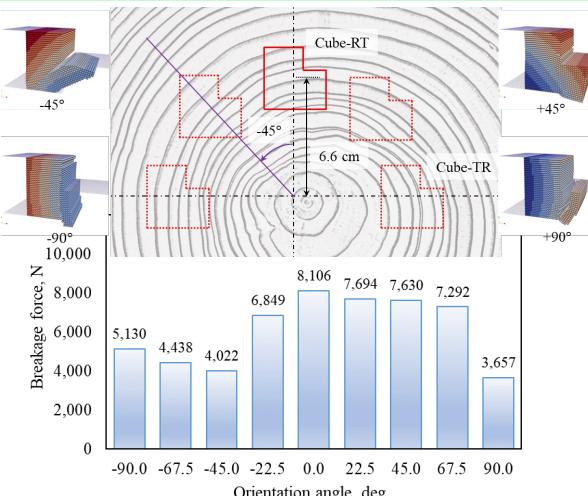
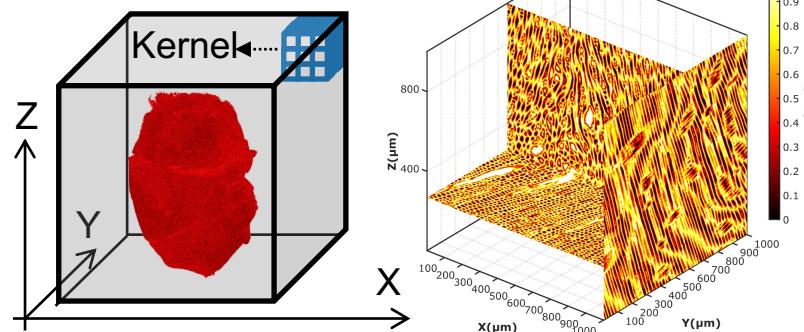


Microscale (um)

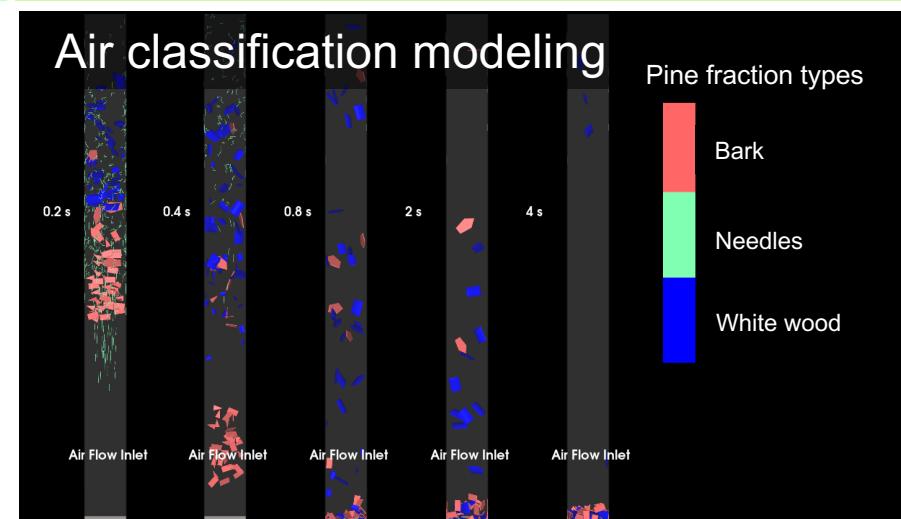
Laboratory scale (cm)

Pilot scale (m)

## Advanced micro-porosity analysis



## Air classification modeling



Pine fraction types

- Bark
- Needles
- White wood



## Identified particle- & bulk-scale models suitable for the flow of milled biomass and recommended best practices (part 1)

### Current Knowledge Gap

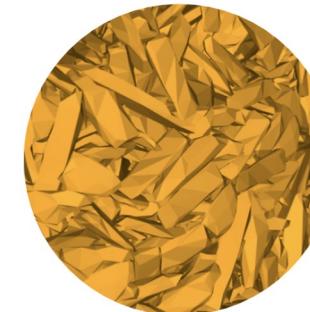
- Lack of computational models suitable for biomass flow
- Lack of experimental data for new model development
- Lack of open-source model platforms for user coverage

### Achievement

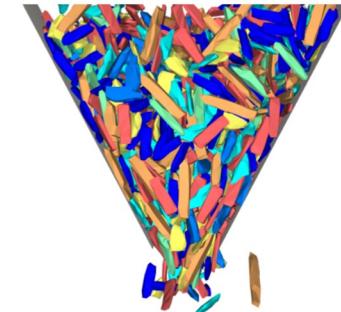
- Identified limitations of existing models as knowledge base
- Recommended potential flow models & codes for biomass



Chipped loblolly pine particles  
(3-4 mm sieve size)



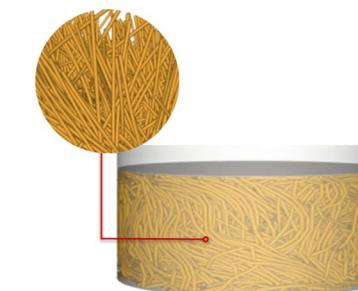
Custom polyhedral particles  
of arbitrary shapes



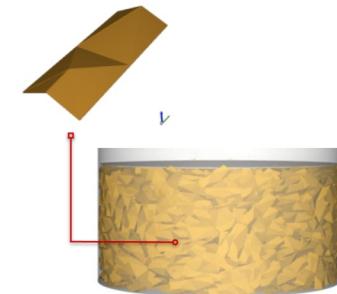
A V-shape hopper discharge of  
polyhedral particles



Milled corn stover particles  
(e.g. fiber & shell shapes)



Flexible fiber particles of  
arbitrary aspect ratio



Flexible thin shell of  
arbitrary aspect ratio

Yidong Xia, Jonathan Stickel, Wencheng Jin, Jordan Klinger. A review of computational models for the flow of milled biomass I: Discrete-particle models, *ACS Sustainable Chemistry & Engineering*, 8, No. 16 (2020): 6142-6156. <https://pubs.acs.org/doi/abs/10.1021/acssuschemeng.0c00402>



## Identified particle- & bulk-scale models suitable for the flow of milled biomass and recommended best practices (part 2)

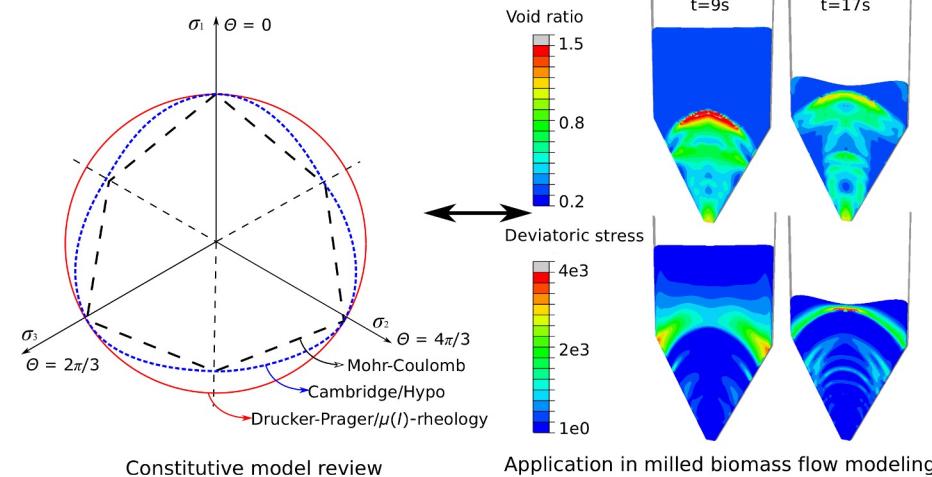
### Current Knowledge Gap

- Lack of computational models suitable for the flow of milled biomass
- Lack of experimental data for supporting new model development
- Lack of open-source model platforms for user coverage

### Achievement

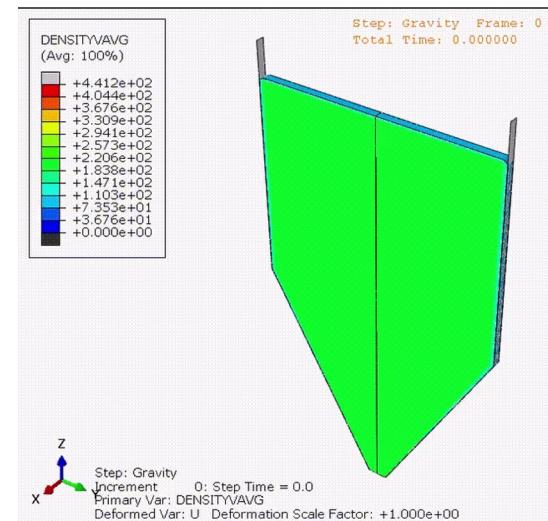
- Identified limitations of existing models as knowledge base
- Recommended potential flow models & codes for biomass materials

Wencheng Jin, Jonathan Stickel, Yidong Xia, Jordan Klinger. A review of computational models for the flow of milled biomass II: Continuum-mechanics models, *ACS Sustainable Chemistry & Engineering*, 8, No. 16 (2020): 6157-6172. <https://pubs.acs.org/doi/abs/10.1021/acssuschemeng.0c00412>



Constitutive model review

Application in milled biomass flow modeling



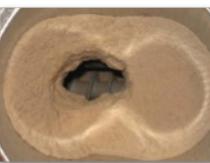
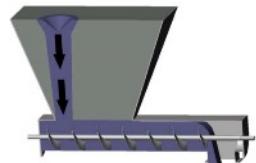
# Approach

Goal: Develop first-principles-based design tools that enable continuous, steady, trouble-free bulk flow transport through processing train to reactor throat.

Process upsets in handling are a major challenge for lowering costs of biomass.



Conveyor/Feeder



Experimental: multi-scale material characterization for state-of-the-art **knowledge** and **design charts**

Particle-scale



Bulk-scale

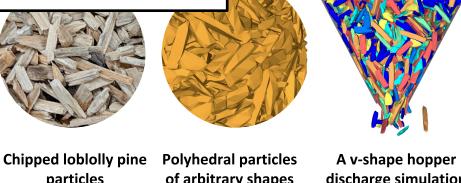


Pilot/demonstration-scale

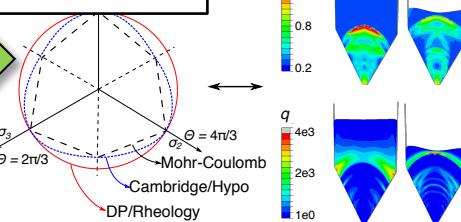


Computational: experiment-validated multi-scale biomass mechanics & flow simulators as **open-source toolkits**

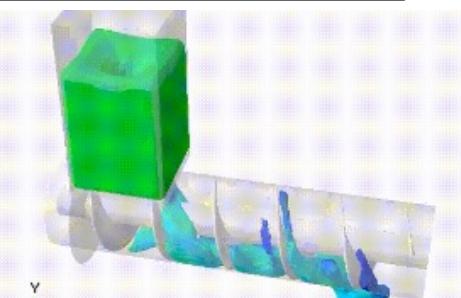
Particle-scale



Bulk-scale



Pilot/demonstration-scale



Outcome: efficient & effective design charts and simulators for bioenergy industries and other applicable areas

Preprocessing  
CQAs (e.g., particle shape, PSD, feed rate)

CMAs & CPPs (e.g., particle shape, PSD, feed rate)  
Material Handling  
CQAs (controlled flow rate)

CMAs & CPPs (e.g., particle shape, PSD, feed rate)  
Conversion  
CQAs

# Approach (continued)

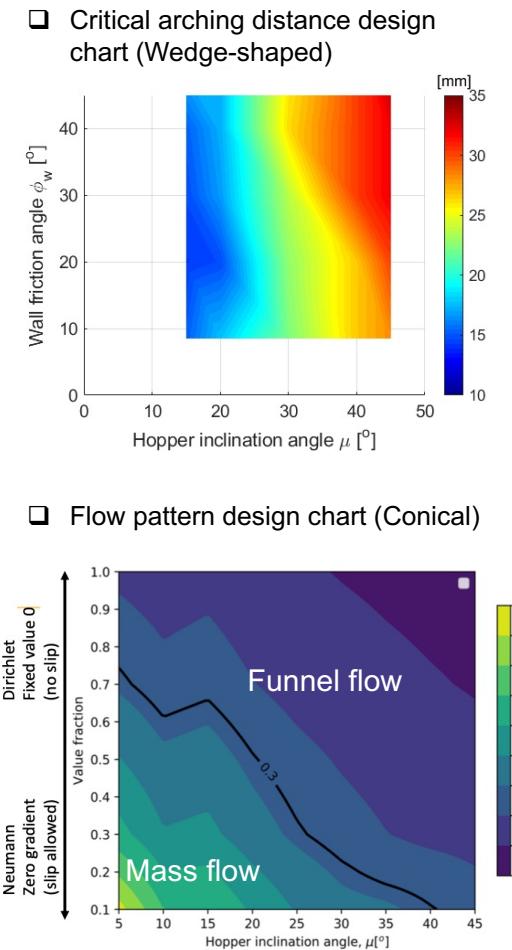
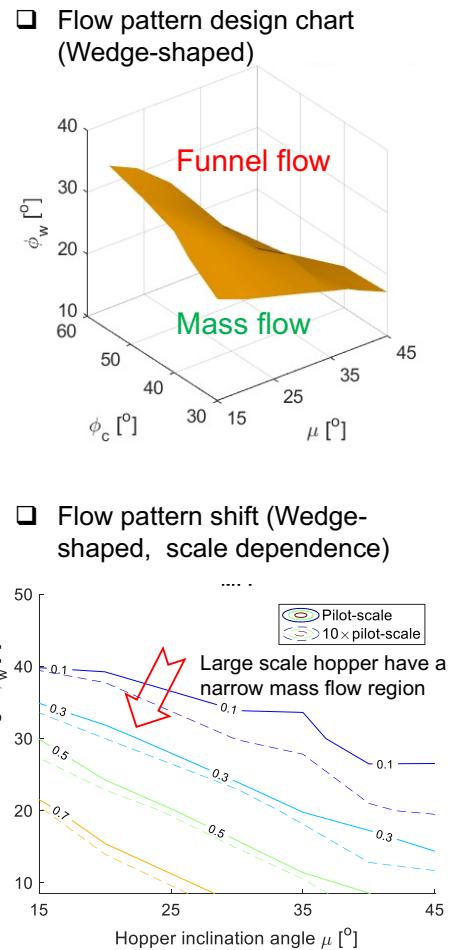
**Metrics:** 1) Operational reliability (e.g., design chart for consistent hopper flow at designed flow rate). 2) qualification of flow models (80% or higher agreement with experimental data).

MA
Controllable attributes
Particle size distribution
Morphology (aspect ratio, shape, etc.)
Particle density/porosity
Surface energy
* Moisture content; * Ash content
Physical properties
Initial & critical state void ratio/density (bulk scale)
Critical state friction angle (bulk scale)
Elasticity (bulk scale)
Contact laws (particle scale)
* Time consolidation; * Scale-up effect

CPPs of Hopper



Feeding mass rate
Outlet mass rate
Depth
Side inclination angle
Outlet aperture size



CMA: Internal friction angle  $\phi_c$   
CQA: Flow pattern, critical arching distance

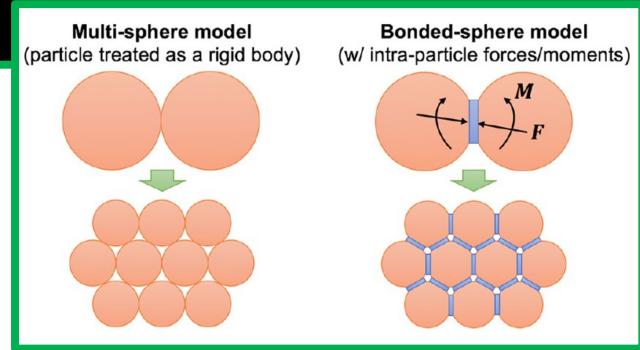
Attributes denoted by \* means not being currently studied in modeling



# Early DEM Models for Biomass Particle Flow

## Multi-sphere (rigid) and bonded-sphere (flexible) DEM particle models

- **Advantages:** simple surface contact detection
- **Biomass applications:** Pines (Xia et al, 2019) switchgrass (Guo et al. 2020)
- **Limitation:** (1) Limited shape complexity; (2) Expensive for certain shapes like long fiber-like particles, corn stover



Yidong Xia, Zhengshou Lai, Tyler Westover, Jordan Klinger, Hai Huang, Qiushi Chen, "Discrete element modeling of deformable pinewood chips in cyclic loading test", *Powder Technology*, Vol 345, 1 March 2019, Pages 1-14. <https://doi.org/10.1016/j.powtec.2018.12.072>

Yuan Guo, Qiushi Chen, Yidong Xia, Tyler Westover, Sandra Eksioglu, Mohammad Roni, "Discrete element modeling of switchgrass particles under compression and rotational shear," *Biomass & Bioenergy*, Vol. 141, No. 105649, Oct. 2020. <https://doi.org/10.1016/j.biombioe.2020.105649>

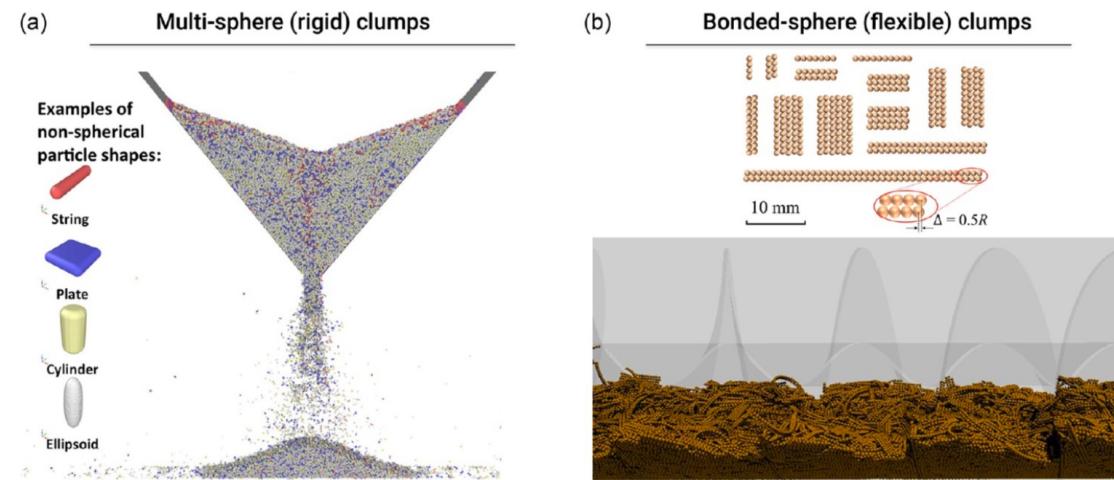


Figure 4. Composite-sphere models for milled biomass: (a) multisphere models for hard wood chips and (b) bonded-sphere models for flexible chopped switchgrass fragments.

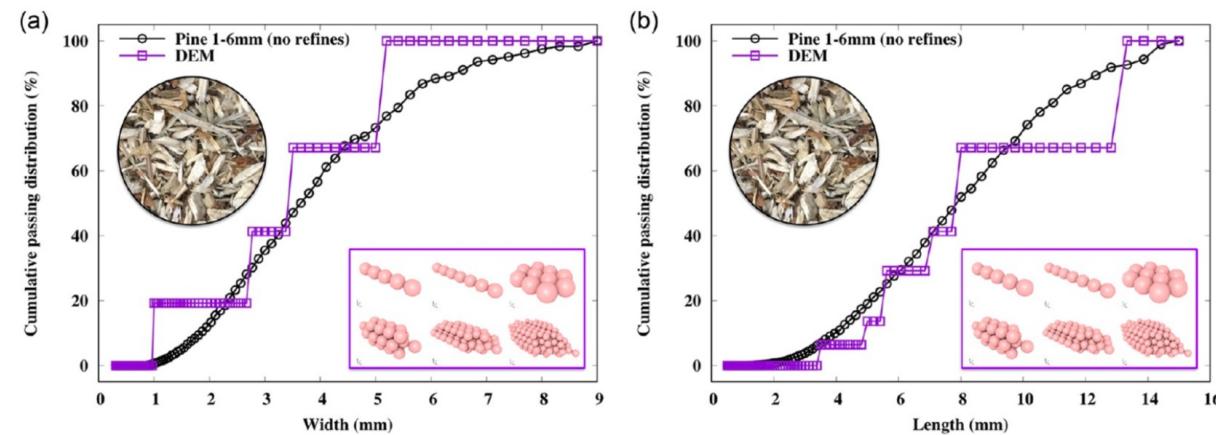
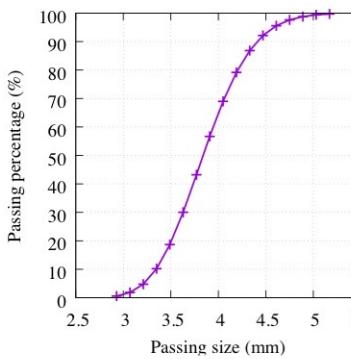


Figure 5. Approximation of (a) width and (b) length distributions of the physical loblolly pine particles (smooth curves) using the bonded-sphere DEM model with six shape templates and thus finite width and length distribution (staircase lines) (adapted with permission from Xia et al.,<sup>45</sup> Copyright 2019, Elsevier). Each bonded-sphere shape template represents real pine particles for a certain range of sizes. As a result, the cumulative distributions of the DEM particles show steps with each step corresponding to the size of a shape template.

# Shape Specification for Biomass Particles

Tools



Types	Shape description	No. of particles	%	No. of particles
(a)	Flat square flakes (dark brown)	38	6.2%	
(b)	Flat square flakes (white)	153	25.1%	
(c)	Flat rectangular parallelepiped plates/flakes	116	19.0%	
(d)	Short needles, cylinders, rods, prisms (4 faces)	171	28.1%	
(e)	Medium needles, cylinders, rods, prisms (4 faces)	107	17.6%	
(f)	Long needles, cylinders, rods, prisms (4 faces)	24	3.9%	

Nano-CT



Types	Example particle	EX-POLY	HIGH-POLY	LOW-POLY	SPHERO-POLY	
(a)	Flat square flakes (dark brown)	2.5 x 5.2 x 9.9 (mm <sup>3</sup> )				
(b)	Flat square flakes (white)	2.2 x 5.6 x 8.6 (mm <sup>3</sup> )				
(c)	Flat rectangular parallelepiped plates/flakes	2.5 x 3.8 x 11.6 (mm <sup>3</sup> )				
(d)	Short needles, cylinders, rods, prisms (4 faces)	2.6 x 4.8 x 14.1 (mm <sup>3</sup> )				
(e)	Medium needles, cylinders, rods, prisms (4 faces)	3.1 x 4.9 x 16 (mm <sup>3</sup> )				
(f)	Long needles, cylinders, rods, prisms (4 faces)	3.6 x 4.6 x 18.7 (mm <sup>3</sup> )				

Yidong Xia, Feiyang Chen, Jordan Klinger, Joshua Kane, Tiasha Bhattacharjee, Robert Seifert, Oyelayo O. Ajayi, Qiushi Chen, "Assessment of a tomography-informed polyhedral discrete element modeling approach for complex-shaped granular woody biomass in stress consolidation." Biosystems Engineering, 205 (2021): 187-211.  
<https://doi.org/10.1016/j.biosystemseng.2021.03.007>



# *A Closer Look at the Fractured Pine Particles*

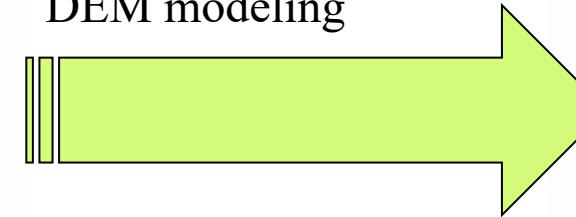


15 micrometer  
resolution



“Extreme”-resolution polyhedron

Coarse-graining for  
DEM modeling



“High”-resolution polyhedron



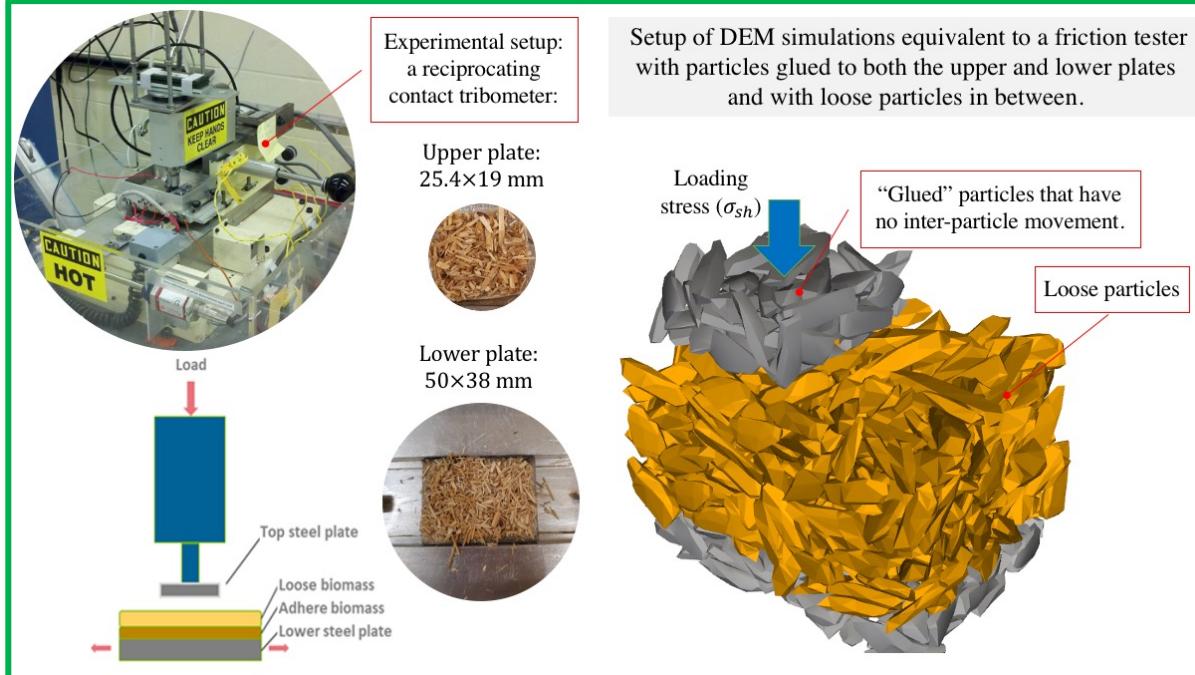
## XCT-informed polyhedral DEM for fundamental flow physics of bulk fractured pine particles

### Description

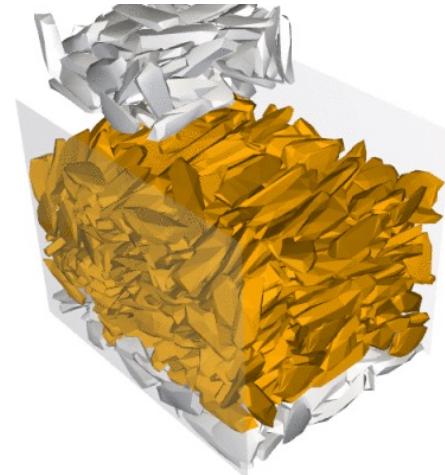
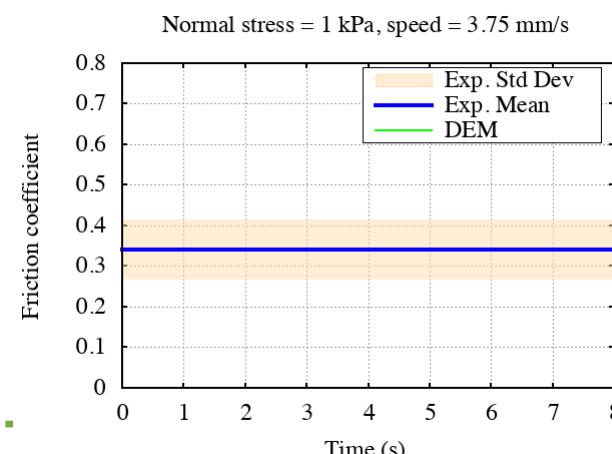
- For study of the influence of particle morphologies (shape, size, etc.) and contact force models as CMAs in stress consolidation.

### Value of new tool

- First-of-its-kind virtual laboratory for biomass particle mechanics.

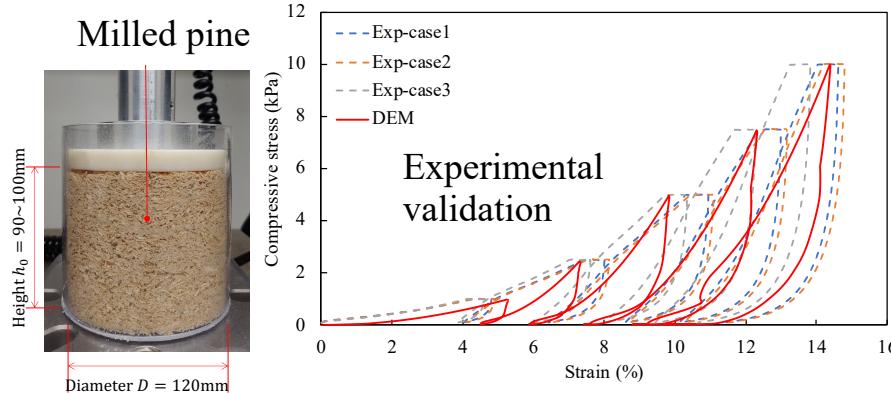


Yidong Xia, Feiyang Chen, Jordan Klinger, Joshua Kane, Tiasha Bhattacharjee, Robert Seifert, Oyelayo O. Ajayi, Qiushi Chen, "Assessment of a tomography-informed polyhedral discrete element modeling approach for complex-shaped granular woody biomass in stress consolidation." Biosystems Engineering, 205 (2021): 187-211.  
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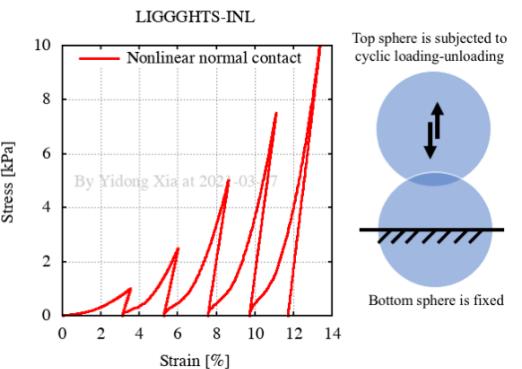


## Coarse-grain DEM for bulk feedstock flow

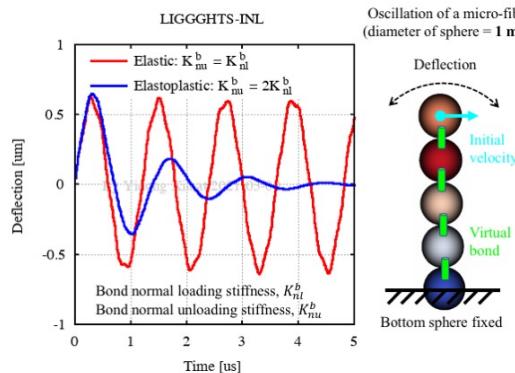
A coarse-grained DEM with hysteretic nonlinear force-displacement contact laws



### Hysteretic nonlinear contact model

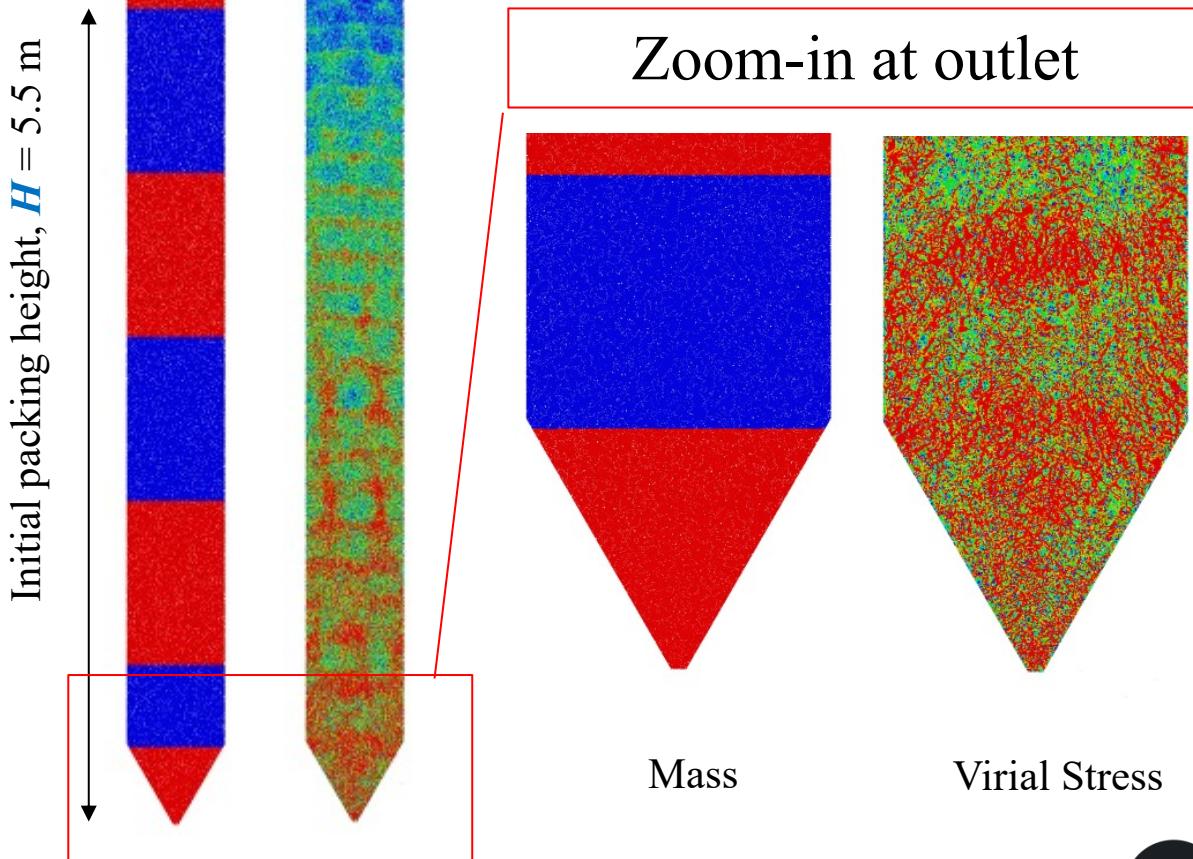


### Hysteretic nonlinear flexible fiber model



## Simulation of pilot-scale hopper discharge

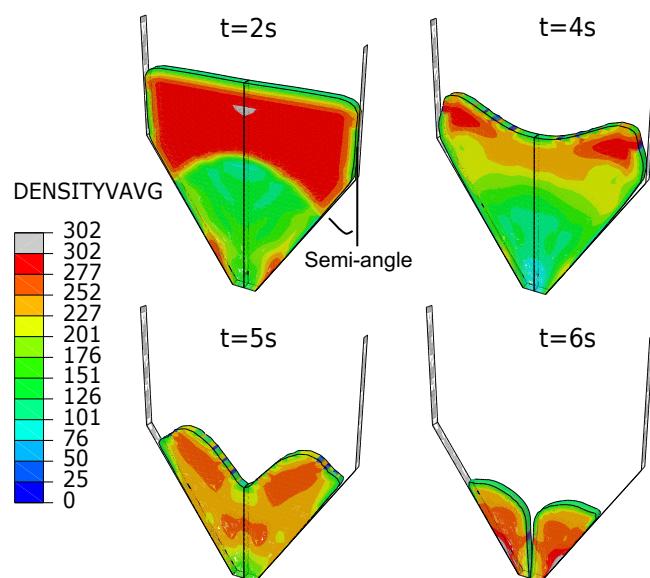
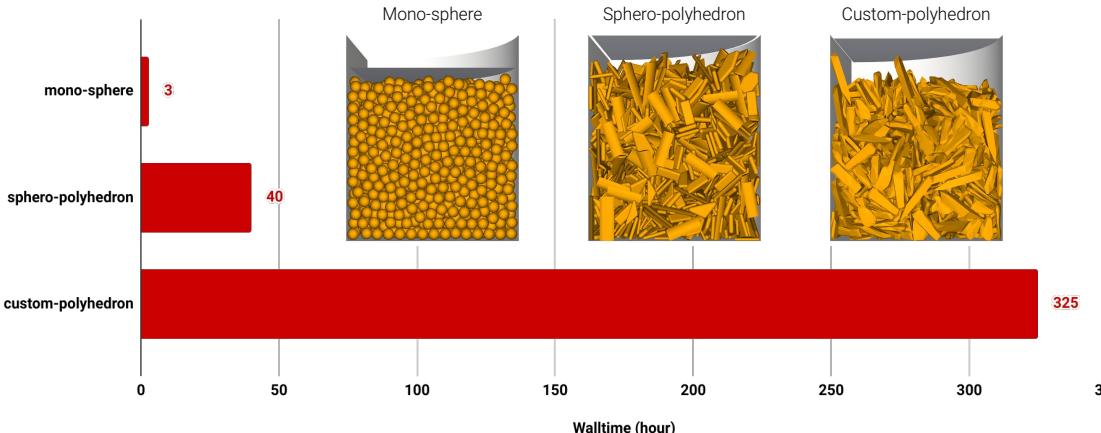
Zoom-in at outlet



<https://github.com/idaholab/LIGGGHTS-INL>



# Limitations of Particle-based Models

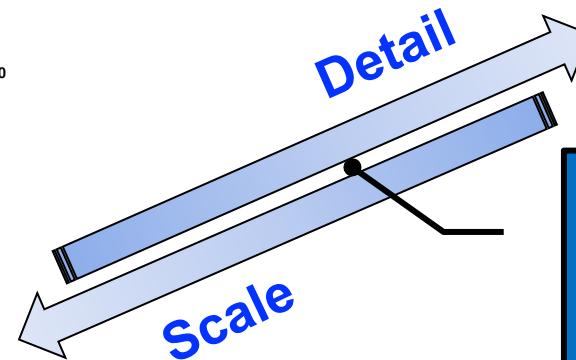


**FEM pilot-scale hopper simulation**  
[Jin et al, 2020]:

- Size: ~1000mm;
- Resource: 32 CPU cores
- **Cost: 2 hours**

## DEM particle axial shear simulation:

- Size: ~50mm (~2000 particles)
- Resource: 4 CPU cores
- Cost: **300 hours** with polyhedral DEM model
- Cost: **3 hours** with coarse-grained DEM model



No access to HPC?  
Not a problem.

Most simulations shown here  
require only a good personal  
workstation to complete within a  
reasonable amount of time.



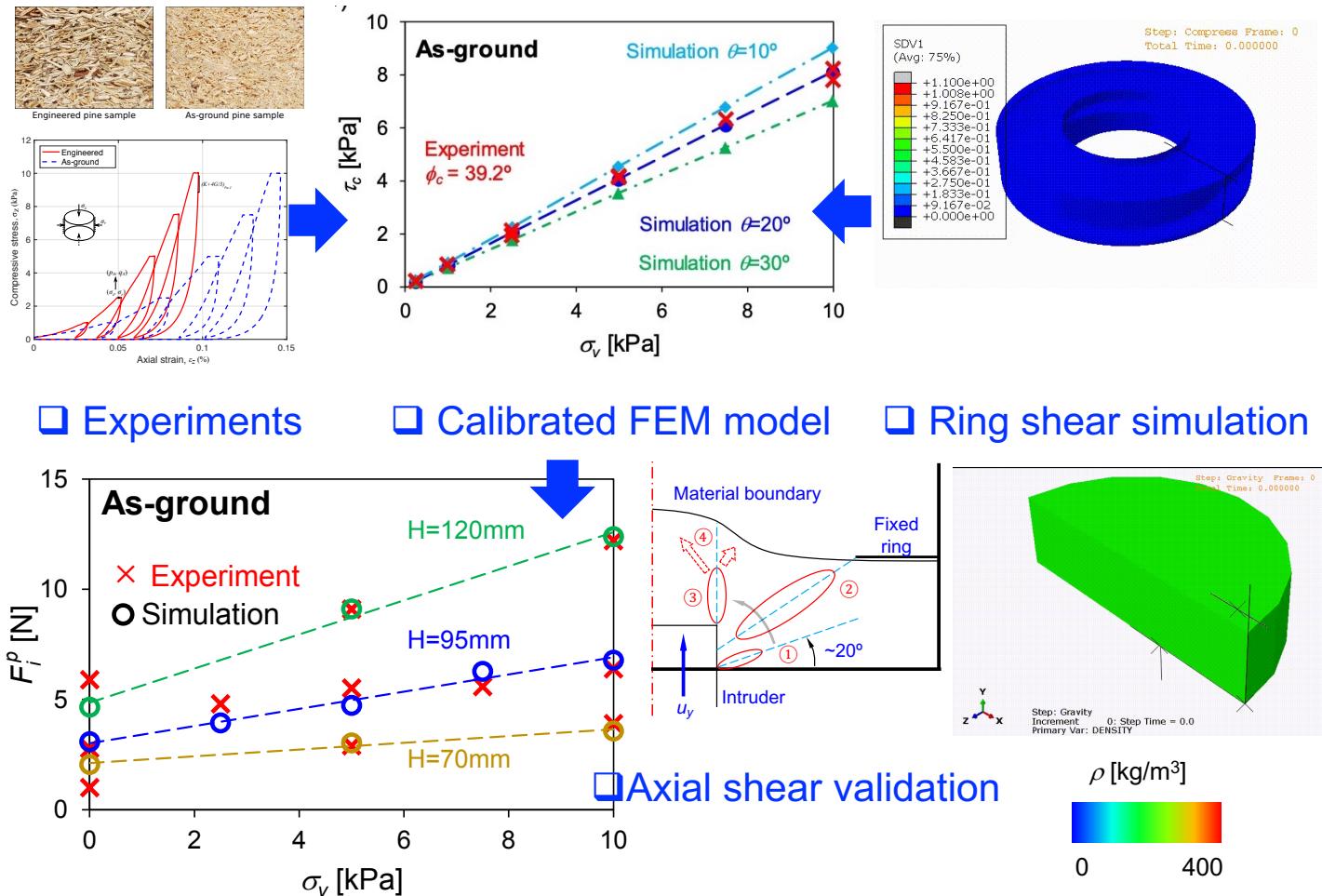
## Advanced continuum particle flow theories & models to predict biomass in storage & slow flow conditions.

### Current Knowledge Gap

- The state-of-the-art continuum flow models based on different theories & mathematical frameworks have not been evaluated for modeling biomass.
- Lab tests cannot provide direct measurement of constitutive model parameters due to the compressibility of particles

### Achievement

- Established a work-flow to calibrate the model parameters by coupling standard laboratory tests with numerical simulations
- Implemented and evaluated four advanced continuum particle flow models for biomass granular material, and identified the **hypoplastic model** with critical state theory is the best one



W. Jin et al. A density dependent Drucker-Prager/Cap model for ring shear simulation of ground loblolly pine, *Powder Technology*, 368:45-58, 2020. <https://doi.org/10.1016/j.powtec.2020.04.038>



## Reformulated continuum particle flow models predict biomass & guide design of pilot-/industrial-scale hopper & conveyor.

### Description

The validated hypoplastic model accurately capture the flow behavior in a pilot-scale hopper and capture flow behavior in the Acrison feeder at industrial-scale

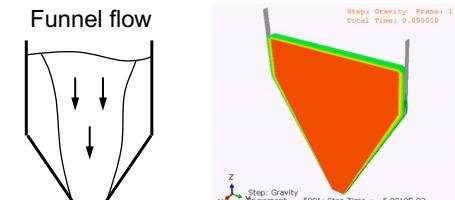
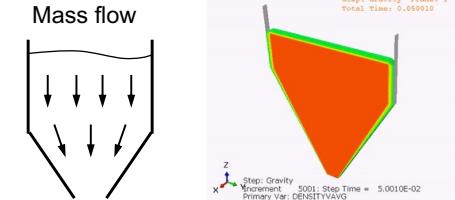
### Value of new tool

Industry-scale simulation using the constitutive model will identify the CMAs that control material flow and provide a tool to optimize equipment design and to guide equipment operation for biorefinery engineers

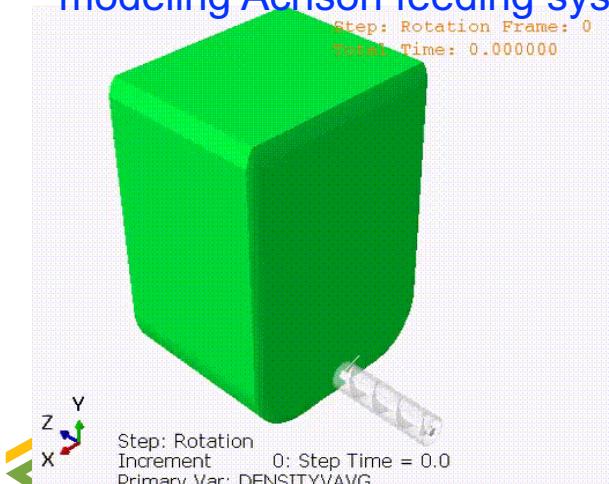
Sensitivity analysis using the constitutive model will provide CMAs working envelops for conventional flow equipment as a tool and the tool will guide biomass preprocessing steps

Y., Lu, W. Jin, J. Klinger, T. Westover, S. Dai. Flow characterization of compressible biomass particles using multiscale experiments and a hypoplastic model, *Powder Technology* (2021). <https://doi.org/10.1016/j.powtec.2021.01.027>

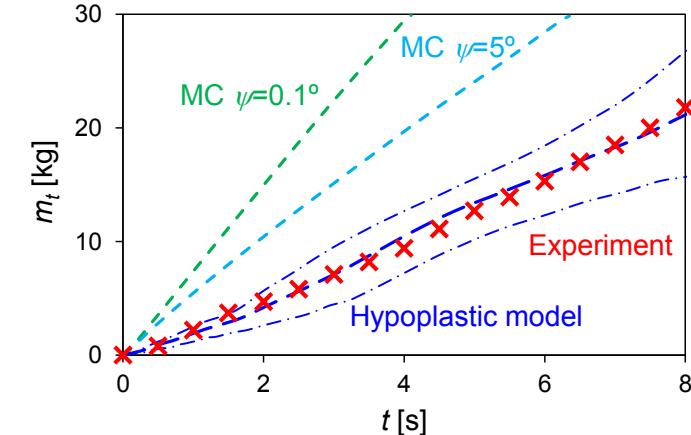
### Hopper flow pattern prediction



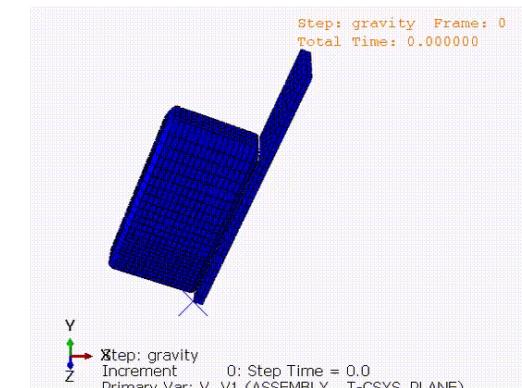
### Engineering Application - modeling Acrison feeding system



### Quantitative flow rate validation



### Inclined plate flow modeling

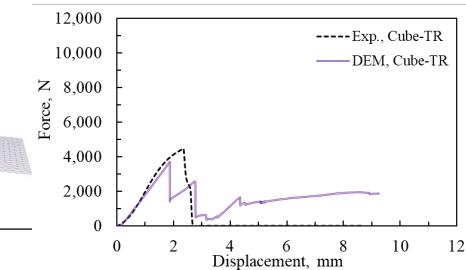
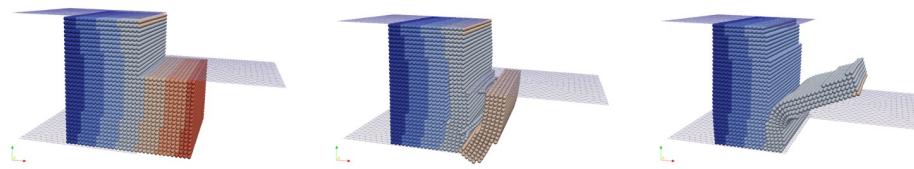


# Deconstruction Mechanism Theory & Model

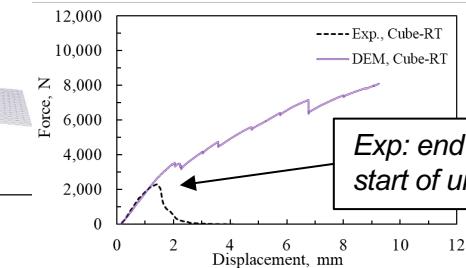
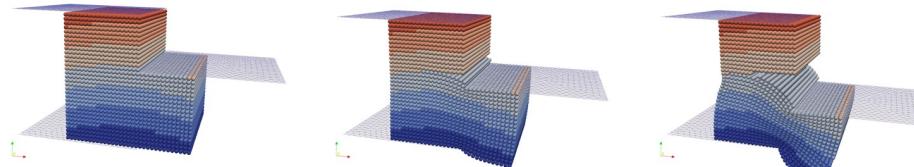


Developed experiment-validated open-source macroscale DEM model for pine structural deformation & deconstruction

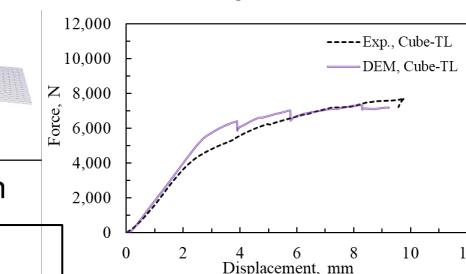
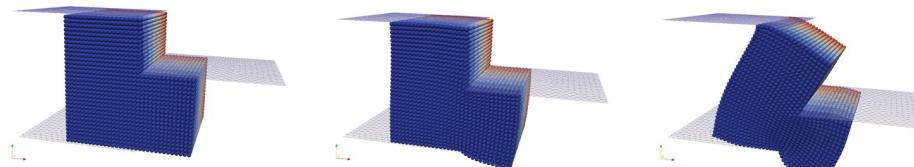
Cube-TR



Cube-RT



Cube-TL



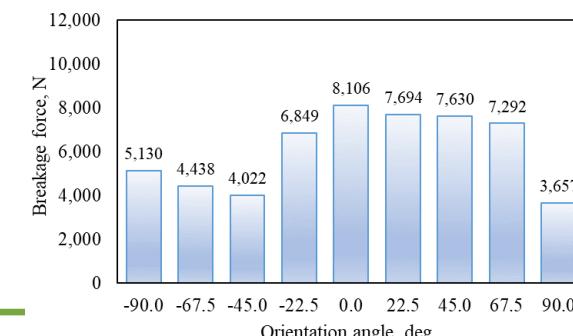
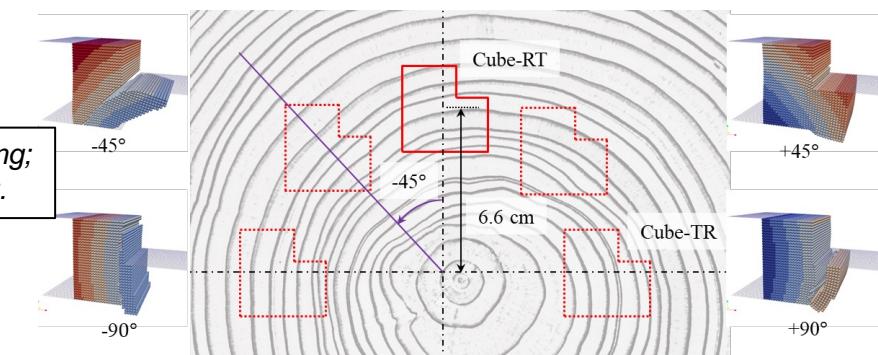
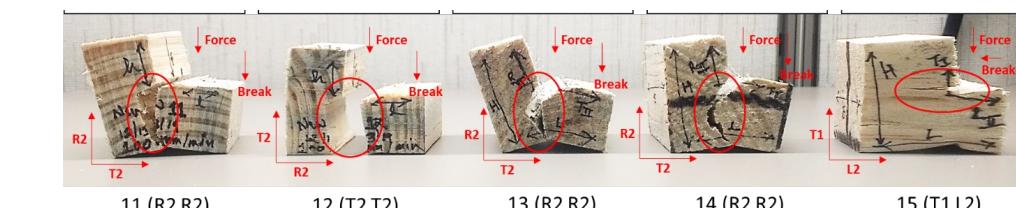
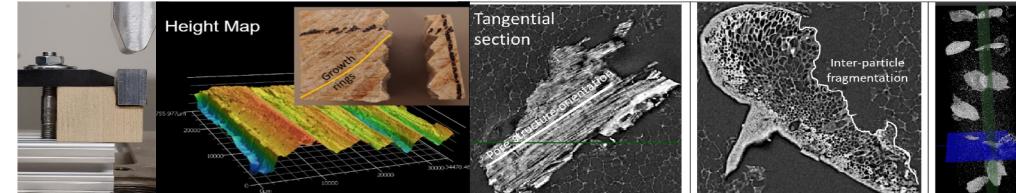
Disp. = 0 mm

Disp. = 4 mm

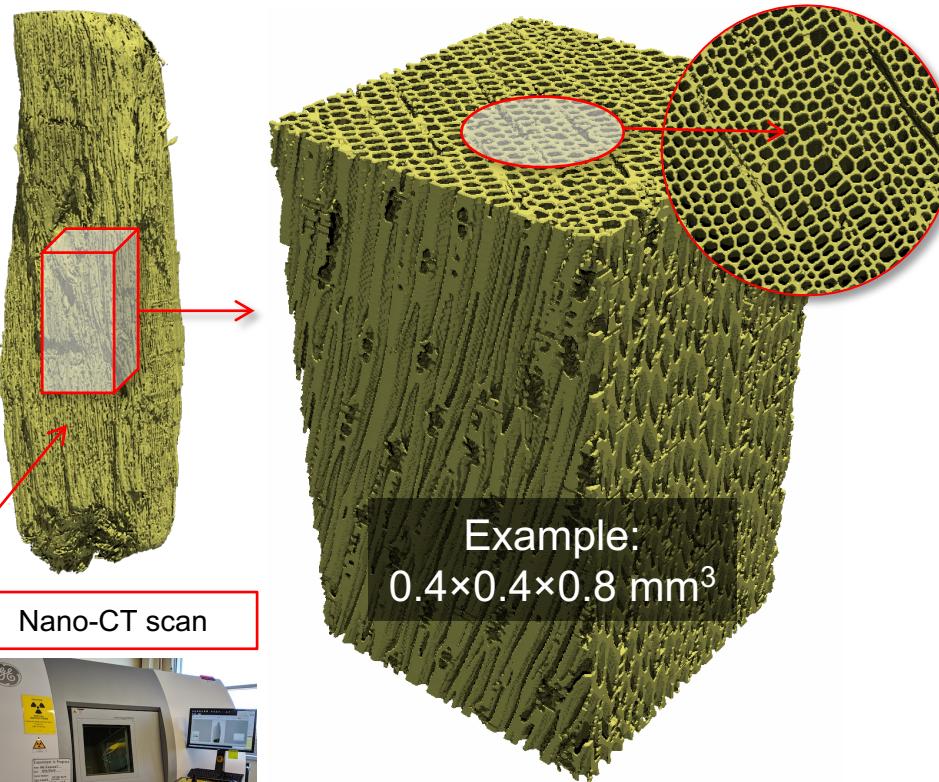
Disp. = 8 mm

Yuan Guo, Qiushi Chen, Yidong Xia, Jordan Klinger, Vicki Thompson, "A nonlinear elasto-plastic bond model for the discrete element modeling of woody biomass particles." Powder Technology 385 (2021): 557-571.

<https://doi.org/10.1016/j.powtec.2021.03.008>

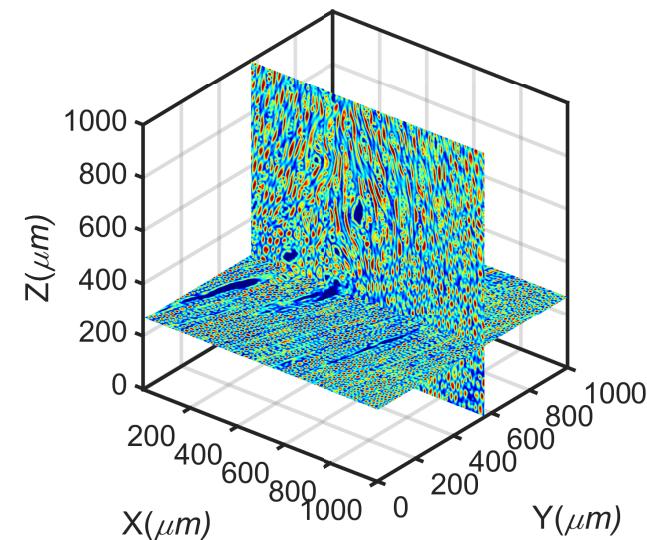
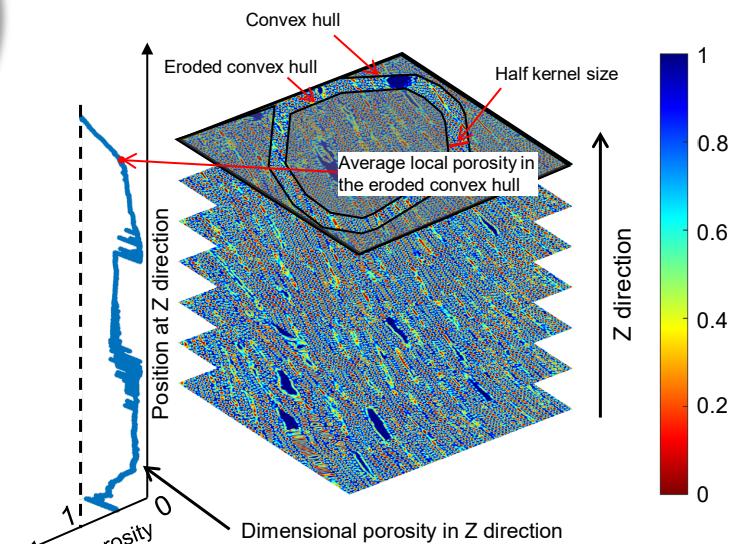


Developed XCT-informed loblolly pine 3D microstructural topology reconstruction workflow for fracture physics & models



## Value of new tool

- First-of-its-kind virtual laboratory for biomass micromechanics
- Microstructural mechanics DEM model will be open-source
- An intermediate-scale model links mesoscale model and macroscale model in the multiscale model plan (NREL/INL)



Quan Sun, Yidong Xia, Jordan Klinger, Robert Seifert, Joshua Kane, Vicki Thompson, Qiushi Chen, "X-ray computer tomography-based porosity analysis: Algorithms and application for porous woody biomass." Powder Technology 388 (2021): 496-504.  
<https://doi.org/10.1016/j.powtec.2021.05.006>

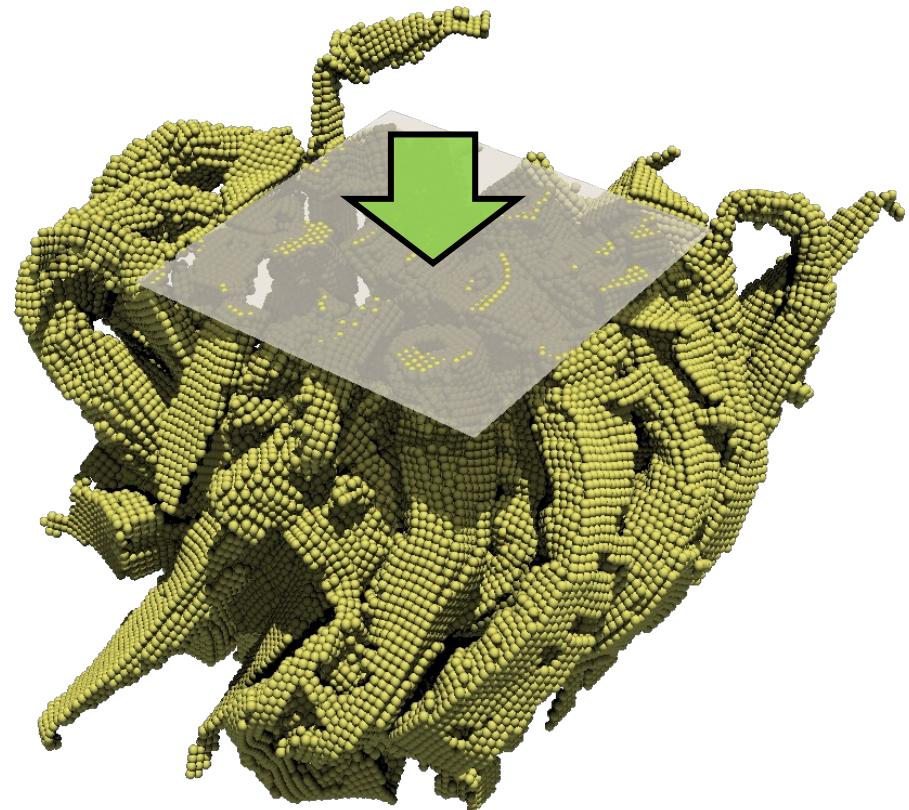
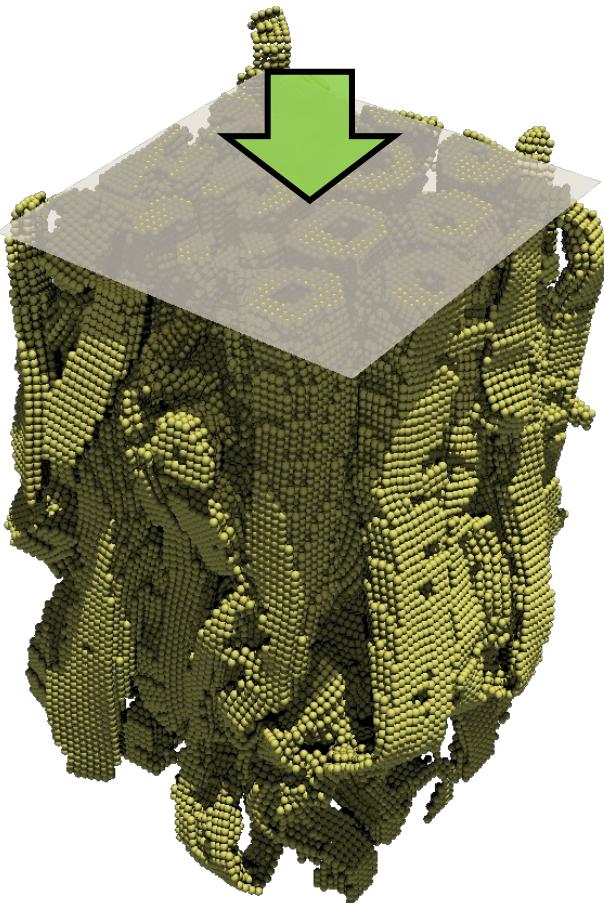
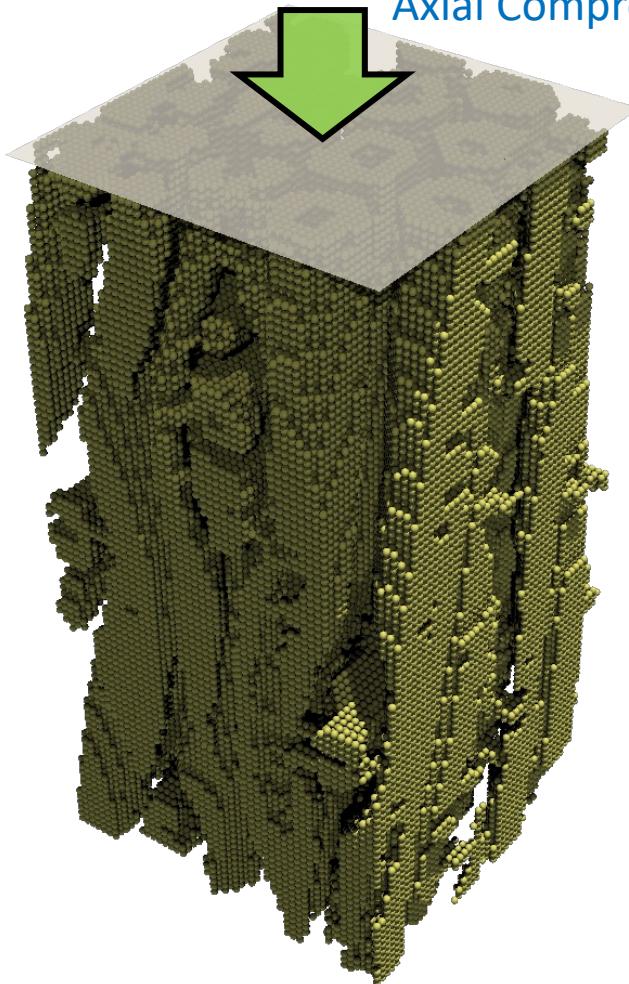
# Axial Loading of Microscale ROI of Pine Particle



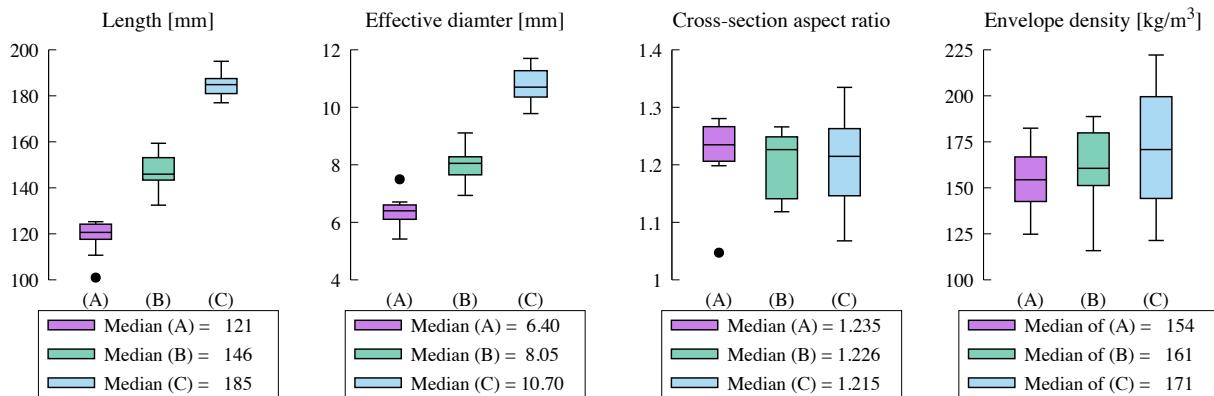
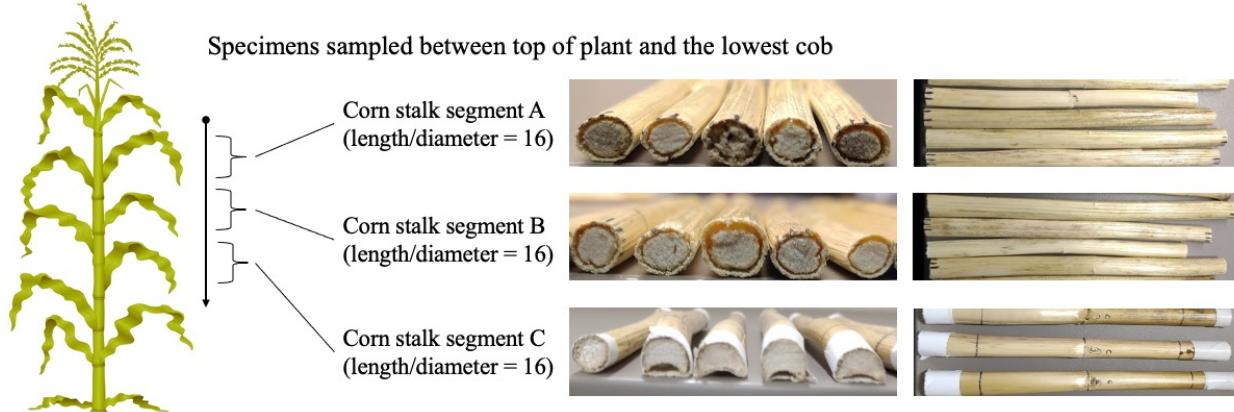
Axial Compression to Realistic Structural Damage: Case study of a region of interest (ROI) of pine particle

Size of ROI:  $100 \times 100 \times 200 \text{ } \mu\text{m}^3$ . Sphere diameter: 2  $\mu\text{m}$

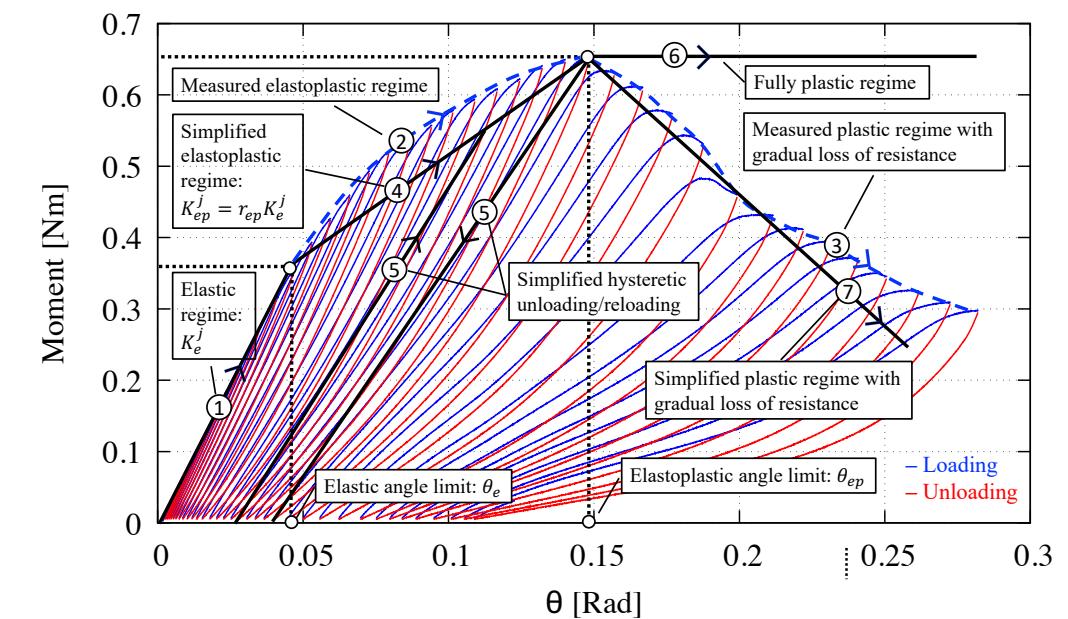
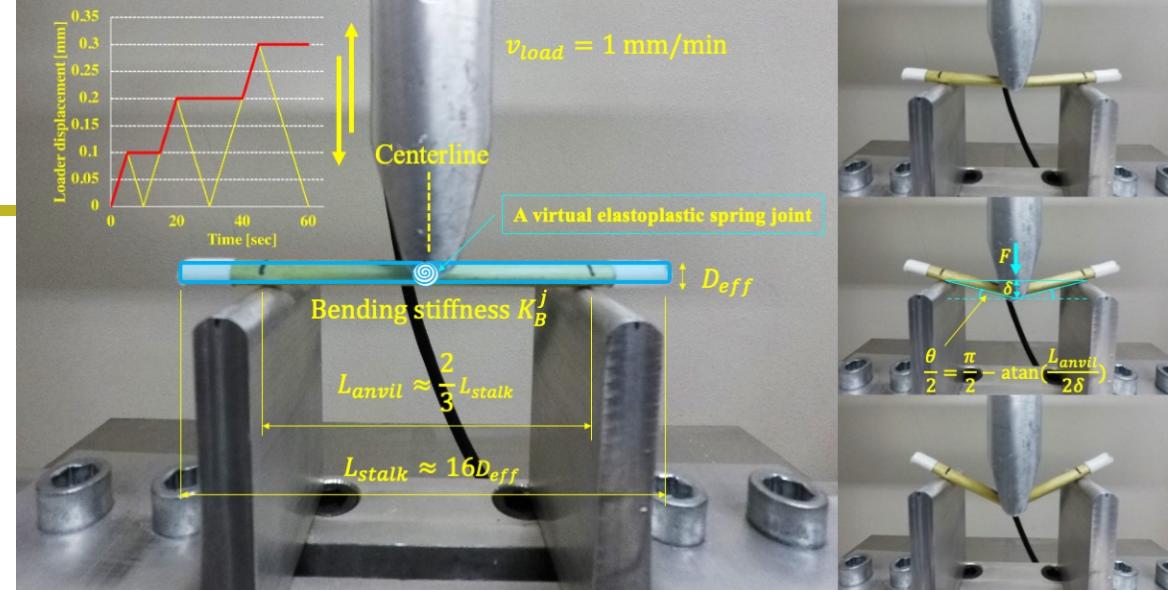
Image credit: Yidong Xia (Idaho National Laboratory)



# Biomechanics of Corn Stover



Yidong Xia, Jordan Klinger, Tiasha Bhattacharjee, Vicki Thompson, "The elastoplastic flexural behavior of corn stalks", Biosystems Engineering 216 (2022): 218-228.



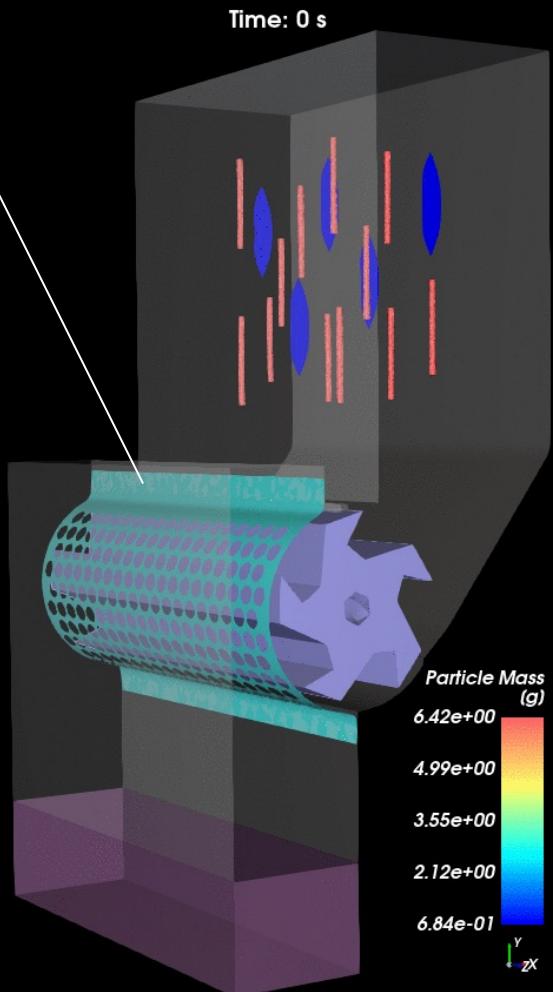
# Preprocessing – An JRS Knife Milling Model

Tools



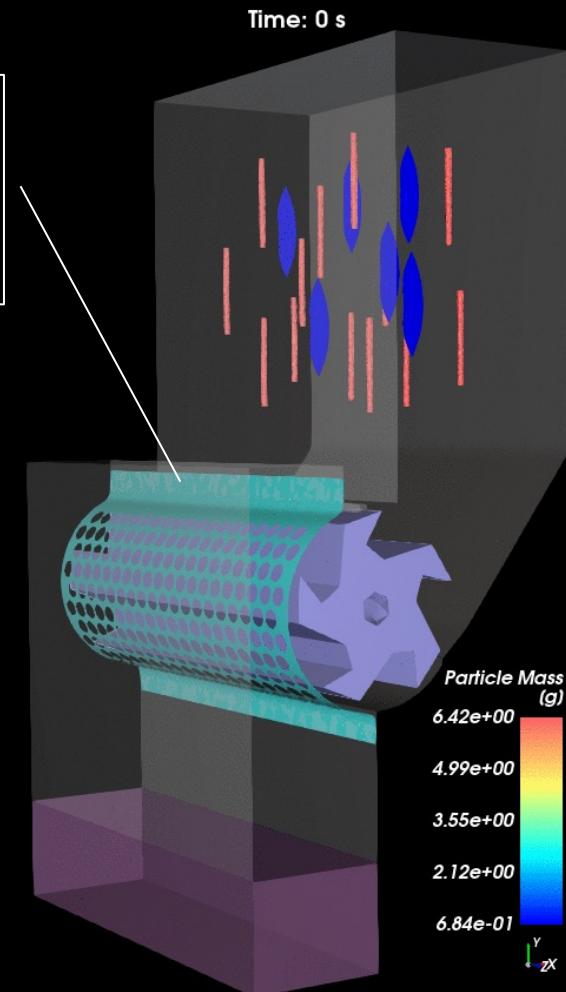
Low rpm:

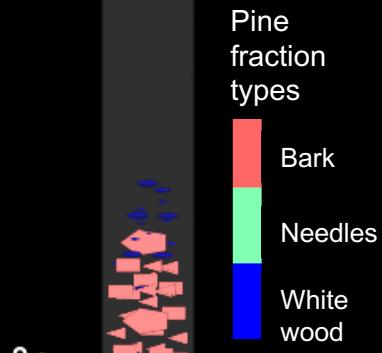
- Corn leaf comminuted
- Corn stalk deformed but not comminuted



High rpm:

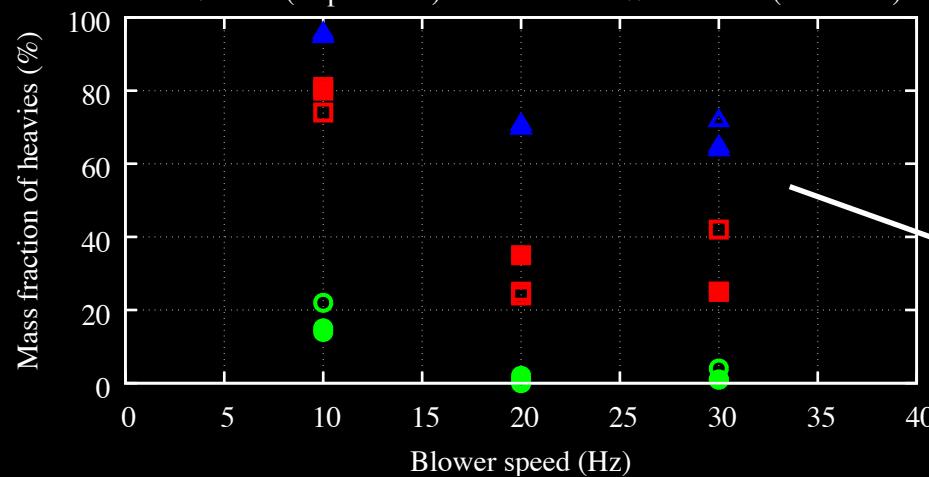
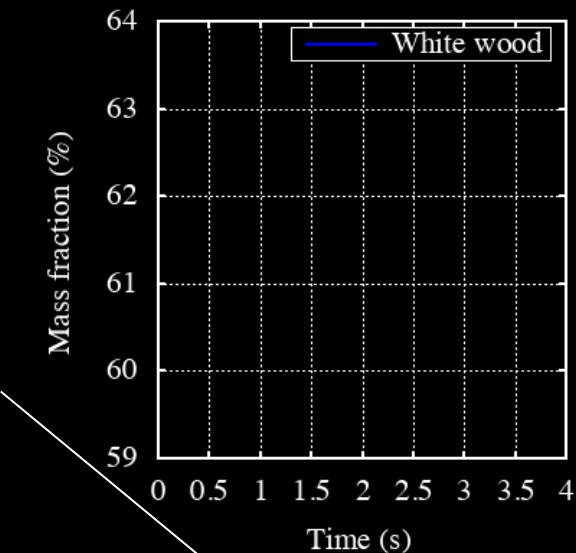
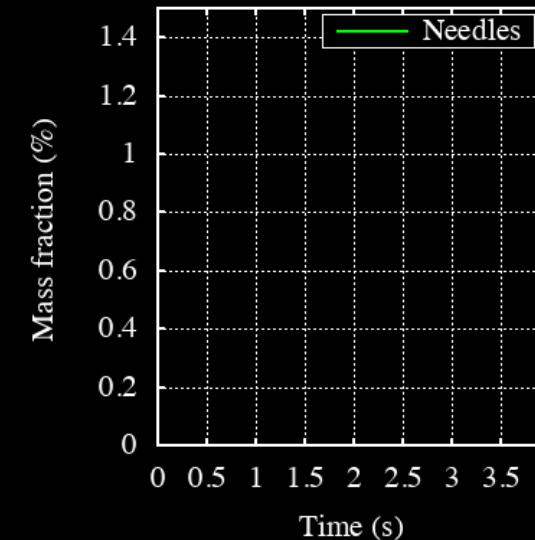
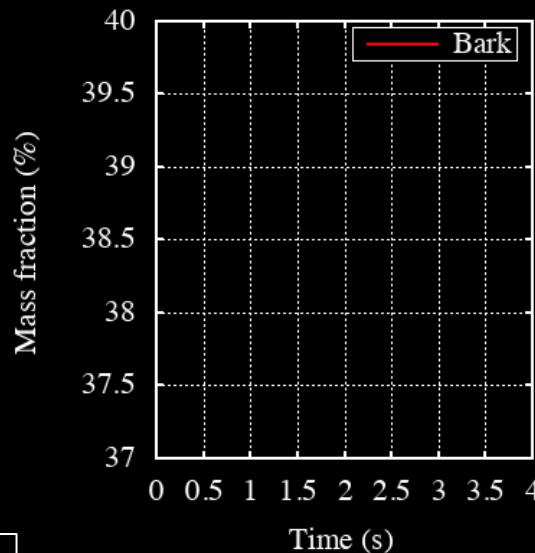
- Corn leaf comminuted
- Corn stalk comminuted





Process parameters:

- Feed rate
- Blower power, etc.



Quality attributes:

- Heavy fraction mass rate
- Output particle size distributions, etc.

Experimental validation

# Readyng Capabilities for the Emerging Needs

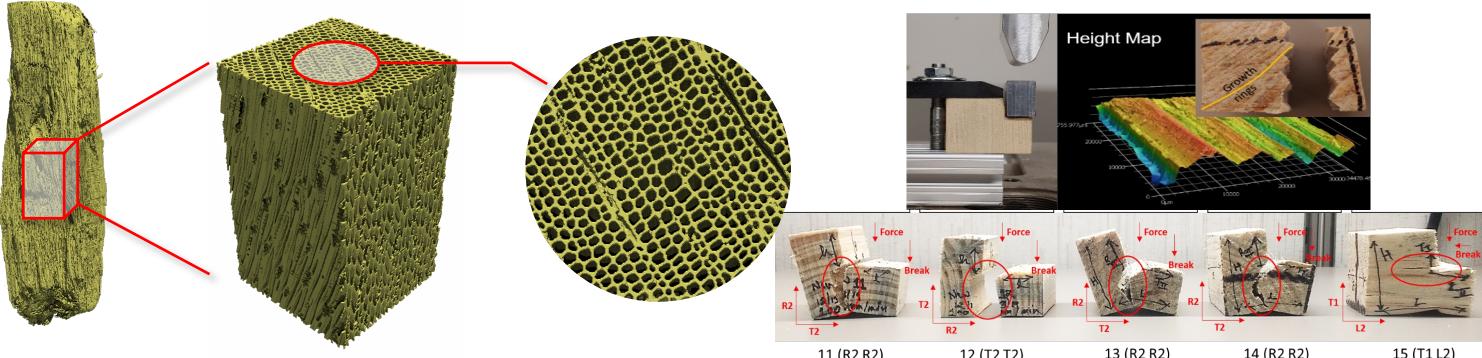
Understanding and being able to model the unique physical characteristics of municipal solid waste (MSW) is a prerequisite of including MSW in Virtual Feedstock Processing Laboratory.



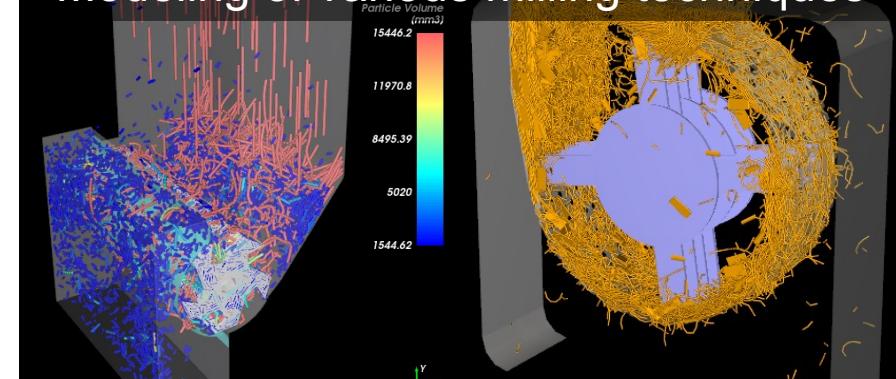
# Recap: Virtual Feedstock Processing Laboratory



## XCT-informed microstructural deconstruction model and upscaling



## Modeling of various milling techniques

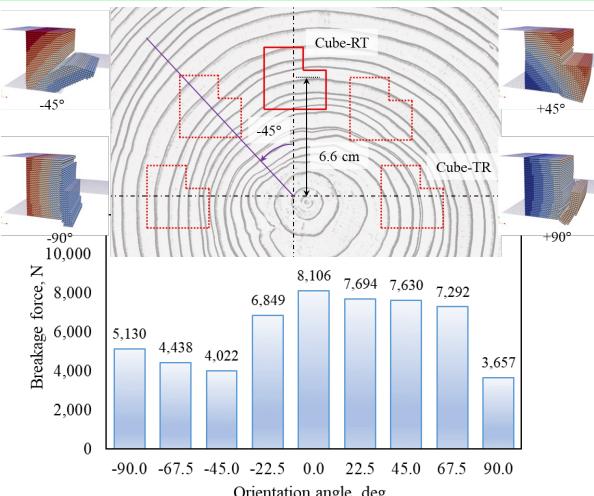
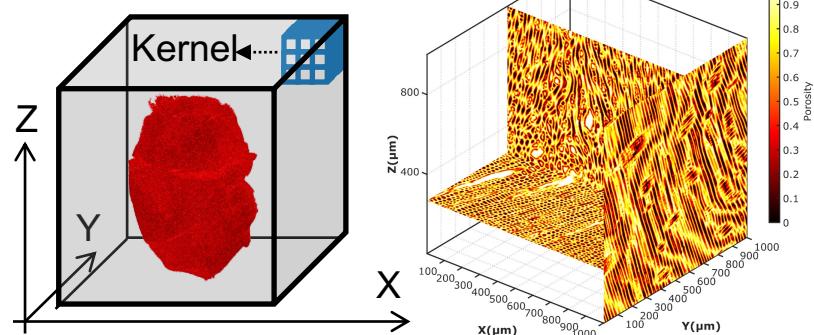


Microscale (um)

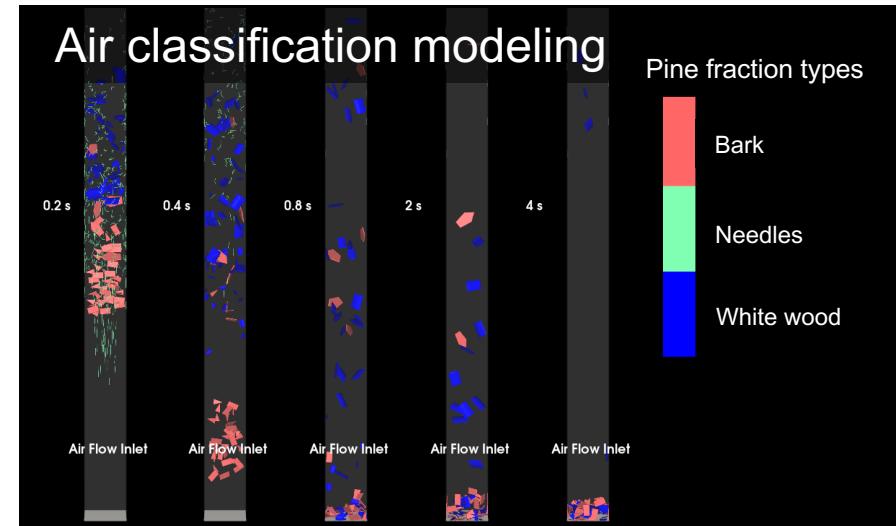
Laboratory scale (cm)

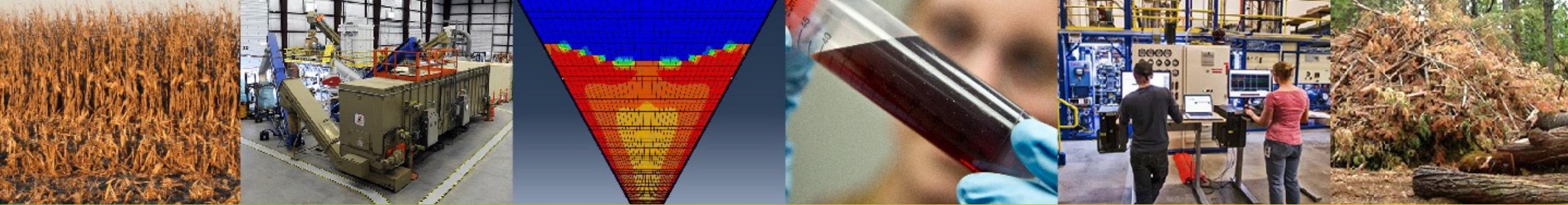
Pilot scale (m)

## Advanced micro-porosity analysis



## Air classification modeling





*Thank you*

[energy.gov/fcic](http://energy.gov/fcic)

