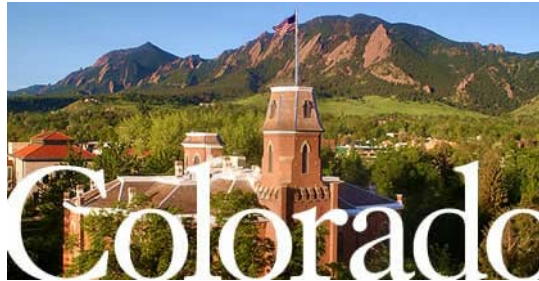


MFIX-DEM Enhancement for Industrially-Relevant Flows



2017 Crosscutting Research Project Review

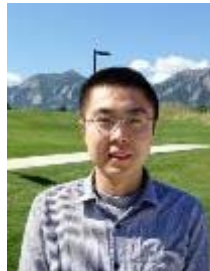
**Pittsburgh, PA
March 20-23, 2017**

***Project Leads:** Dr. Ray Cocco (PSRI, co-PI)
Dr. Ray Grout (NREL, co-PI)
Prof. Thomas Hauser (Univ. CO, co-PI)
Prof. Christine Hrenya (Univ. CO, PI)*

Project Team

University of Colorado Chemical & Biological Engineering

DEM modeling of granular and gas-solid flows, MFIX



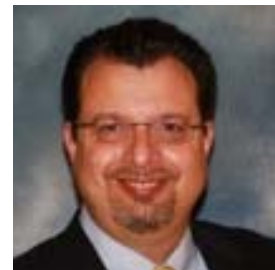
Prof. Christine Hrenya **Dr. William Fullmer** **Dr. Peiyuan Liu**

NREL Computational Science

High-performance computing, CFD



Dr. Ray Grout **Dr. Hari Sitaraman** **Deepthi Vaidhynathan**



Dr. Ray Cocco



Rasa Kales



Dr. Allan Issangya

University of Colorado Research Computing

High-performance computing, CFD



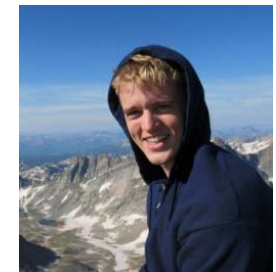
Prof. Thomas Hauser



Dr. Dane Skow



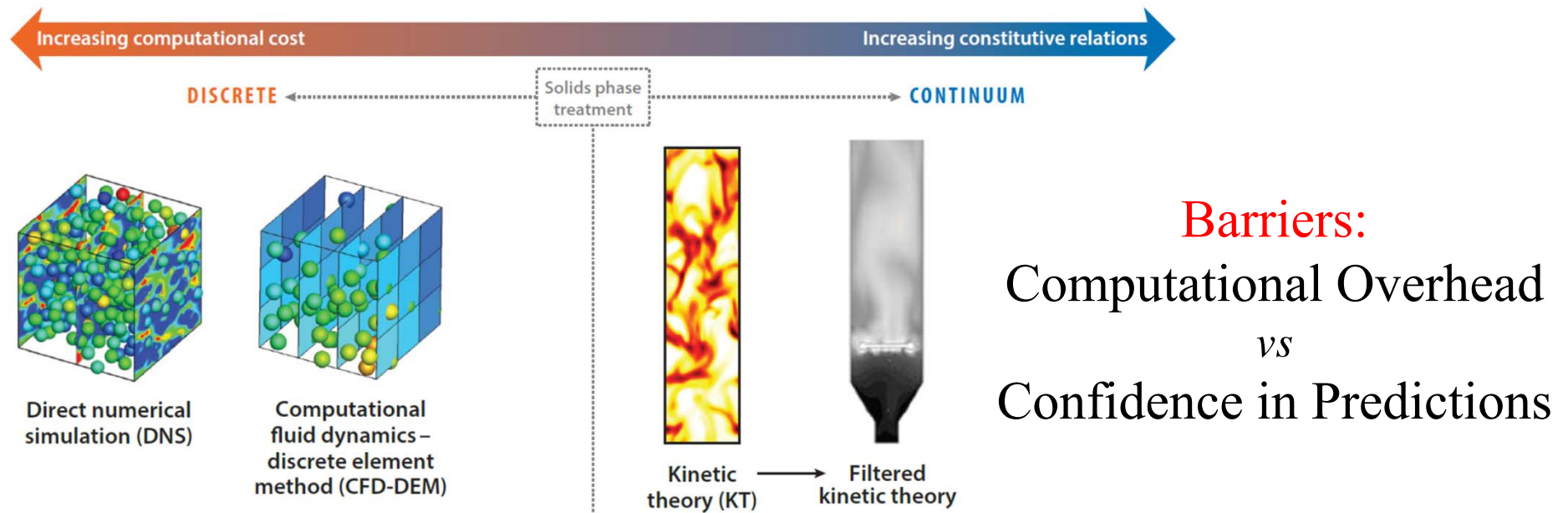
Tim Brown



Aaron Holt

PSRI
Industrial Application and Experiments of Particle Flows

Motivation



Barriers:
 Computational Overhead
 vs
 Confidence in Predictions

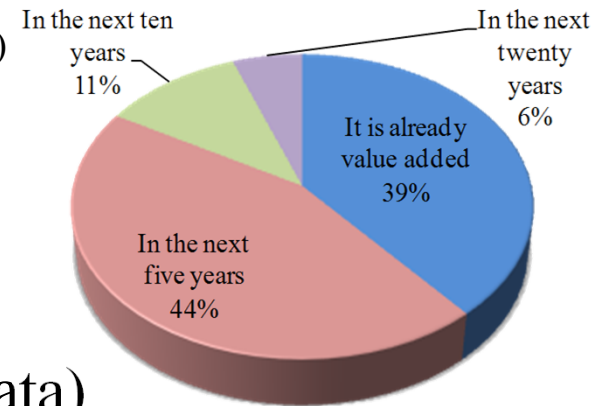
Fullmer & Hrenya
(Annu. Rev. Fluid Mech. 2017)

Motivation:
 DEM application
 toward industrially-
 relevant systems

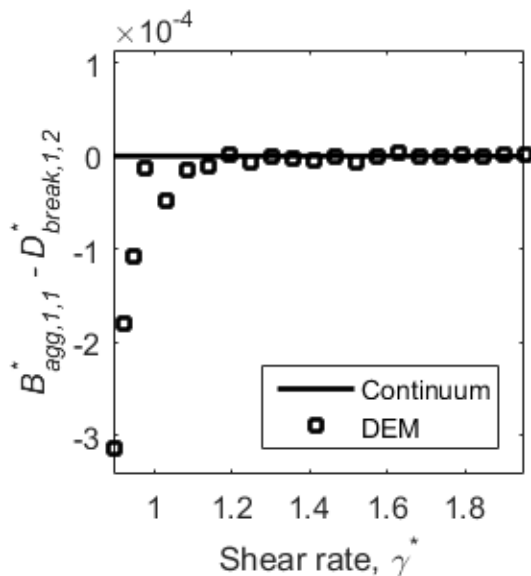
Potential significance of the results of the work

Expected value added through DEM:

PSRI Industrial Survey
(Cocco et al., *Chem. Eng. Prog.*, in press)



- Expanded industrial use of DEM
- Indirect: Improved physics in continuum and hybrid modeling (DEM as benchmark data)
- Direct: Aid in design/optimization of industrial components

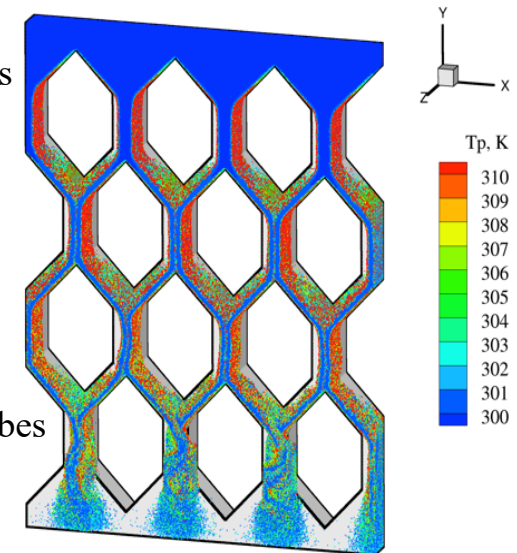


Agglomeration balance of doublets:

Continuum Theory for Rapid, Cohesive-Particle Flows
(Kellogg, Liu, LaMarche & Hrenya, submitted)

Fully-developed characteristics:

Heat transferred to particles falling over heated tubes
(Morris et al., *Solar Energy*, 2016)



Phase I Statement of Project Objectives (SOP)

Task 1 - Project Management and Planning

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Task 5c: Compare enhancements on multiple Xeon/Xeon Phi architectures

Task 6 - Industrially Relevant Problem

Task 6a: Survey of PSRI member companies

Task 6b: Experiments of Interacting Nozzles

Task 7 - Uncertainty Quantification

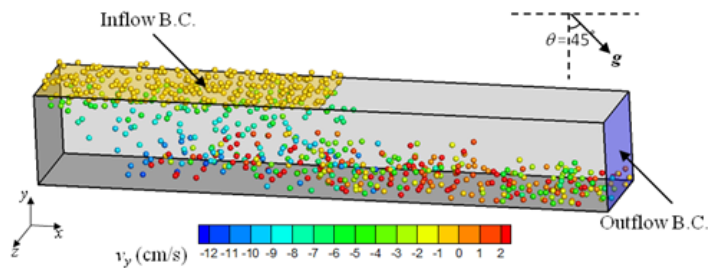
Task 7a: Test Problem

Task 7b: Challenge Problem

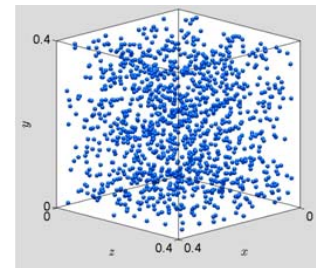
Task 7c: Industrially Relevant Problem

Milestone 2: Benchmark Cases

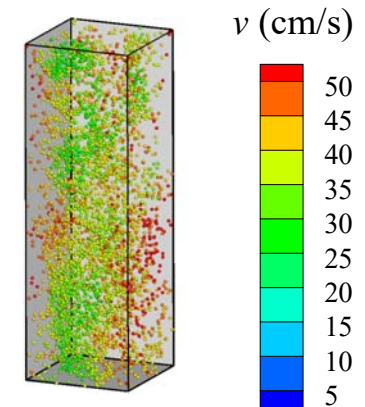
Dilute, nearly instantaneous collisions



Ramp flow

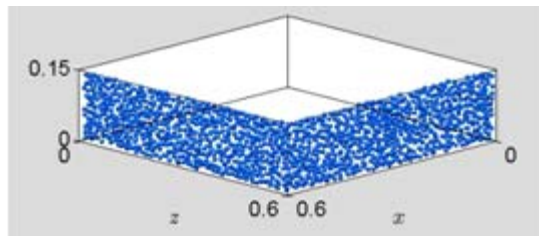


Homogeneous cooling

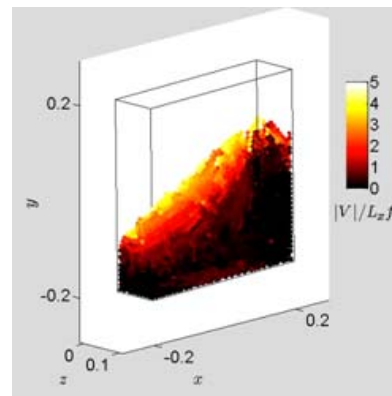


Riser flow

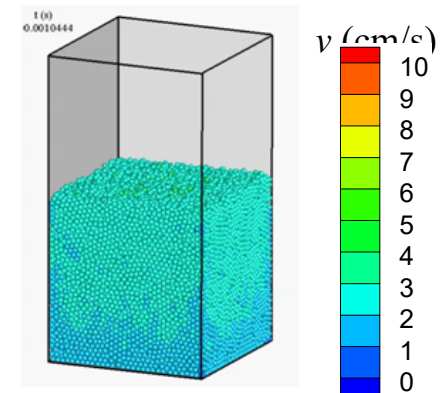
Dense, enduring contacts



Settling



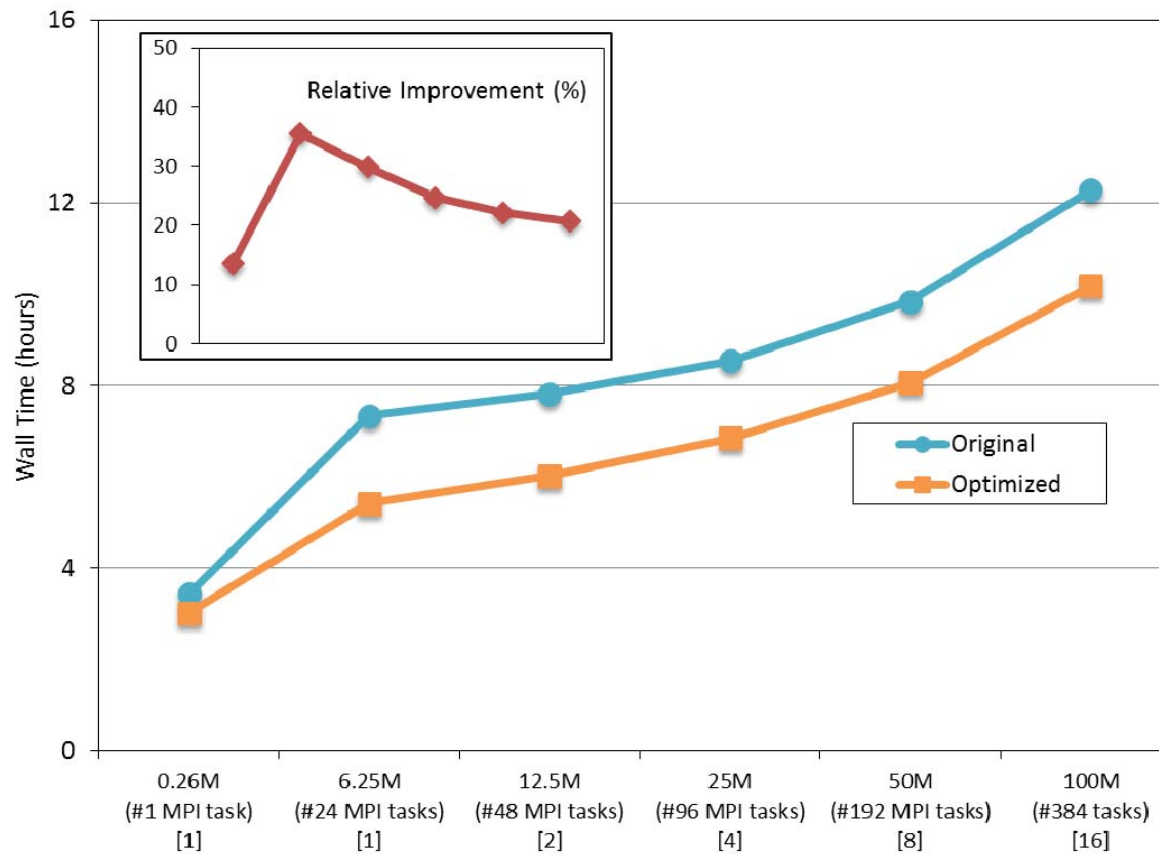
Square tumbler



Fluidized bed

100M Particle Settling – Weak Scaling

- Locality-based Particle Sorting – improves neighbor search
- State-based Particle sorting – improves vectorization
- Masking – improves vectorization



Milestone 5 report (submitted to DOE)

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Task 6 - Industrially Relevant Problem

Task 6a: Survey of PSRI member companies

Task 6b: **Experiments of Interacting Nozzles**

Task 7 - Uncertainty Quantification

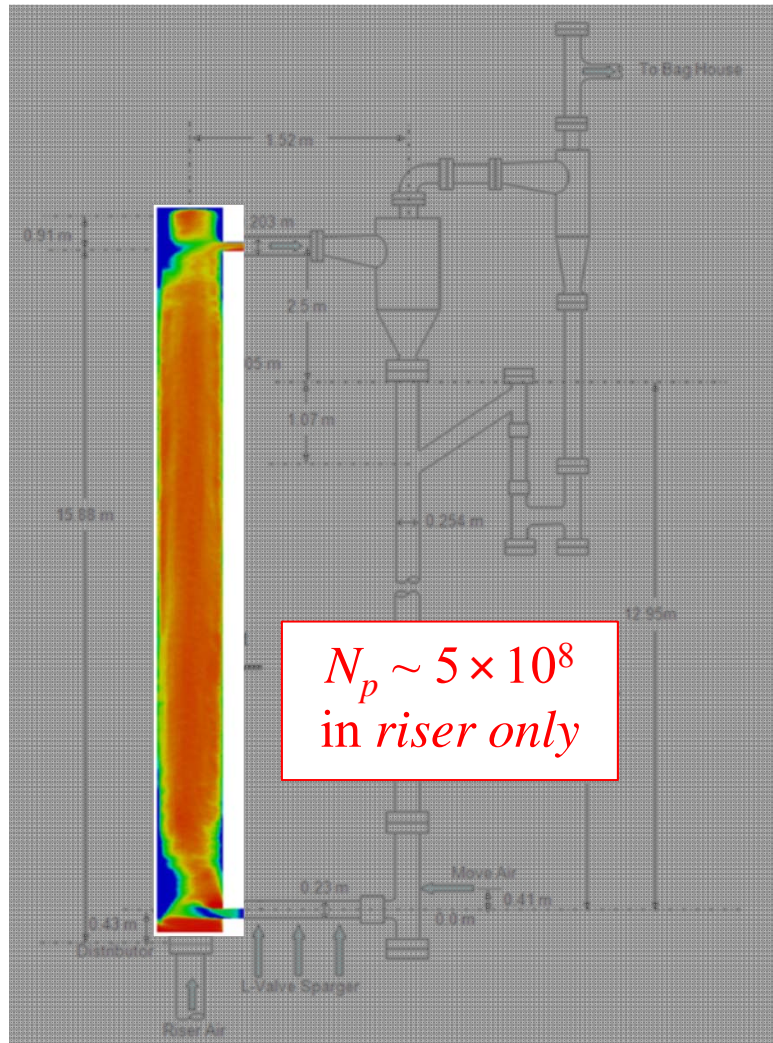
Task 7a: Test Problem

Task 7b: Challenge Problem

Task 7c: Industrially Relevant Problem

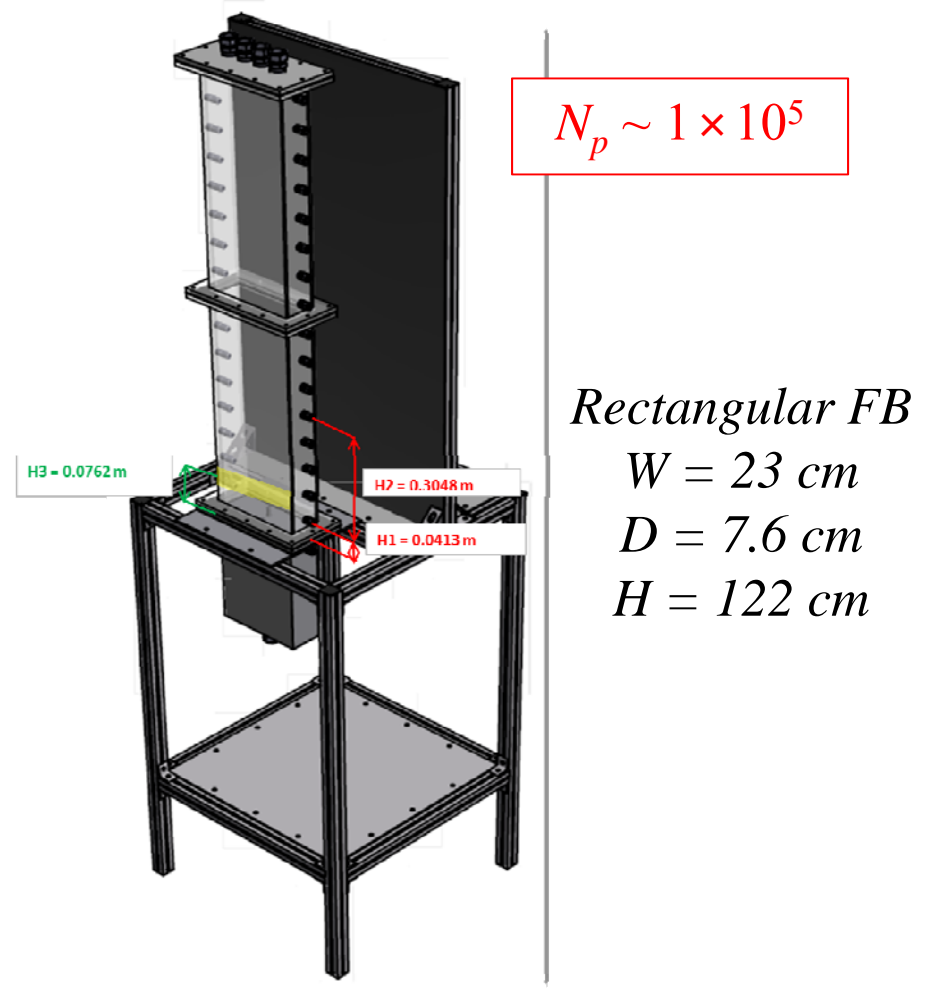
Need for CFD-DEM Validation Data

NETL/PSRI Challenge Problem III



(Li et al., *Chem. Eng. Sci.*, 2012)

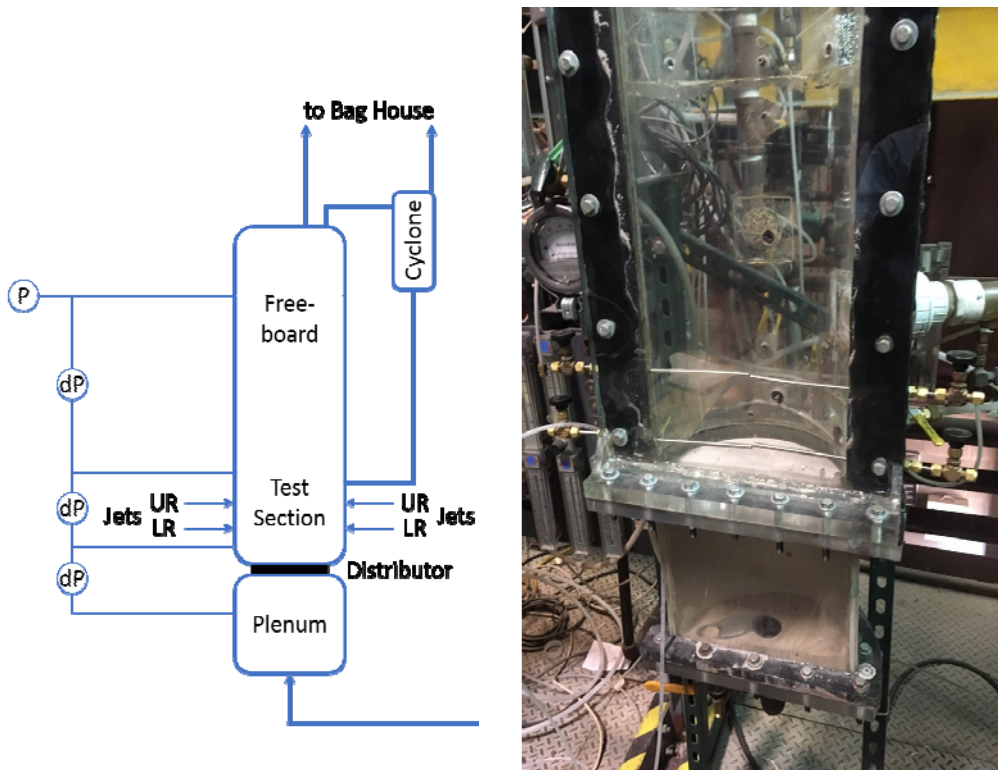
NETL Small-Scale Challenge Problem I



(Gopalan et al., *Powder Tech.*, 2016)

Horiz. Jet Experiments: Unit and Materials

Semi-circular Fluidized Bed with Side Jets



Characteristics:

- $W = 11.25$ in
- $h_{bed} \sim W$
- $d_j \sim 4$ mm
- $U \sim U_{mf}$
 $\sim 30\text{-}150$ cm/s
- $U_j \sim 200$ m/s

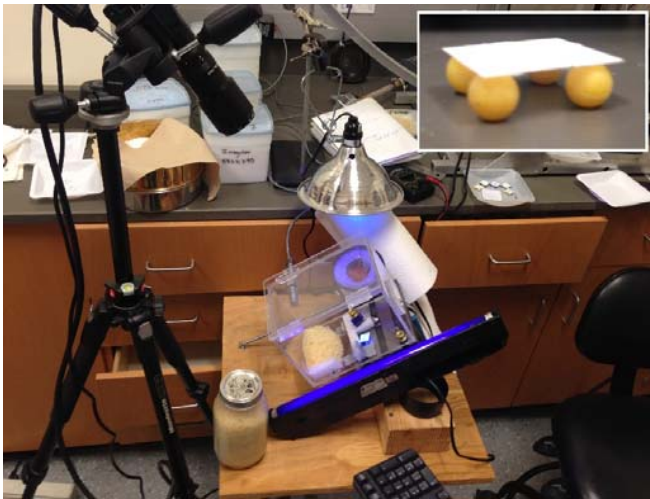
Materials



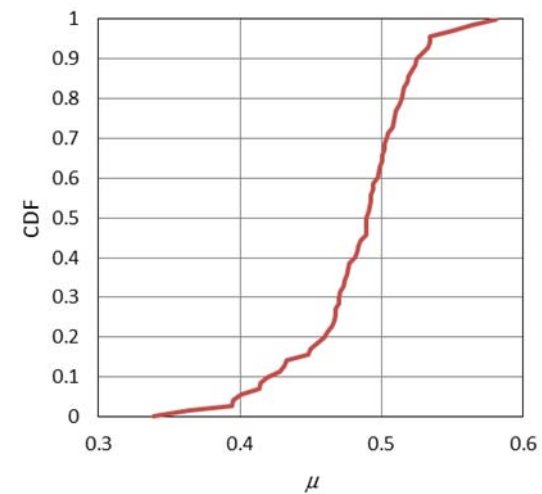
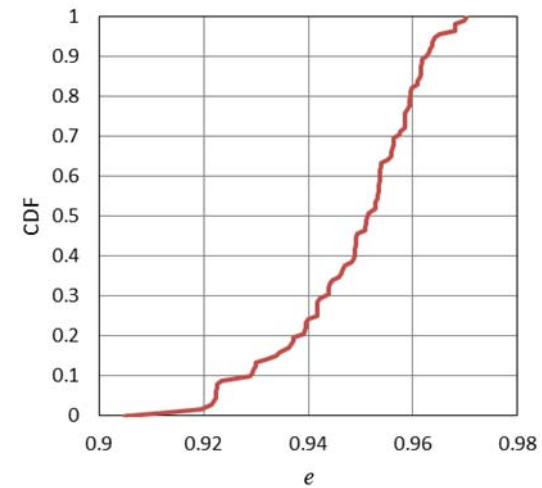
- **6.0 mm plastic:** $N_p \sim 6 \times 10^4$
- **3.0 mm ceramic:** $N_p \sim 4 \times 10^5$
- 1.6 mm mix: $N_p \sim 3 \times 10^6$
- 1.5 mm glass: $N_p \sim 4 \times 10^6$
- 1.0 mm ceramic: $N_p \sim 1 \times 10^7$
- 0.8 mm glass: $N_p \sim 3 \times 10^7$

Horiz. Jet Experiments: Particle Characterization

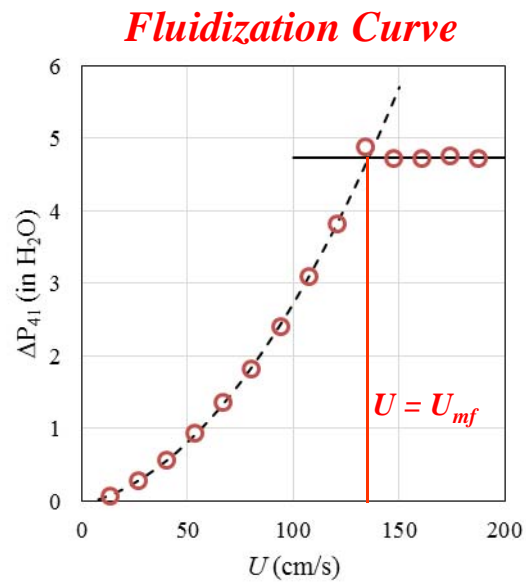
Methods



Results

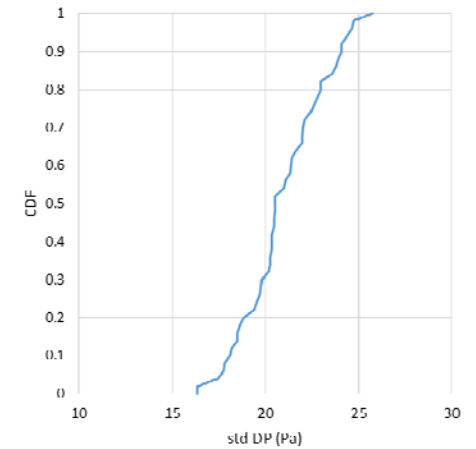
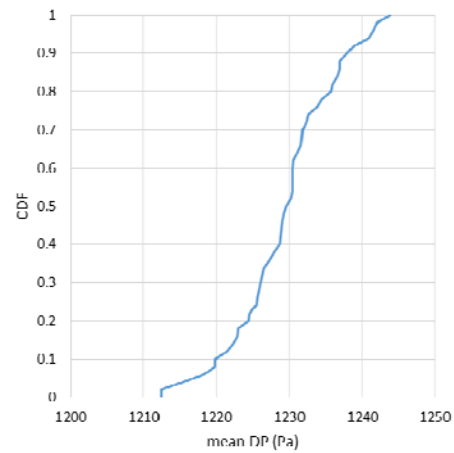
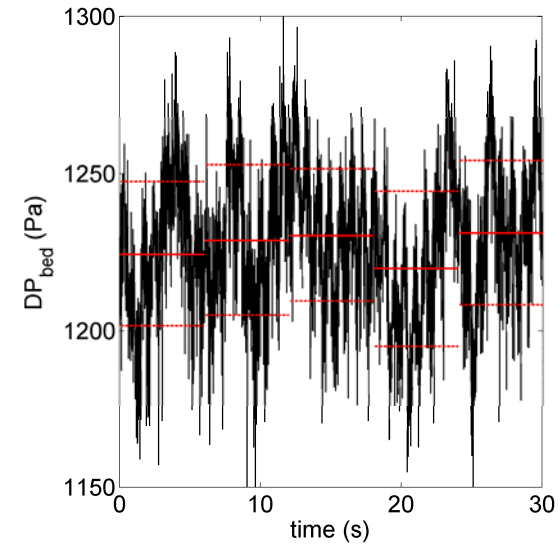


Horiz. Jet Experiments: Pressure Drop



$U_{mf} = 135$ cm/s
 Bed operated at:
 $U \sim 90\% \text{ \& } 110\%$ of U_{mf}

DP Results

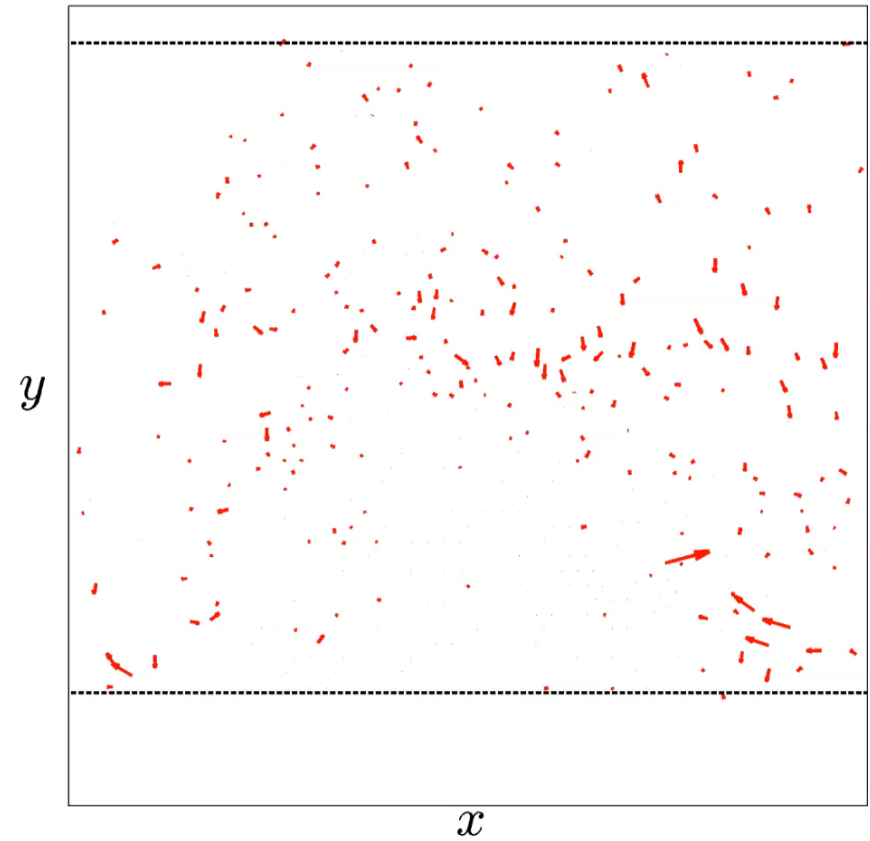


Horiz. Jet Experiments: HSV and PT

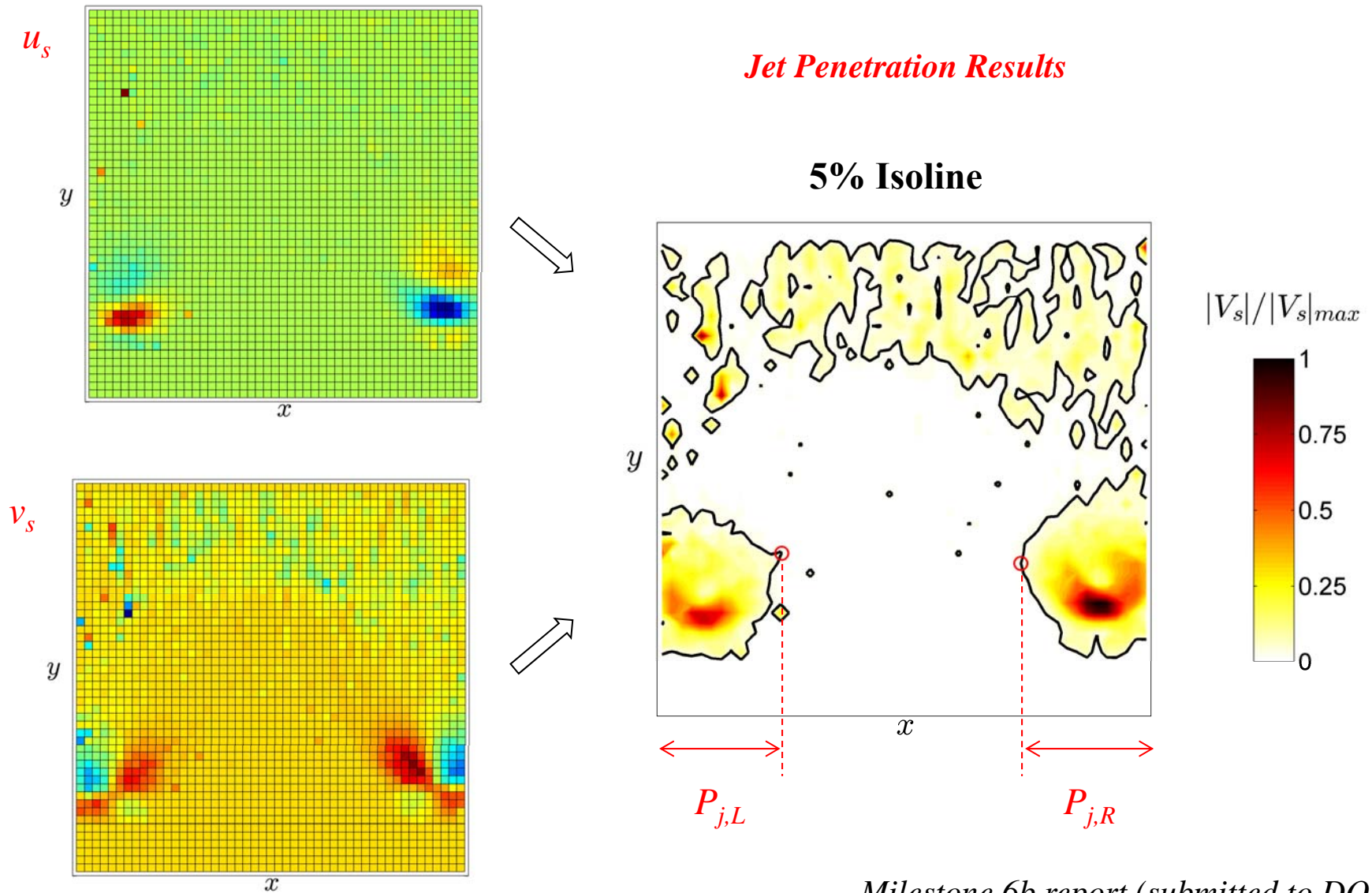
Raw HSV Data



Particle Tracking (PT) Analysis



Horiz. Jet Experiments: PT Post-processing



Milestone 6b report (submitted to DOE)

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Task 6 - Industrially Relevant Problem

Task 6a: Survey of PSRI member companies

Task 6b: Experiments of Interacting Nozzles

Task 7 - Uncertainty Quantification

Task 7a: Test Problem

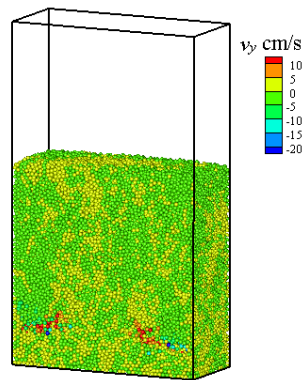
Task 7b: Challenge Problem

Task 7c: **Industrially Relevant Problem**

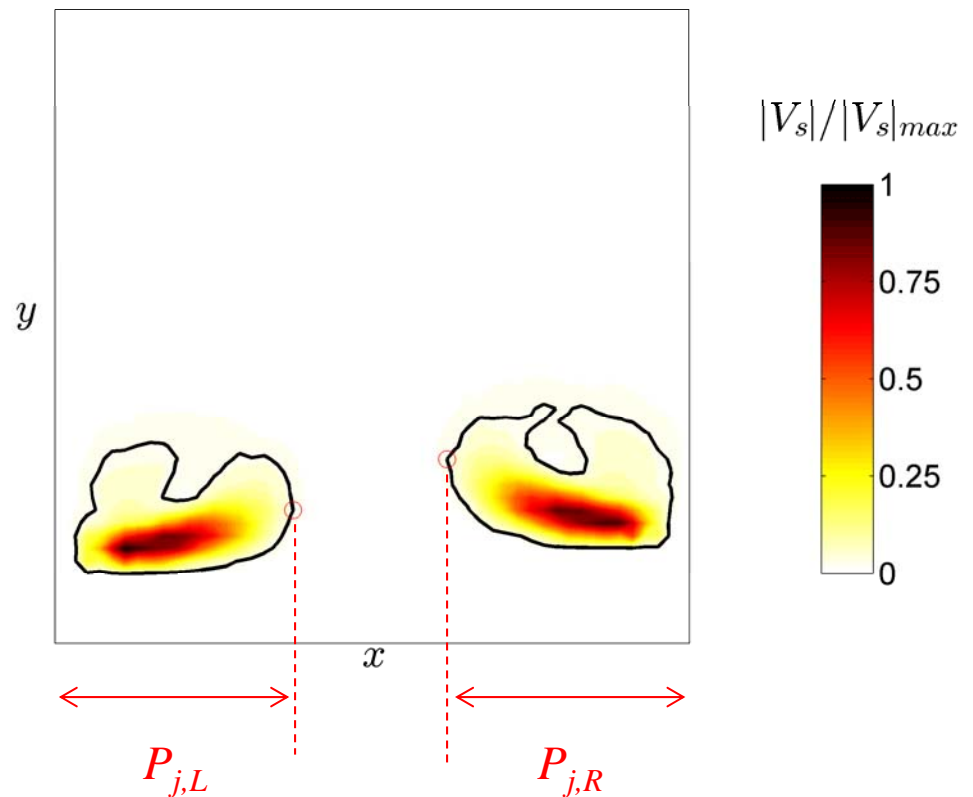
CFD-DEM+UQ: Base Case

CFD-DEM Model Description

- Rectangular geometry
- Point sources for jets
- Incompressible
- No shear- or particle-induced turbulence models
- Uniform inflow
- No-slip wall BC for gas
- $\Delta x \sim 2 d_p$



Jet Penetration Depth:
same analysis as exp data

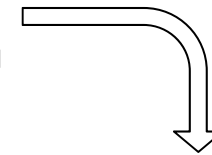
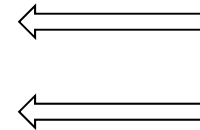


CFD-DEM+UQ: PIRT

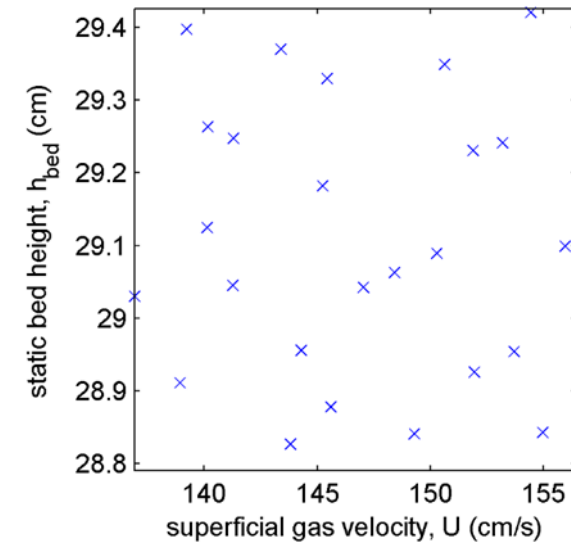
Parameter Identification and Ranking Table

Parameter	Input Uncertainties				SRQ Ranking		
	lower bound	base case	upper bound	type	$P_{i,L}$	$P_{i,R}$	ΔP
Bed							
U (cm/s)	136.9	146.7	156.5	e	100.0	100.0	100.0
$U_{i,L}$ (m/s)	189.2	200.9	212.5	e	2.2	1.1	1.2
$U_{i,R}$ (m/s)	182.8	194.4	205.9	e	0.5	4.9	1.0
h_{bed} (cm)	28.8	29.1	29.4	e	0.3	1.1	29.9
A (cm ²)	333.1	340.4	347.8	e	-	-	-
Left Jets							
$A_{i,L}$ (cm ²)	0.1168	0.1171	0.1174	e	-	-	-
$y_{i,L}$ (cm)	5.067	5.146	5.225	e	0.0	0.0	0.0
$z_{i,L}$ (cm)	1.588	1.667	1.746	e	0.0	0.0	0.0
$d_{i,L}$ (cm)	-0.3175	0.000	0.3175	e	-	-	-
Right Jets							
$A_{i,R}$ (cm ²)	0.1168	0.1171	0.1174	e	-	-	-
$y_{i,R}$ (cm)	5.377	5.456	5.535	e	0.0	0.0	0.0
$z_{i,R}$ (cm)	1.667	1.746	1.826	e	1.5	18.2	2.1
$d_{i,R}$ (cm)	-0.3175	0.000	0.3175	e	-	-	-
Particle-phase Properties							
d_p (μ m)	5761	5924	6006	a	1.8	4.9	6.8
ϕ (-)	0.931	0.943	0.948	a	0.0	0.0	0.0
ρ_p (g/cm ³)	1.042	1.0435	1.045	e	0.2	0.3	1.2
e_{pp} (-)	0.819	0.948	0.990	a	3.3	9.4	0.6
μ_{pp} (-)	0.338	0.482	0.581	a	2.8	6.3	2.2
e_{pw} (-)	0.905	0.948	0.970	a	0.0	1.0	0.1
μ_{pw} (-)	0.338	0.482	0.581	a	0.4	0.6	2.7
Gas-phase Properties							
ρ_g (g/cm ³ $\times 10^3$)	1.1104	1.1697	1.2290	e	7.3	10.6	3.3
μ_g (g/cm-s $\times 10^5$)	1.7	1.8	1.9	e	2.3	2.9	0.5

1. $> 10^{1.5}$ **Important**
2. $10^{1.5} - 10^{1.0}$ **Mildly Important**
3. $10^{1.0} - 10^{0.5}$ **Marginal**
4. $10^{0.5} - 10^{0.0}$ **Mildly Insignificant**
5. $< 10^{0.0}$ **Insignificant**



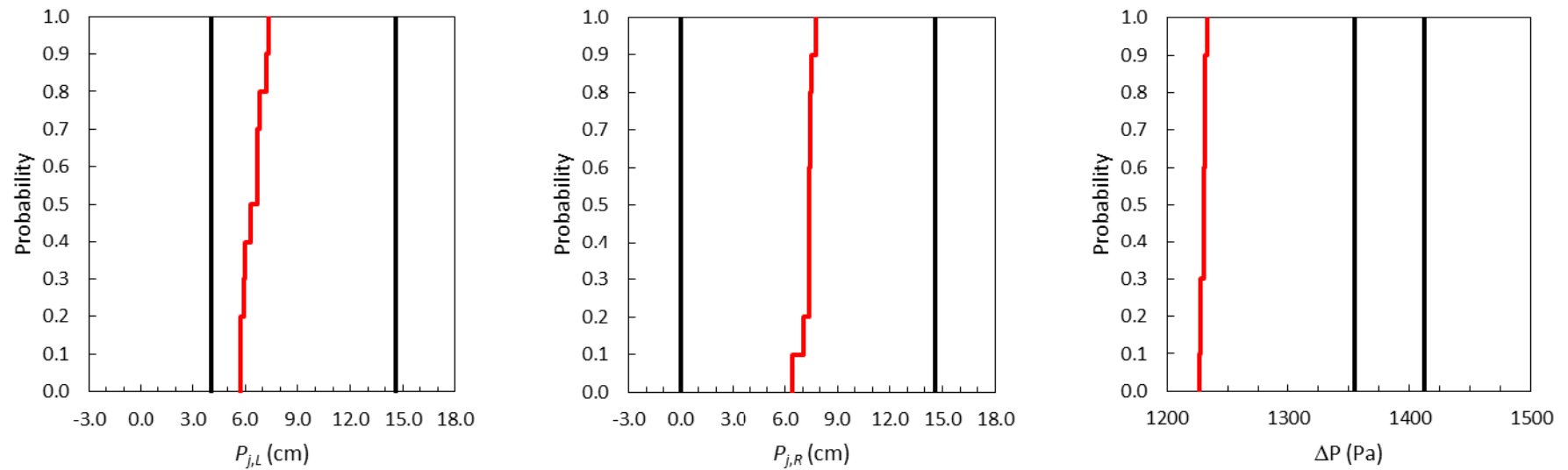
Sampling



Milestone 7 report (submitted to DOE)

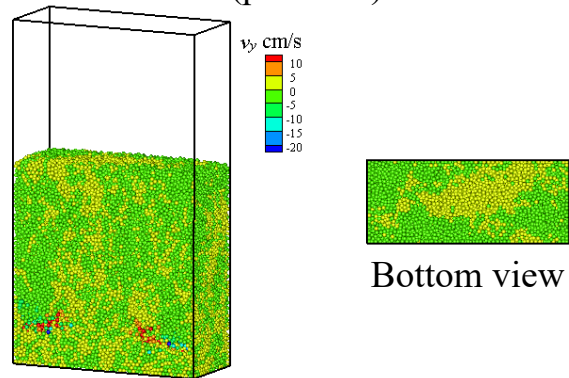
CFD-DEM+UQ: Results

Empirical CFDs of the *experimental results* (red line)
with the *CFD-DEM propagated UQ* in the SRQs (black lines)

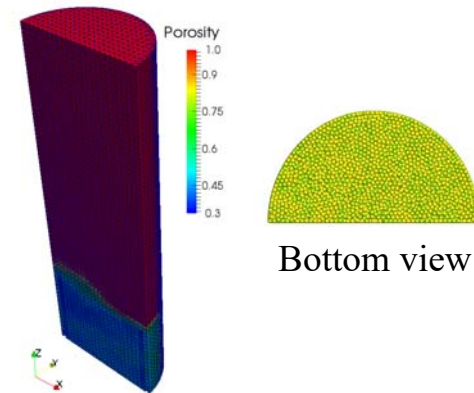


Phase-II CFD-DEM+UQ: *Very Preliminary Results*

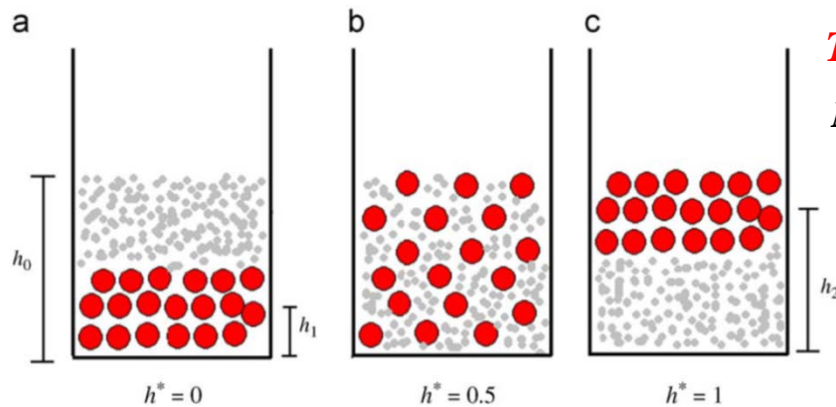
Rectangular geometry w/ point-source jets
(previous)



Semi-elliptical geometry w/ cut-cells & point-source jets
(in progress)



Phase-II Outlook



Task 8: Very, Very Small Scale Problem

$$N_p \sim O(3)$$

Task 9: Countercurrent Air Flow Stripper Unit

thank you
for your
attention

