



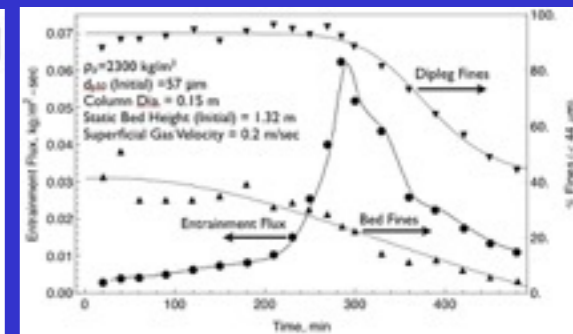
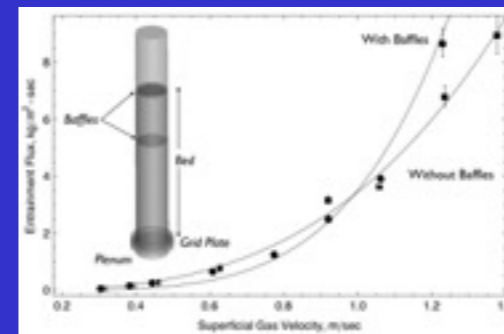
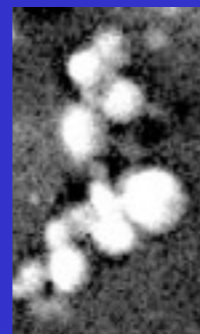
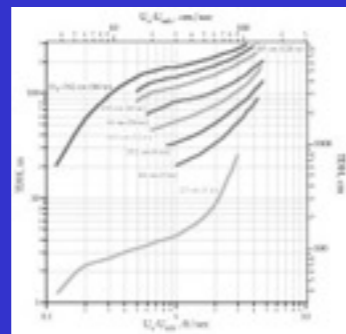
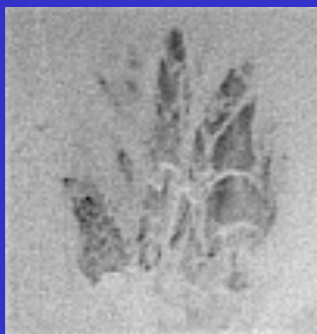
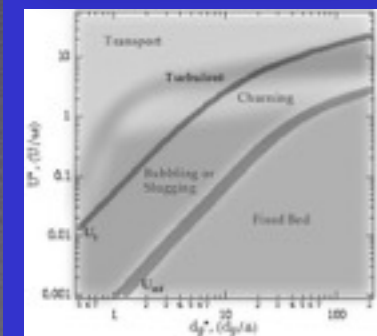
# CFD Models and Validation

Ray Cocco  
 Particulate Solid Research, Inc. (PSRI)

August 13, 2015



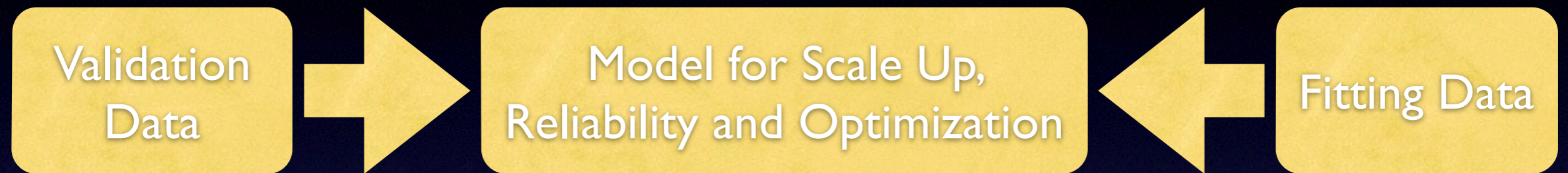
*Applying the Fundamentals*



# Outline

- Validation challenges in fluidization
- PSRI's modeling methodology
- Gaps in PSRI's modeling methodology
- Summary

# Challenges in Validating Fluidization Models



- Experiments have mostly been focused on providing validation for model development.
- Particle have a wide range of properties that may not be captured with a model
- Modeling with a commercial code of commercial systems requires a “fitting” of the drag model
- Experimental methods are limited for this “fitting”

# The Multi-scale Validation Paradox

## *Micro-scale*

1 to 100's Particles

$10^{-6}$  to  $10^{-4}$  m

Experiments  
are cheap

Simulations  
are cheap

Analysis are  
expensive

## *Meso-scale*

Millions to Billions  
of Particles

$10^{-2}$  to  $10^{-1}$  m

Experiments are  
inexpensive

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## *Macro-scale*

Trillions of  
Particles

$10^{-1}$  to  $10^2$  m

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# The Multi-scale Validation Paradox

Model Fitting

Model Development

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# The Multi-scale Validation Paradox

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## Model Fitting

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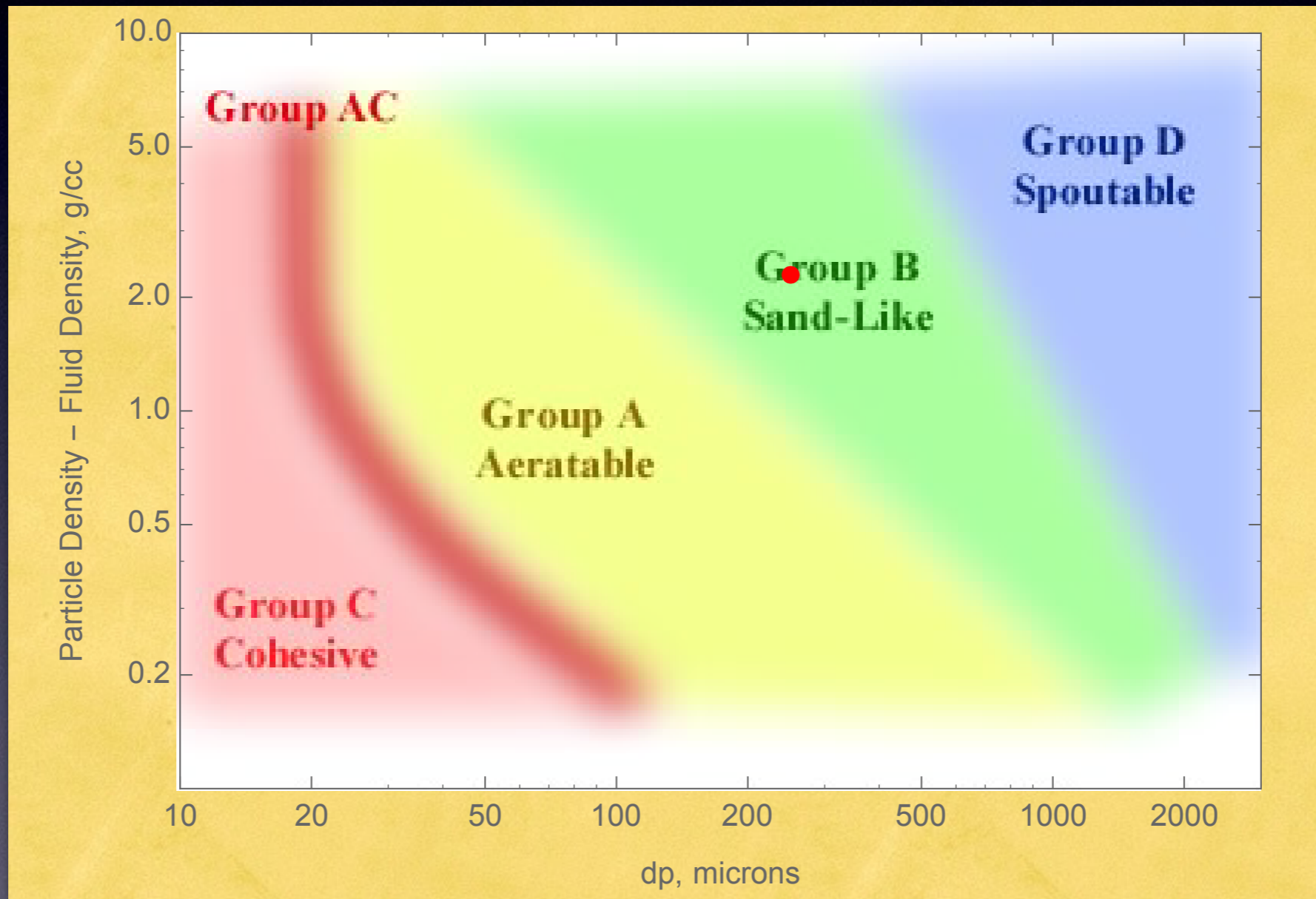
Simulations are expensive

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# Factors Effecting the Fundamentals

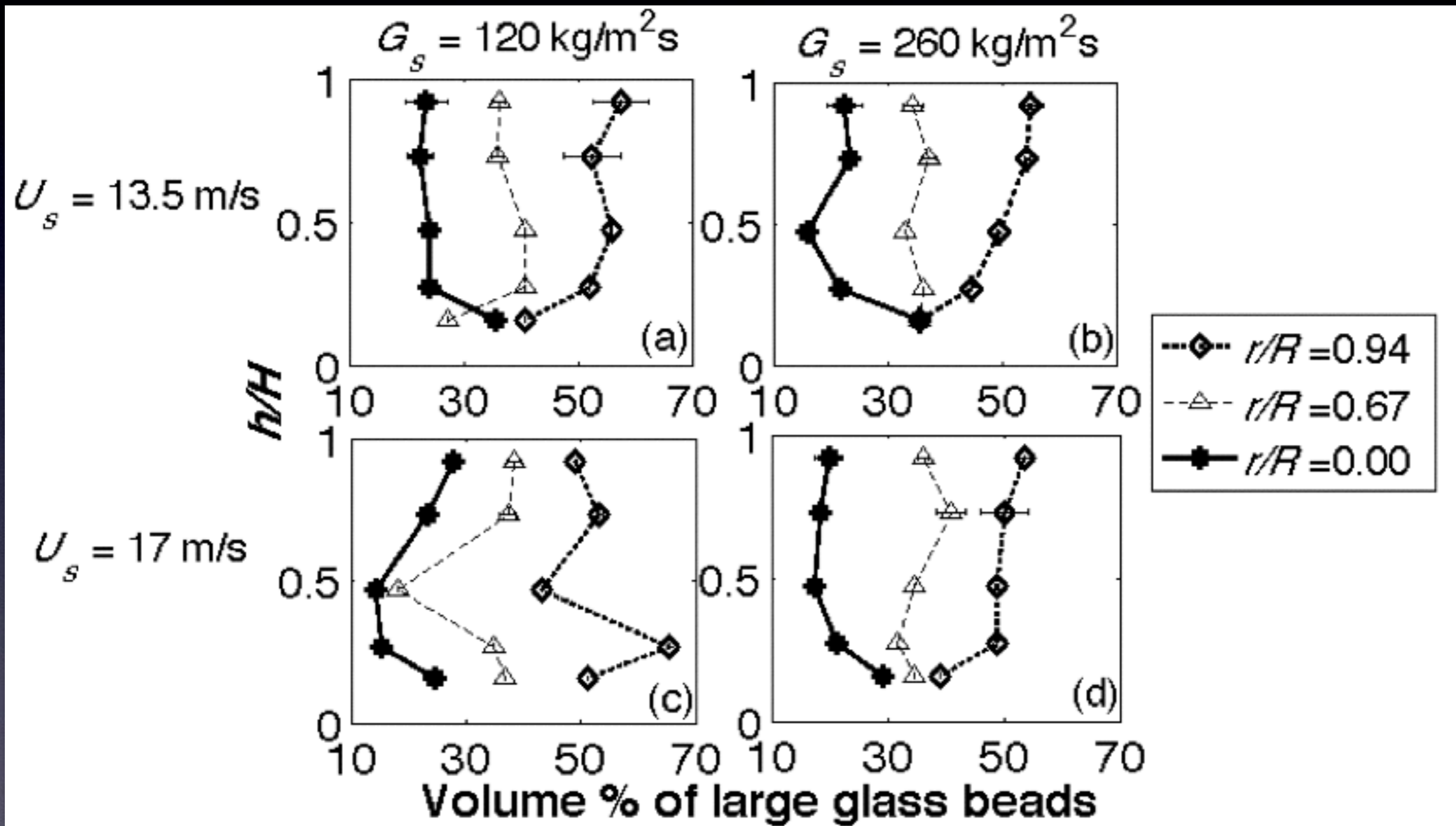
- Particle diameter
- Particle density
- Particle size distribution
- Particle shape
- Particle morphology
- Particle adsorbates

# Particle Size and Density



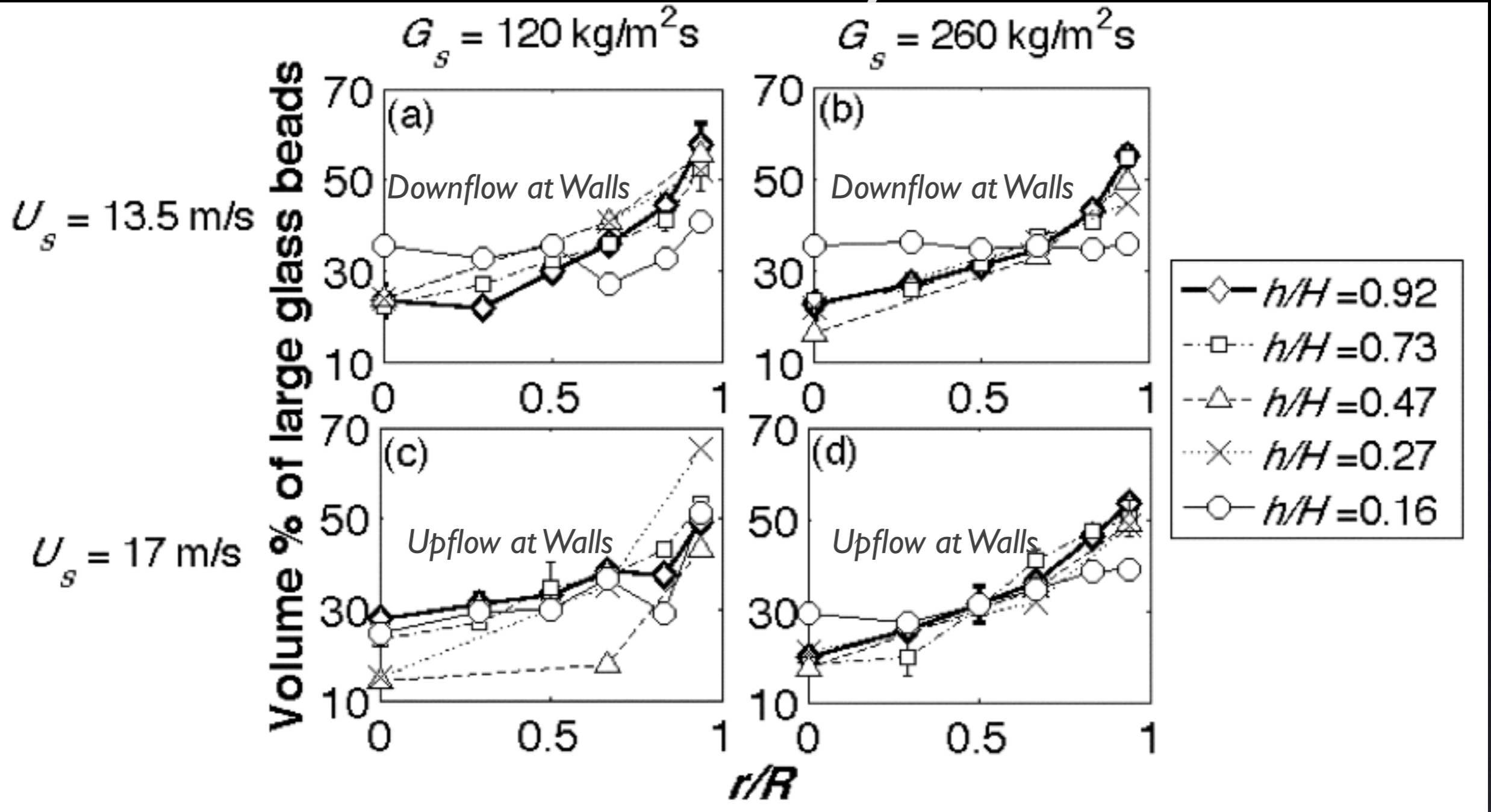


# Axial Segregation with Size-Difference Binary Mixture



- Most of the segregation occurs in the full-developed flow region

# Radial Segregation with Size-Difference Binary Mixture

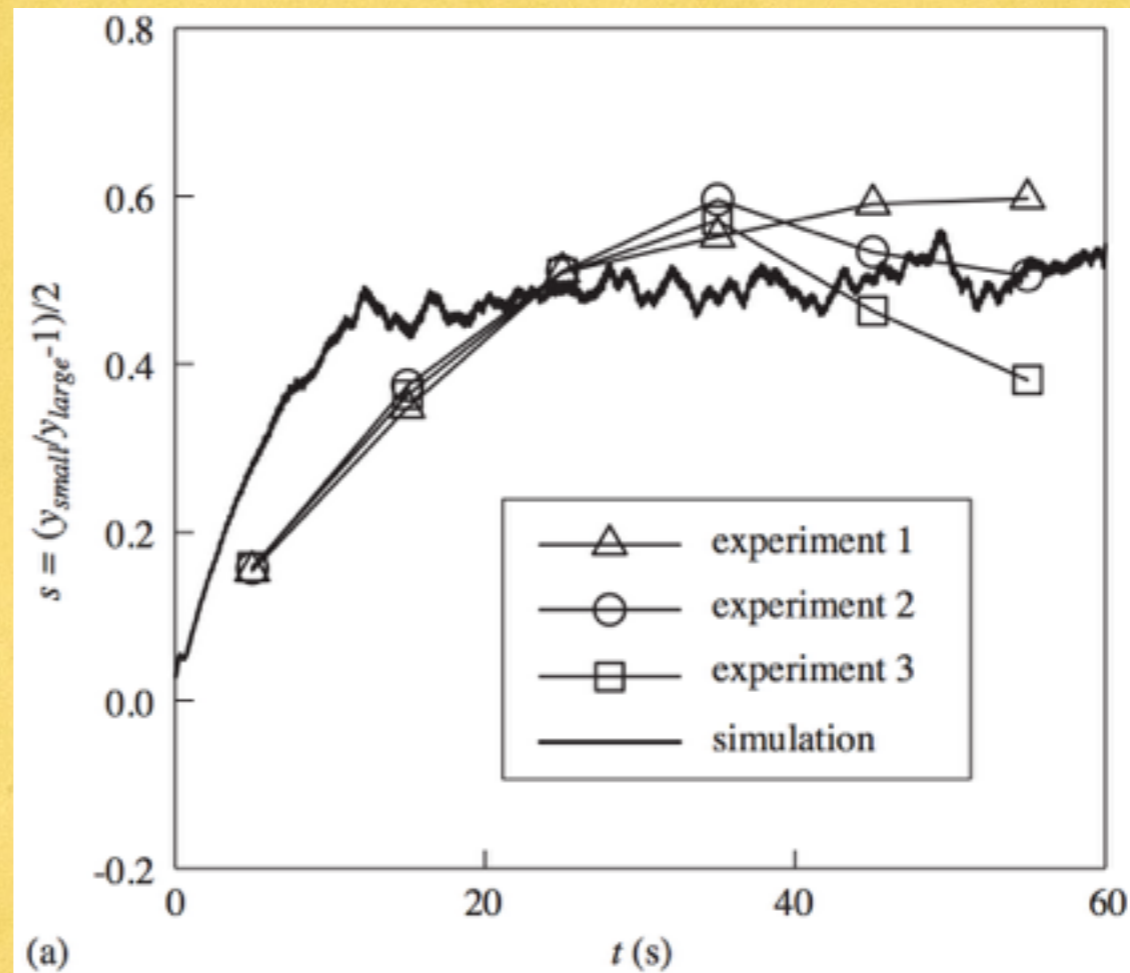


- More segregation near the top of the riser and for downflow and upflow at the walls

J.W. Chew, R. Hays, J.G. Findlay, S.B.R. Karri, T.M. Knowlton, R.A. Cocco, et al., Species segregation of binary mixtures and a continuous size distribution of Group B particles in riser flow, Chemical Engineering Science. 66 (2011) 4595–4604.

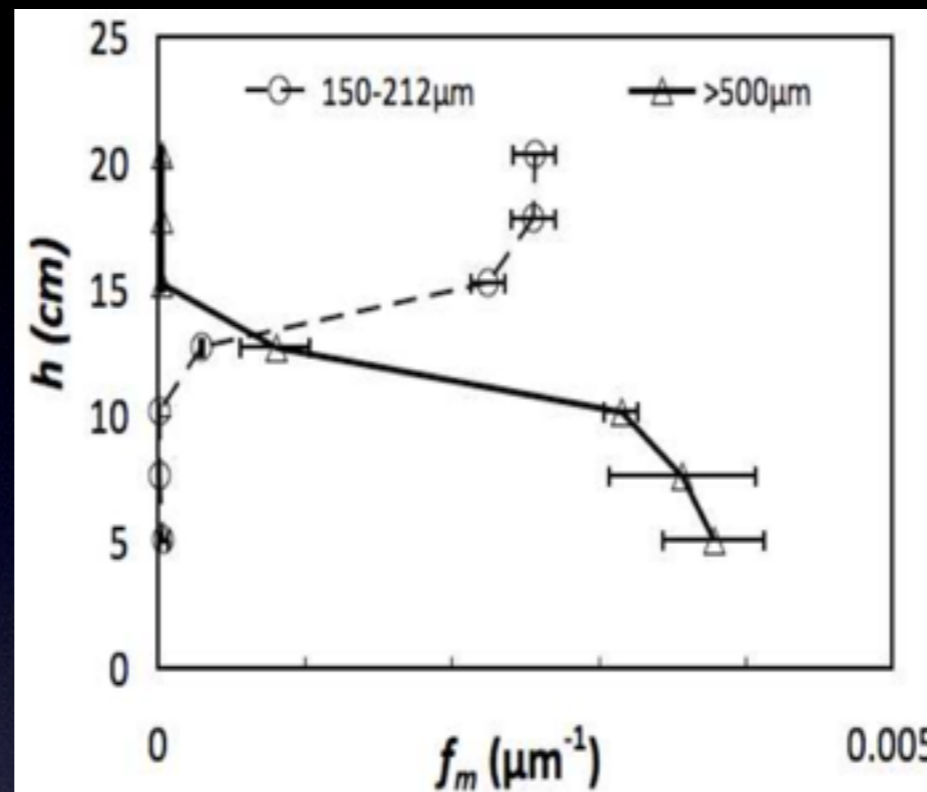
# Segregation in Fluidized Beds

$$s = \frac{S - 1}{S_{\max} - 1} = \frac{\frac{\langle y_{\text{small}} \rangle}{\langle y_{\text{large}} \rangle} - 1}{\left( \frac{2 - x_{\text{small}}}{1 - x_{\text{small}}} - 1 \right)}$$



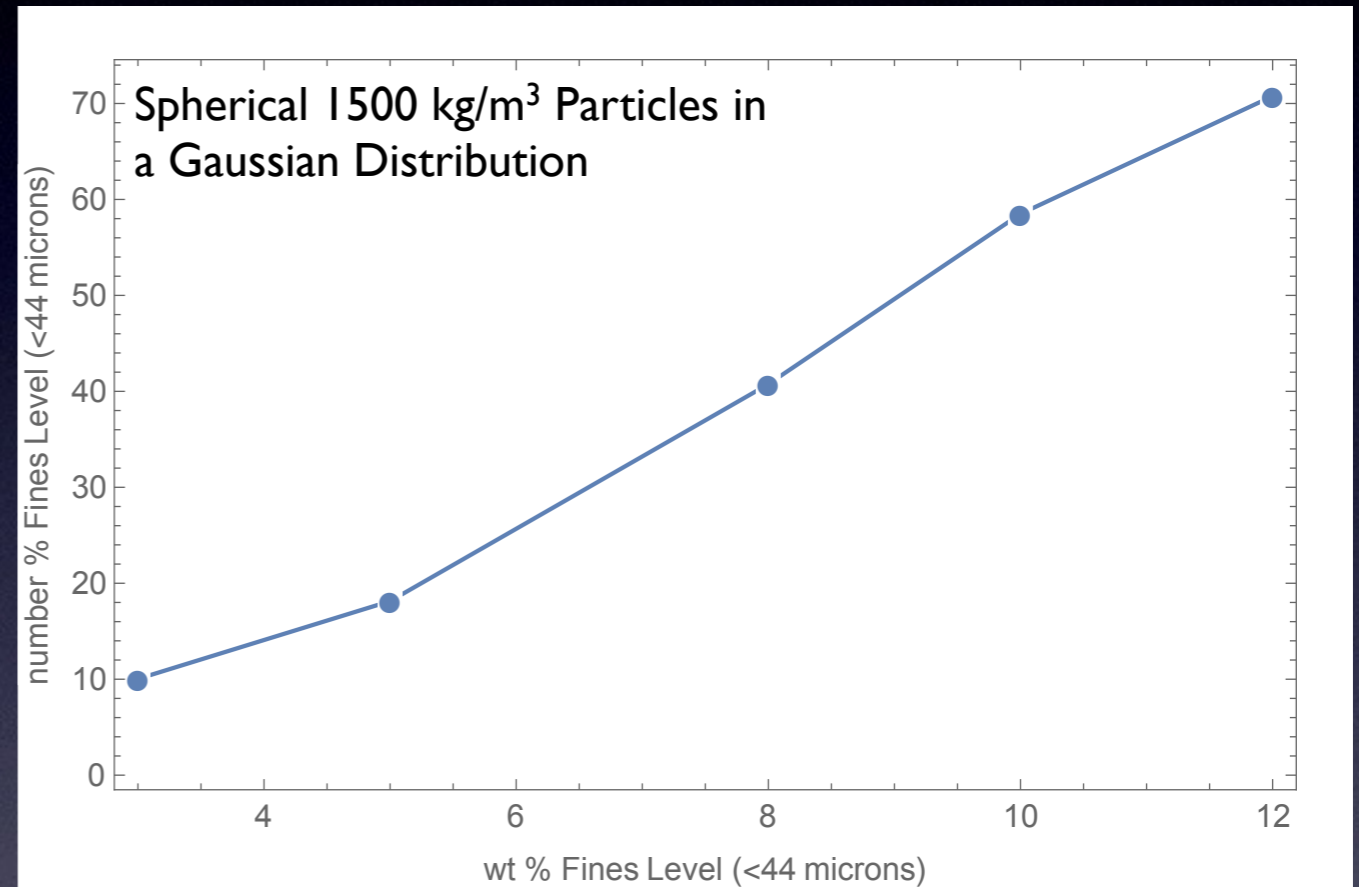
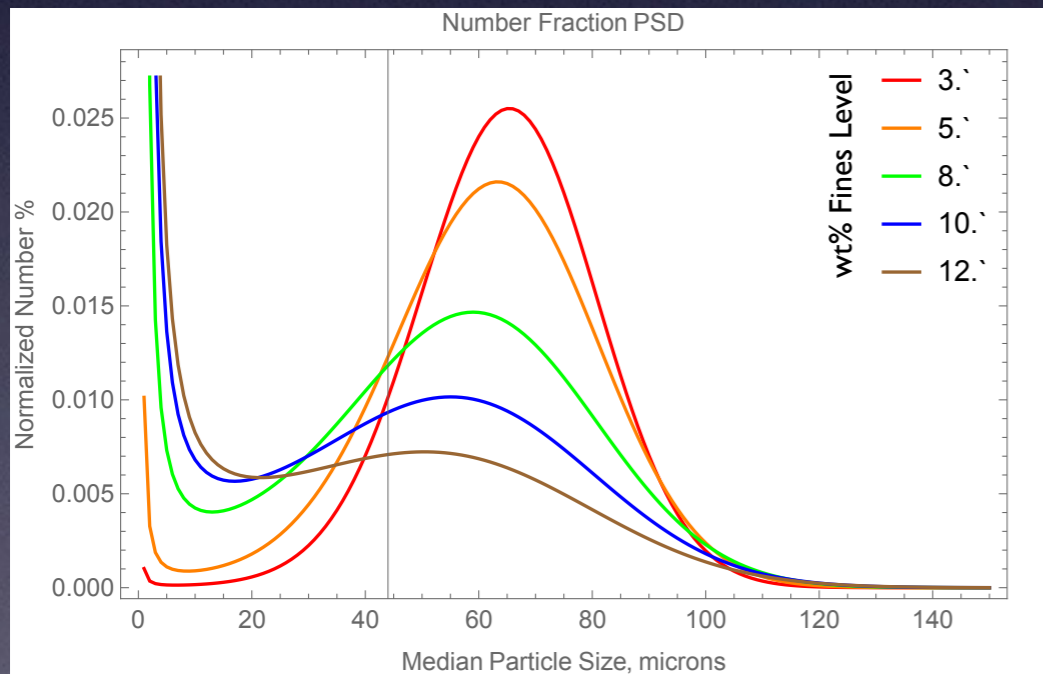
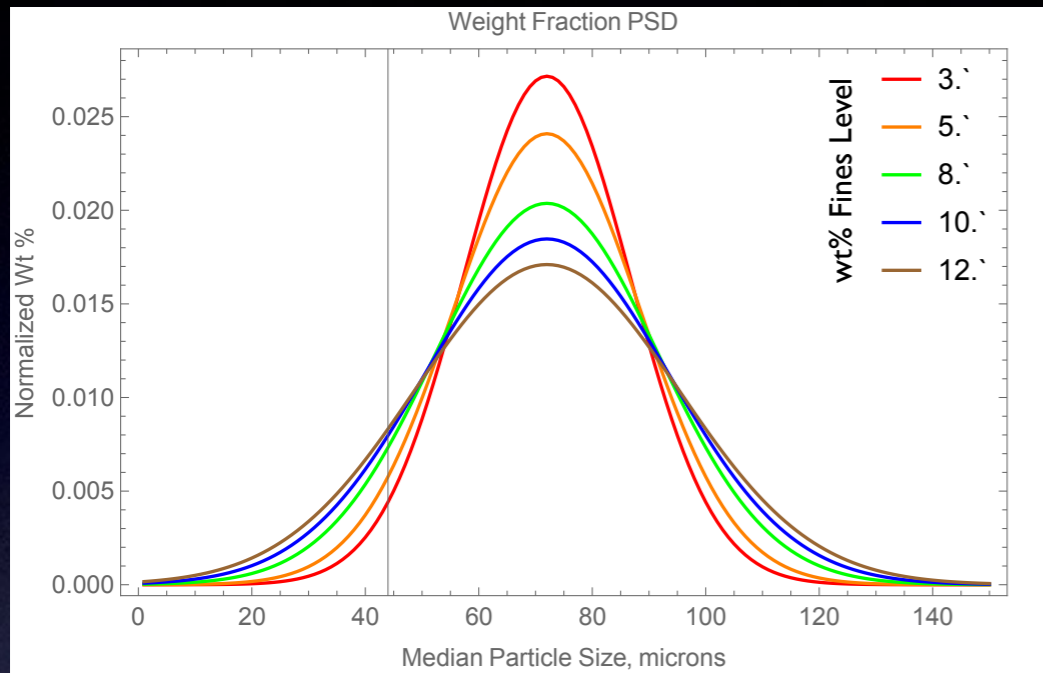
(a)

# Bubbles and Segregation



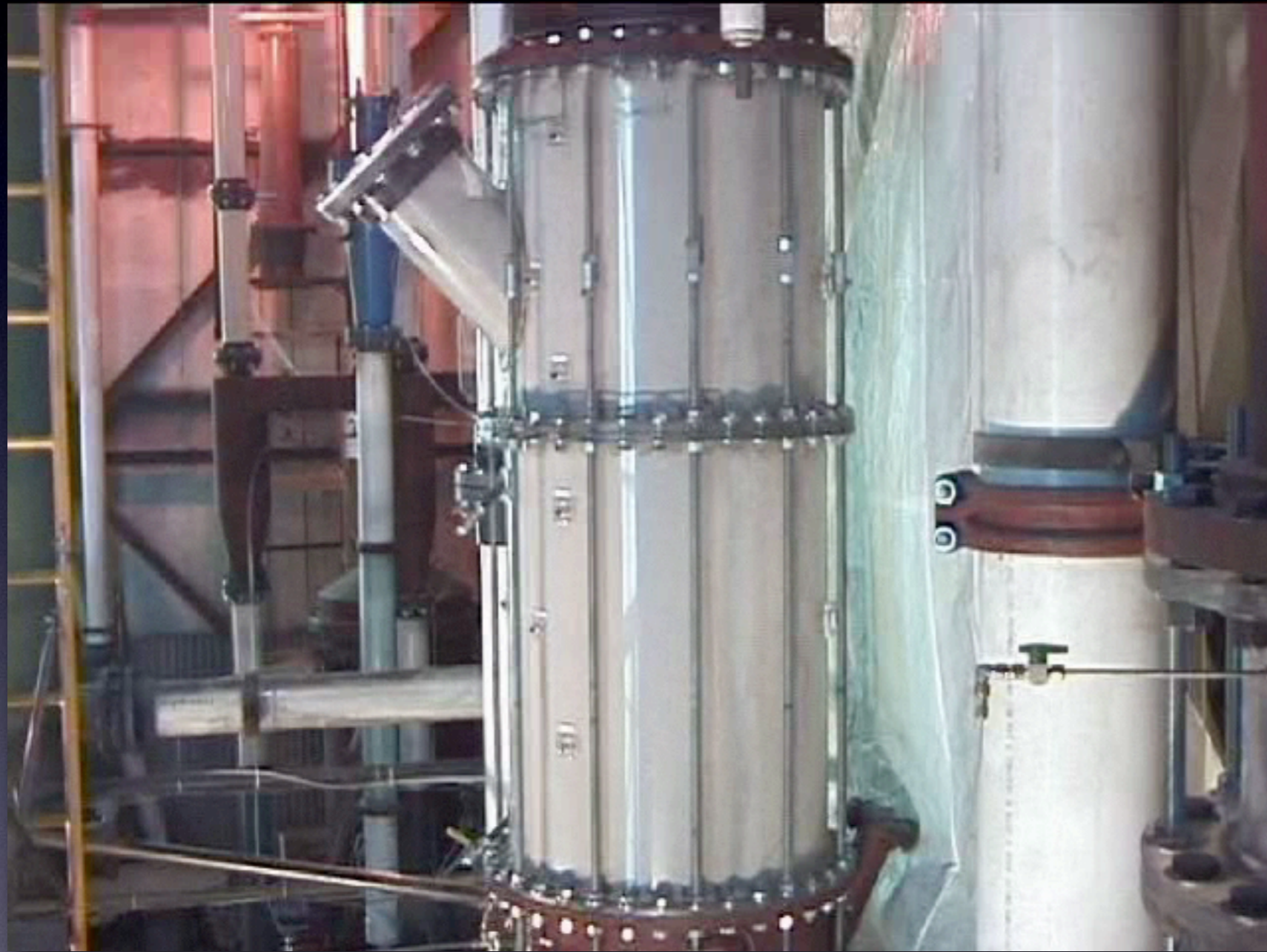
- Axial segregation profile of the finest and coarse particles with a Gaussian distribution ( $\sigma/d_{sm}=0.3$ )
- Bubbles limit segregation
- Bottom of the bed is limited in bubbles, thus segregation can be significant here

# Particle Size Distribution



*Strength in Numbers*

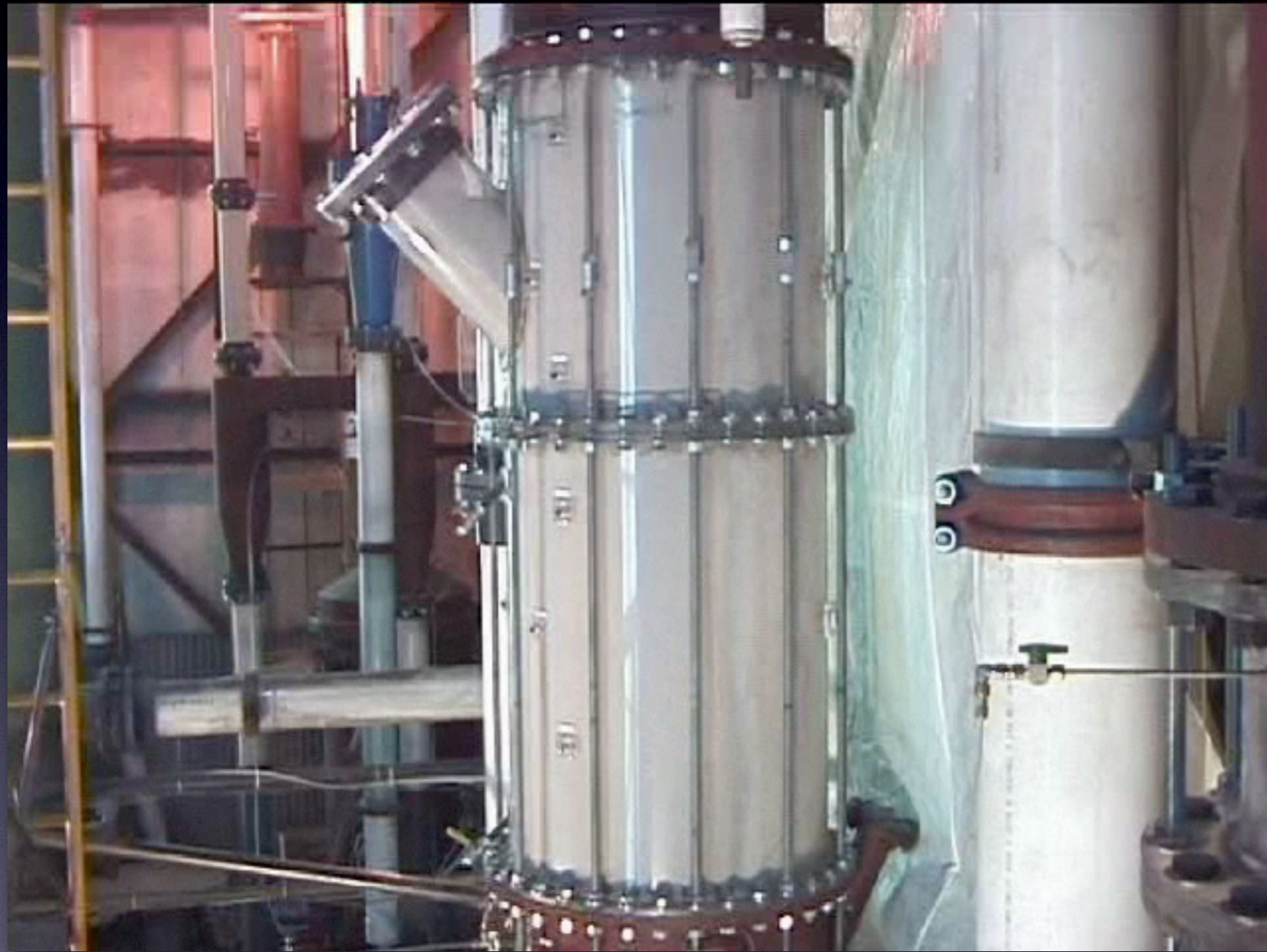
# Gas Bypassing in Fluidized Beds



0.9 m ID Fluidized Bed  
 $U_g = 0.46$  m/sec with FCC powder (3% fines)

- Large regions of the bed poorly fluidized!
  - Severe bypassing of gas
- Grid pressure drop  $\gg$  1/3 bed pressure drop
- Little help in detection
  - $\Delta P/L$  was uniform
  - Entrainment rate did not change

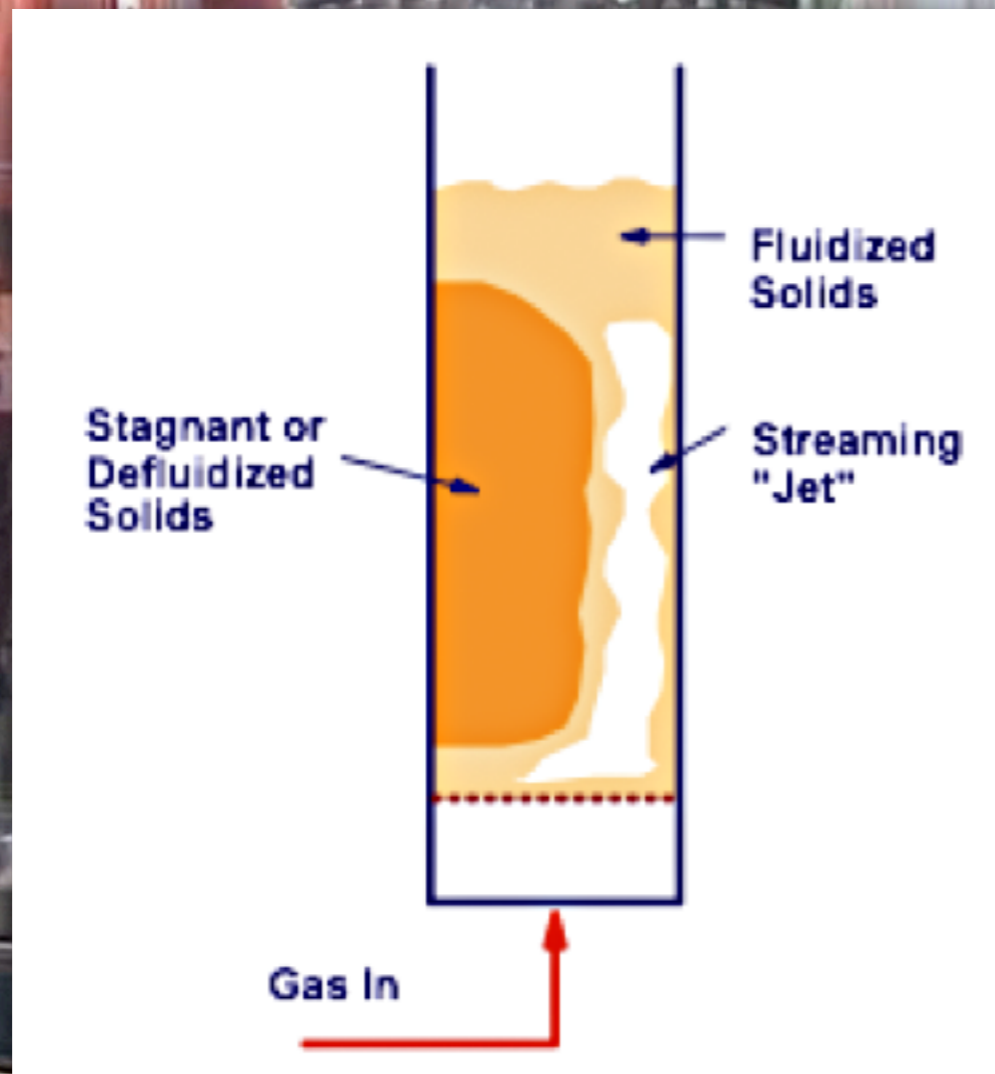
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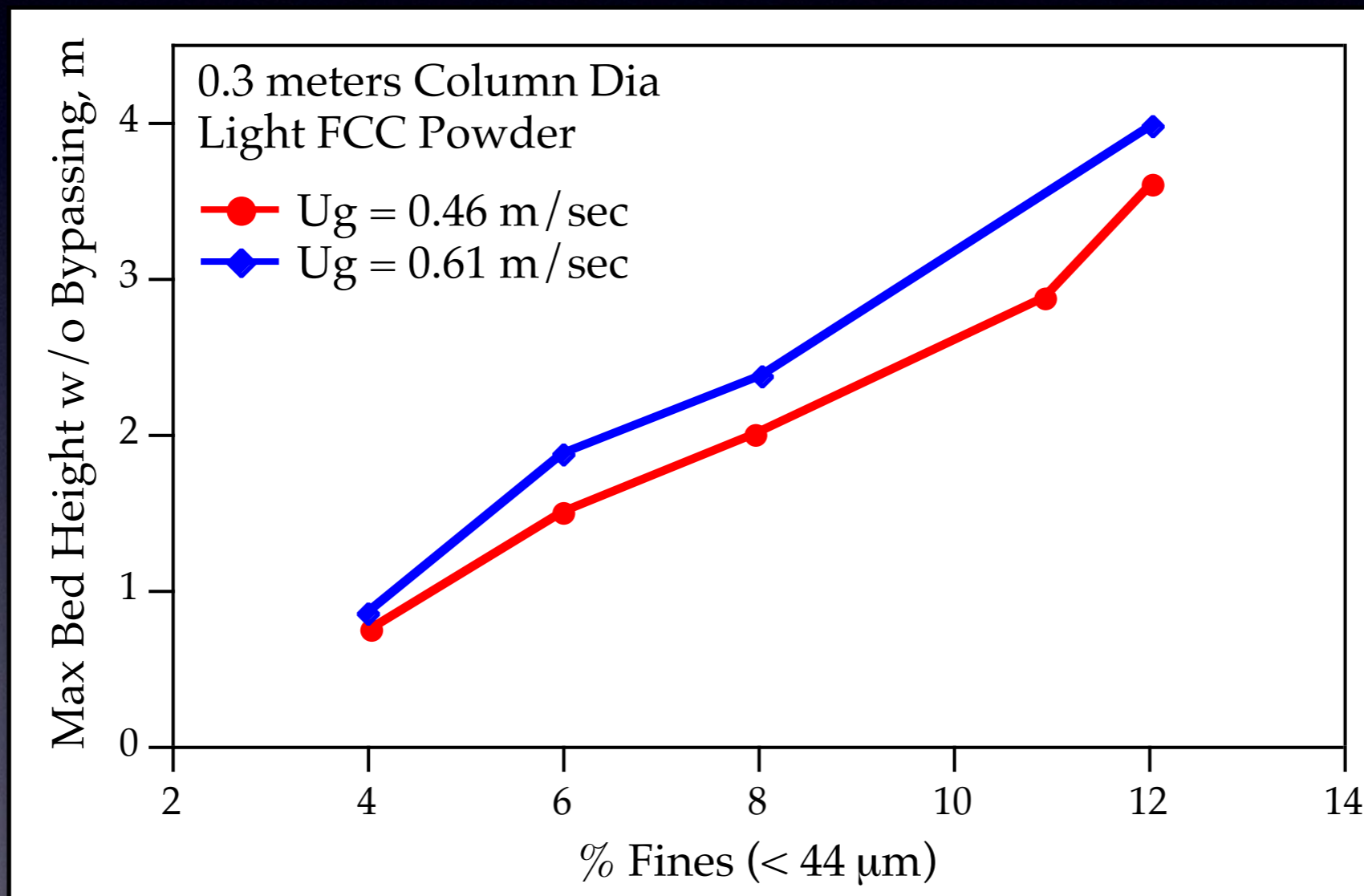


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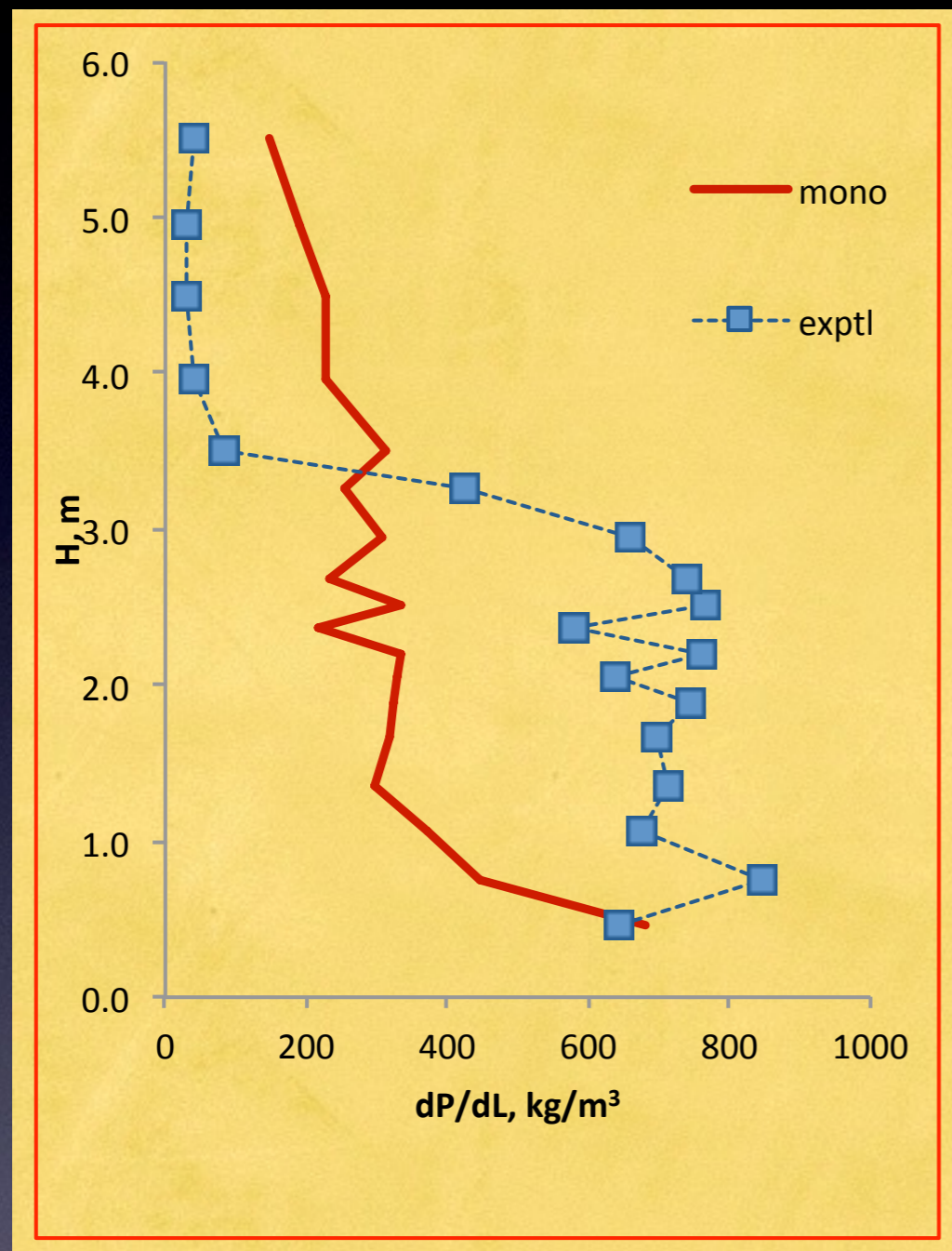
0.9 m ID Fluidized Bed  
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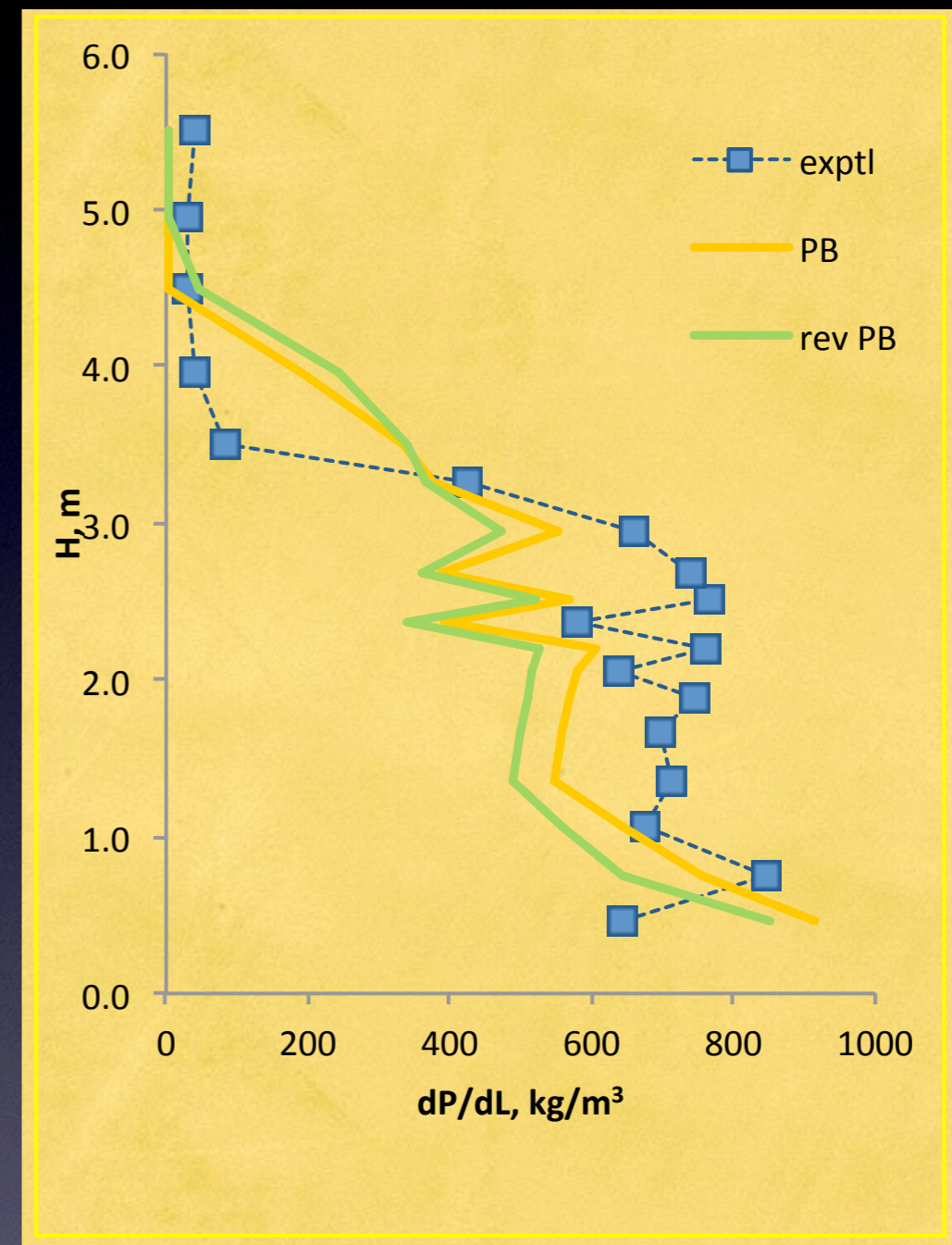
# Fines Matter



# PSRI & NETL Challenge Problem

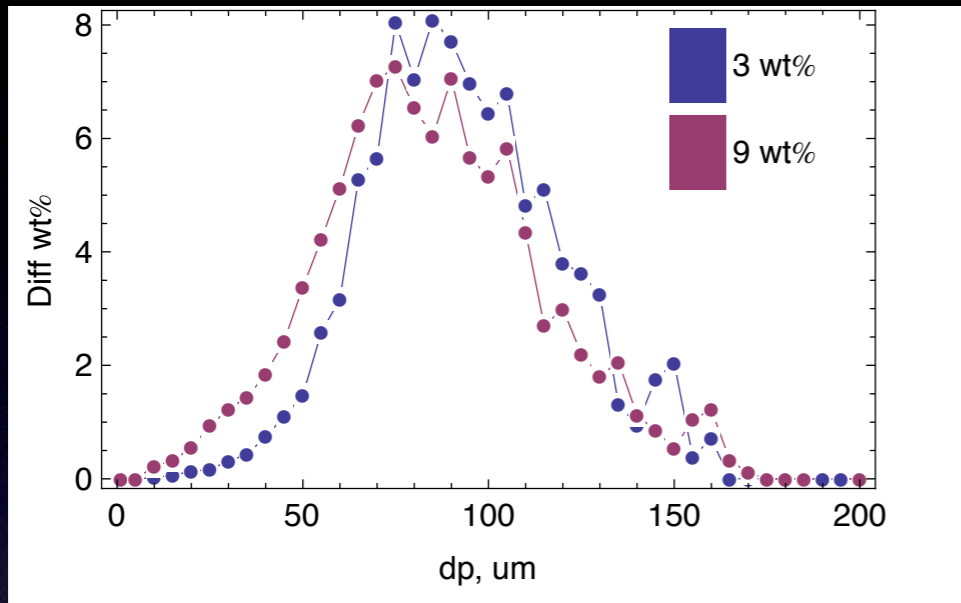


Eulerian-Eulerian with Single Particle Size



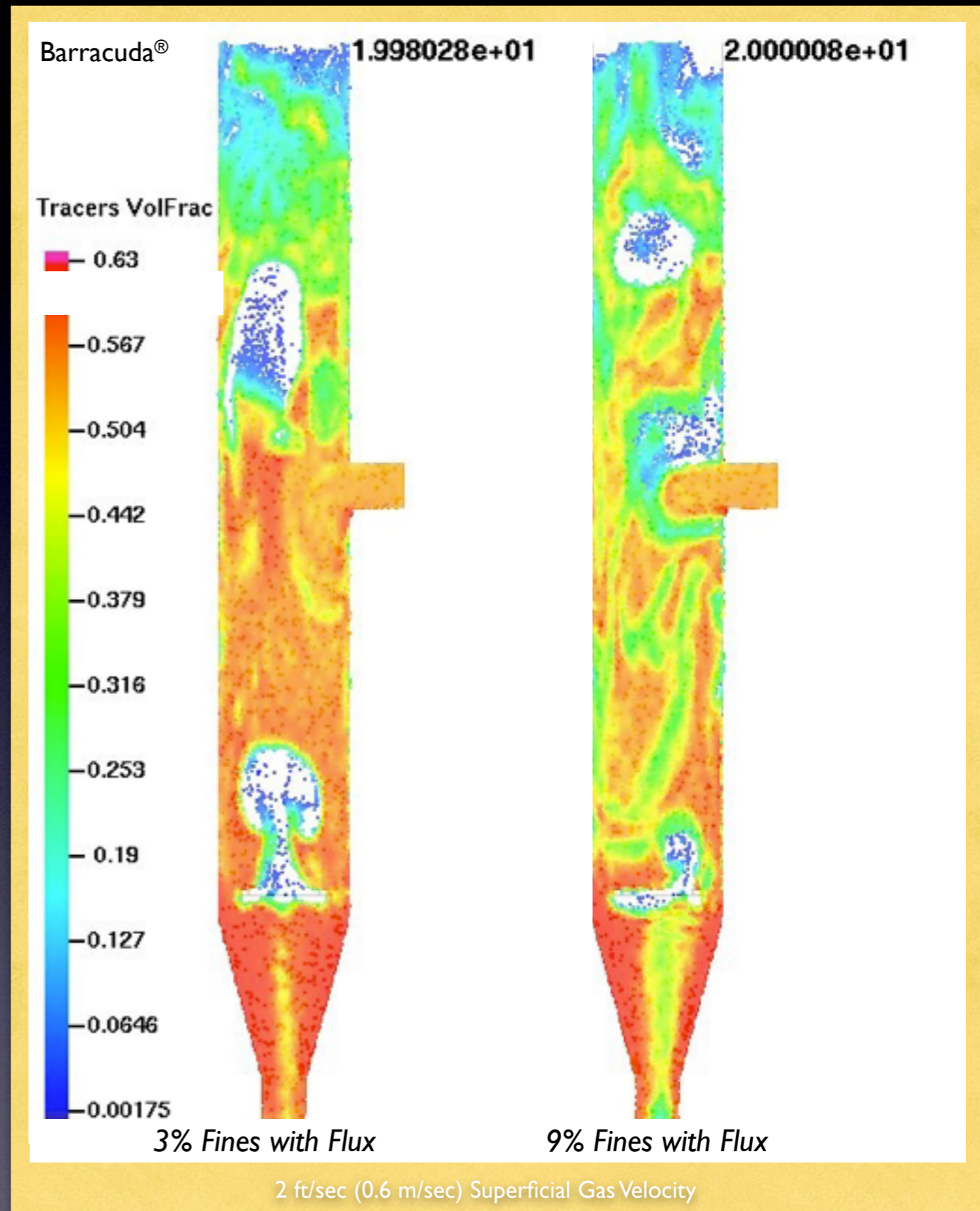
Eulerian-Eulerian with Population Balance for Particle Size Distribution

# Gas Bypassing

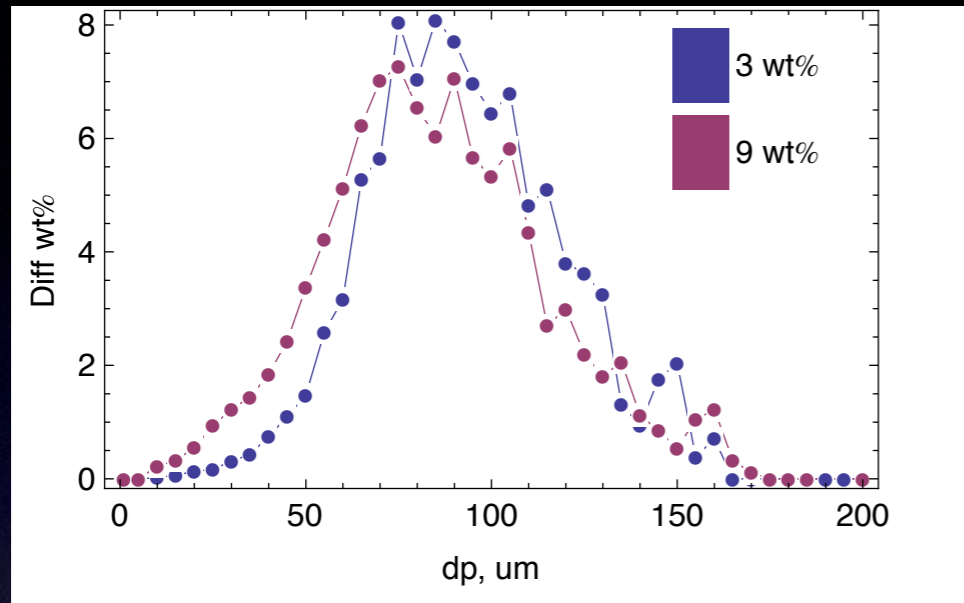


Reported	dp50, $\mu\text{m}$	% Fines, ( $< 44 \mu\text{m}$ )
3 wt%	80.4 $\mu\text{m}$	2.7%
8 wt%	81.0 $\mu\text{m}$	8.6%

- Significant difference in hydrodynamics due to fines level, not median particle size.
- If using one representative particle size, which one do you use?

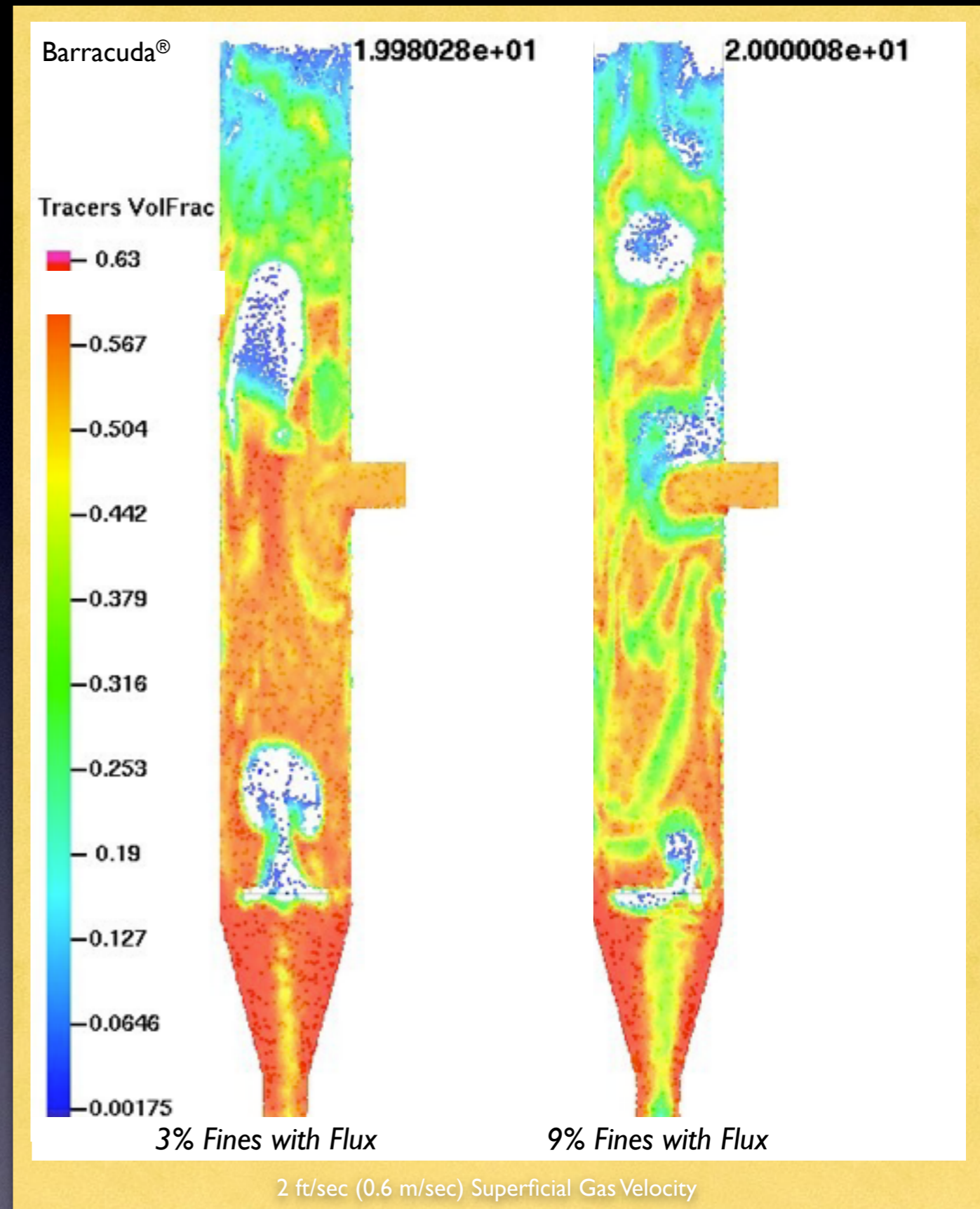


# Gas Bypassing

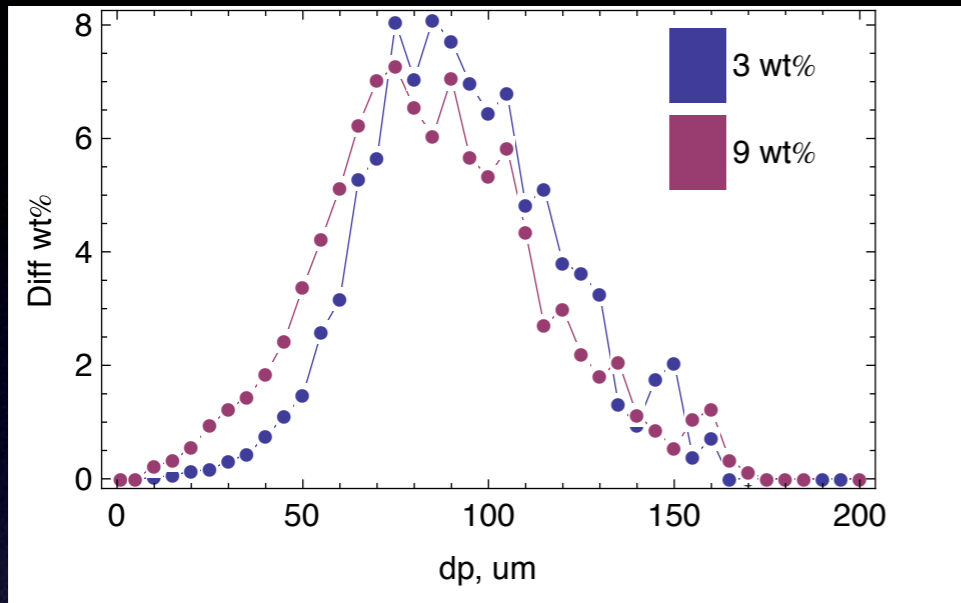


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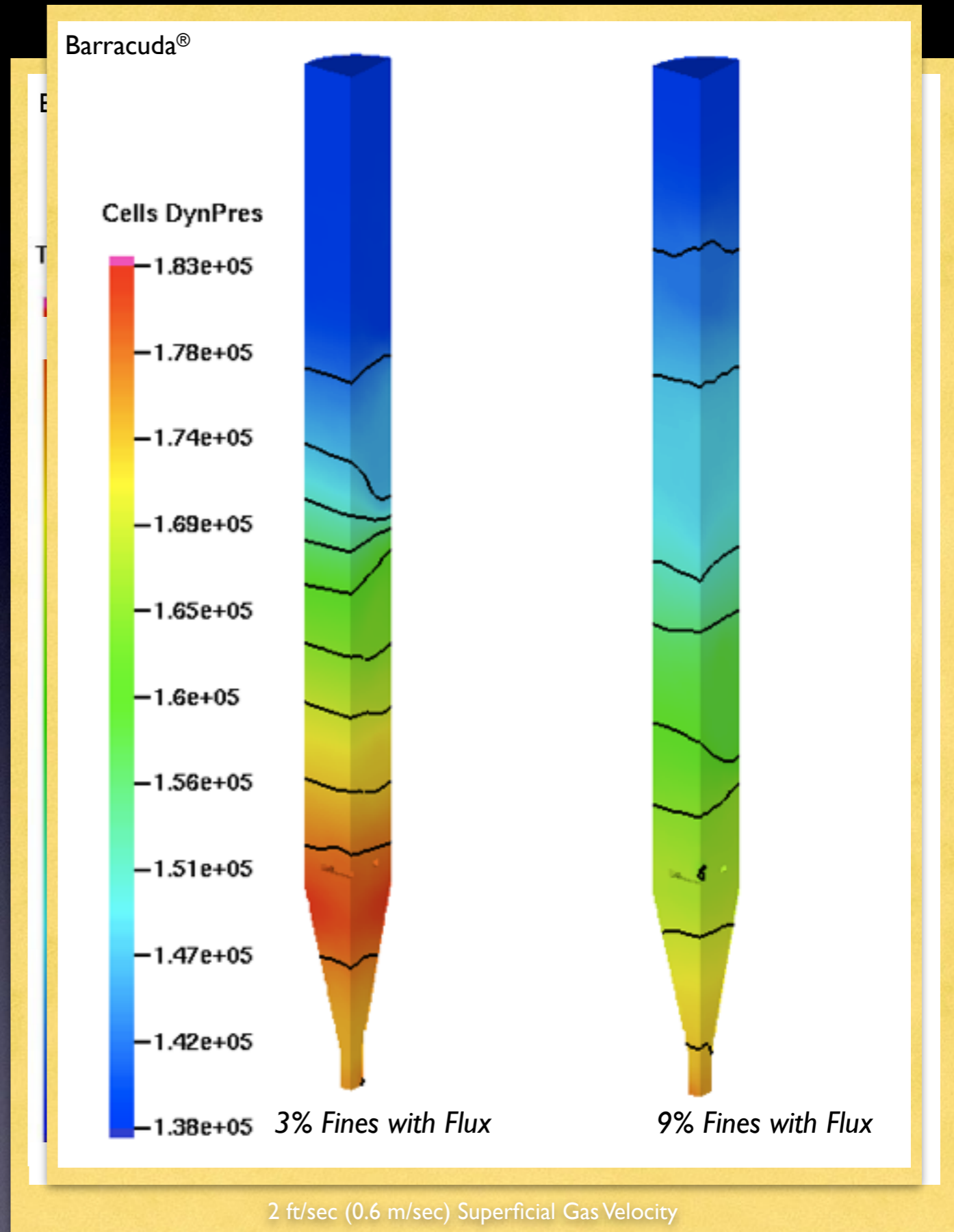


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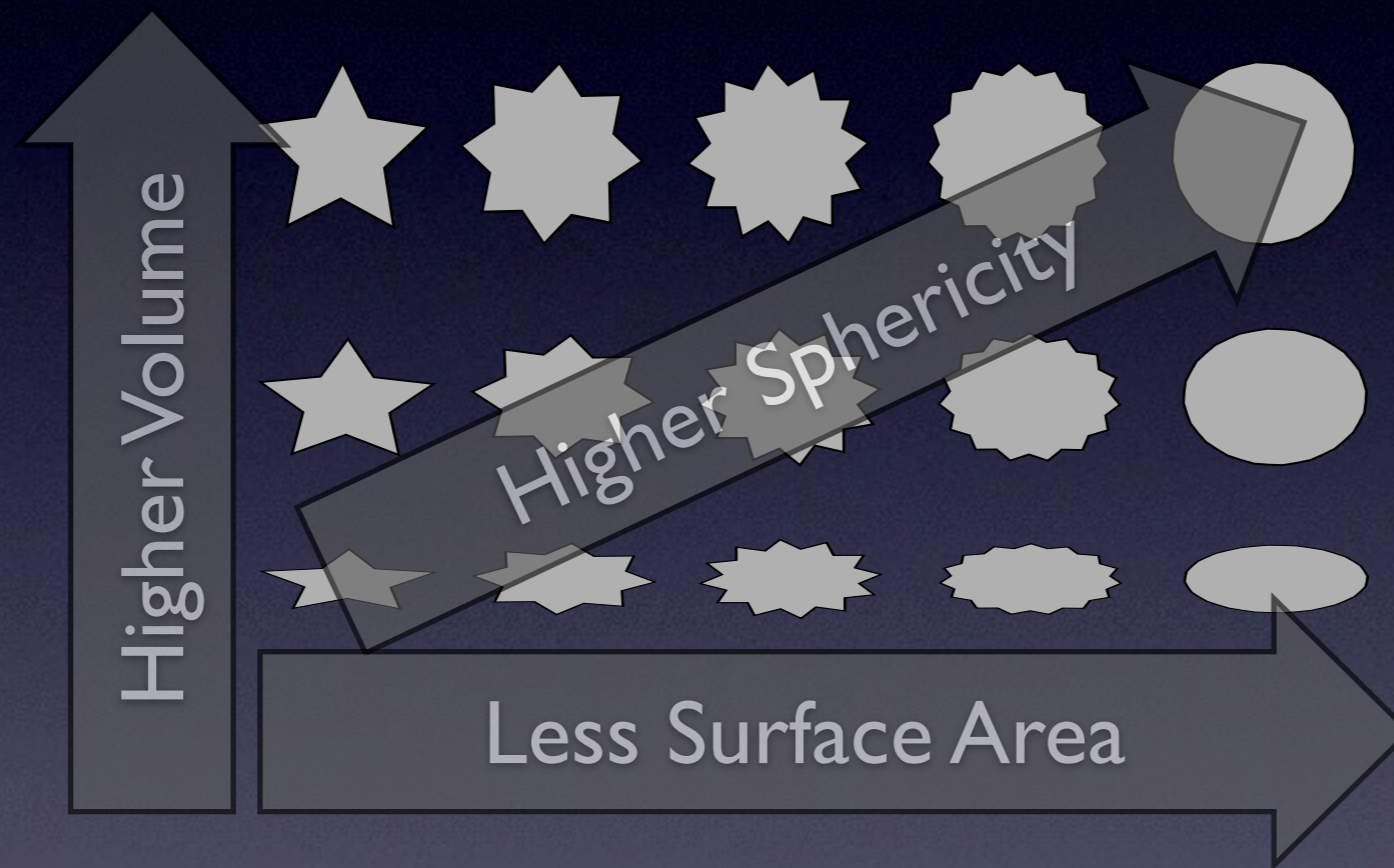


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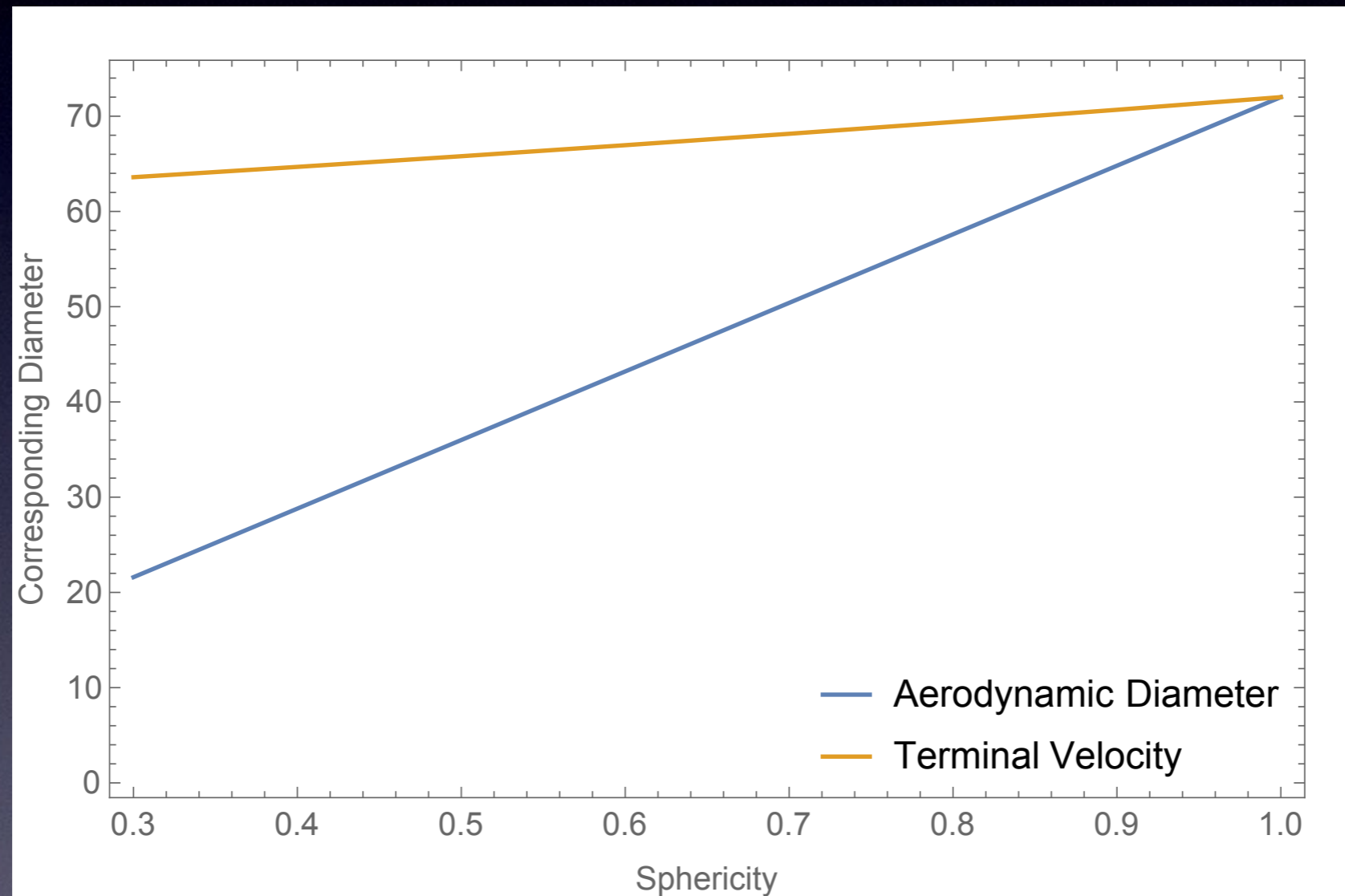
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# Particle Shape



# Aerodynamics



# Particle-Particle Interactions

Part 1

300  $\mu\text{m}$

*Near Capture*

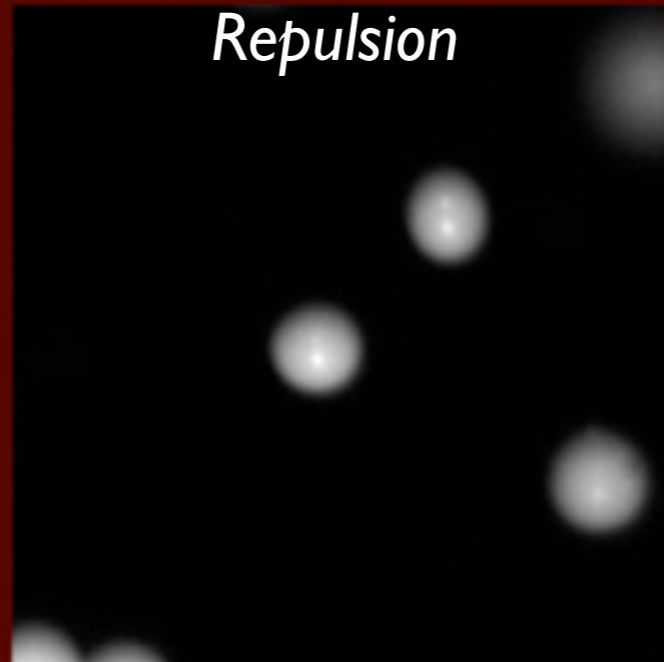


V. Lee, S. Waitukaitis, M. Miskin, H. Jaeger  
University of Chicago ©2015

Part 3

500  $\mu\text{m}$

*Repulsion*

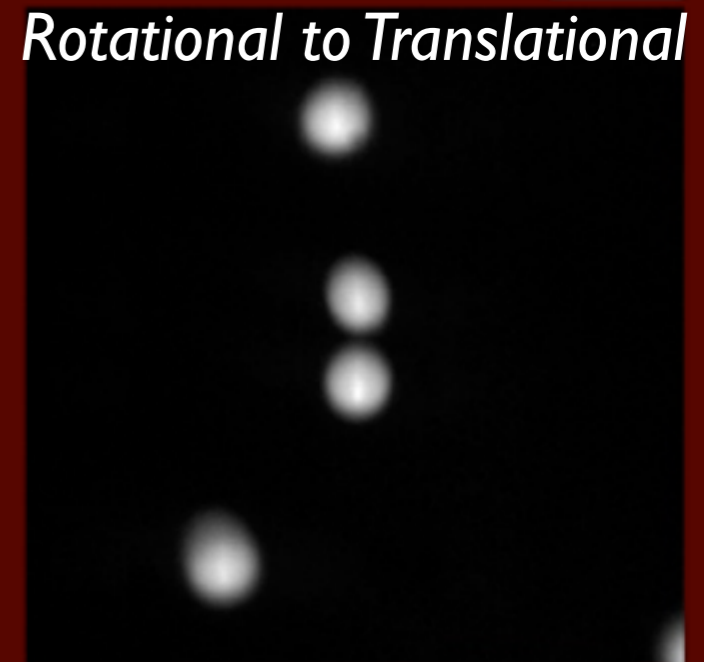


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Part 4

500  $\mu\text{m}$

*Rotational to Translational*



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*1000 fps capture with 25 fps play back*



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*Near Capture*

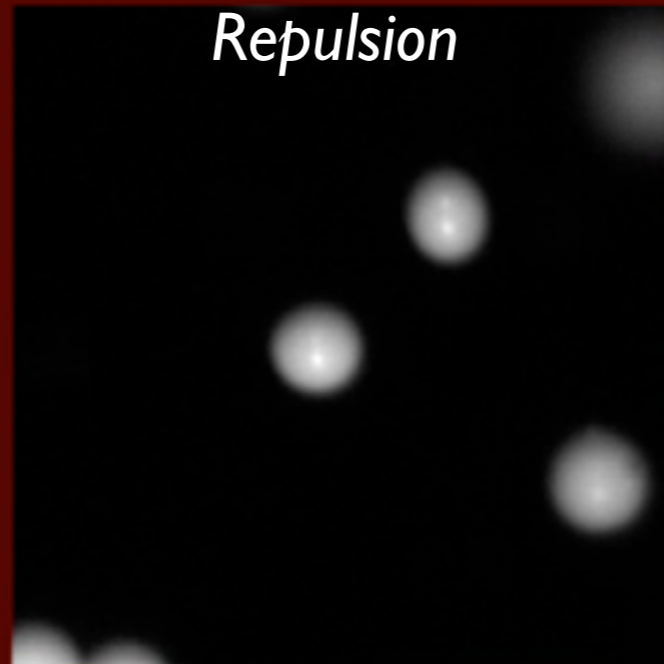


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*Repulsion*

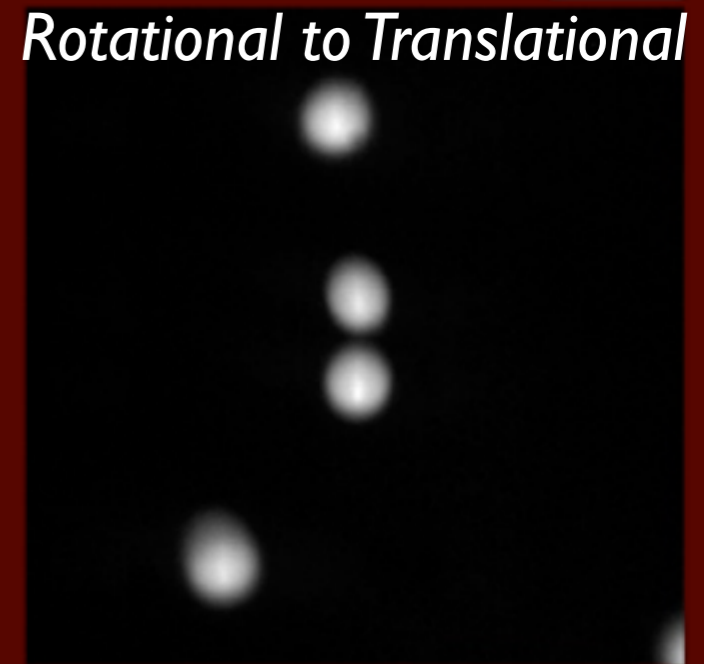


V. Lee, S. Waitukaitis, M. Miskin, H. Jaeger  
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Part 4

500  $\mu\text{m}$

*Rotational to Translational*



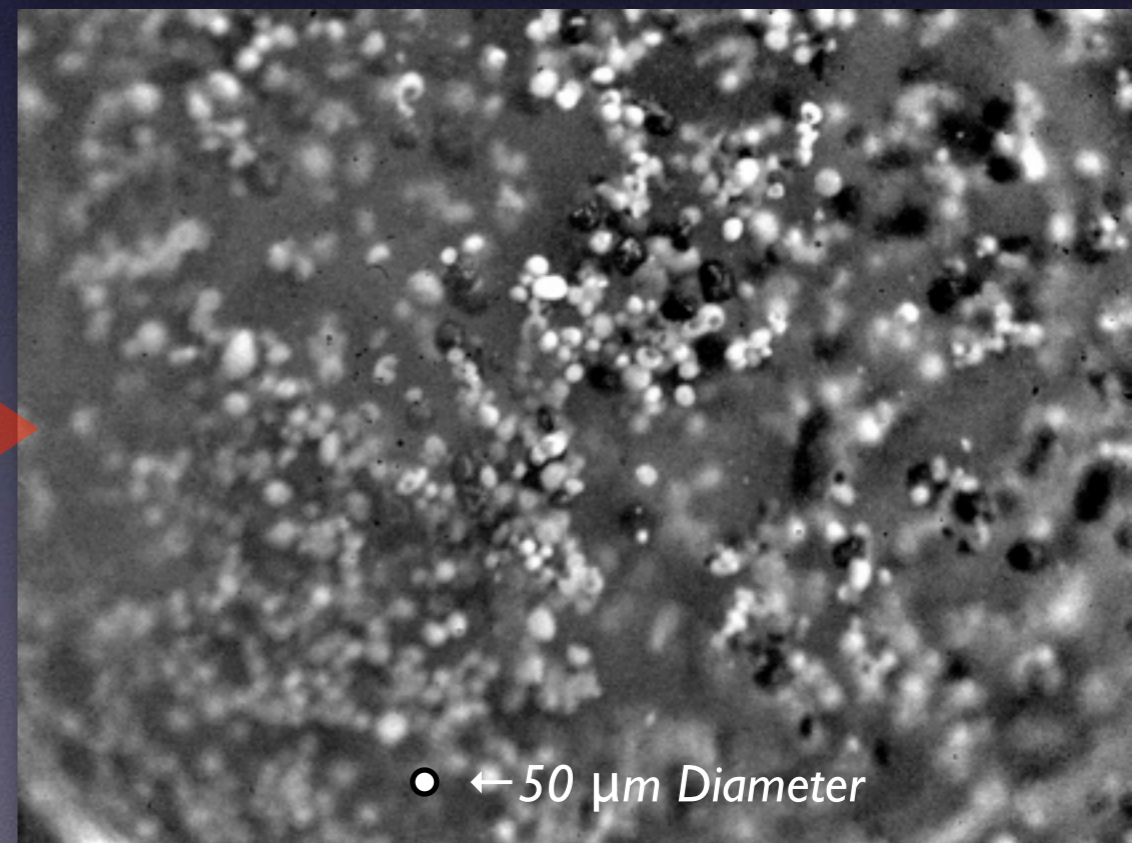
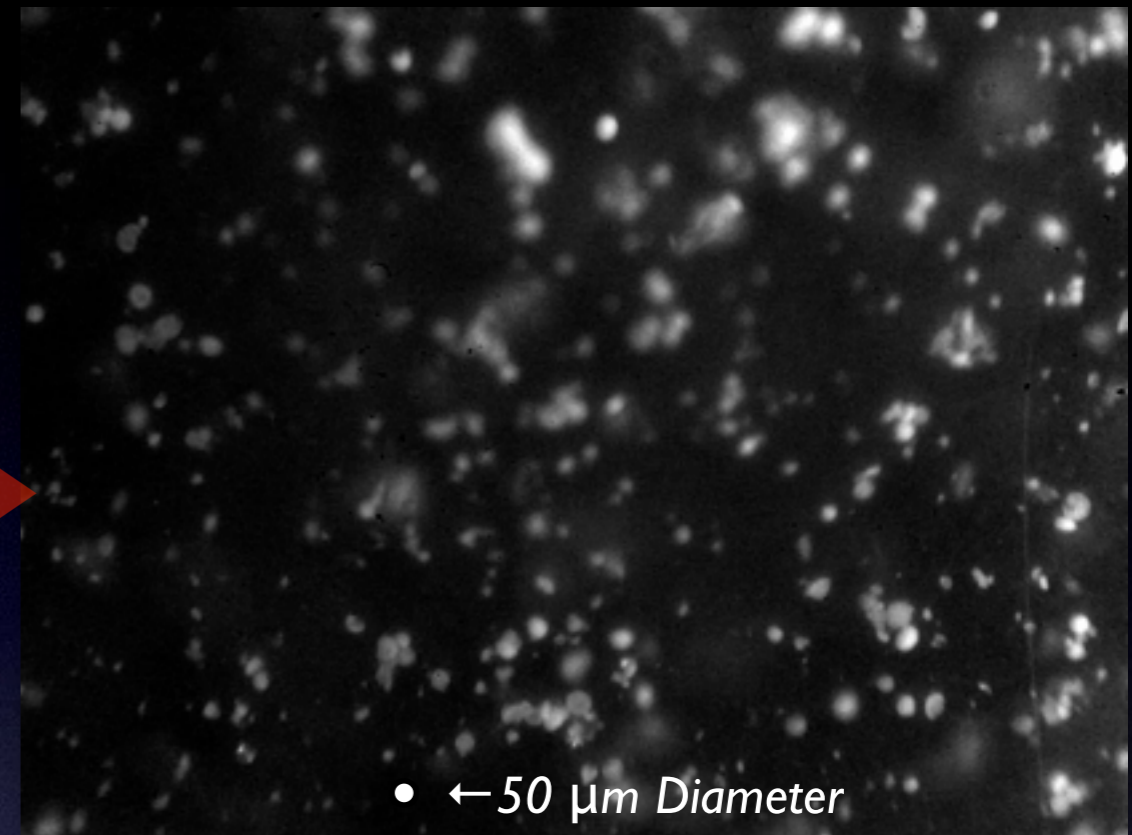
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University of Chicago ©2015

*1000 fps capture with 25 fps play back*

# Particle Morphology and Adsorbates

FCC powder with  $d_{p50}$  of 72 microns in a 6-in (15-cm) ID fluidized bed with a superficial gas velocity of 1 ft/sec (0.3 m/sec)

- 30% of the material in the freeboard were observed as clusters
- Average cluster size was 11 particles

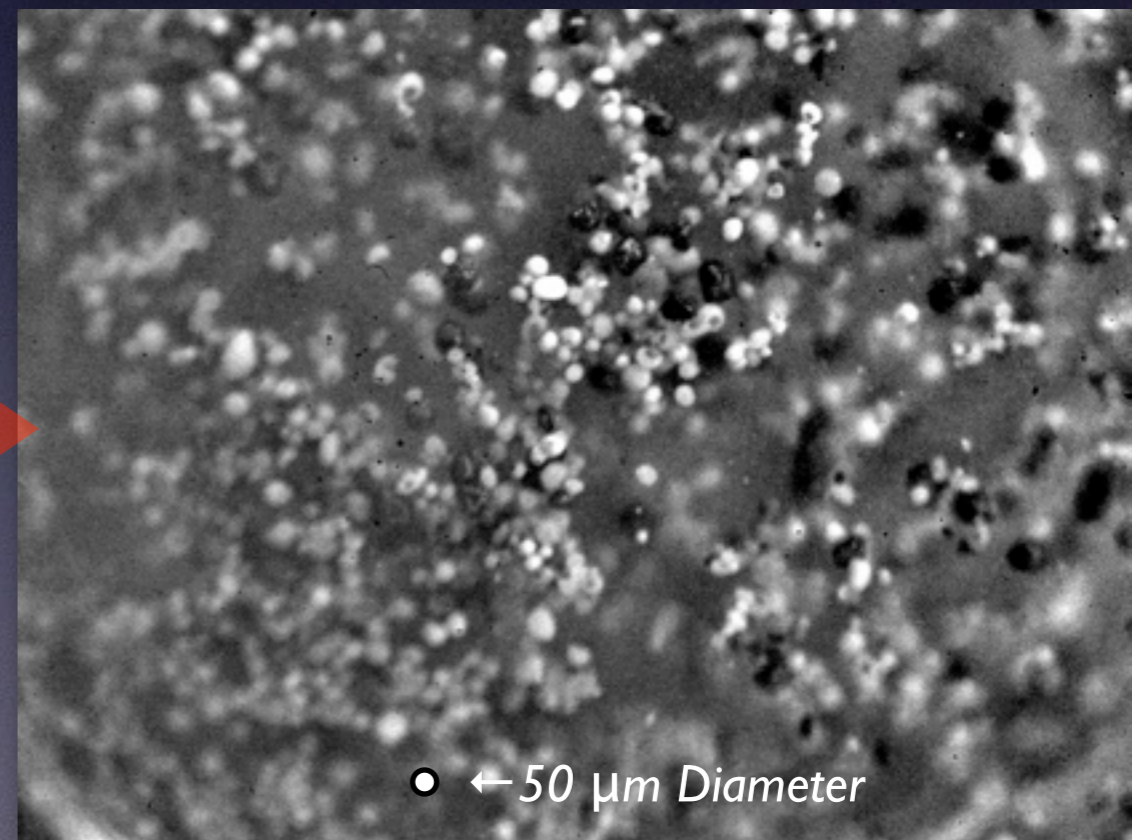
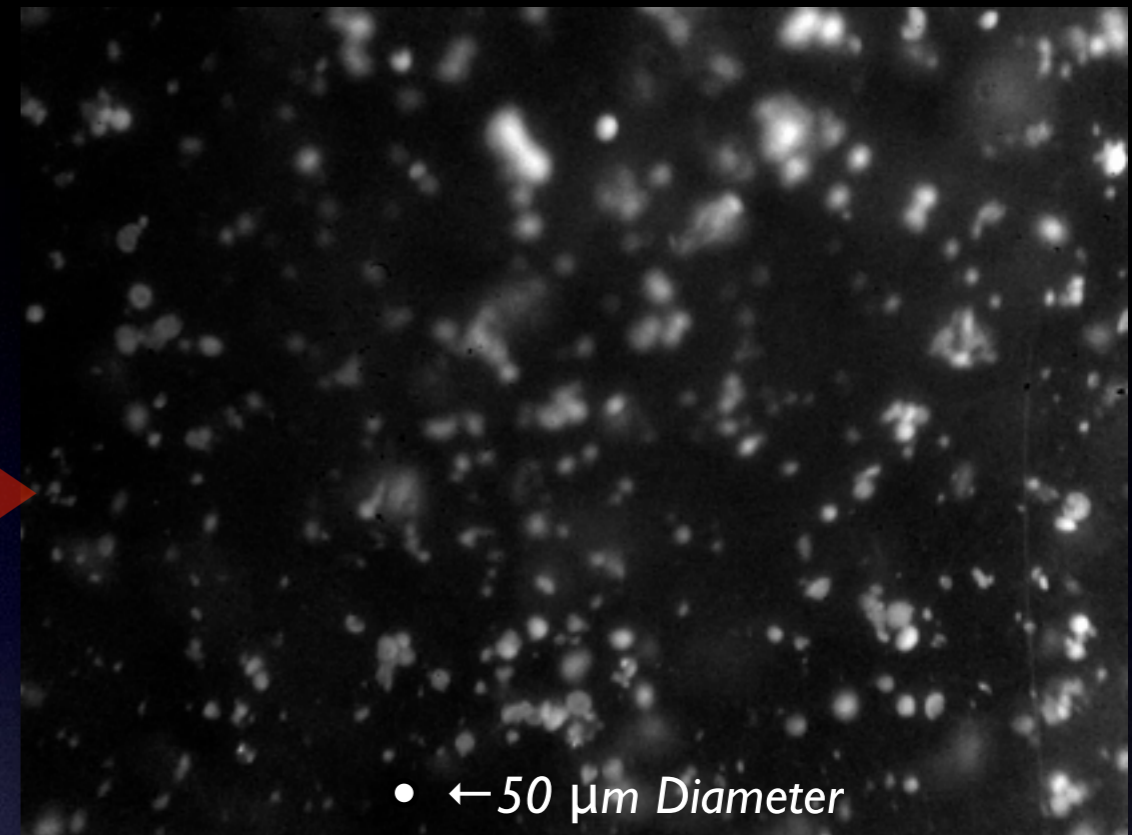


Phantom V7.1 @ 4000 fps, 20  $\mu$ s exposure (NETL)

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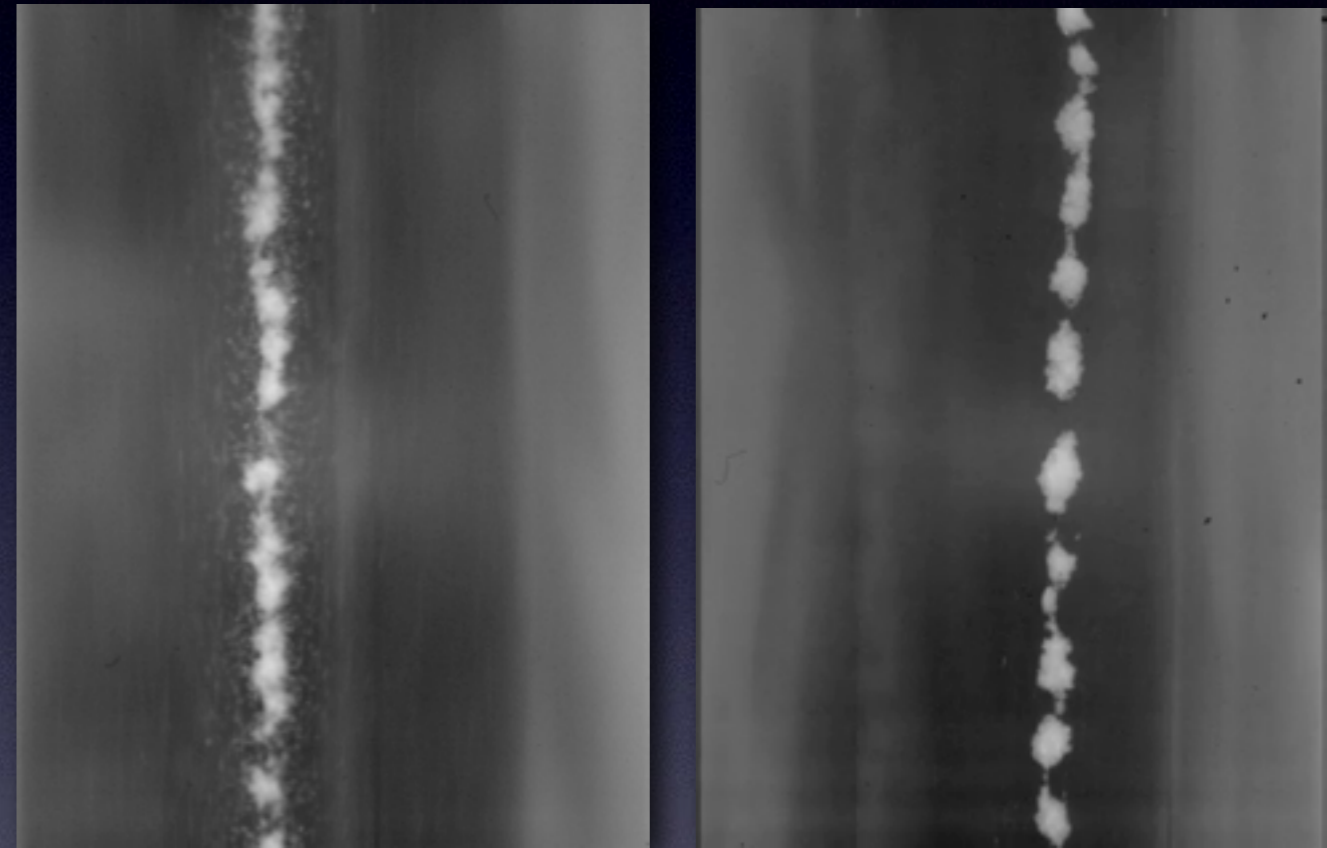
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# Powder Drop Experiment

- Particle clustering may not be due to hydrodynamic effects
- All commercial CFD codes for granular-fluid systems capture only hydrodynamic effects
- Cohesive effects are ignored
  - Electrostatics
  - Van der Waals
  - Boundary layer “wetting”

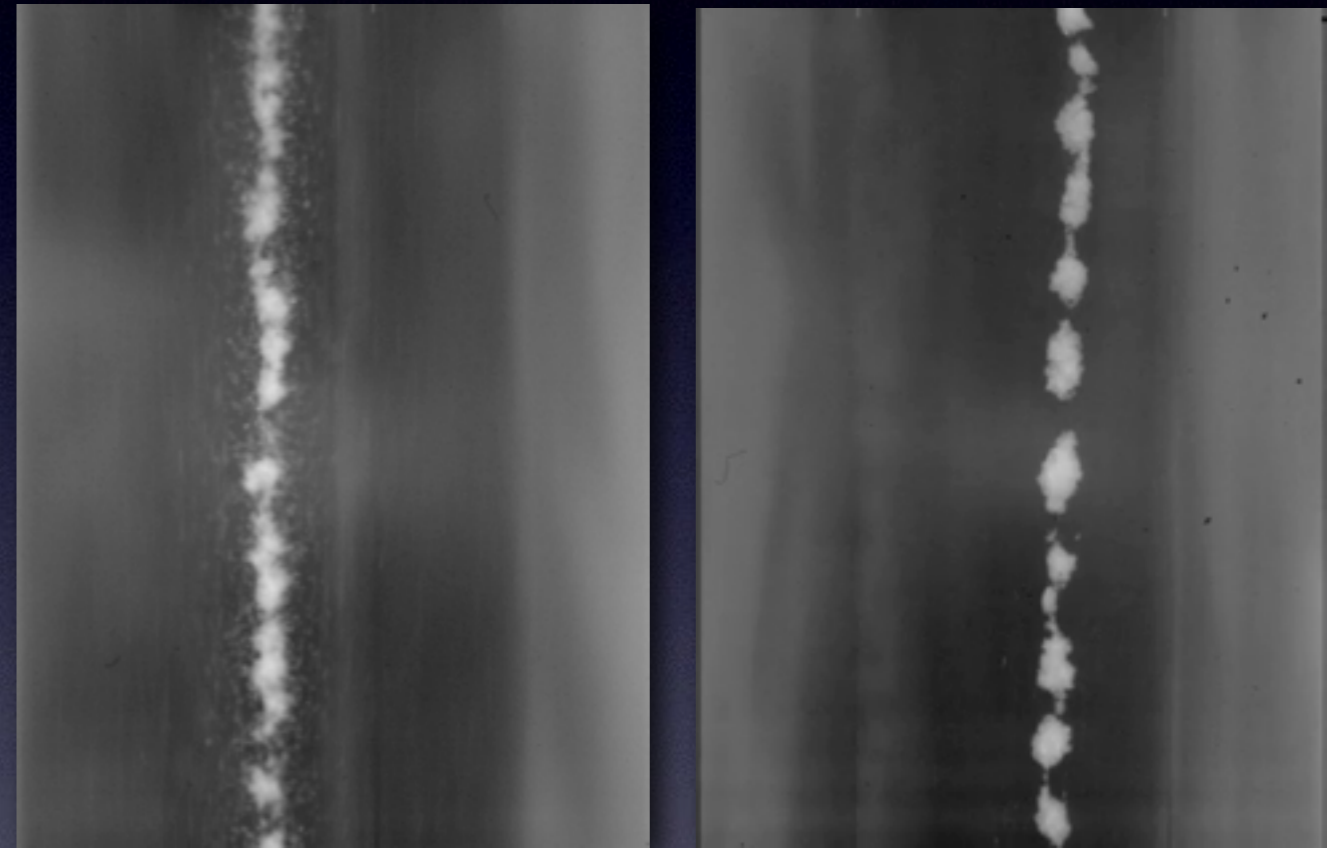


University of Chicago powder drop experiment with 100 micron glass beads

Royer, J.R., Evans, D.J., Oyarte, L., Guo, Q., Kapit, E., Möbius, M.E., Waitukaitis, S.R., Jaeger, H.M., H, Nature 459 (2009) 1110-1113.

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# What are Holding These Clusters Together?

- Glass beads ( $d_{p50} = 107 \mu\text{m}$ ) vs. copper powder ( $d_{p50} = 130 \mu\text{m}$ )
- Both performed below 1 torr
- Glass beads clustered together were the copper powder did not

*Glass Beads*



*Copper Powder*

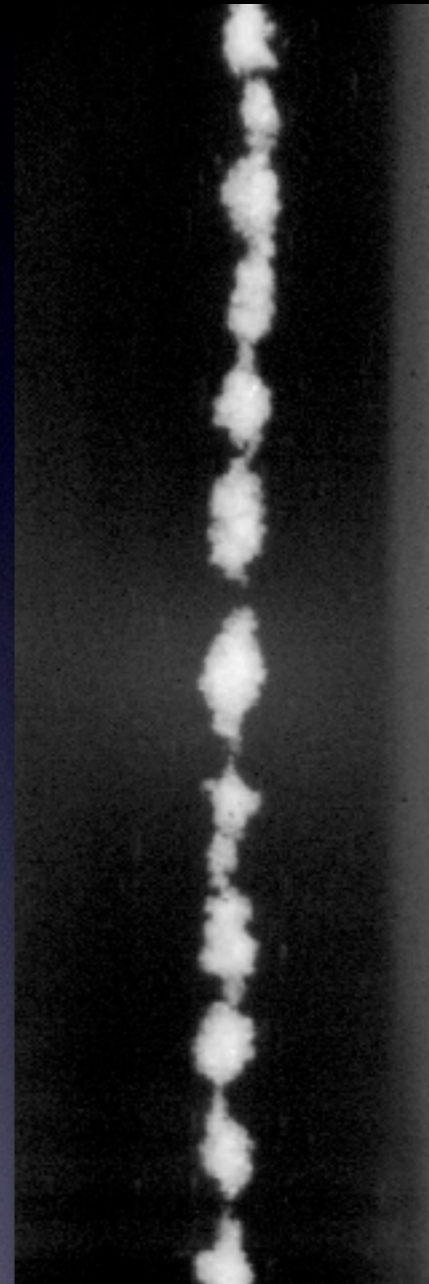


*No Change in Electrical Field*

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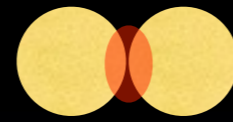
*Copper Powder*



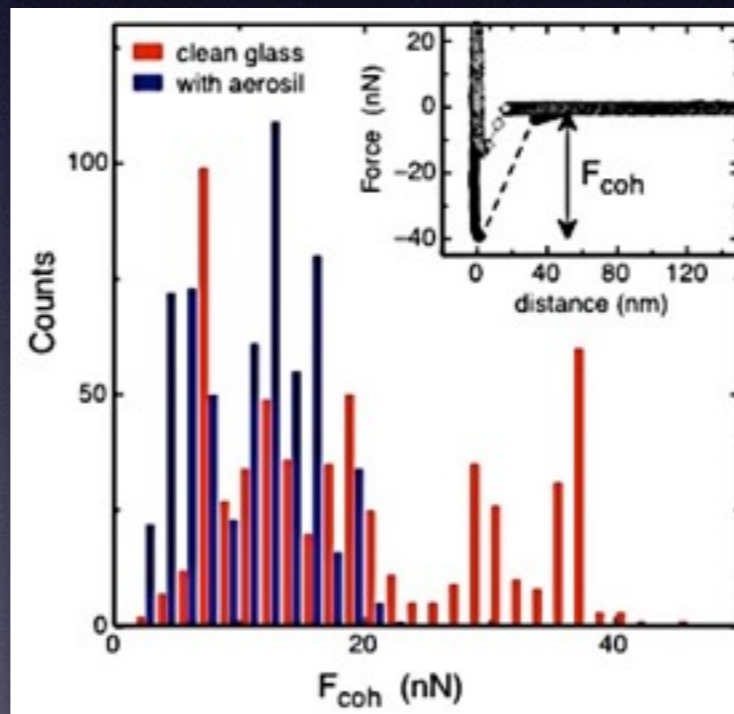
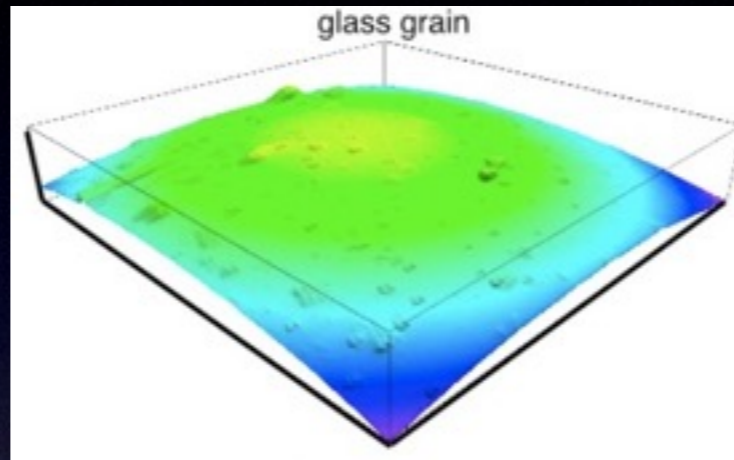
*No Change in Electrical Field*

# Surface Roughness and Cohesive Forces

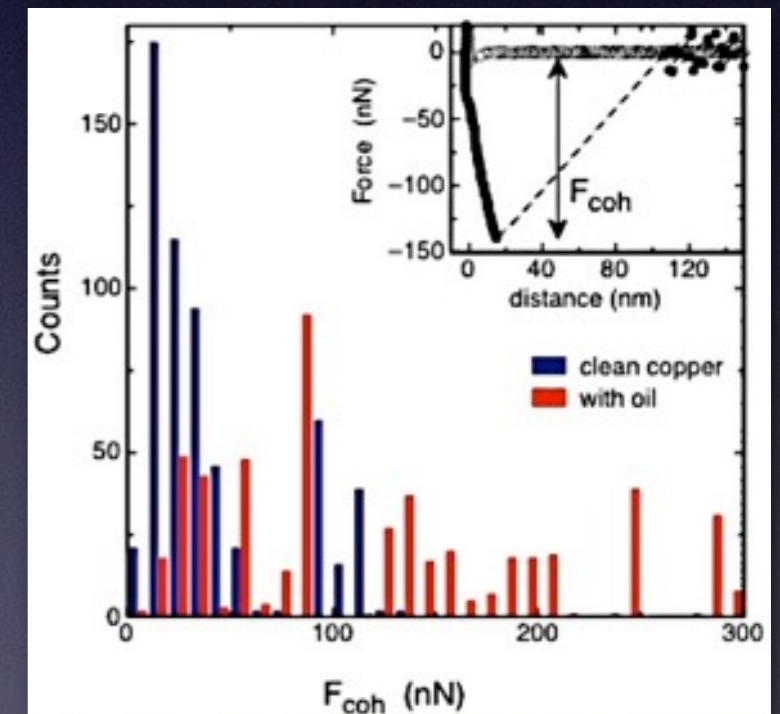
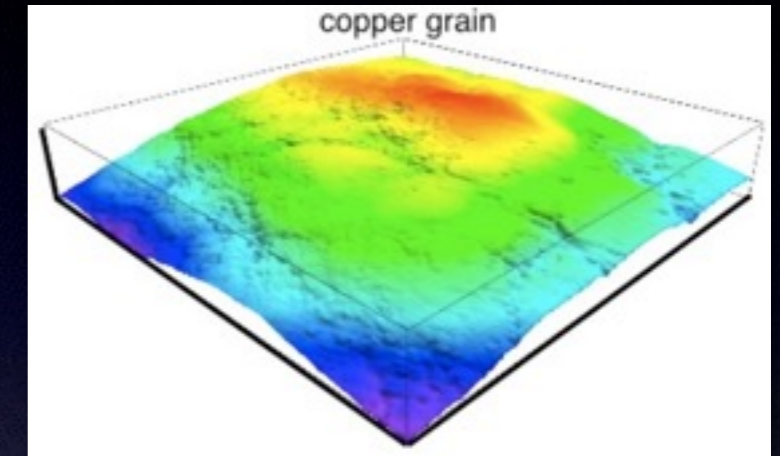
- Copper has 3.5 times more cohesive forces between two particles than the glass beads
- Surface protrusions from rough surfaces appear not to be inhibiting cohesive forces
- Oil did make the copper particles cluster



Strong Cohesive Force  
Glass Beads



Weak Cohesive Force  
Copper Powder

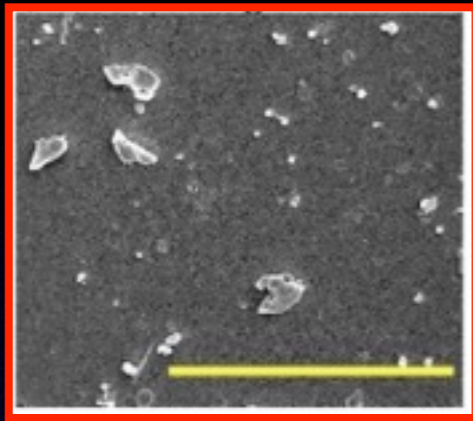


AFM Results from University of Chicago

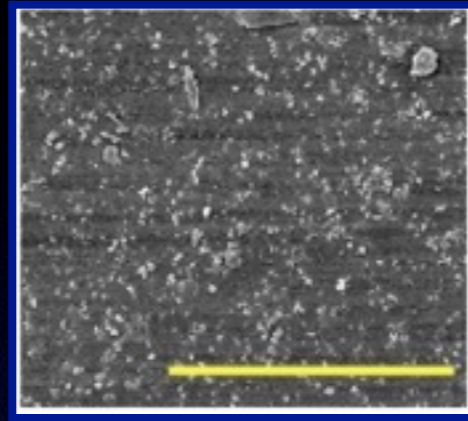


# What are Holding These Clusters Together?

Clean Glass

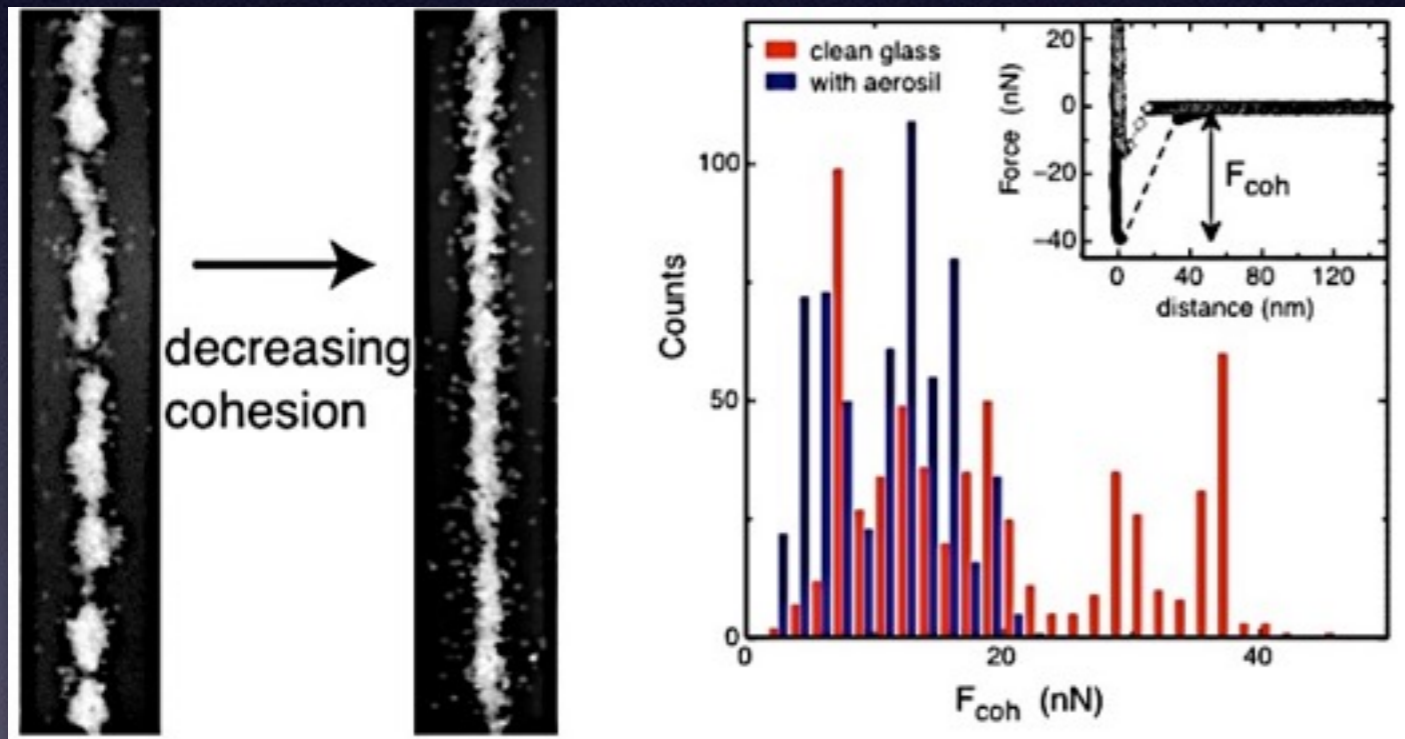


Glass with Aerosil™



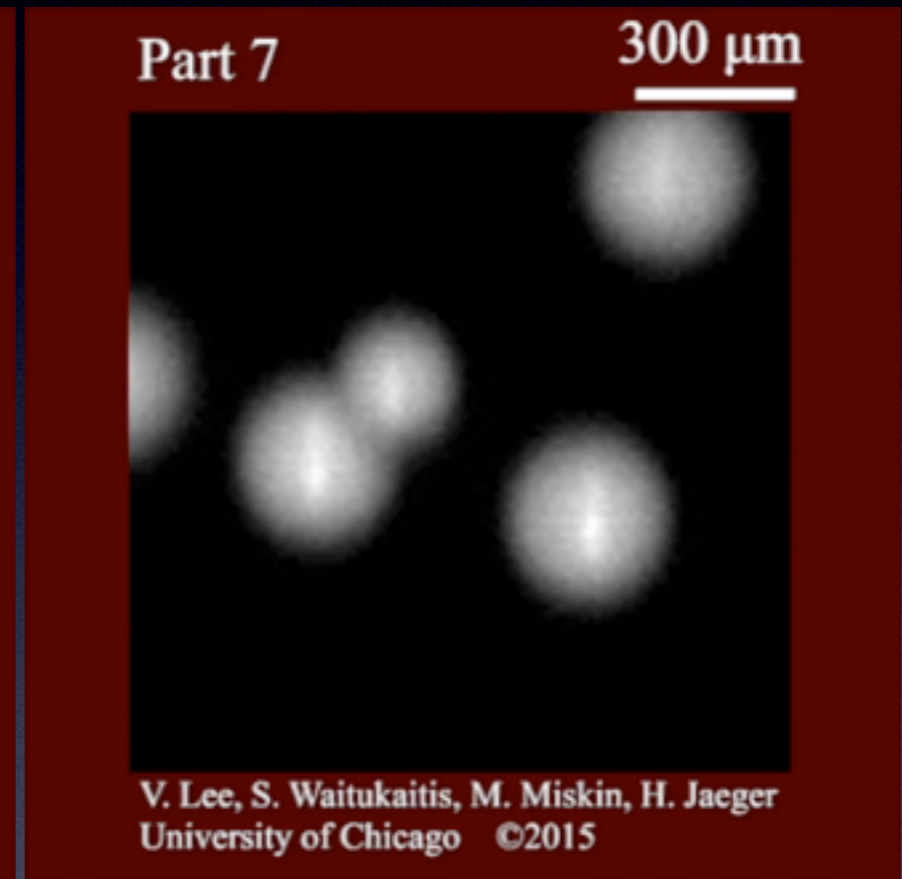
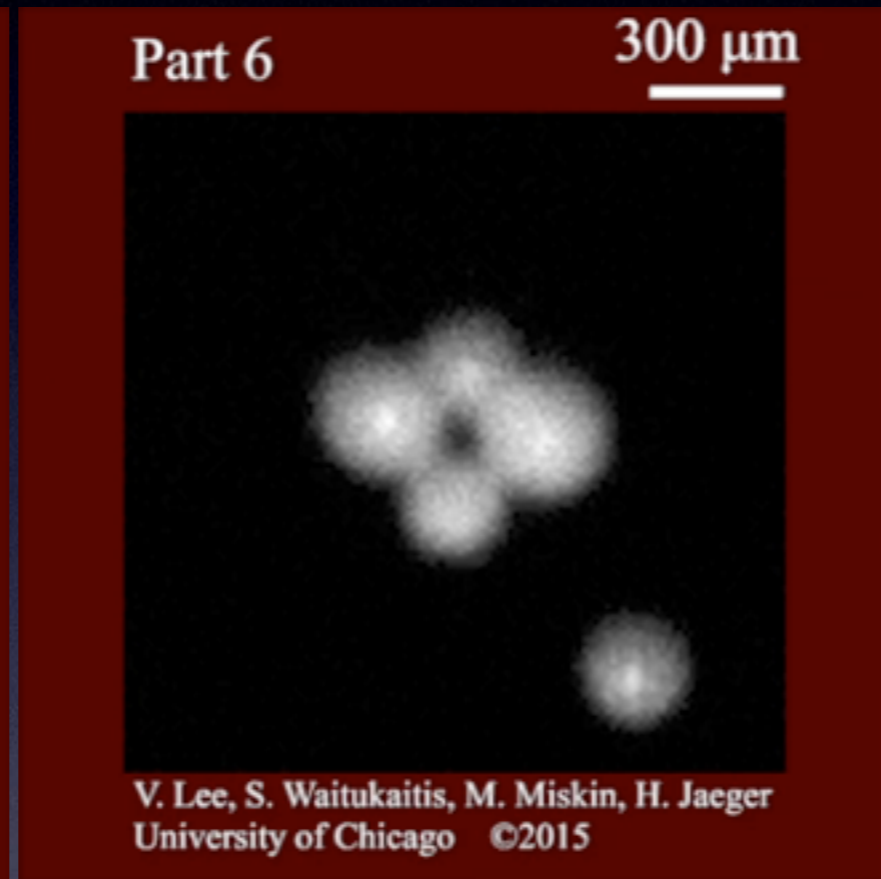
Glass Beads with and without Aerosil

- Relatively smooth surface appear to result in high cohesion
- Aerosil addition reduced cohesion
- Could this be a surface roughness factor?
- Rough surfaces results in less cohesive forces?



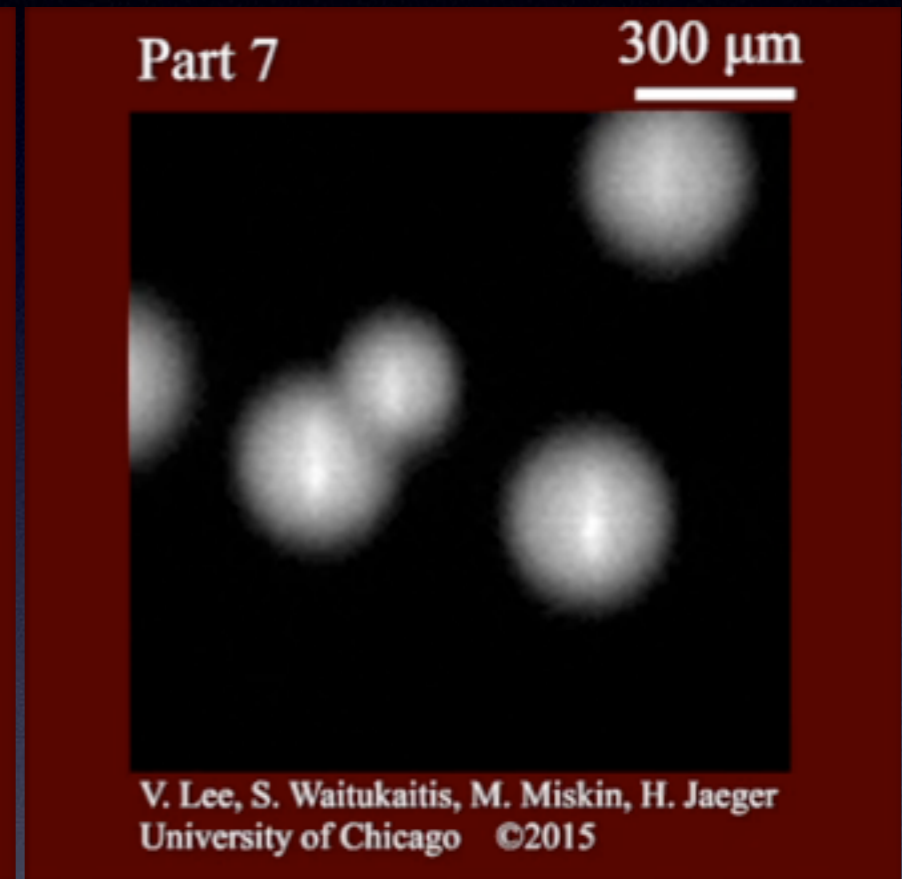
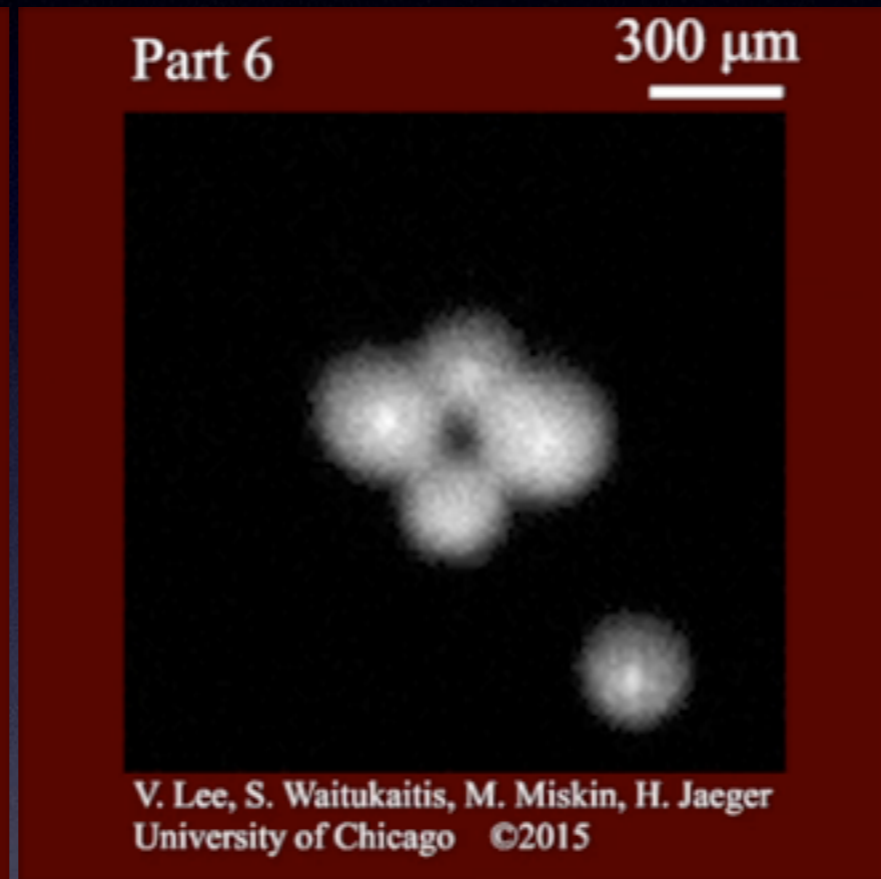
AFM Results from University of Chicago

# Particle Clustering During Free Fall



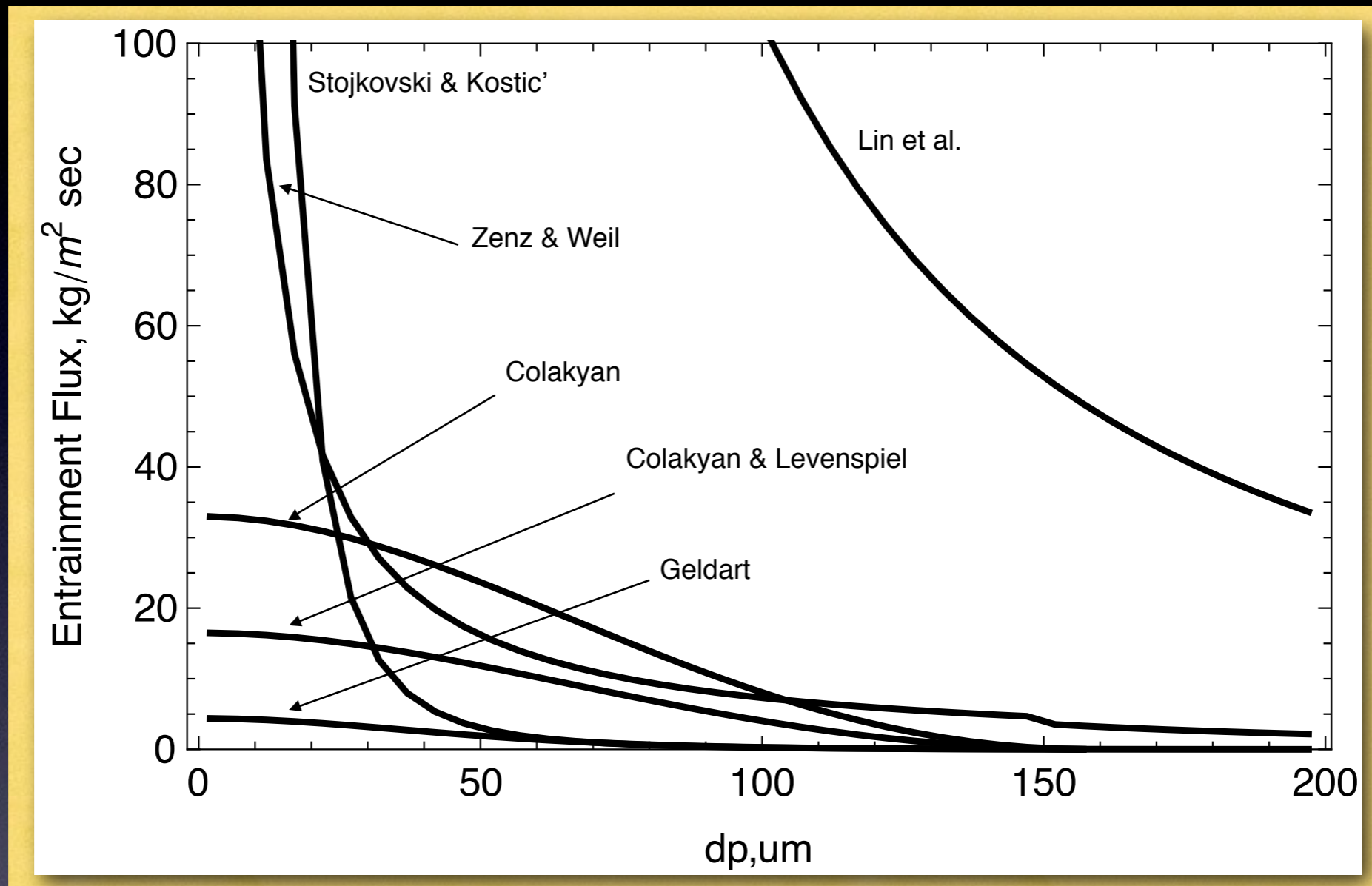
*1000 fps capture with 25 fps play back*

# Particle Clustering During Free Fall



*1000 fps capture with 25 fps play back*

# Entrainment



*Entrainment rate calculations based on FCC catalyst powder with 9% fines in a 3-meters ID x 12-meters tall fluidized bed with a bed height of 6 meters and superficial gas velocity of 1 m/sec at room temperature*

Stojkovski, V., Kostic', Z., Thermal Science, 7 (2003) 43-58.

Zenz, P.A., Weil, N.A., AIChE J., 4 (1958) 472-479.

Lin, L, Sears, J.T., Wen, C.Y., Powder Technology, 27 (1980) 105-115.

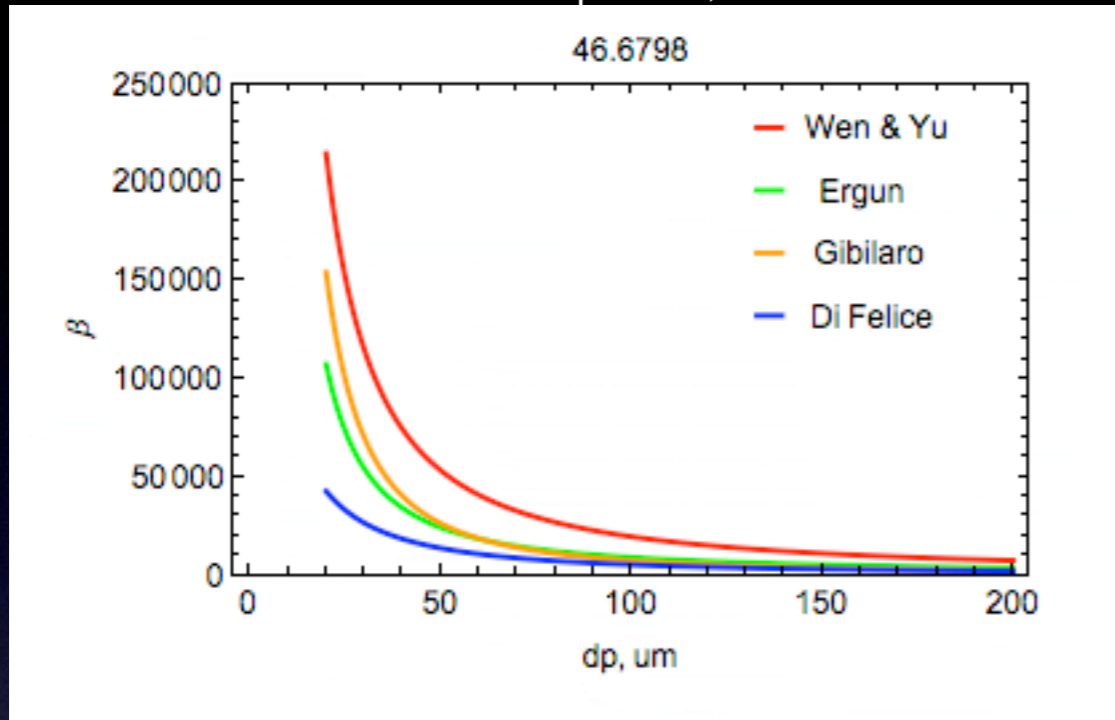
M. Colakyan, N. Catipovic, G. Jovanovic, T.J. Fitzgerald, AIChE Symp. Ser. 77 (1981) 66.

Colakyan, M., Levenspiel, O., Powder Technology, 38 (1984), pp. 223-232

Geldart, D., Cullinan, J., Georghiades, S., Gilvray, D., Pope, D.J., Trans. Inst. Chem. Eng., 57 (1979) 269-277.

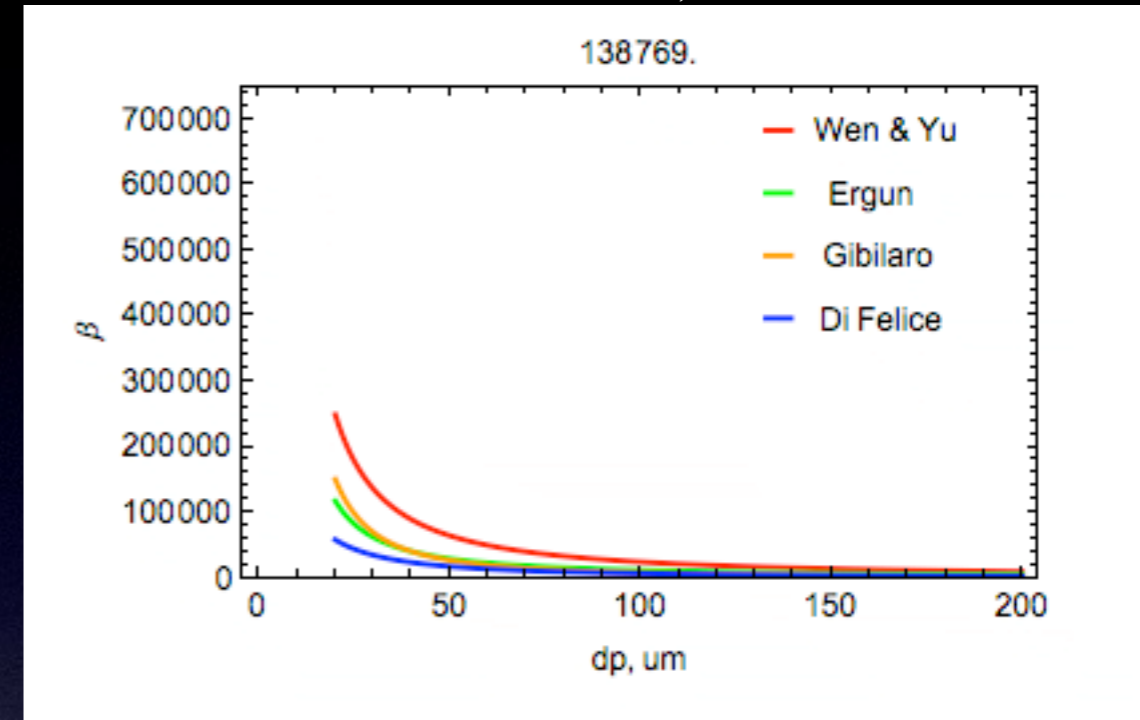
# Factors Affecting Drag

Temperature, °C



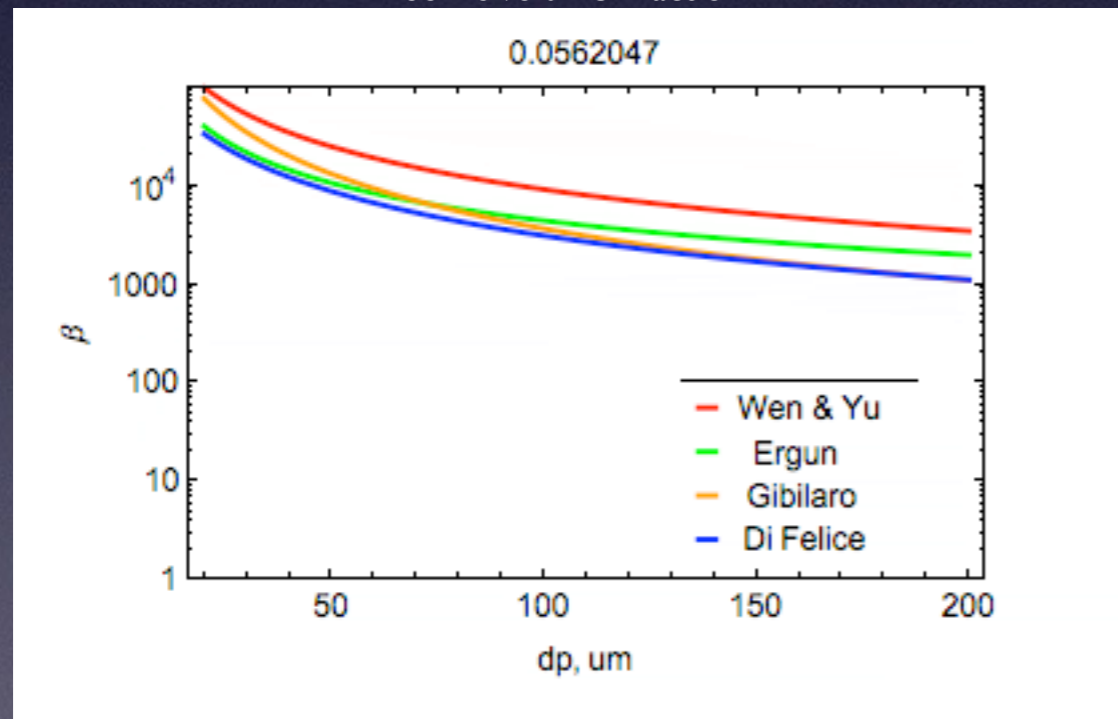
Not all correlations predict the same trend with temperature

Pressure, Pa



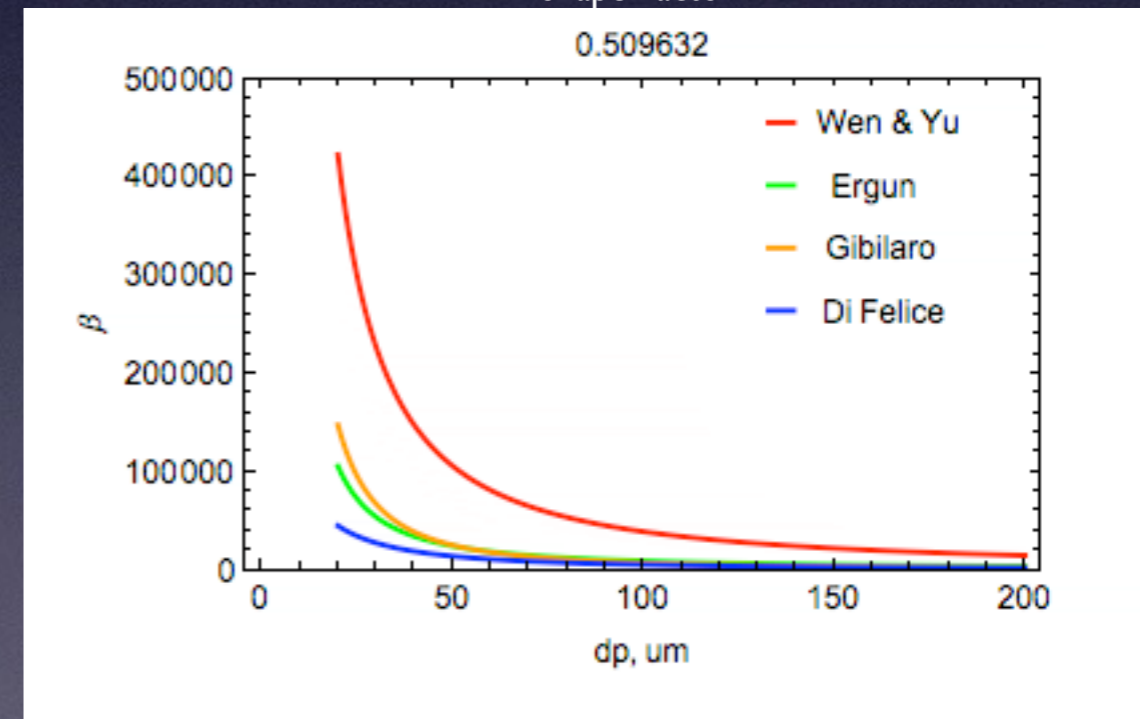
High pressures result in greater drag due to higher gas density

Solids Volume Fraction



All correlations are highly sensitive to solids volume fraction

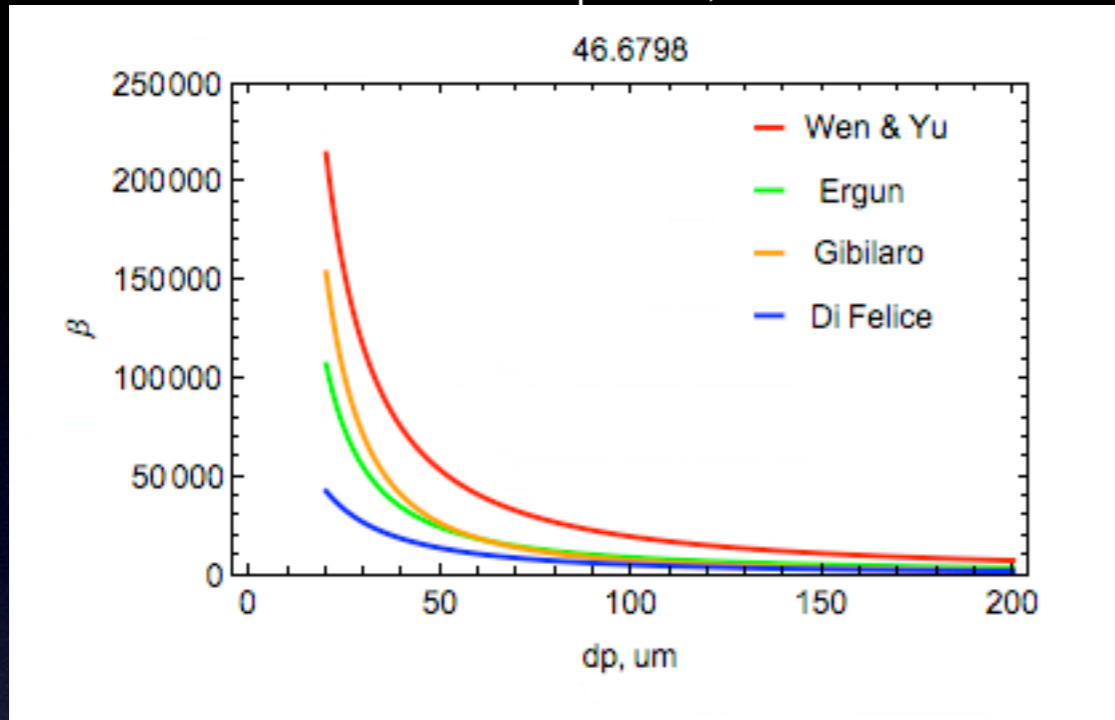
Shape Factor



The less spherical the particles, the greater the drag

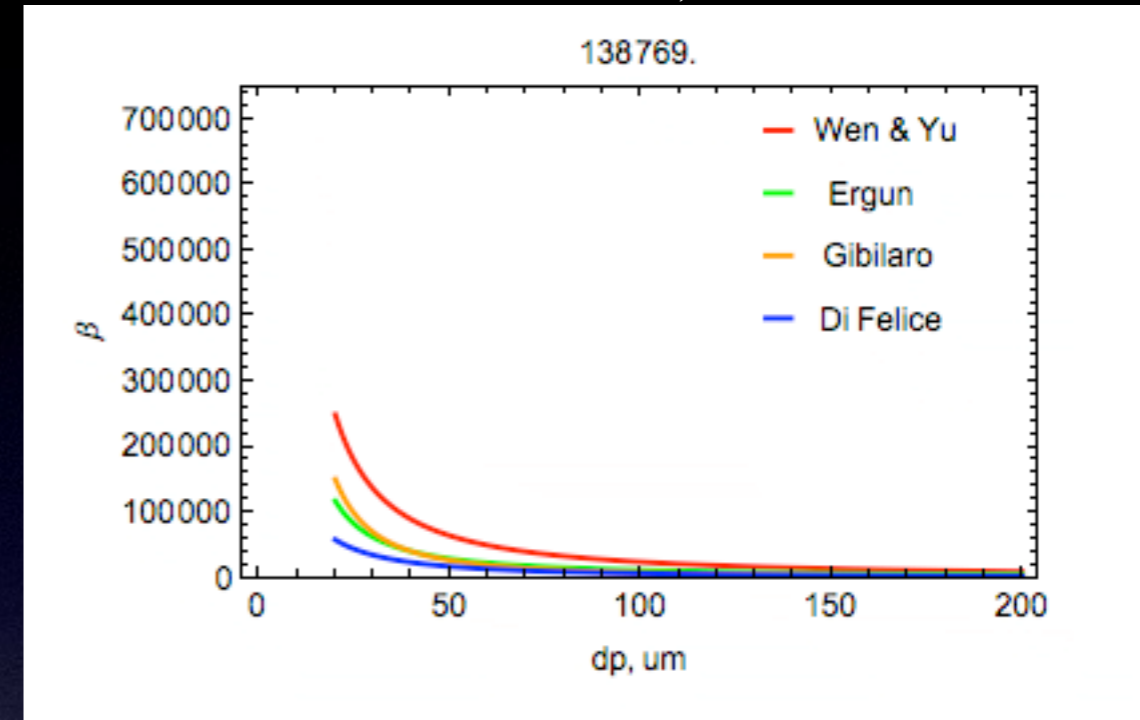
# Factors Affecting Drag

Temperature, °C



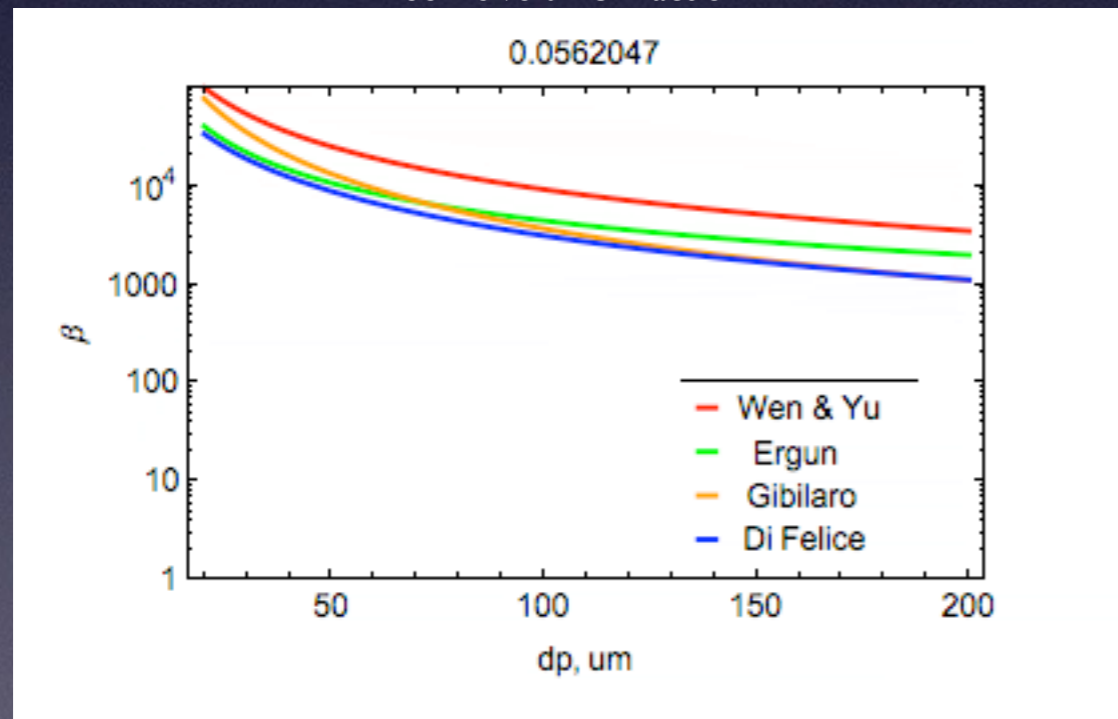
Not all correlations predict the same trend with temperature

Pressure, Pa



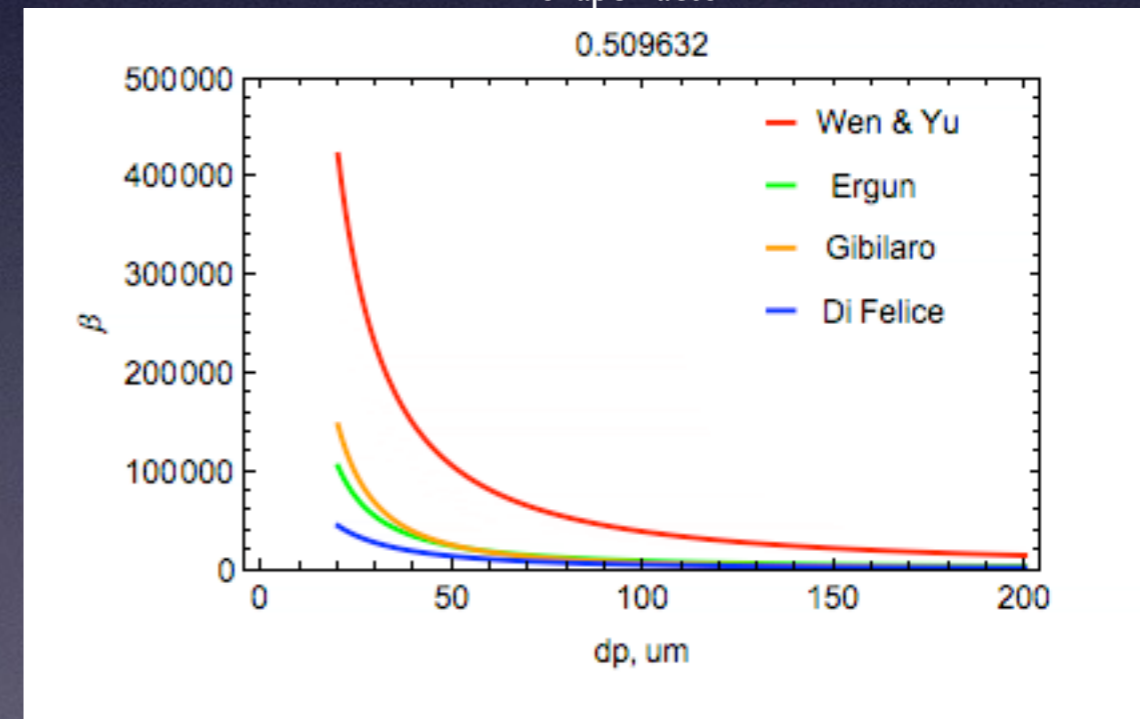
High pressures result in greater drag due to higher gas density

Solids Volume Fraction



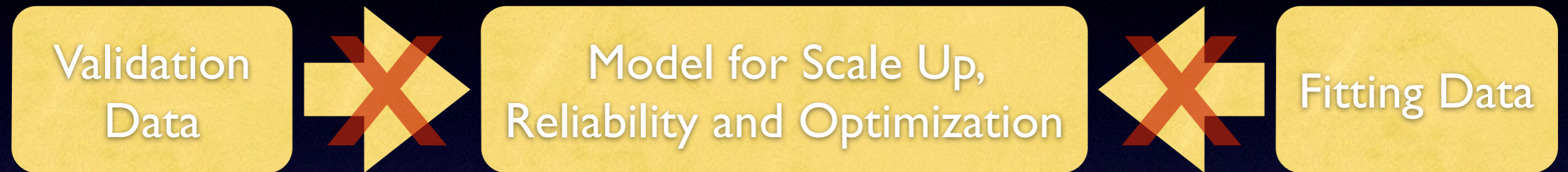
All correlations are highly sensitive to solids volume fraction

Shape Factor



The less spherical the particles, the greater the drag

# Micro-Scale Data Analysis Limited



- Particle-particle and/or particle/monolayer interactions are complex
  - Modeling, even physics, not readily available
- Process modeling needs to use
  - Sub-grid models for what we don't understand
    - Large scale validation for model development

# The Multi-scale Validation Paradox

Fundamentals

Model Fitting

Model Development

*Micro-scale*

1 to 100's Particles



$10^{-6}$  to  $10^{-4}$  m

Experiments  
are cheap

Simulations  
are cheap

Analysis are  
expensive

*Meso-scale*

Millions to Billions  
of Particles



$10^{-2}$  to  $10^{-1}$  m

Experiments are  
inexpensive

Simulations  
are cheap

Analysis are  
inexpensive

*Macro-scale*

Trillions of  
Particles



$10^{-1}$  to  $10^2$  m

Experiments are  
expensive

Simulations  
are expensive

Analysis are  
cheap



# PSRI/NETL Challenge Problem

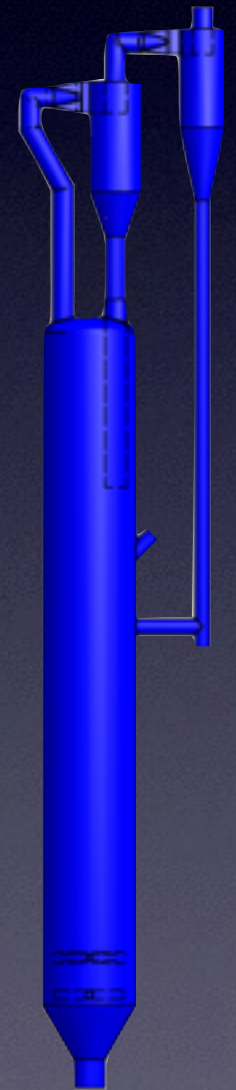


## Circulating Fluidized Bed

- NETL's 12-in (30-cm) ID x 52-ft (16-m) tall CFB
- Geldart Group A and B material
- Gas jet in riser

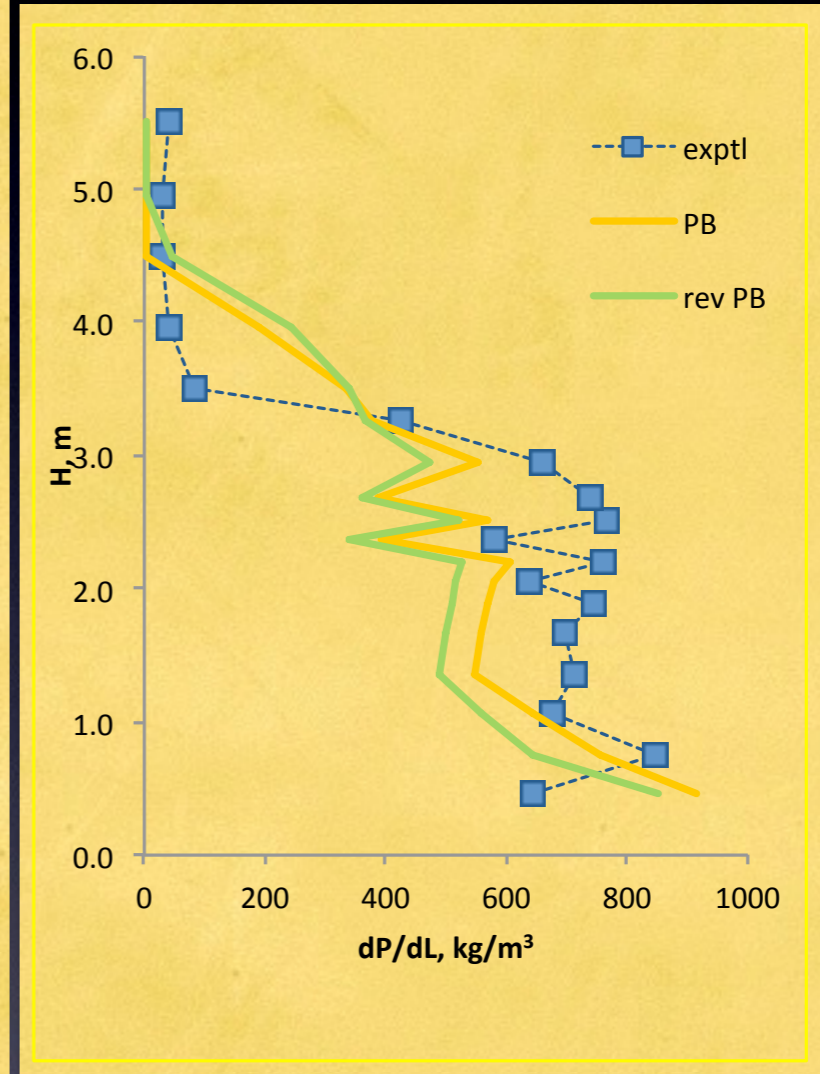
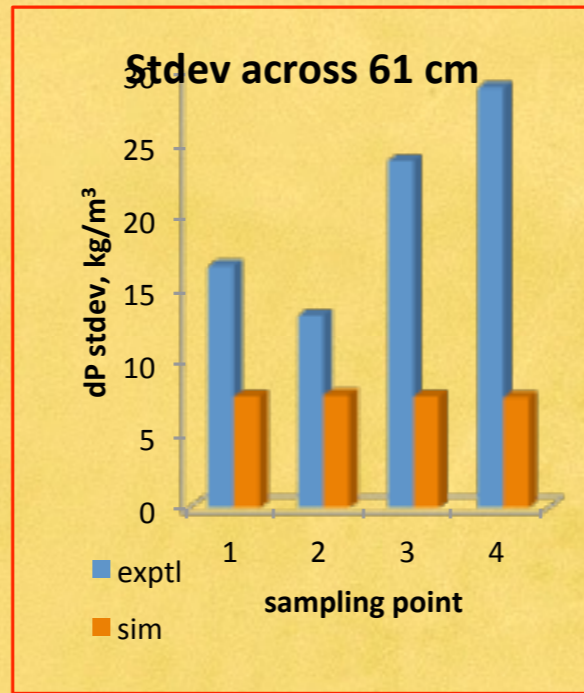
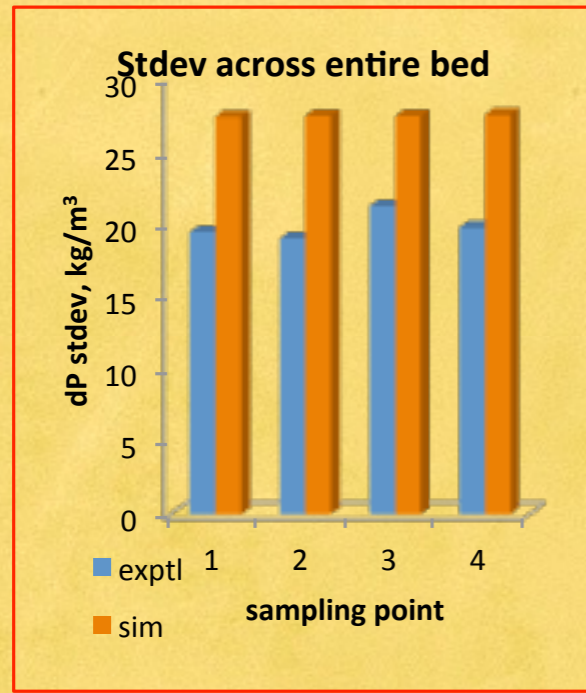
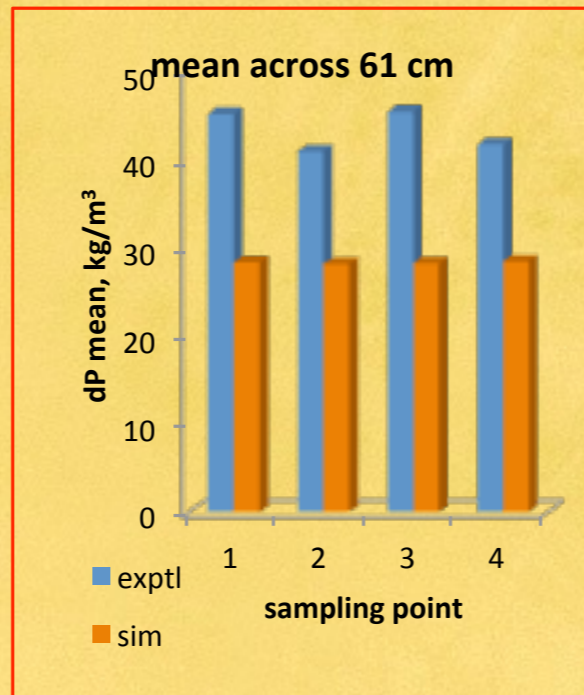
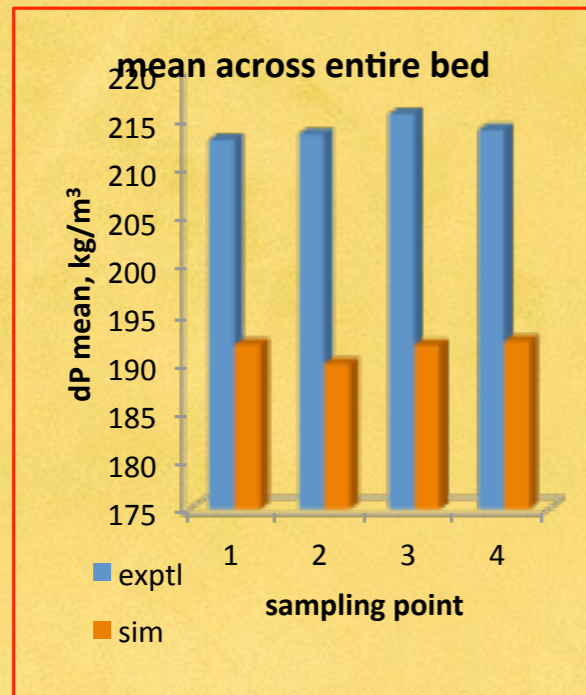
## Bubbling Fluidized Bed

- PSRI's 3-ft (92-cm) ID x 20-ft (6-m) tall BFB
- FCC Powder with different fines levels
- 3% and 12% fines
- Gas bypassing present in low fines case

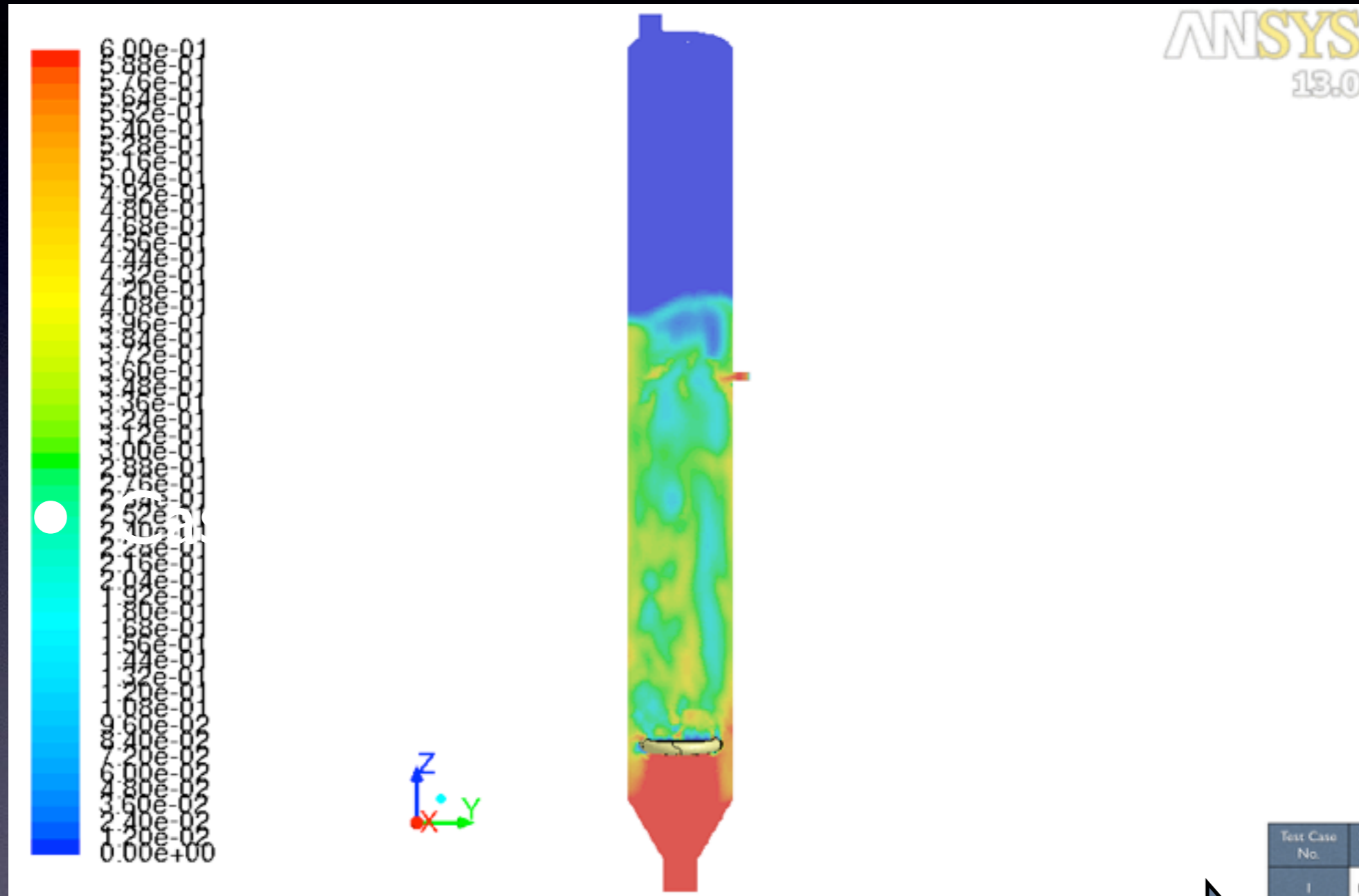


# BFB Modeling Results: Modeler BFB I

with PB for PSD

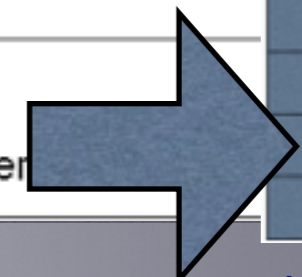


# BFB Modeling Results: Modeler BFB I with PB for PSD



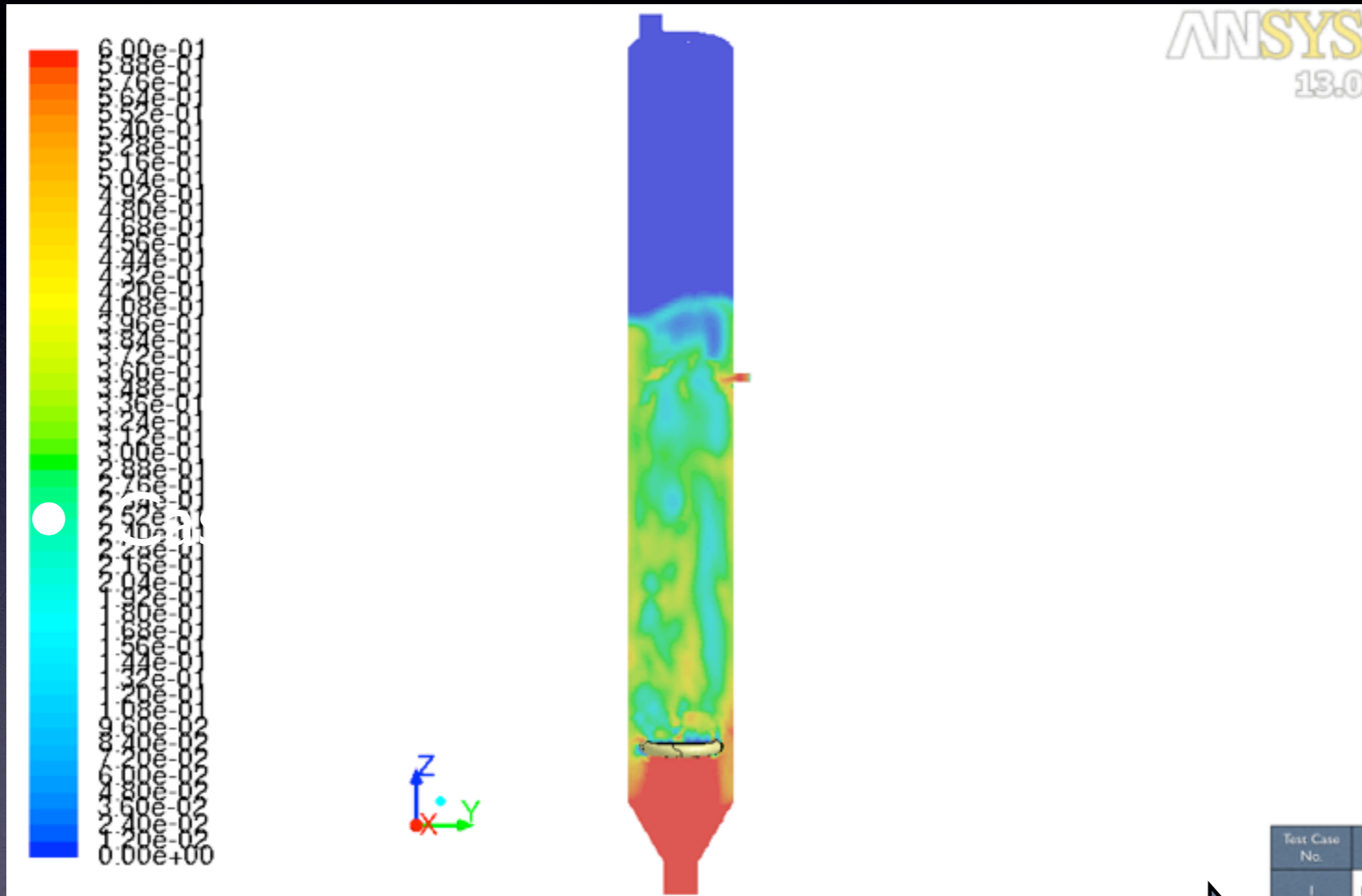
Contours of Volume fraction (coarse) (Time=5.6160e+01)  
ANSYS FLUENT 13.0 (3d, dp, pbns, euler)

Test Case No.	Static Bed Height	FCC Fines Content	Superficial Gas Velocity	Fluidization Behavior
1	12 ft (3.6 m)	3%	1 ft/sec (0.3 m/sec)	Gas Bypassing
2	4 ft (1.2 m)	3%	1 ft/sec (0.3 m/sec)	Uniform
3	8 ft (2.4 m)	3%	2 ft/sec (0.6 m/sec)	Gas Bypassing
4	8 ft (2.4 m)	12%	2 ft/sec (0.6 m/sec)	Uniform



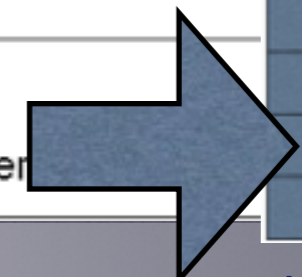
*Applying the Fundamentals*

# BFB Modeling Results: Modeler BFB I with PB for PSD



Contours of Volume fraction (coarse) (Time=5.6160e+01)  
ANSYS FLUENT 13.0 (3d, dp, pbns, euler)

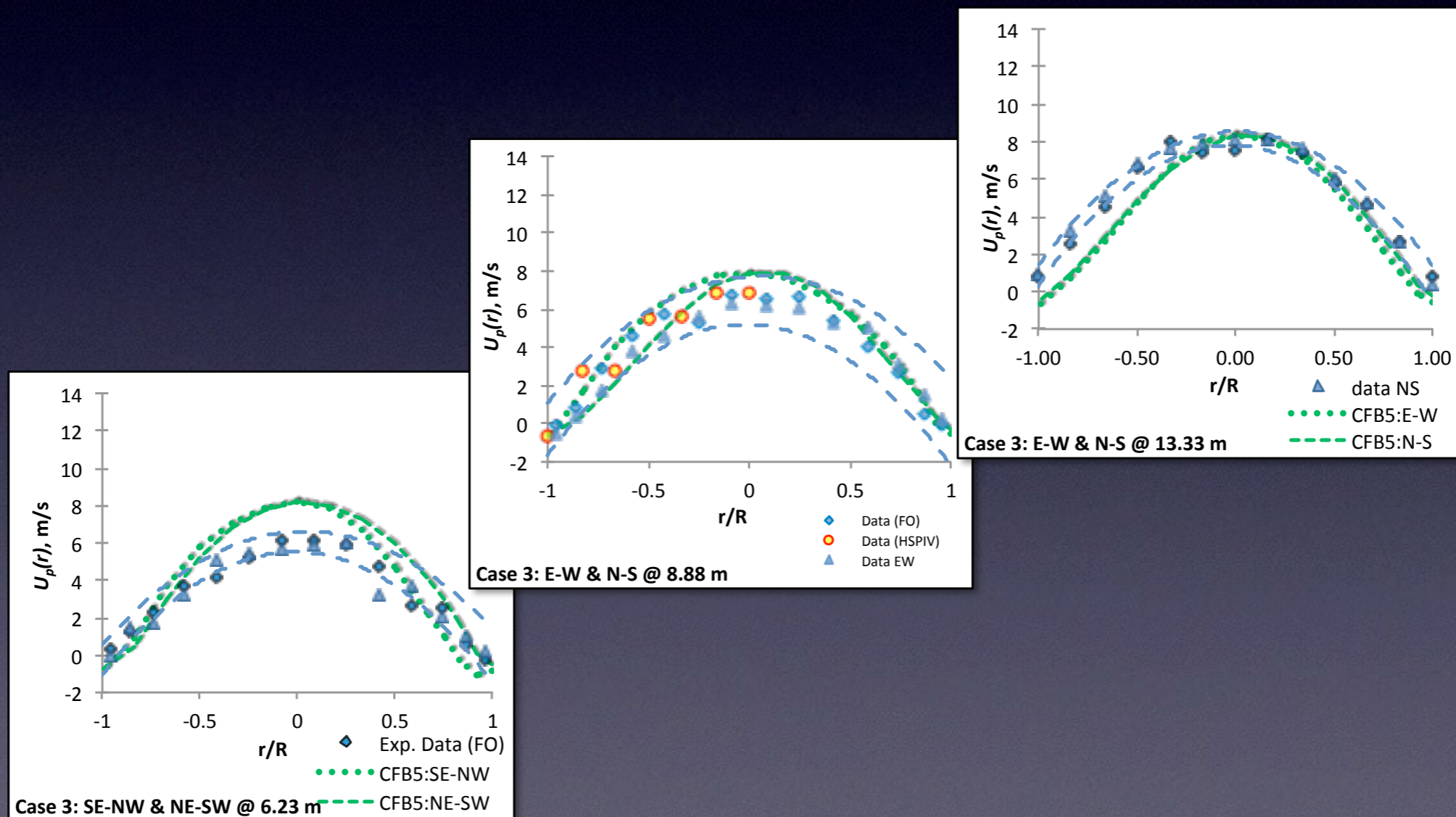
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*Applying the Fundamentals*

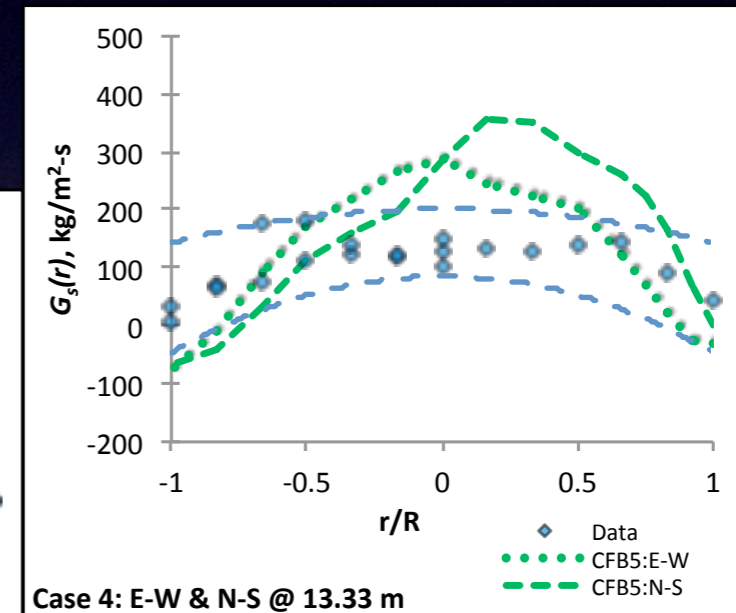
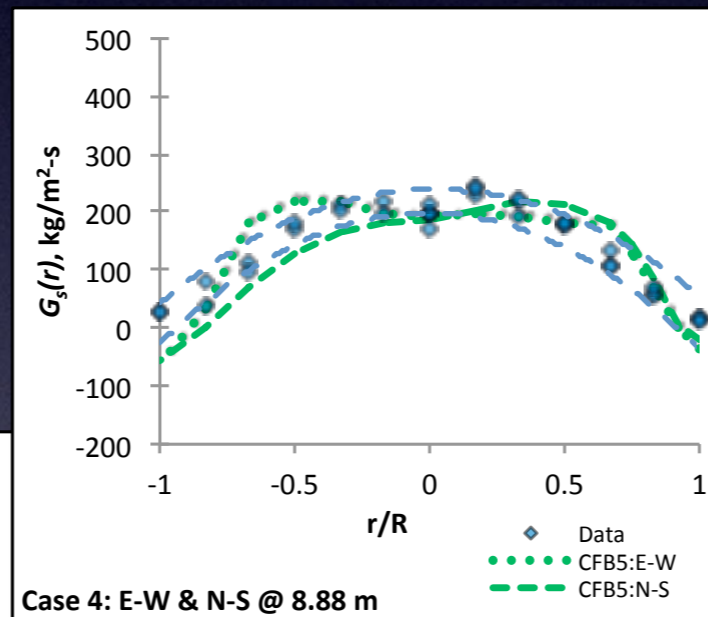
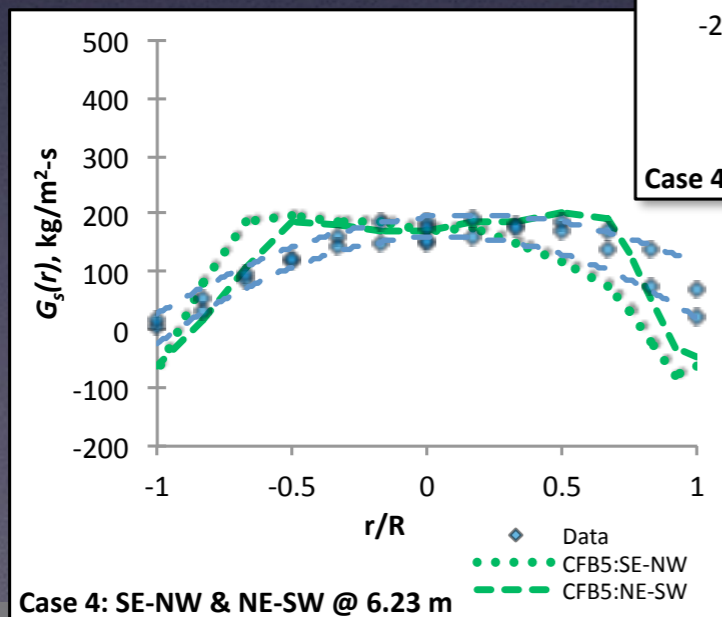
# CFB Modeling Results: Modeler CFB5

## Radial Profile: Case 3 $u_p(r)$ - HDPE



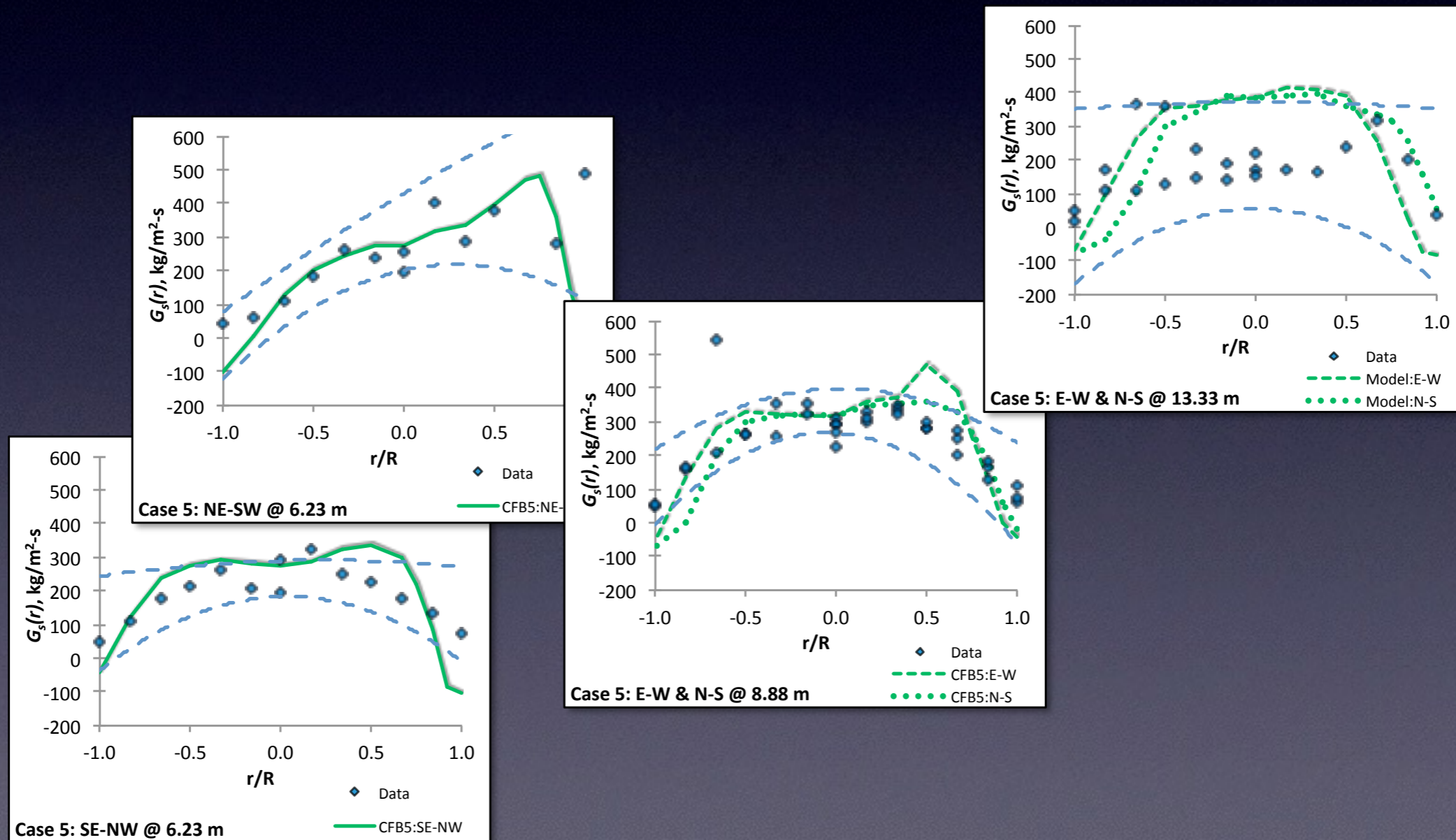
# CFB Modeling Results: Modeler CFB5

## Radial Profile: Case 4 $G_s(r)$ - HDPE



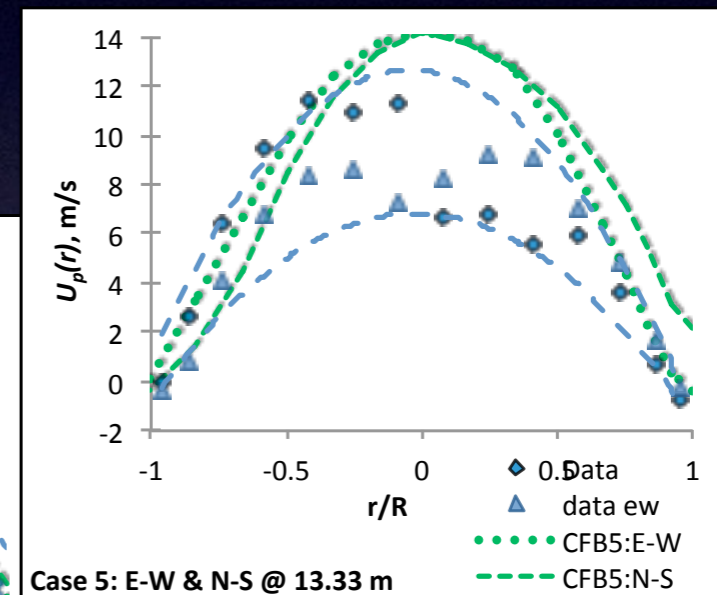
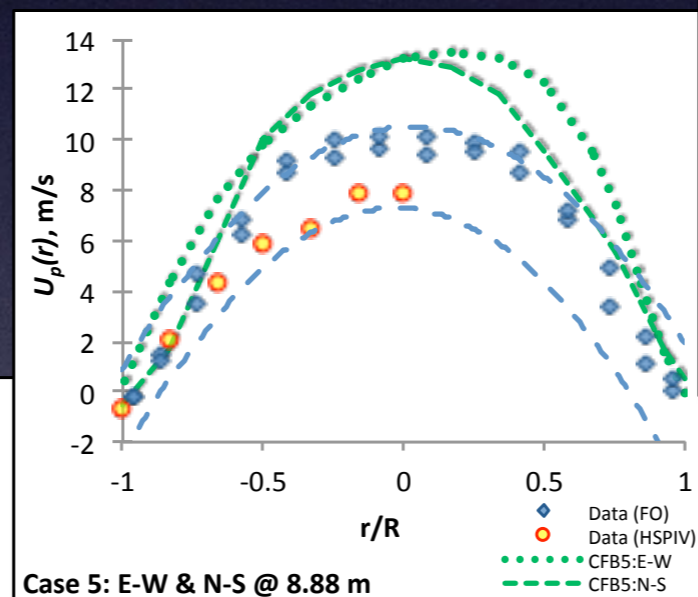
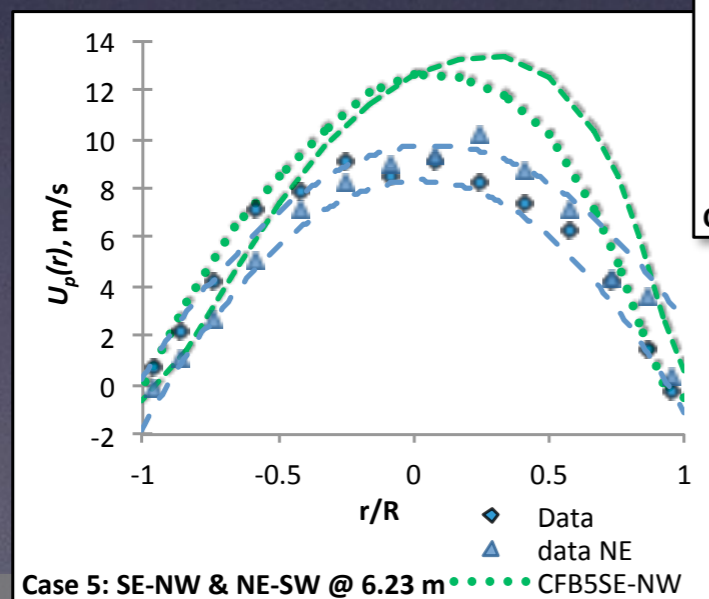
# CFB Modeling Results: Modeler CFB5

## Radial Profile: Case 5 $G_s(r)$ - HDPE



# CFB Modeling Results: Modeler CFB5

## Radial Profile: Case 5 $u_p(r)$ - HDPE





# PSRI Riser

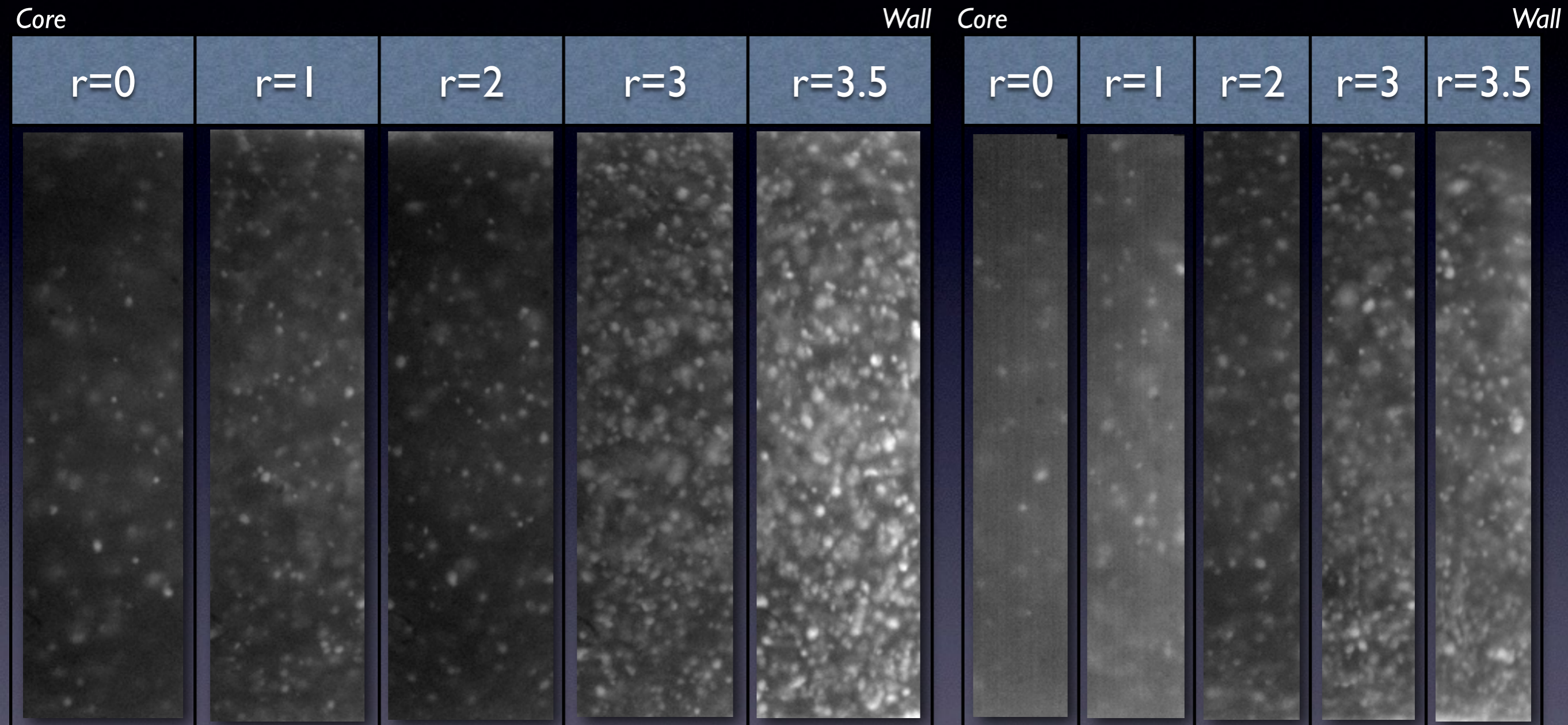
*PSRI 12" (30 cm) ID x  
60' (18 m) Tall Riser*

*Risers have been  
designed to provide  
symmetric profiles*

# Imaging the Core-Annulus Profile

30 ft/sec & 10 lb/ft<sup>2</sup>-sec  
9.1 m/sec & 50 kg/m<sup>2</sup>-sec

60 ft/sec & 80 lb/ft<sup>2</sup>-sec  
18.3 m/sec & 400 kg/m<sup>2</sup>-sec

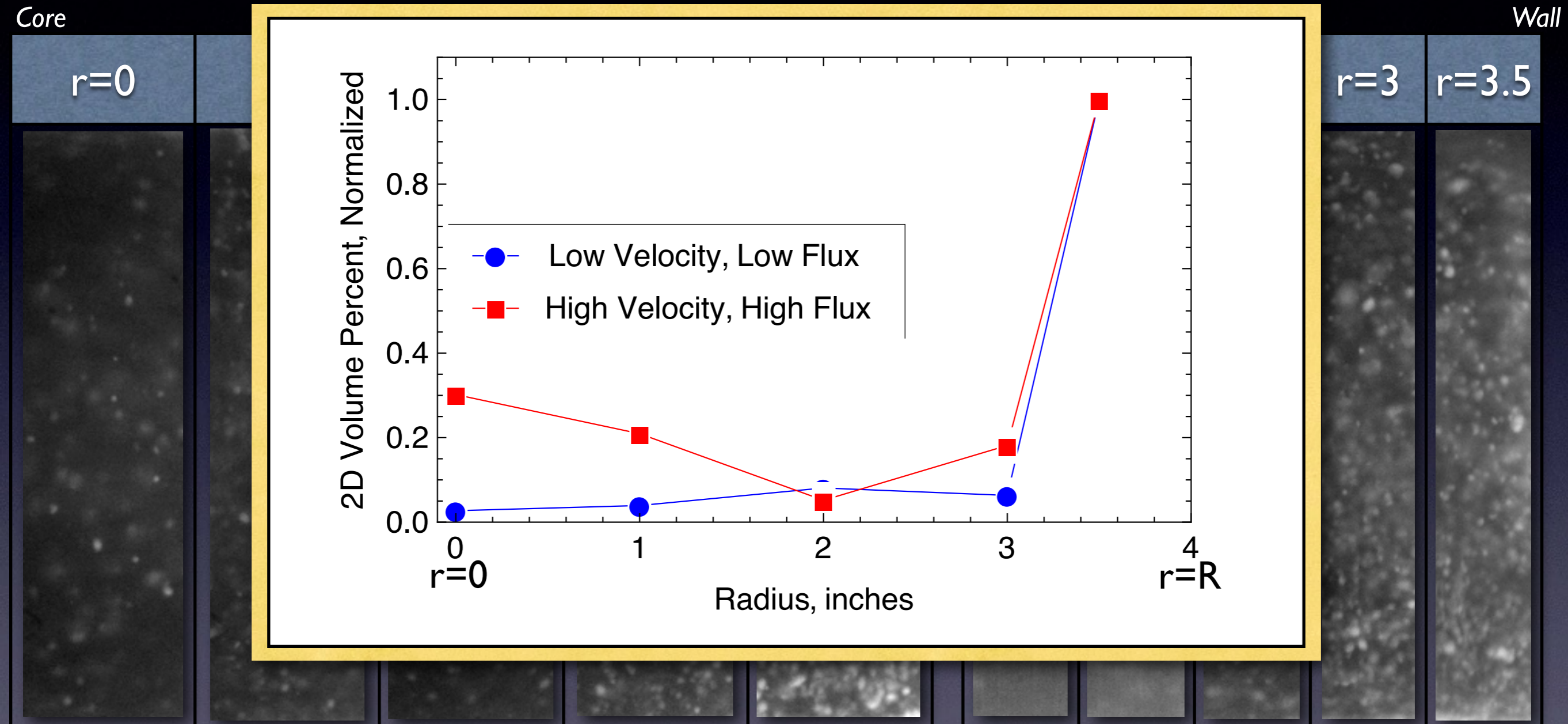


*FCC Catalyst in PSRI's 8-Inch (20-cm) Dia x 72-Foot (22-m) Tall Riser  
Slower particle velocities means we can use higher resolutions*

# Imaging the Core-Annulus Profile

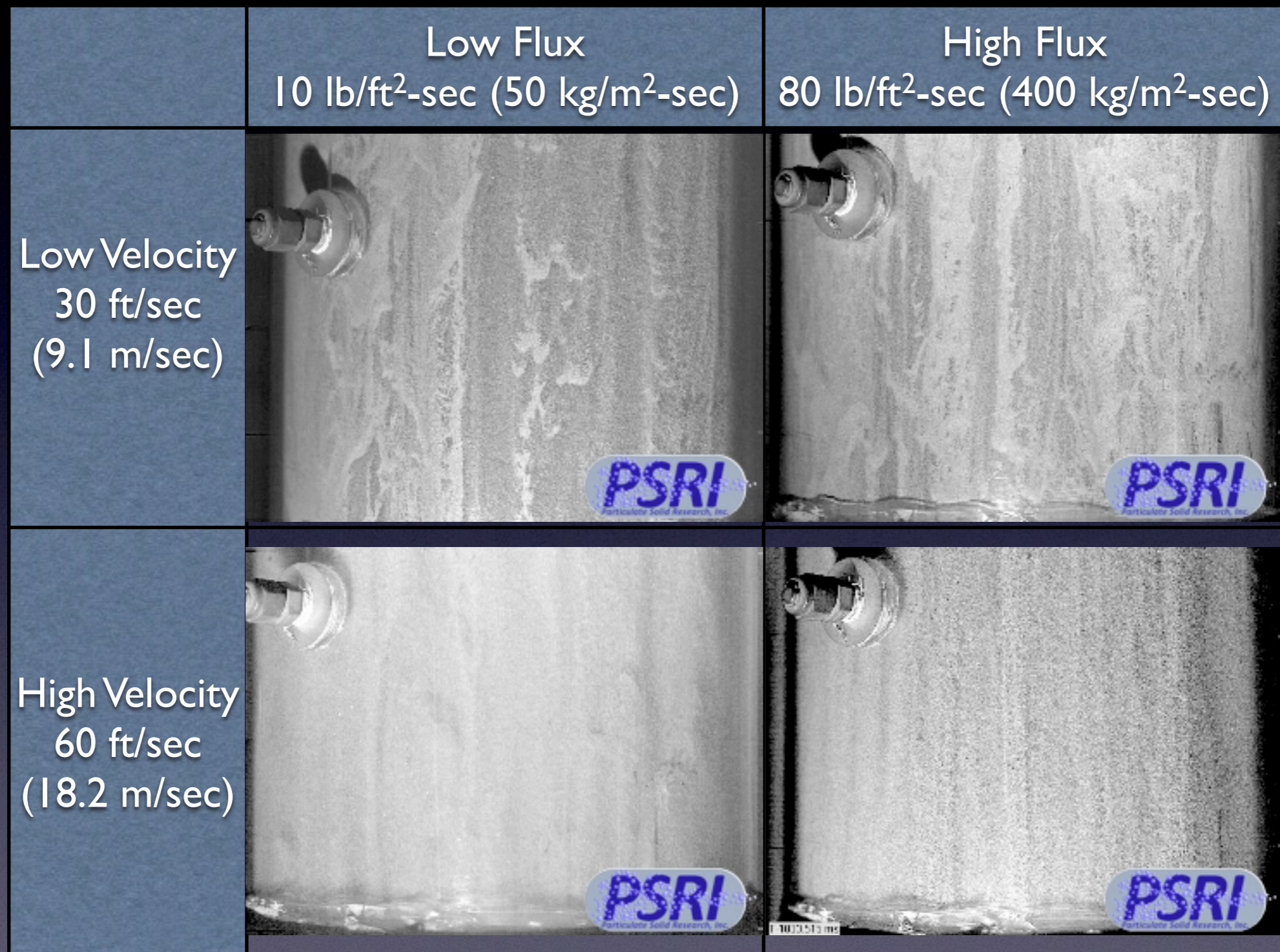
30 ft/sec & 10 lb/ft<sup>2</sup>-sec  
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60 ft/sec & 80 lb/ft<sup>2</sup>-sec  
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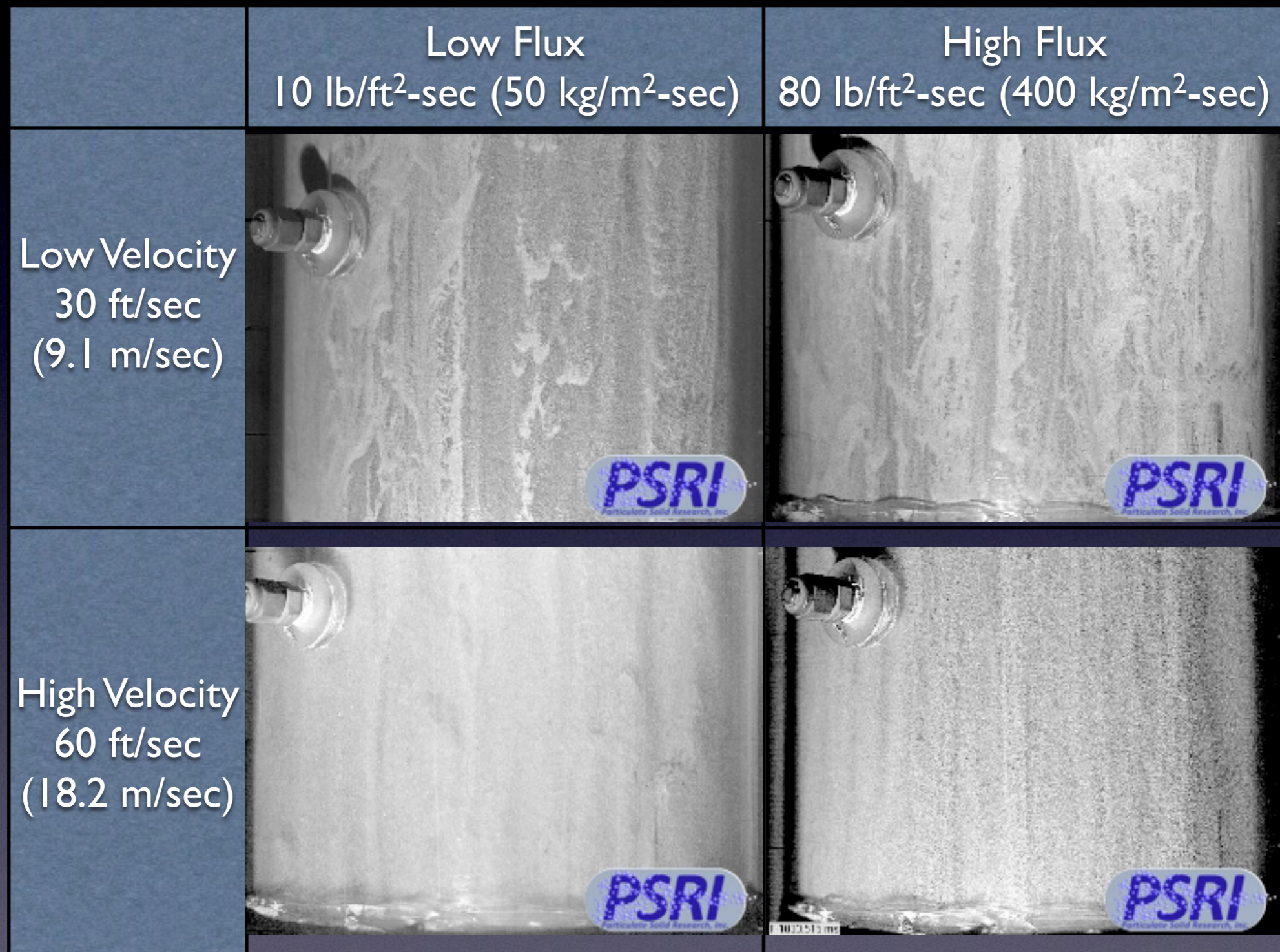
FCC Catalyst in PSRI's 8-Inch (20-cm) Dia x 72-Foot (22-m) Tall Riser  
Slower particle velocities means we can use higher resolutions

# Not Just Core Annulus Profile



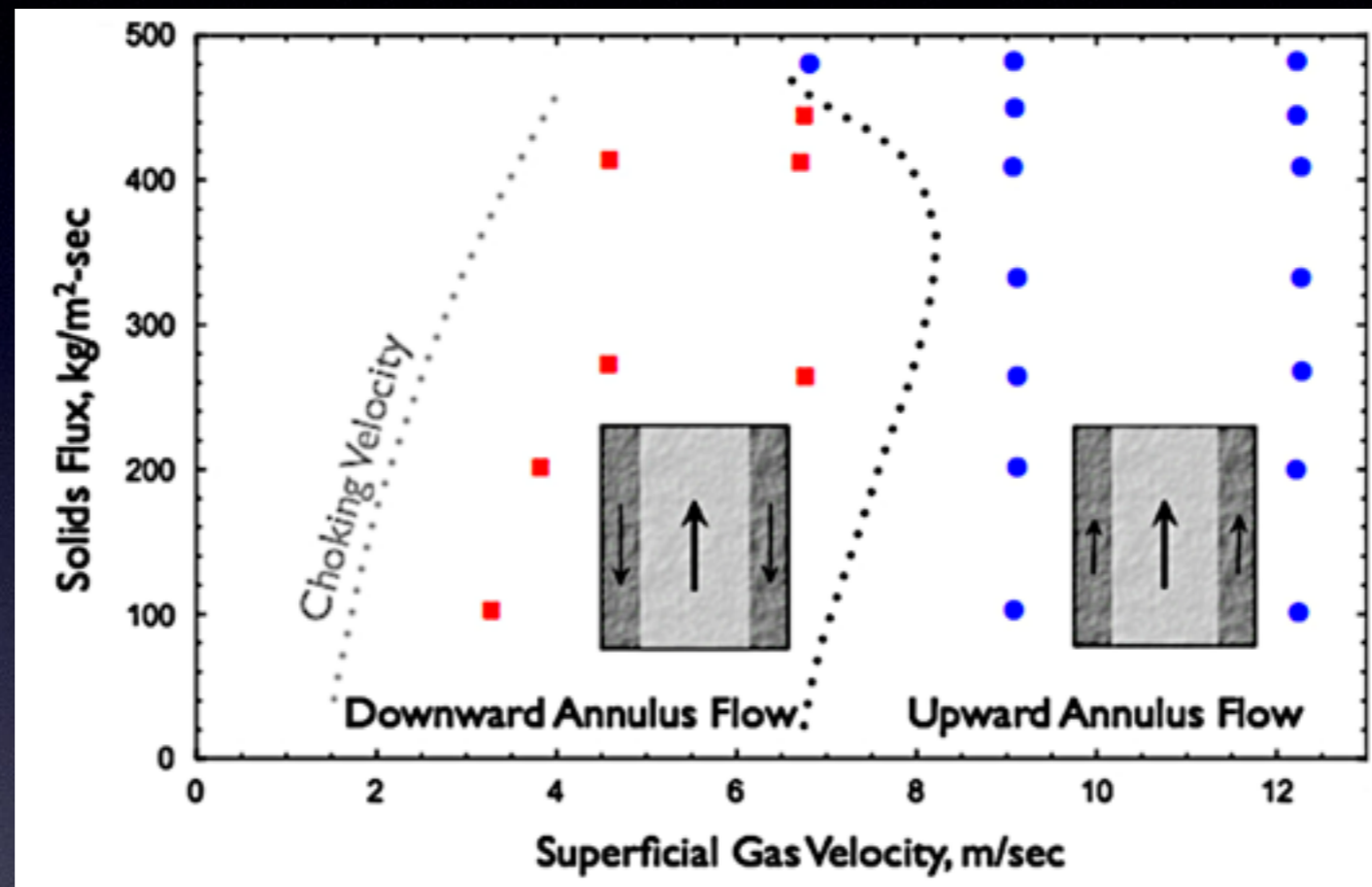
PSRI's 8-inch (20-cm) dia x 72-feet (22-m) tall riser with FCC powder

# Not Just Core Annulus Profile



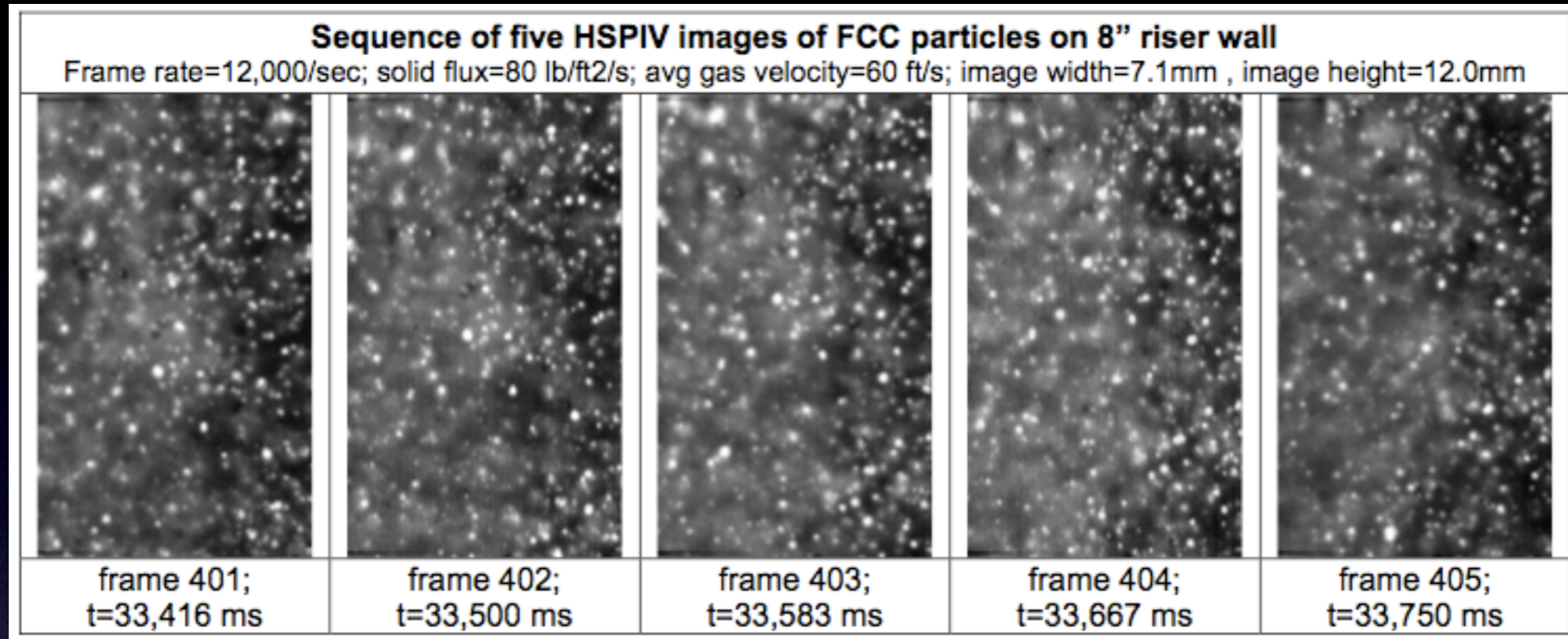
PSRI's 8-inch (20-cm) dia x 72-feet (22-m) tall riser with FCC powder

# Level of Down Flow is Important

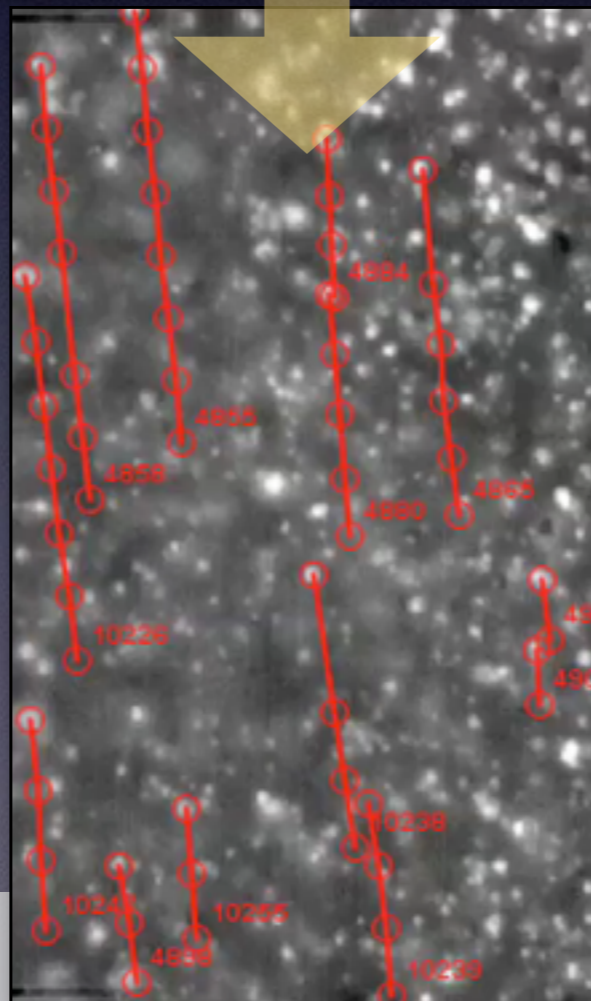


- Degree of backmixing depends if we have up flow or down flow at the wall
- For FCC, coking is an issue with backmixing

# PIV Measurements: NETL's HSPIV



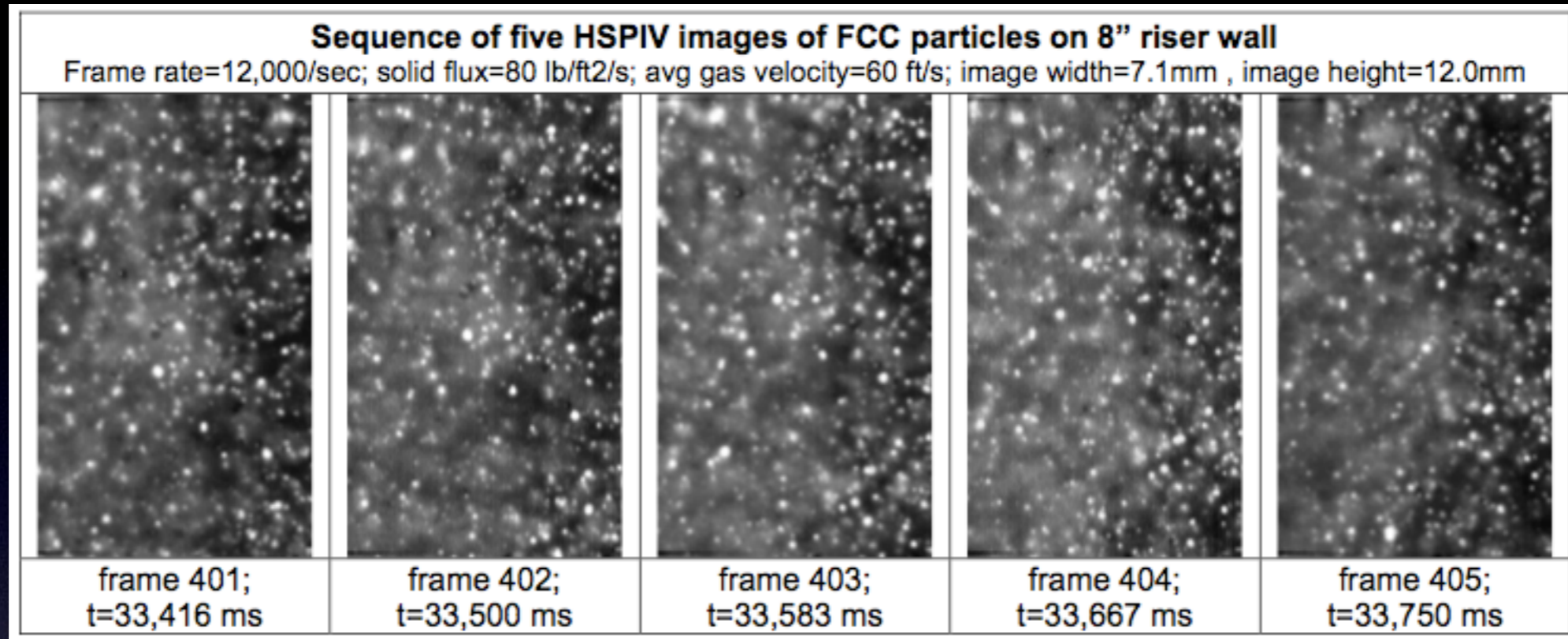
Tracking is based on at least 5 subsequent frames



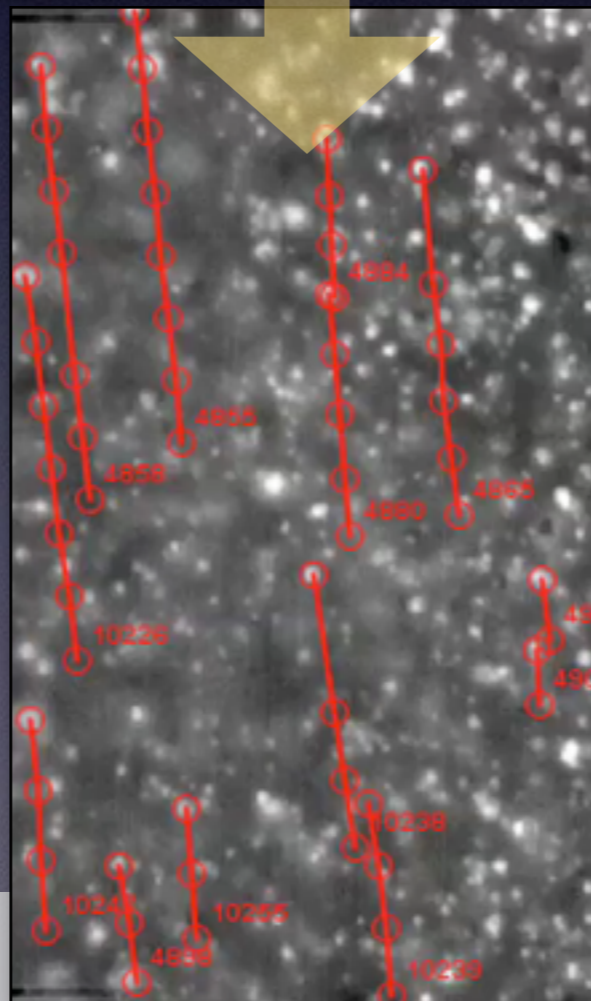
PSRI's 8-inch (20-cm) dia x 72-feet (22-m) tall riser with FCC powder

F. Shaffer, B. Gopalan, R.W. Breault, R. Cocco, S.B.R. Karri, R. Hays, et al., High speed imaging of particle flow fields in CFB risers, (2013) 1-14.

# PIV Measurements: NETL's HSPIV



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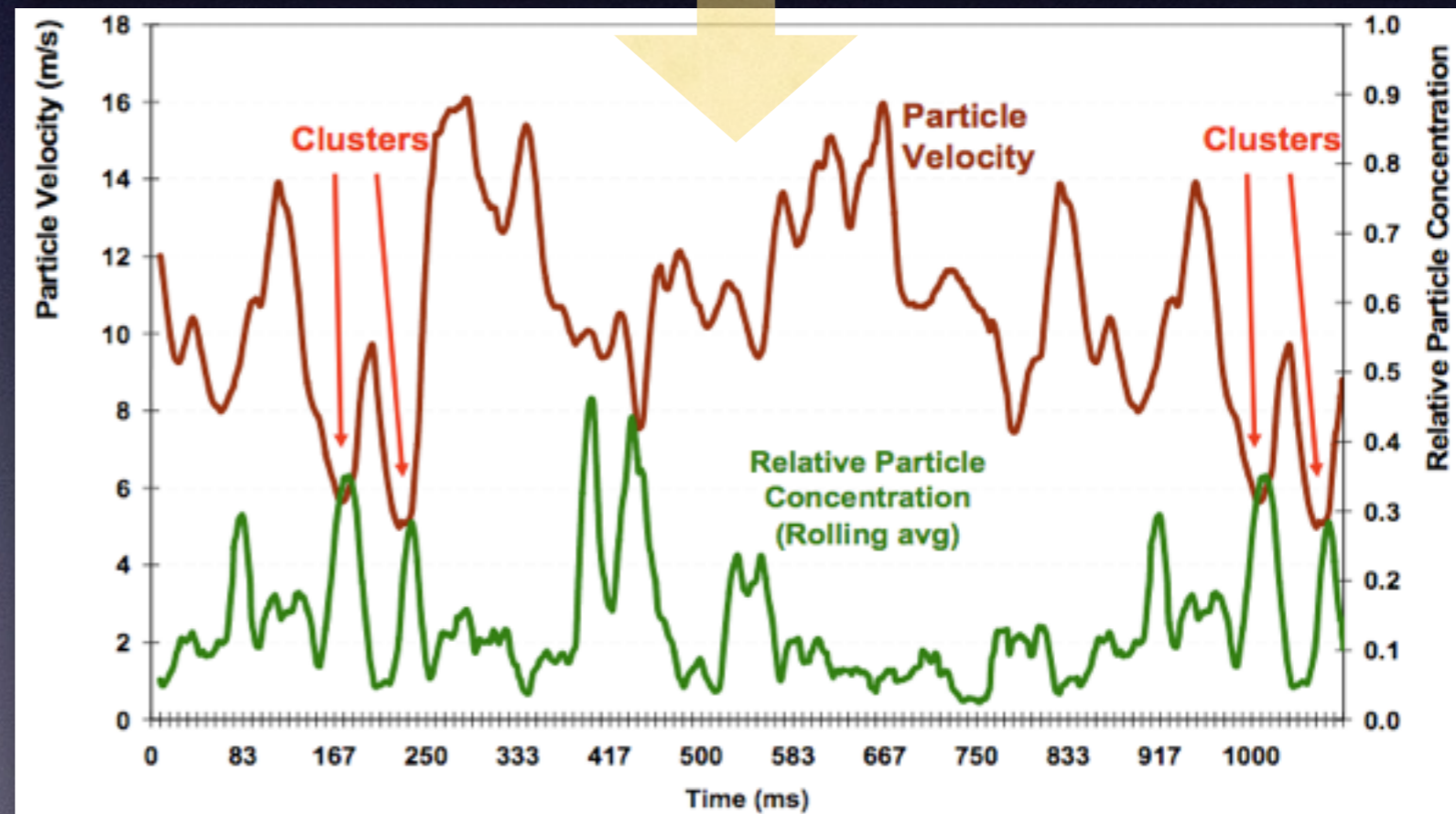
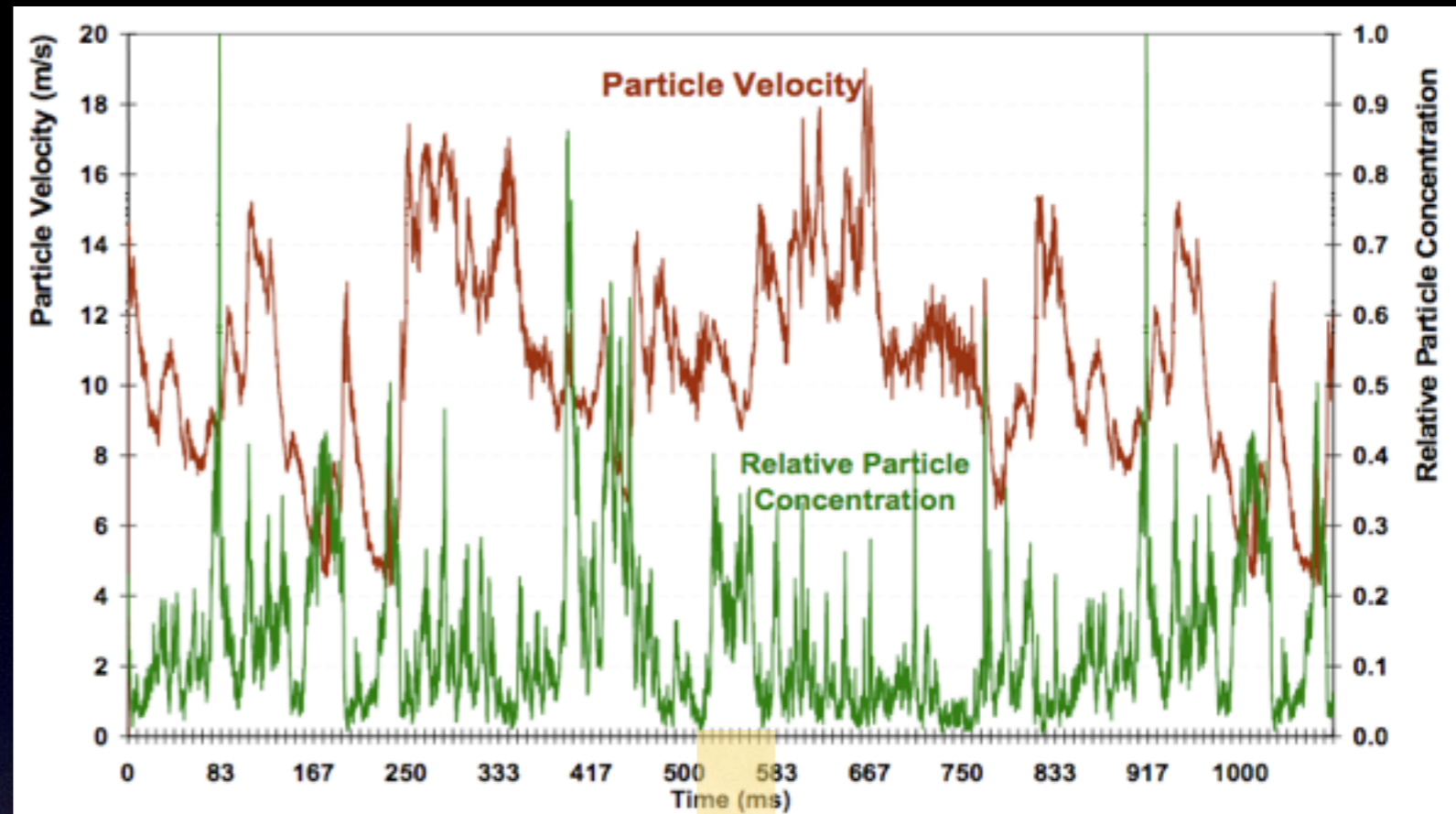
PSRI's 8-inch (20-cm) dia x 72-feet (22-m) tall riser with FCC powder

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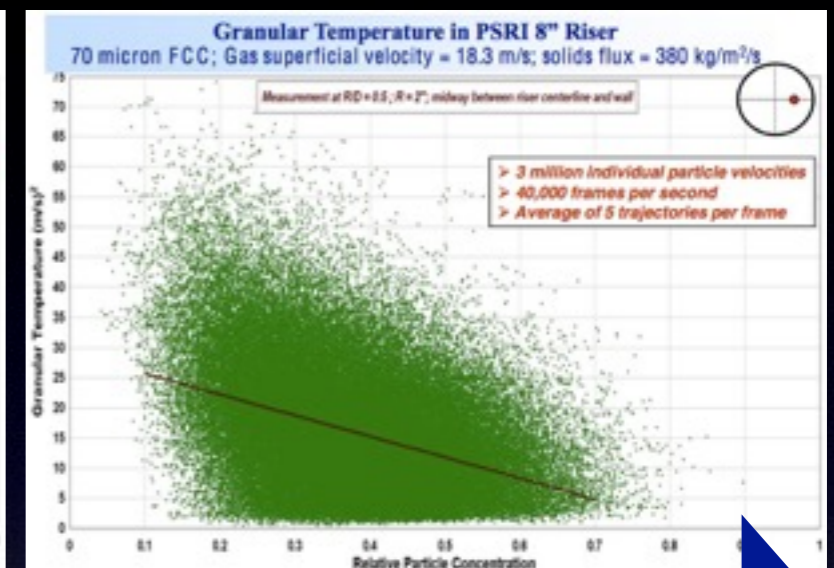
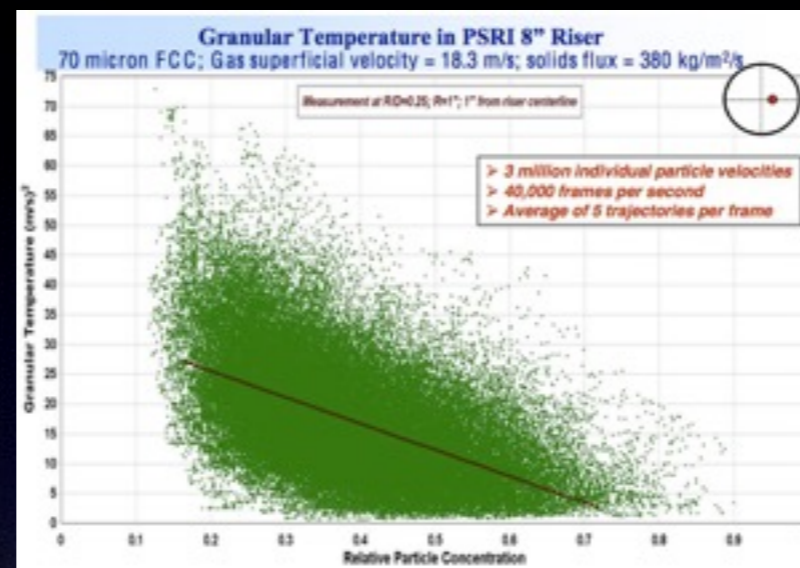
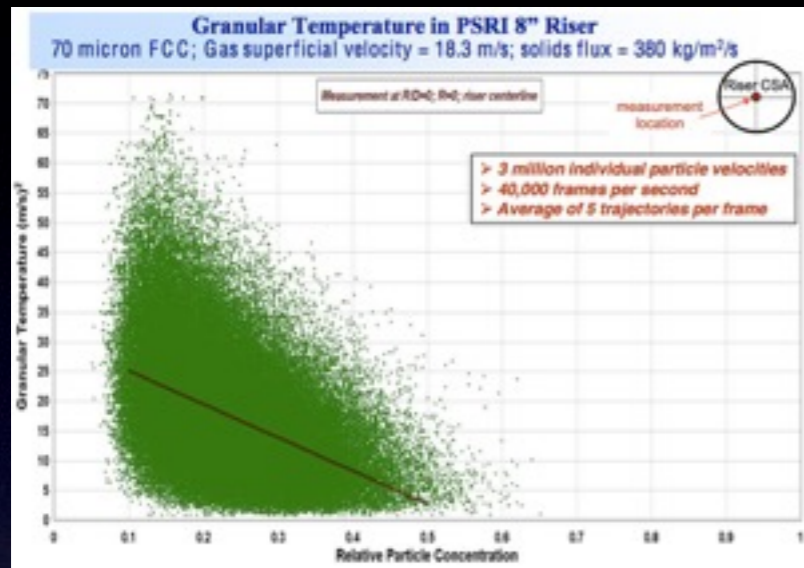
# Cluster Velocities

- Clusters determined by lower velocities AND higher solids concentrations
- Cluster Velocities measured at 12 to 24 ft/sec (3.7 to 7.3 m/sec)
- 50% lower than the mean particle velocity

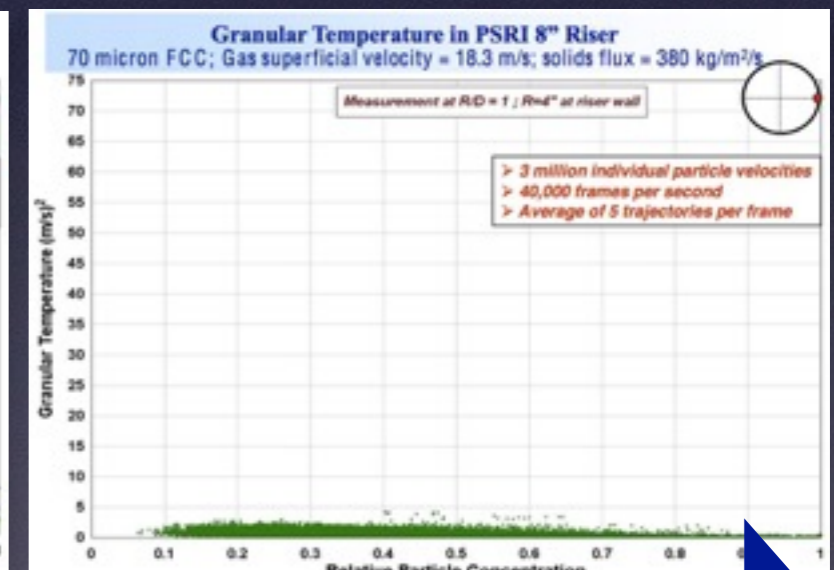
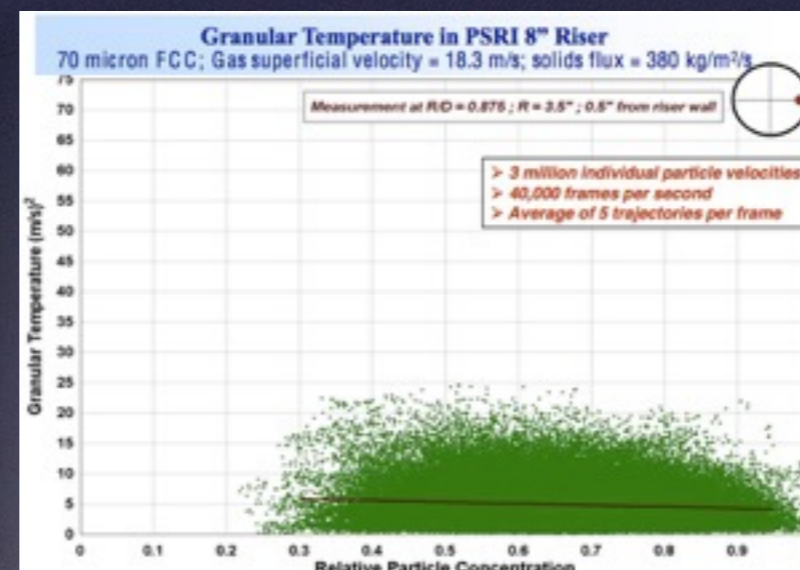
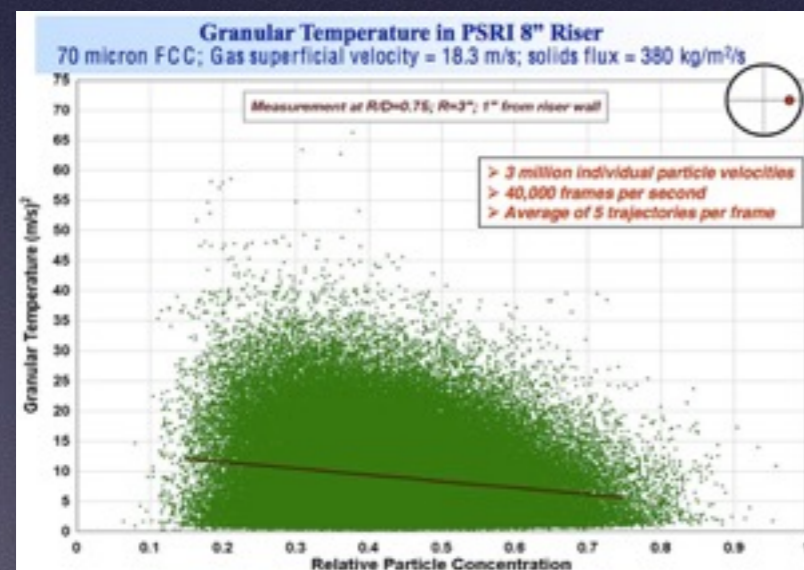


# Granular Temperature

Measuring Granular Temperature in a 0.2-m Diameter x 22-m Tall Riser with FCC Catalyst Powder

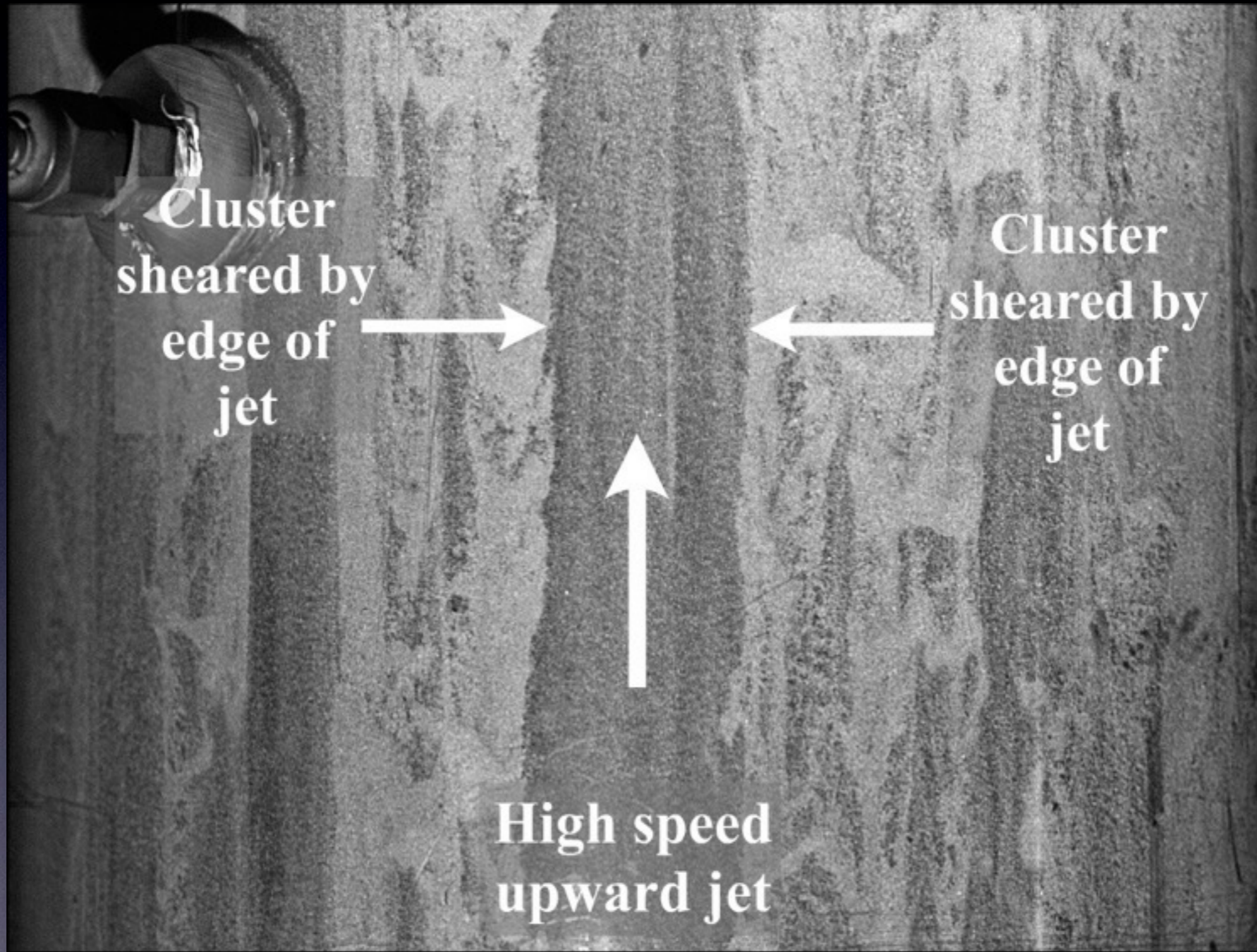


Core



Wall

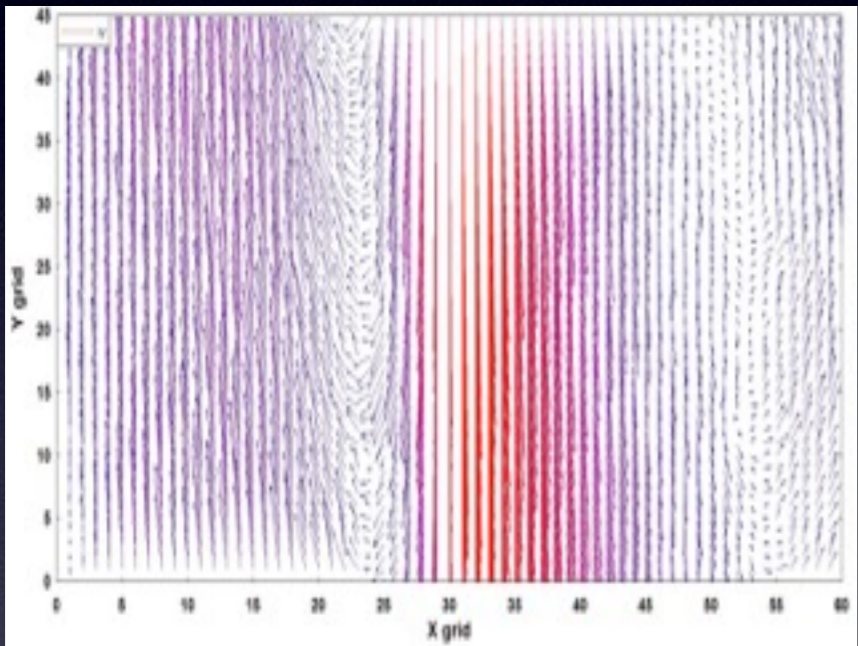
# Clusters and Streamers



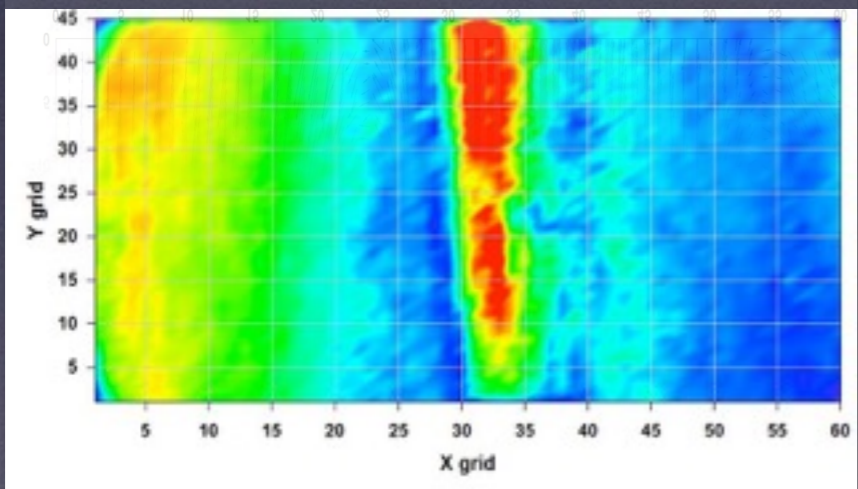
# Quantifying Riser Hydrodynamics



*Particle Tracking of In-Situ Images*



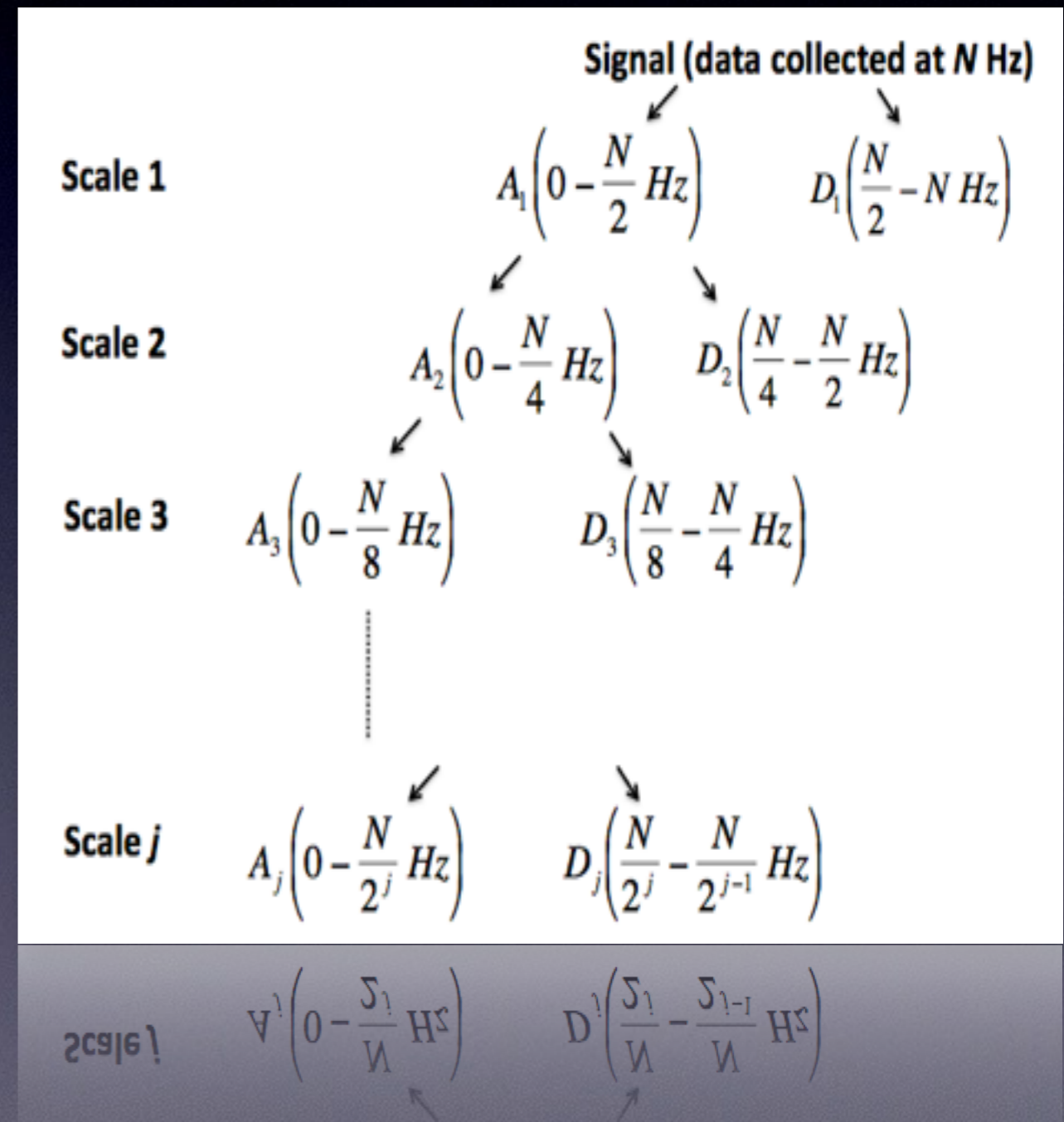
*Velocity Vector Map Derived from In-Situ Images*



*Contour Plot of Fluctuating Velocity (RMS)*

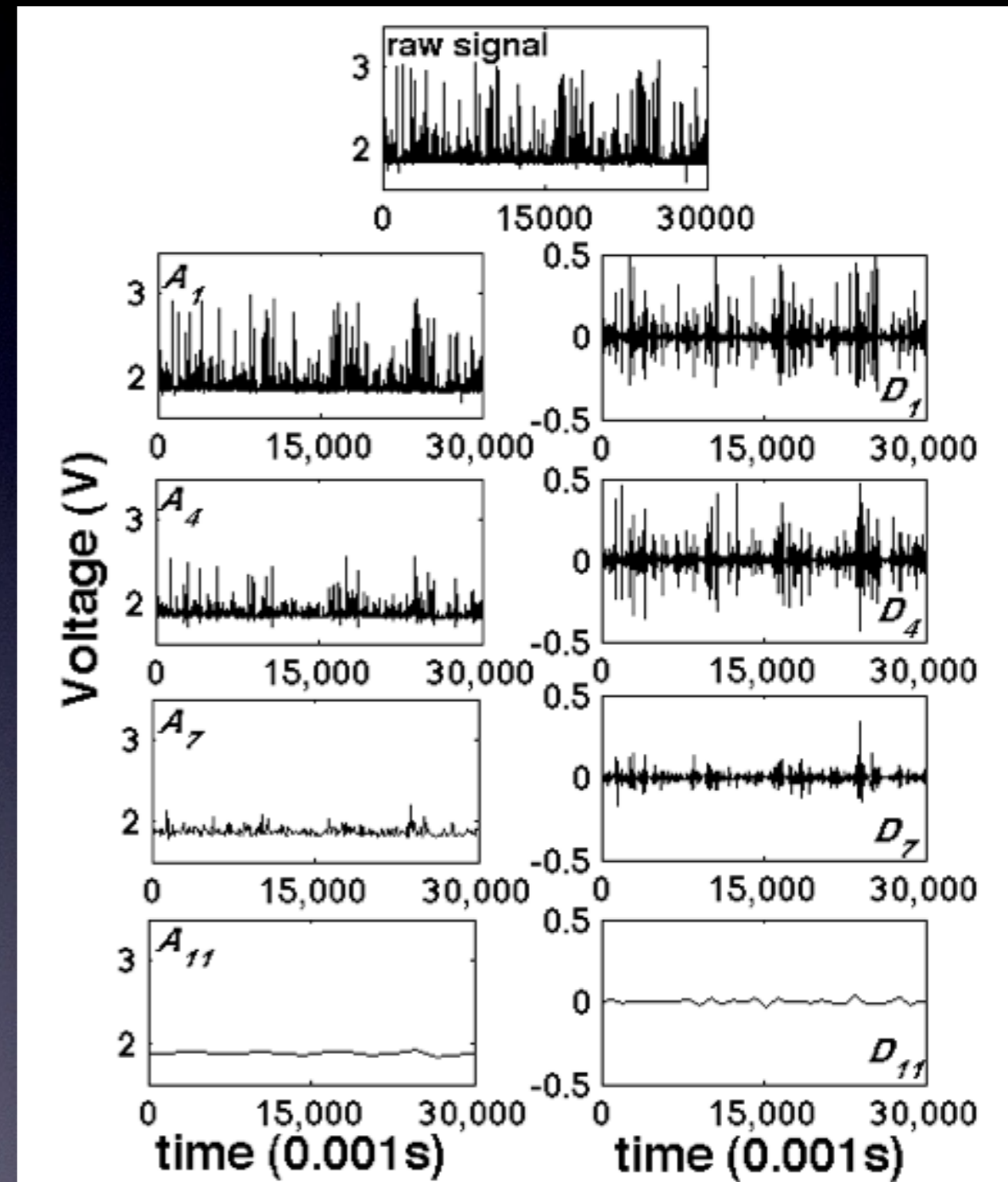
# Wavelet Decomposition

- Wavelet decomposition provides a means of extracting different frequency ranges of data signals by repeatedly breaking down the signal into higher-frequency details (D) and lower-frequency approximations (A)
- Both Matlab and Mathematica have wavelet decomposition tools



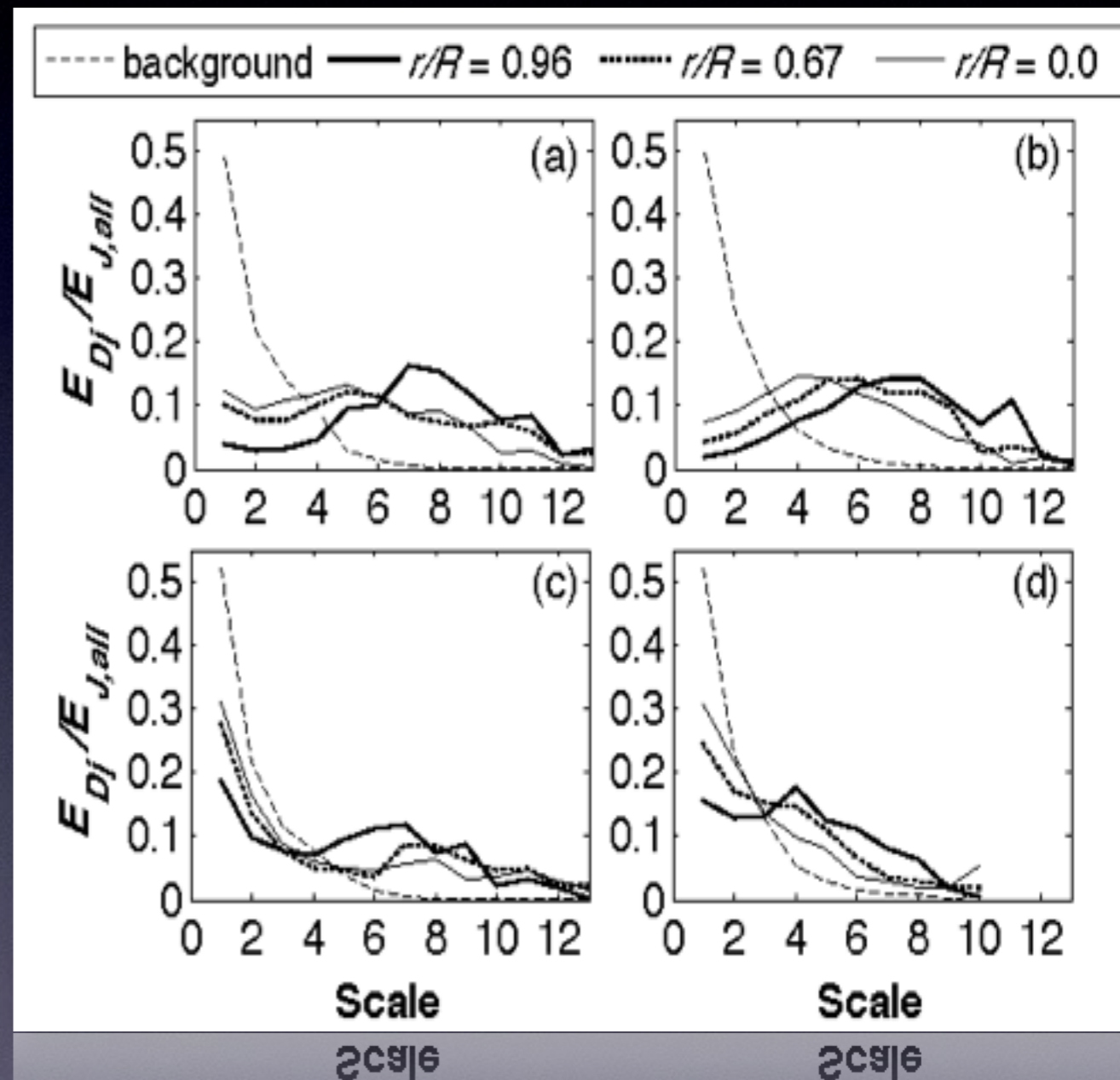
# Wavelet Decomposition

- Wavelet decomposition can be used with acoustic, pressure or fiber optic data in risers and fluidized beds
- For this riser study, fiber optic data were used.
- By normalizing the energies of the high-frequency details (D), the micro, meso and macro scale events can be discerned
  - Periodicity is not a requirement for wavelet decomposition



# Application of Wavelet Decomposition to Riser Hydrodynamics

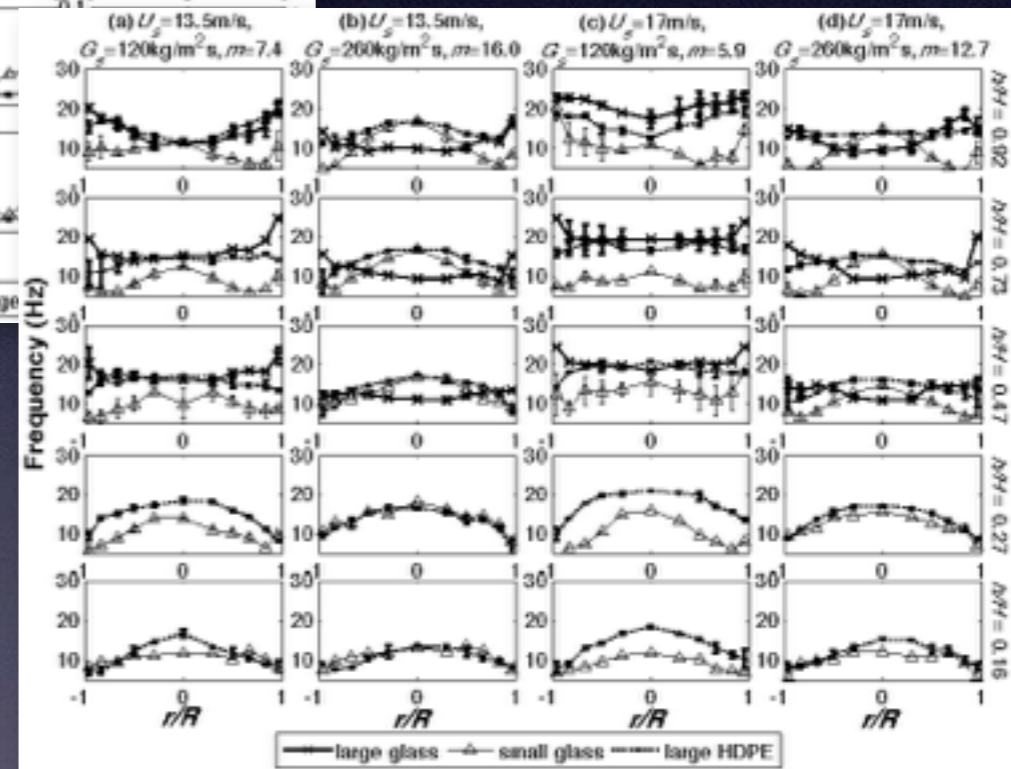
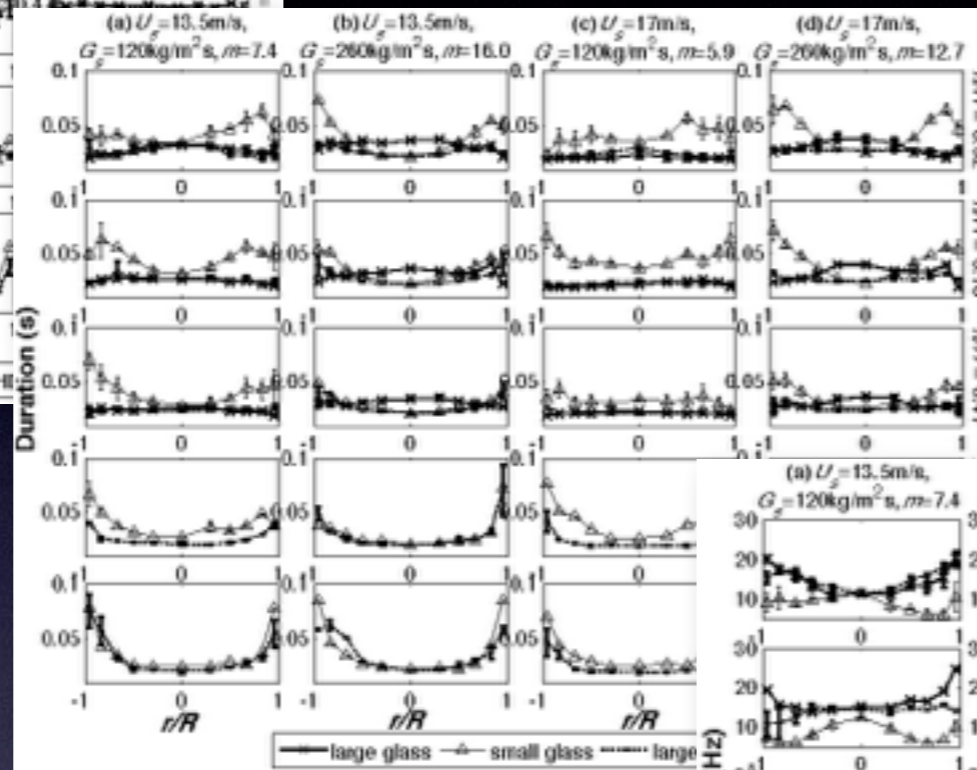
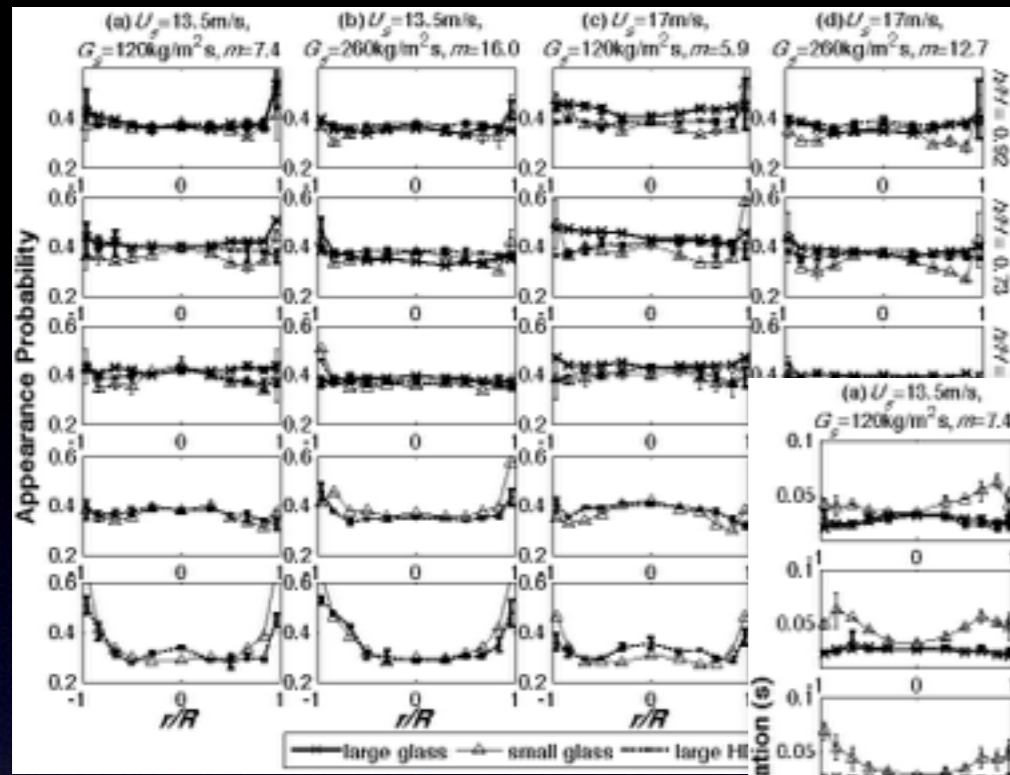
- Unlike previous work where the demarcation between scales was arbitrary, here demarcation was based on the resulting features
  - Micro-scale is 0 to 5 scale
  - Meso-scale is 5 to 11 scale
    - Clusters
    - Macro is  $> 11$  scale
- Cluster can now be tracked according to appearance, duration and frequency



T. Yang, L. Leu, Multiresolution analysis on identification and dynamics of clusters in a circulating fluidized bed, *AIChE Journal*. 55 (2009).

# Clusters in Riser

- Cluster appearance probability is only dependent on riser position



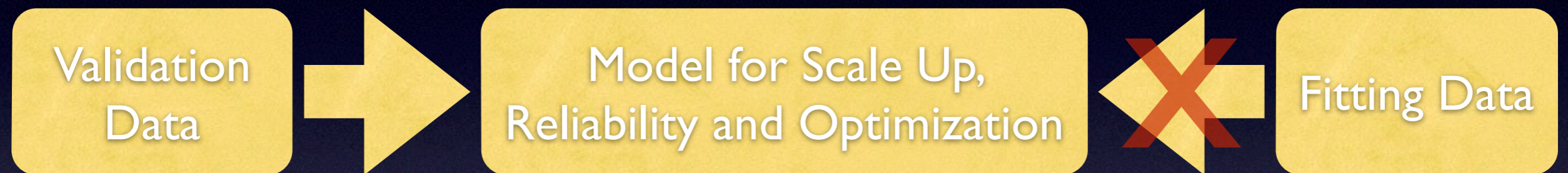
- Cluster duration and frequency are dependent on operating conditions and materials as well

*The role of clusters is complex and dependent on particle size, density, coefficient of restitution (elasticity), friction and shape*

J.W. Chew, R. Hays, J.G. Findlay, T.M. Knowlton, S.B.R. Karri, R.A. Cocco, et al., Cluster characteristics of Geldart group B particles in a pilot-scale CFB riser. II. Polydisperse systems, Chemical Engineering Science. 68 (2012) 82–93.  
 J.W. Chew, R. Hays, J.G. Findlay, T.M. Knowlton, S.B.R. Karri, R.A. Cocco, et al., Cluster characteristics of Geldart Group B particles in a pilot-scale CFB riser. I. Monodisperse systems, Chemical Engineering Science. 68 (2012) 72–81.  
 J.W. Chew, D.M. Parker, R.A. Cocco, C.M. Hrenya, Cluster characteristics of continuous size distributions and binary mixtures of Group B particles in dilute riser flow, Chemical Engineering Journal. 178 (2011) 348–358.



# Macro-scale Experiments are Cost Limited



- For model development, this work is practical. However, it is too expensive and time consuming for “fitting”

# The Multi-scale Validation Paradox

Fundamentals

Model Fitting

Model Development

*Micro-scale*

1 to 100's Particles



$10^{-6}$  to  $10^{-4}$  m

Experiments  
are cheap

Simulations  
are cheap

Analysis are  
expensive

*Meso-scale*

Millions to Billions  
of Particles



$10^{-2}$  to  $10^{-1}$  m

Experiments are  
inexpensive

Simulations  
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Analysis are  
inexpensive

*Macro-scale*

Trillions of  
Particles



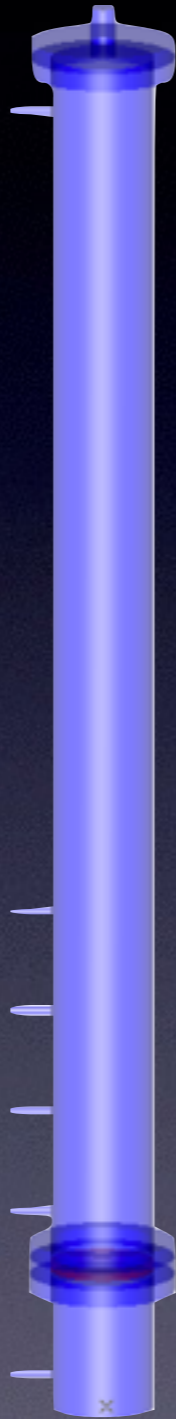
$10^{-1}$  to  $10^2$  m

Experiments  
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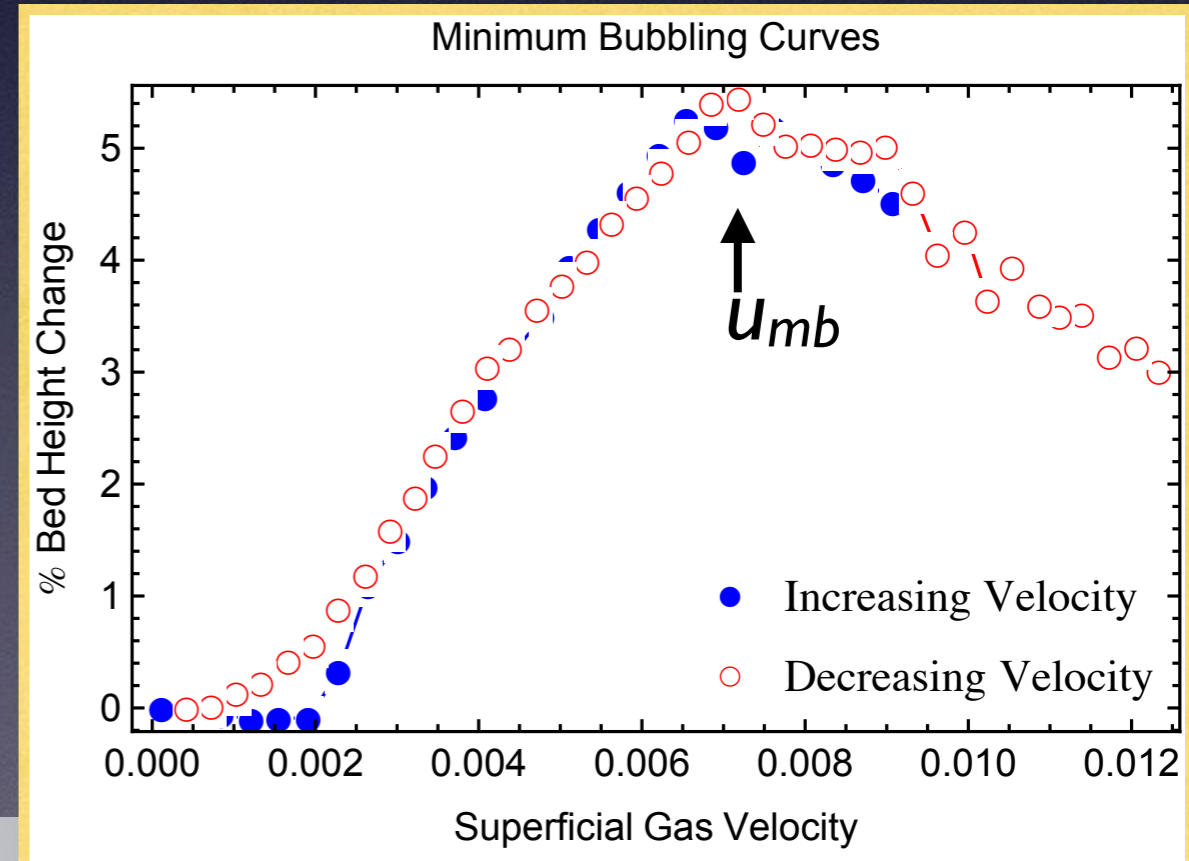
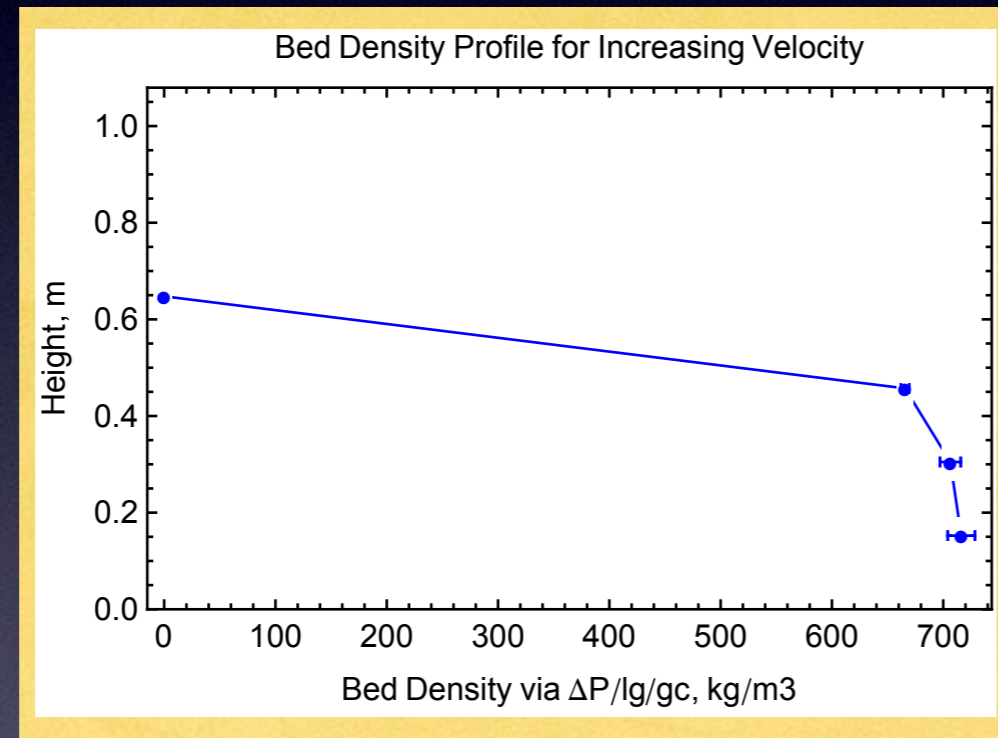
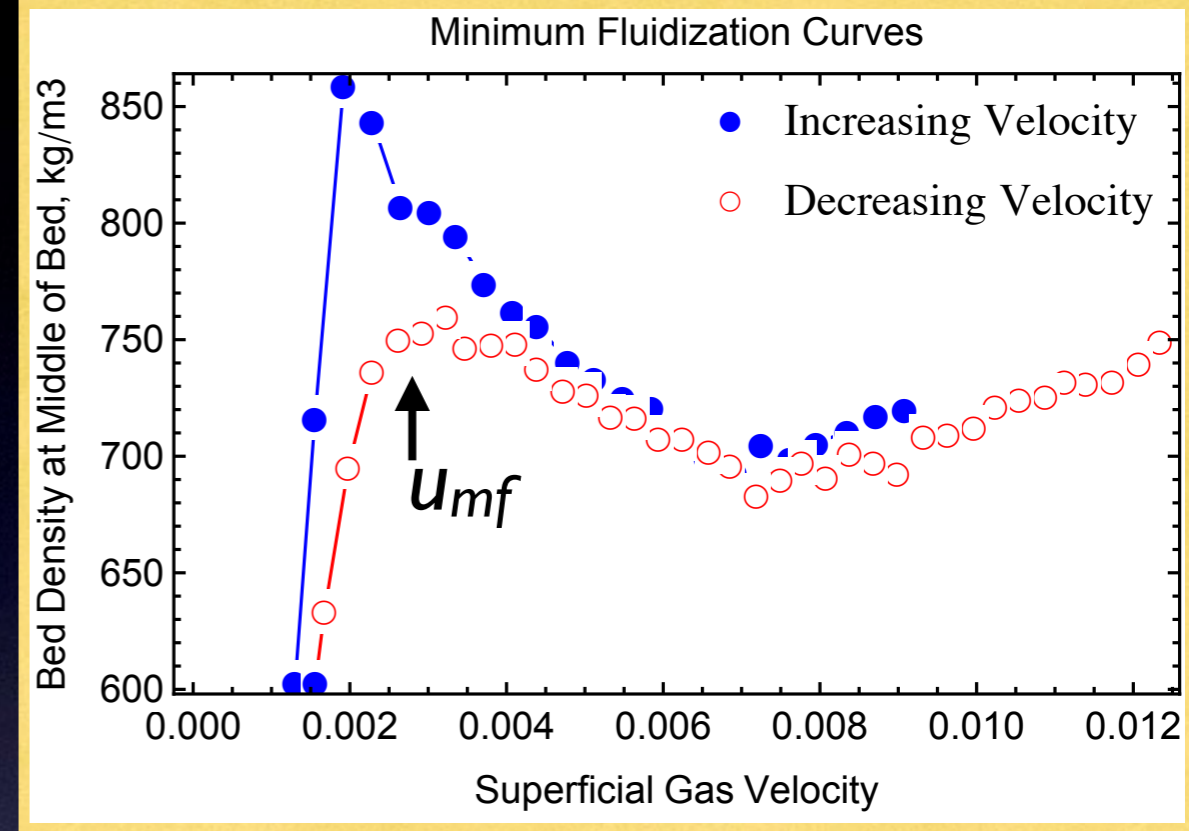
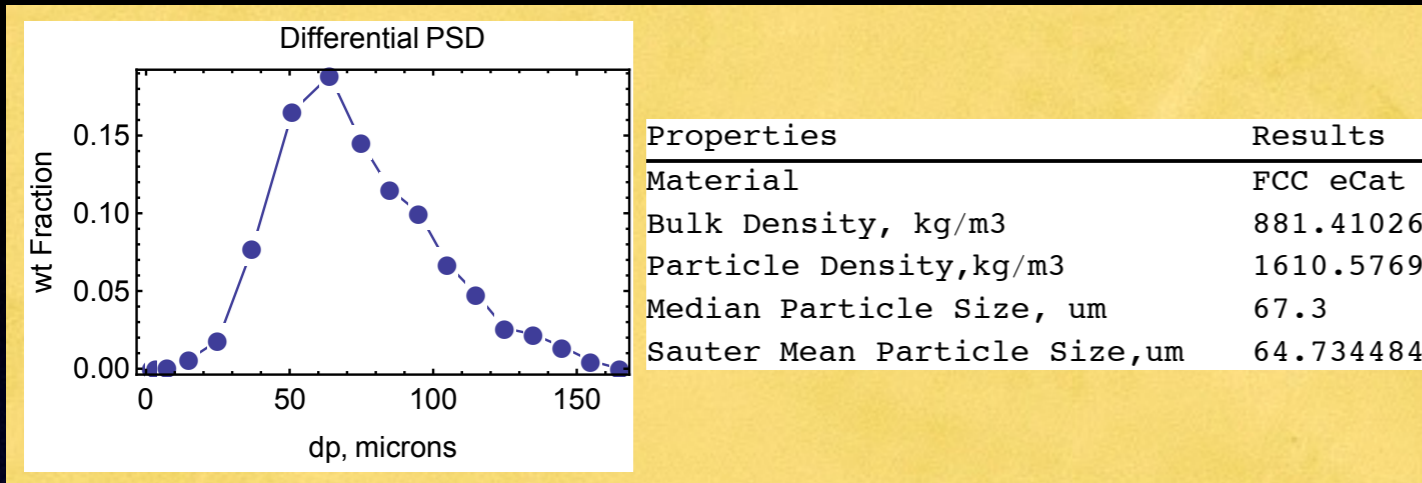
Analysis are  
cheap

# PSRI Modeling Methodology



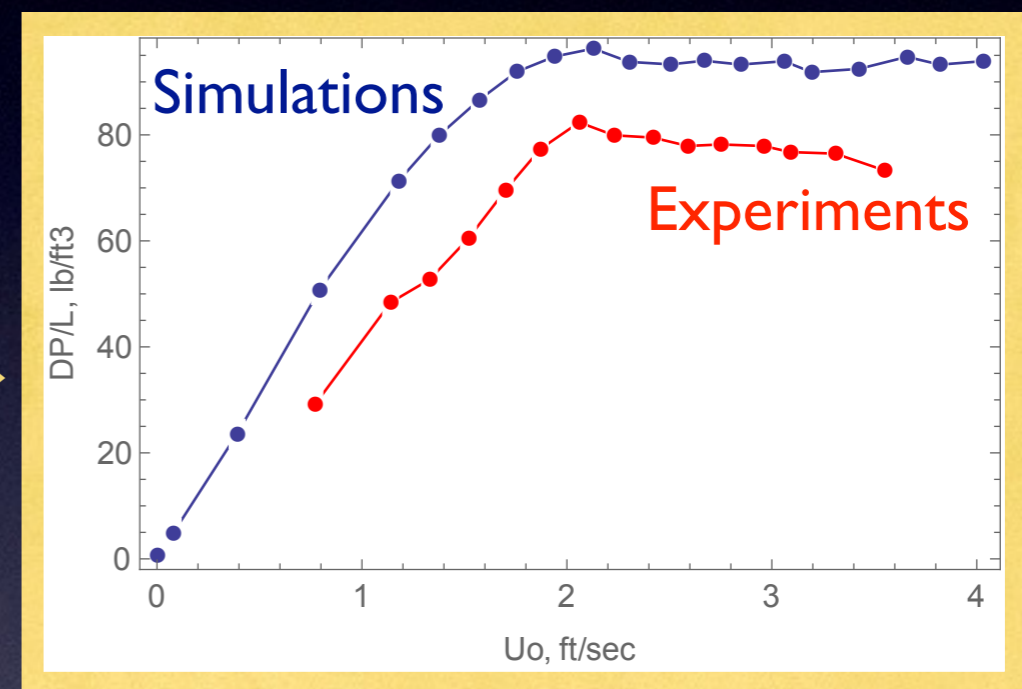
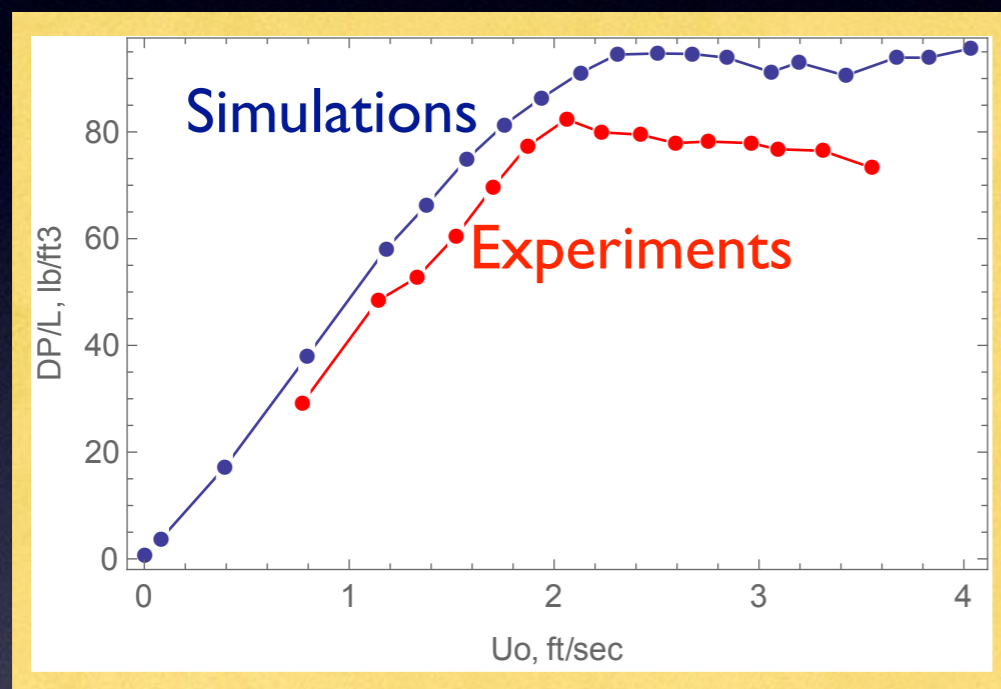
- Needs to be small scale
- Quantifiable and reproducible data
- $U_{mf}$ ,  $U_{mb}$  and bed density determined
  - Experimentally
  - Computationally

# $U_{mf}$ , $U_{mb}$ and Bed Density for FCC eCat Powder



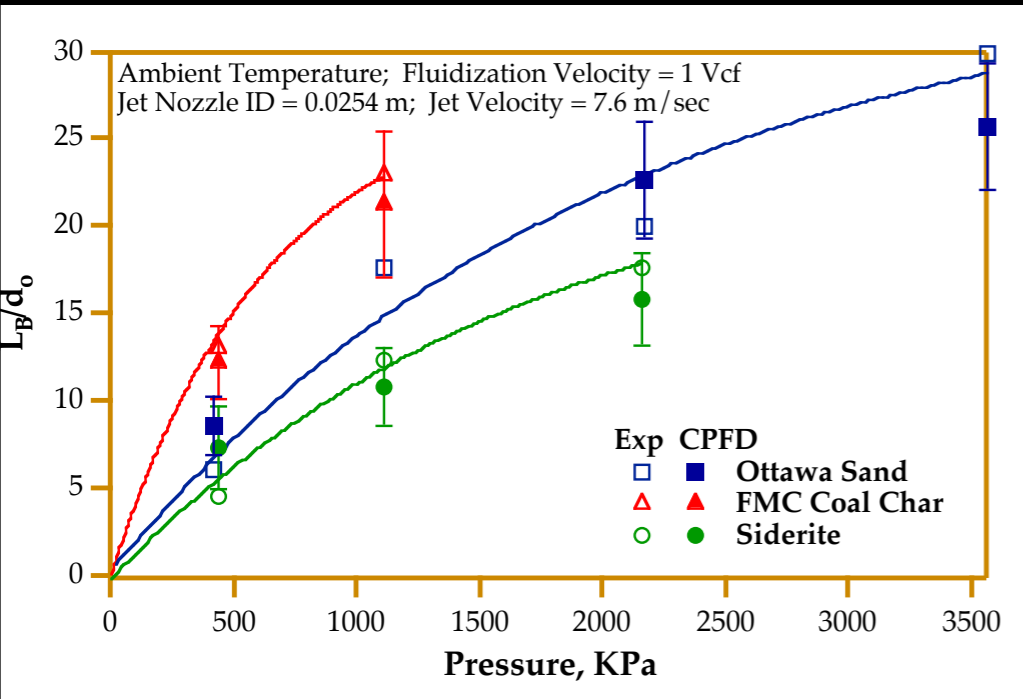
	MKS	FPS
$U_{mf}$ with Increasing Velocity	0.0020421848	0.0067
$U_{mb}$ with Increasing Velocity	0.0065532797	0.0215
Ave Bed Density	696.08707	43.435833
$U_{mf}$ with Decreasing Velocity	0.0033934813	0.011133333
$U_{mb}$ with Decreasing Velocity	0.0071933675	0.0236

# Comparison of Experimental and Computational Results

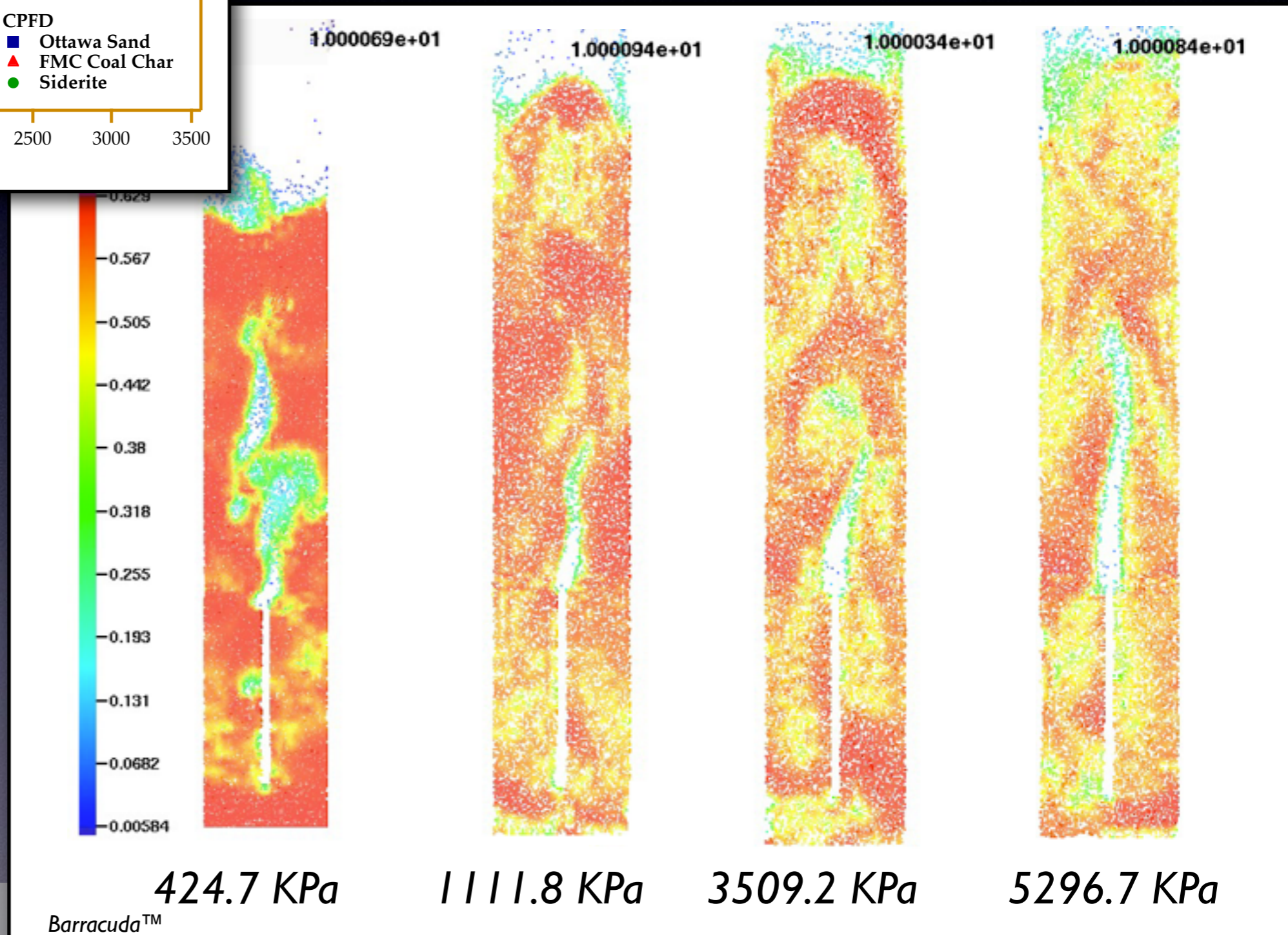


- Drag parameters are varied until bed density and  $U_{mf}$  “match” experimental data
- Method is CPU intensive

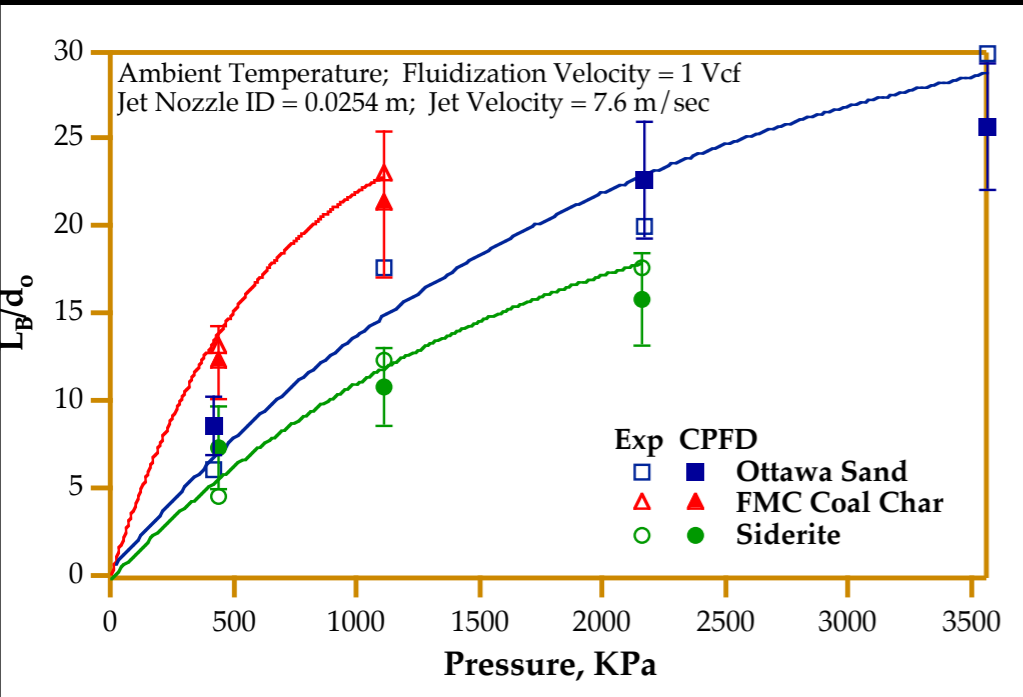
# Validating with Jet Penetration Lengths



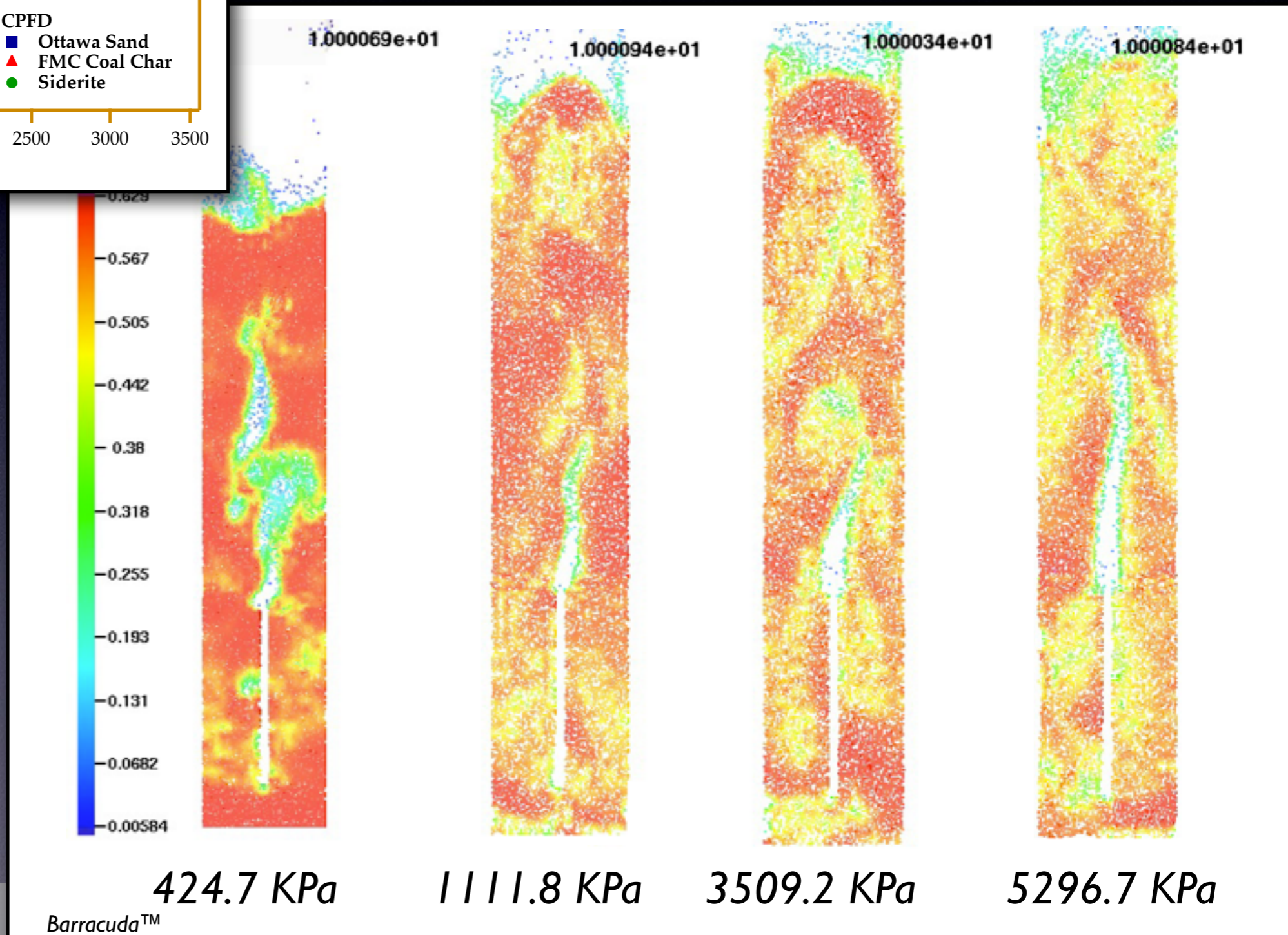
- Most jet penetration correlations do not apply to high pressure



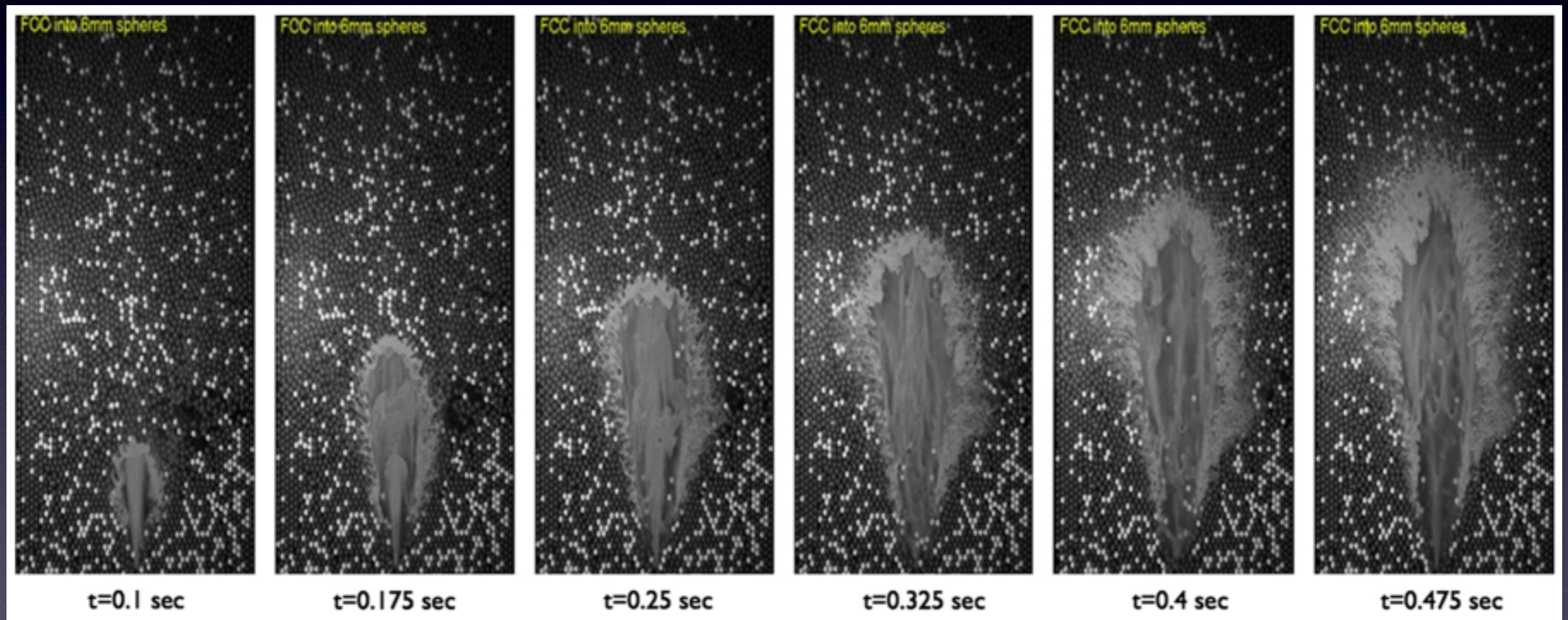
# Validating with Jet Penetration Lengths



- Most jet penetration correlations do not apply to high pressure



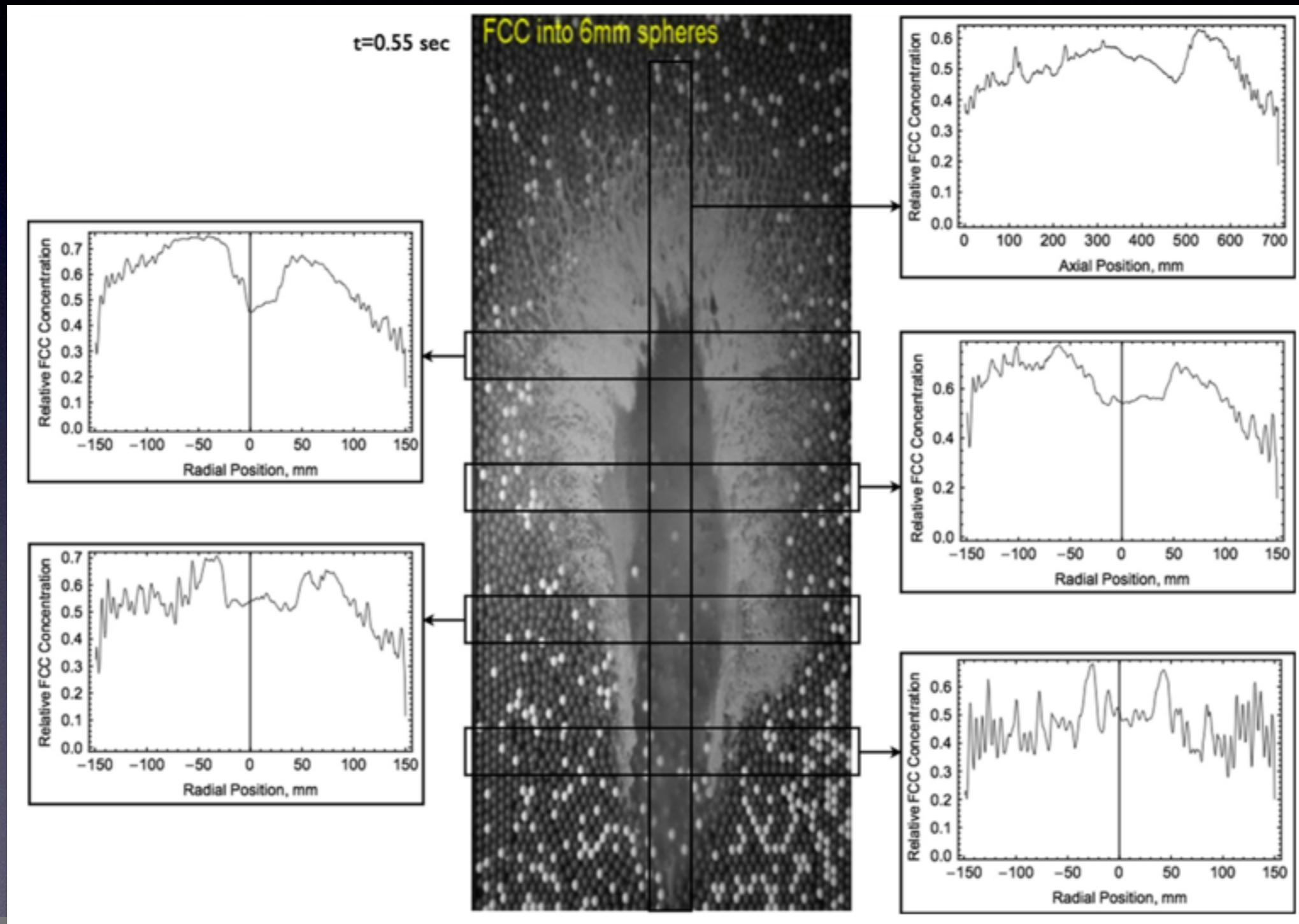
# Fluidization of Geldart Group D Powders



J. McMillan, F. Shaffer, B. Gopalan, J.W. Chew, C. Hrenya, R. Hays, et al., Particle Cluster Dynamics During Fluidization, Chemical Engineering Science. 100 (2013) 39–51



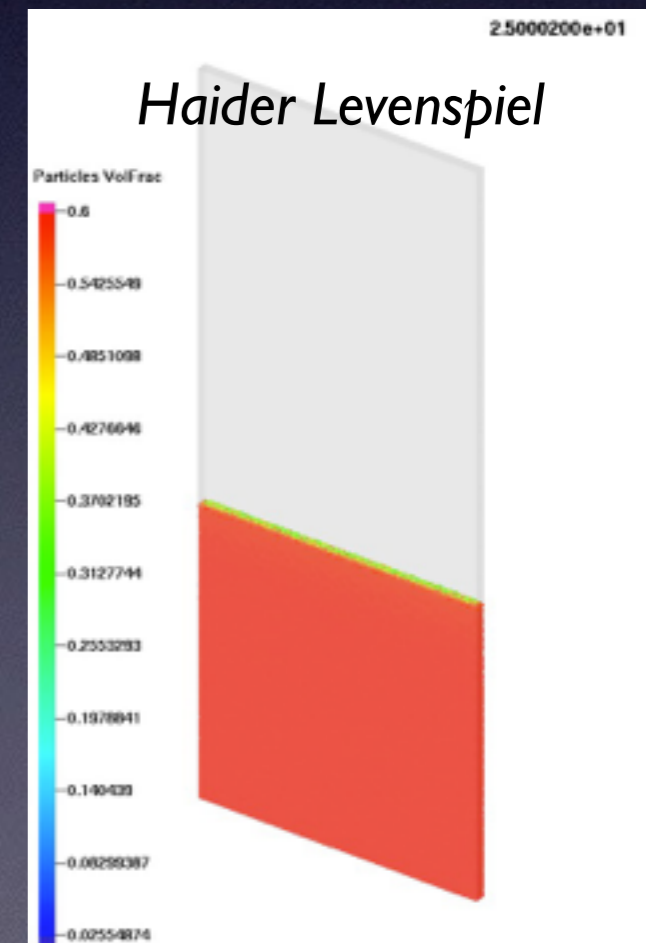
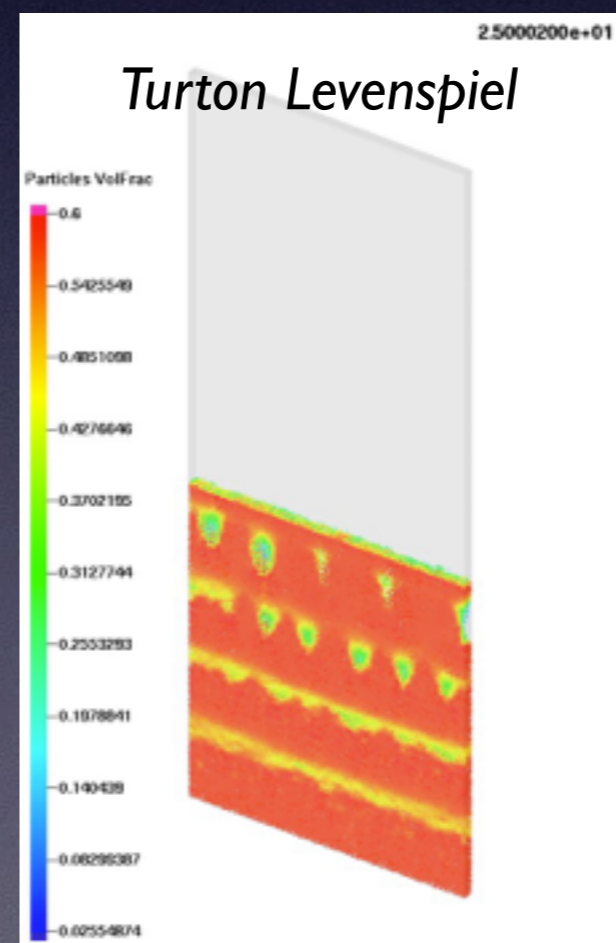
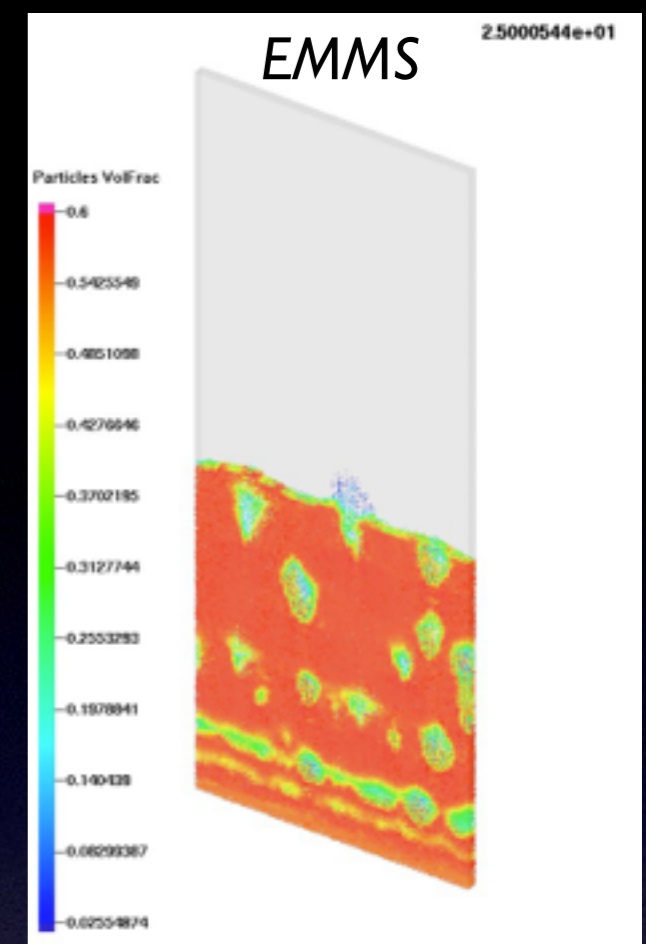
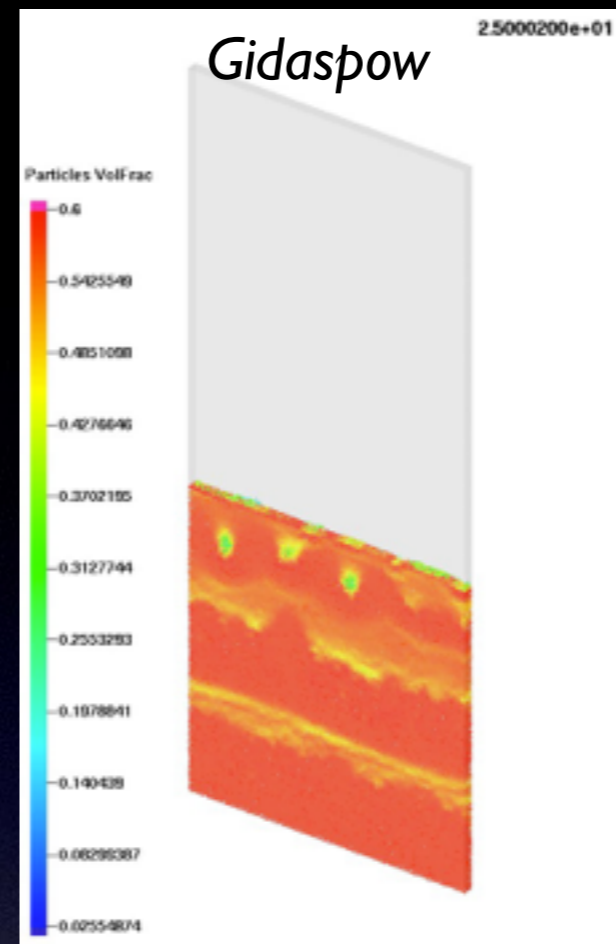
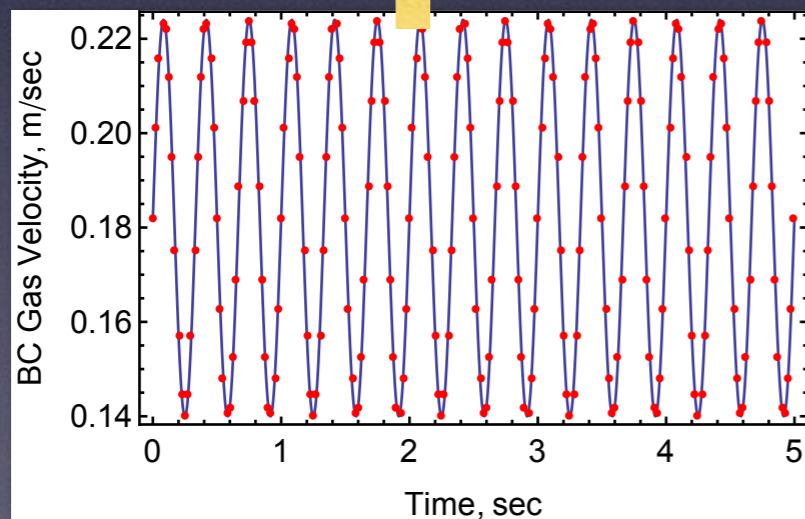
# Fluidization of Geldart Group D Powders



# Other Experiments

## UCL 2D Bed Oscillation Experimental Study

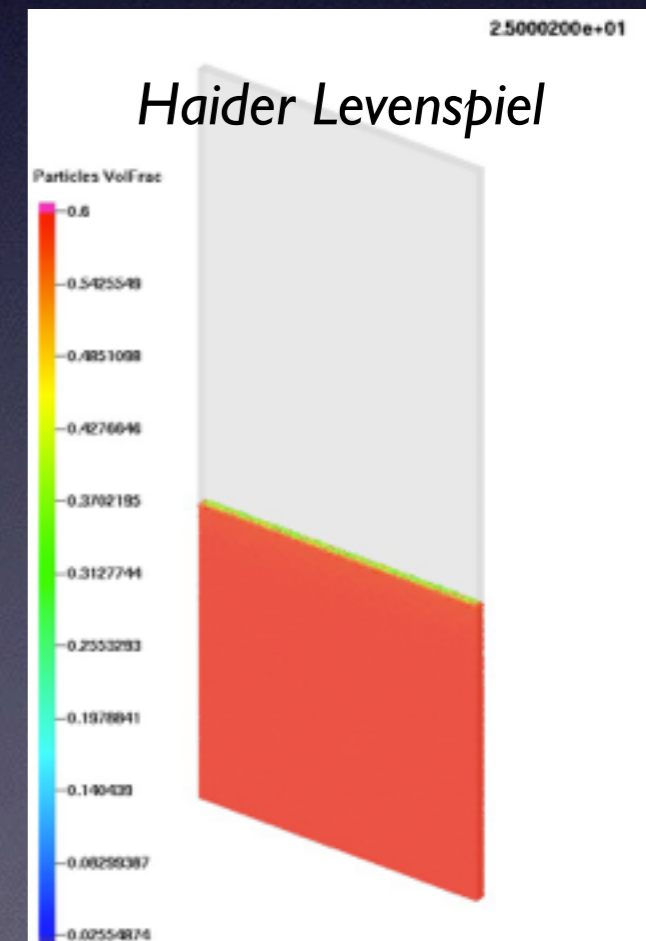
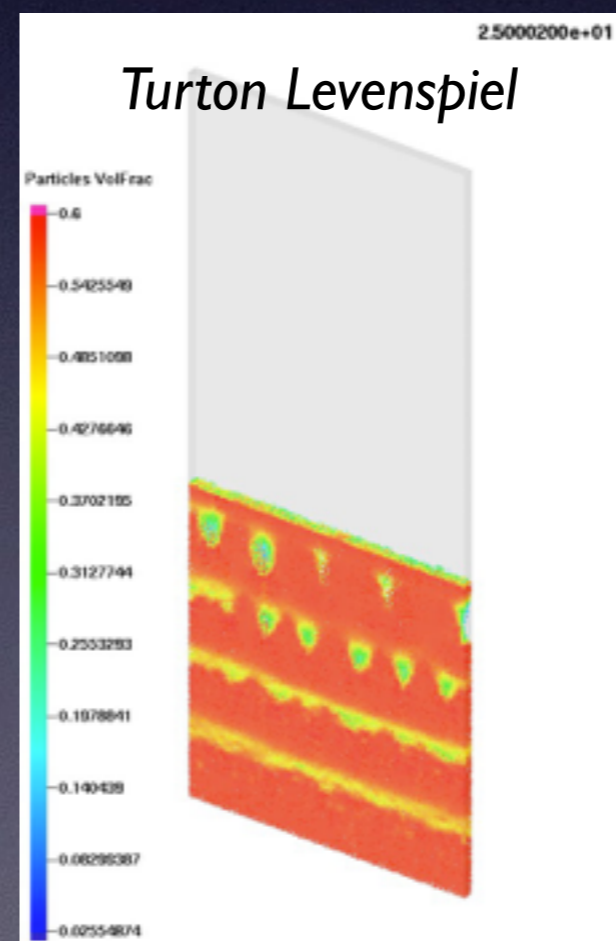
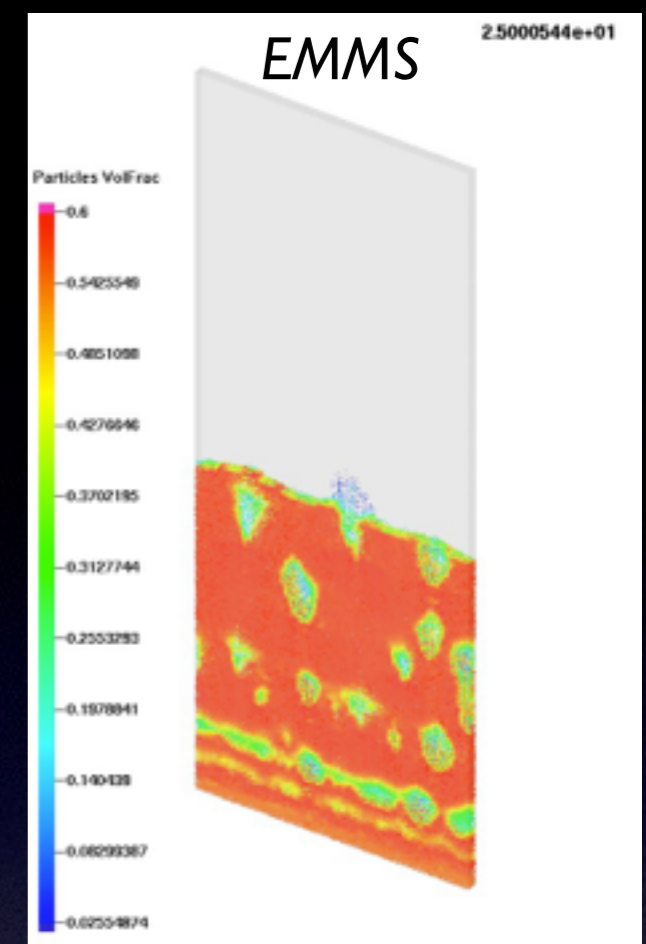
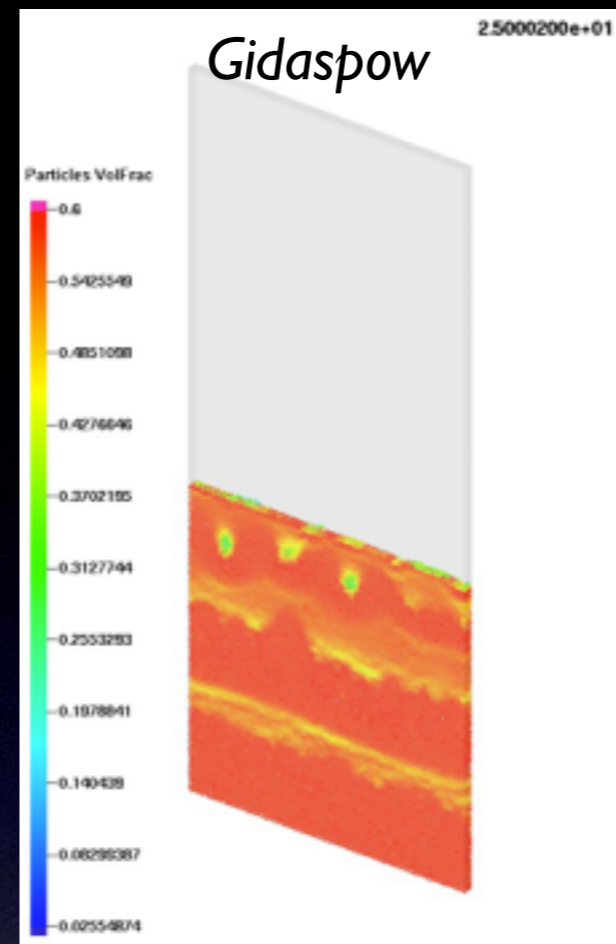
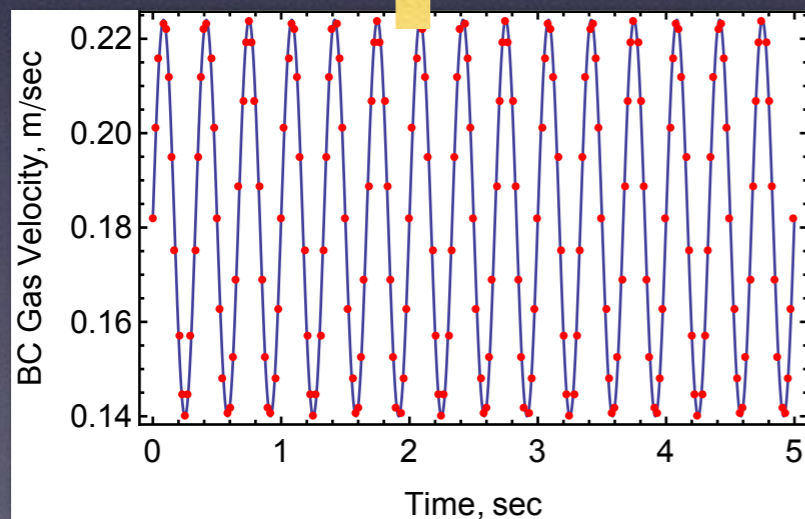
4 cm x  
40 cm x  
100 cm



# Other Experiments

## UCL 2D Bed Oscillation Experimental Study

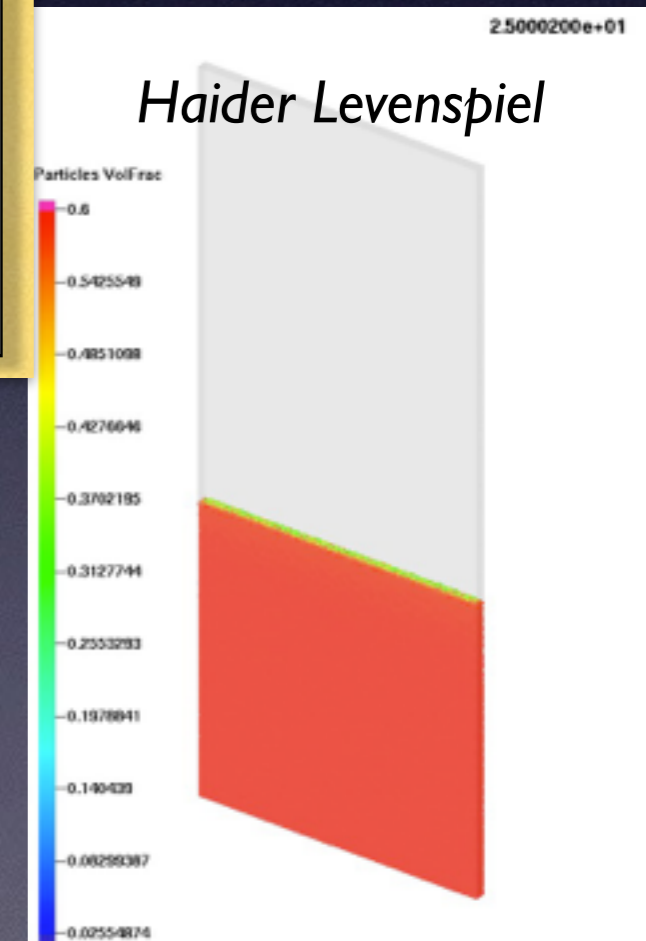
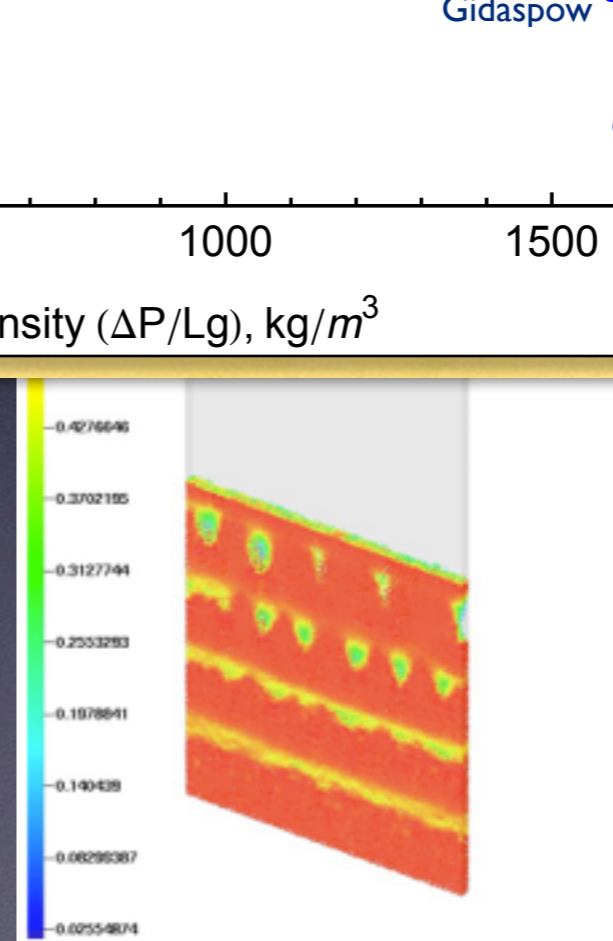
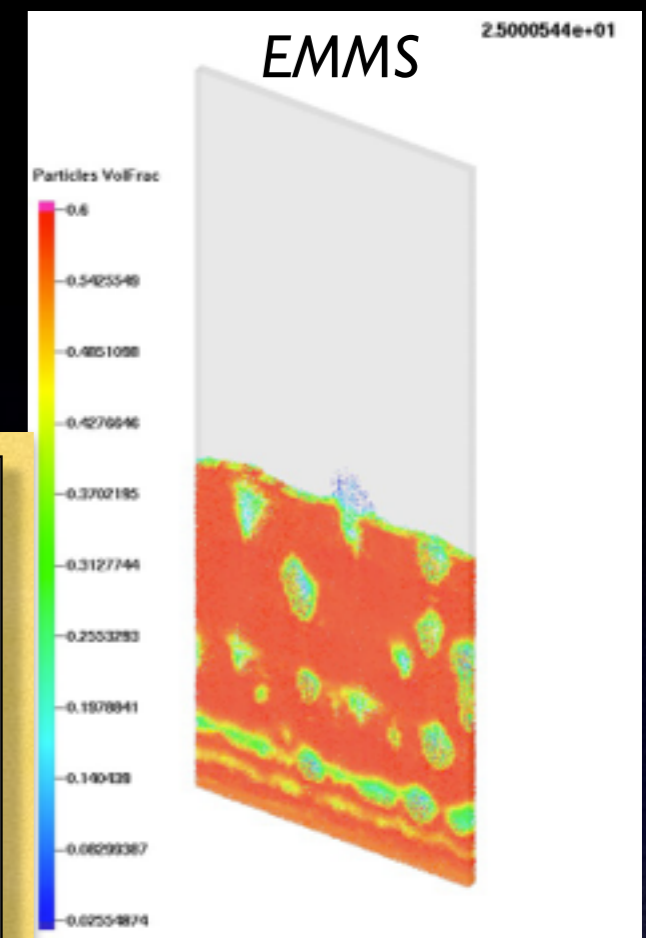
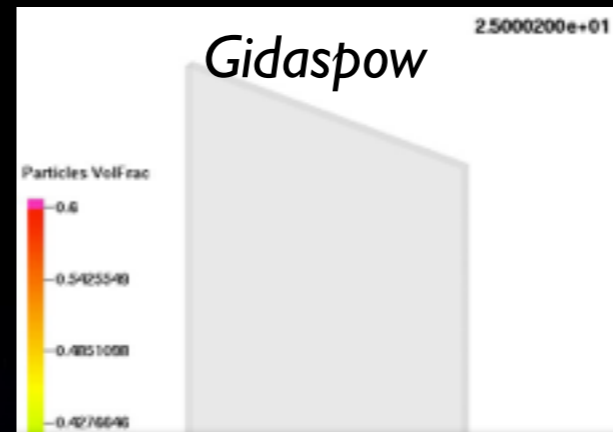
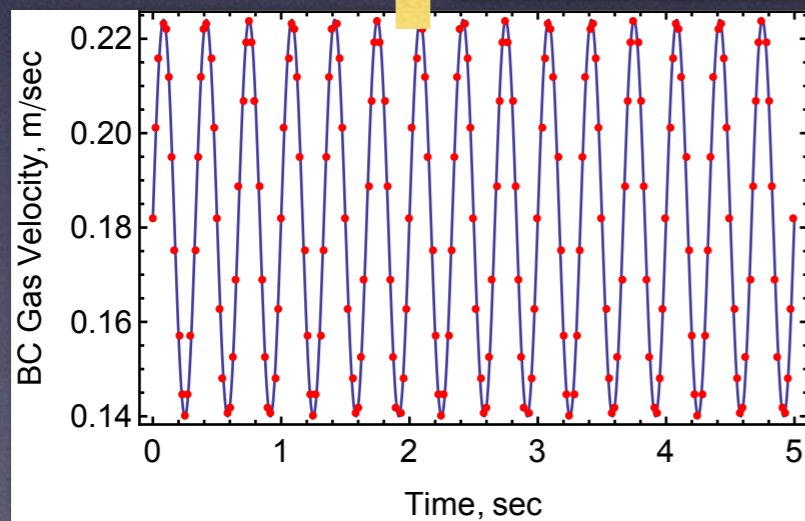
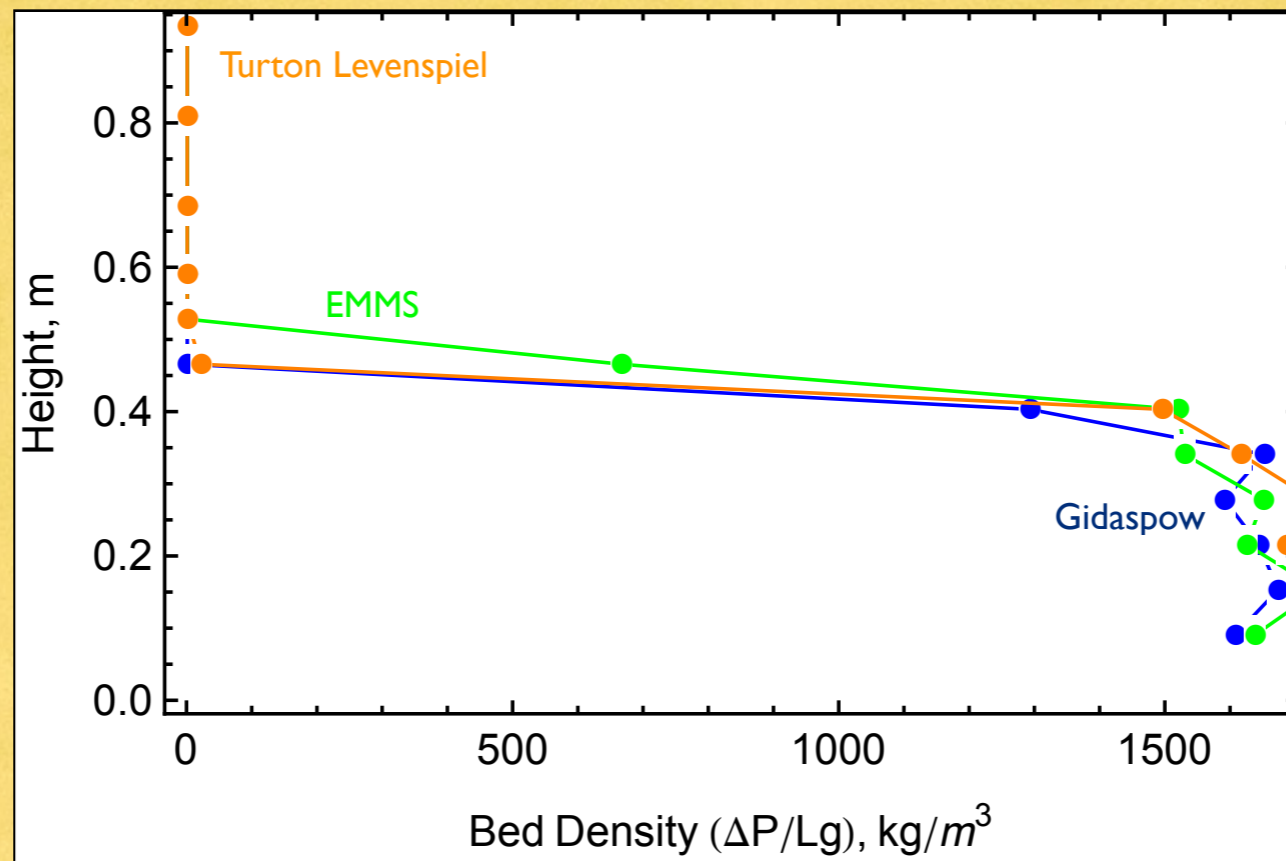
4 cm x  
40 cm x  
100 cm



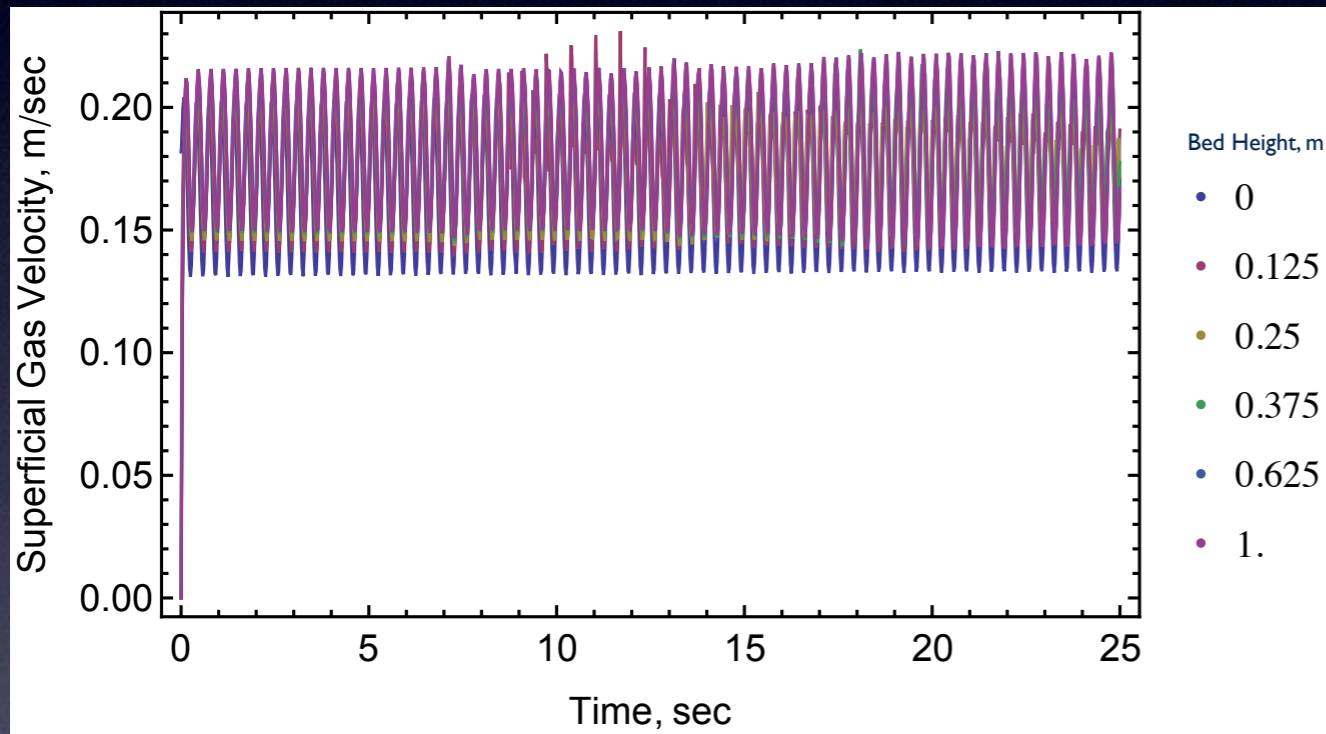
# Other Experiments

## UCL 2D Bed Oscillation Experiment

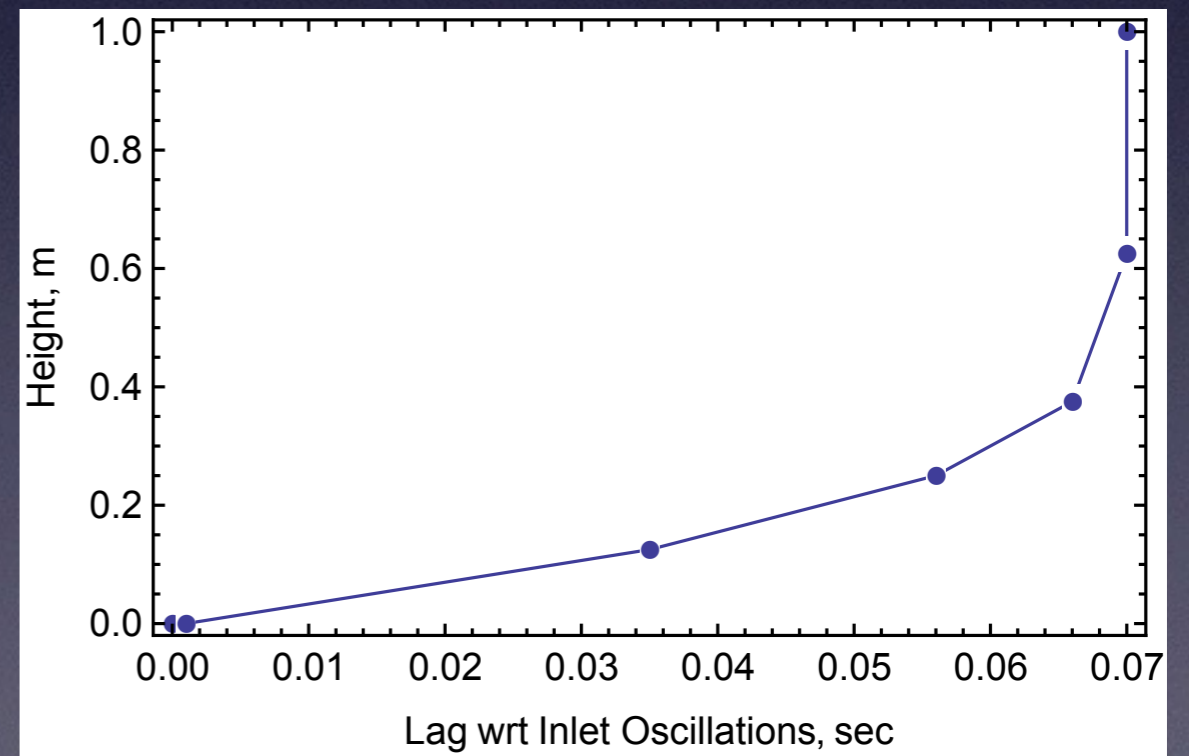
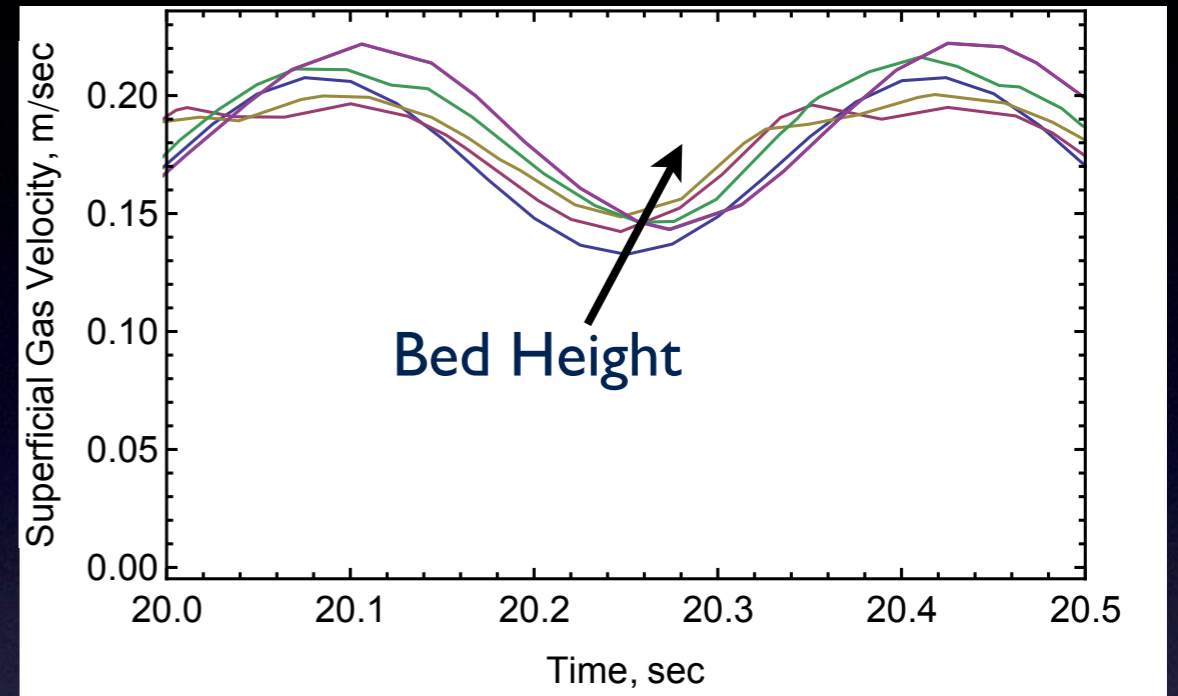
4 cm x  
40 cm x  
100 cm



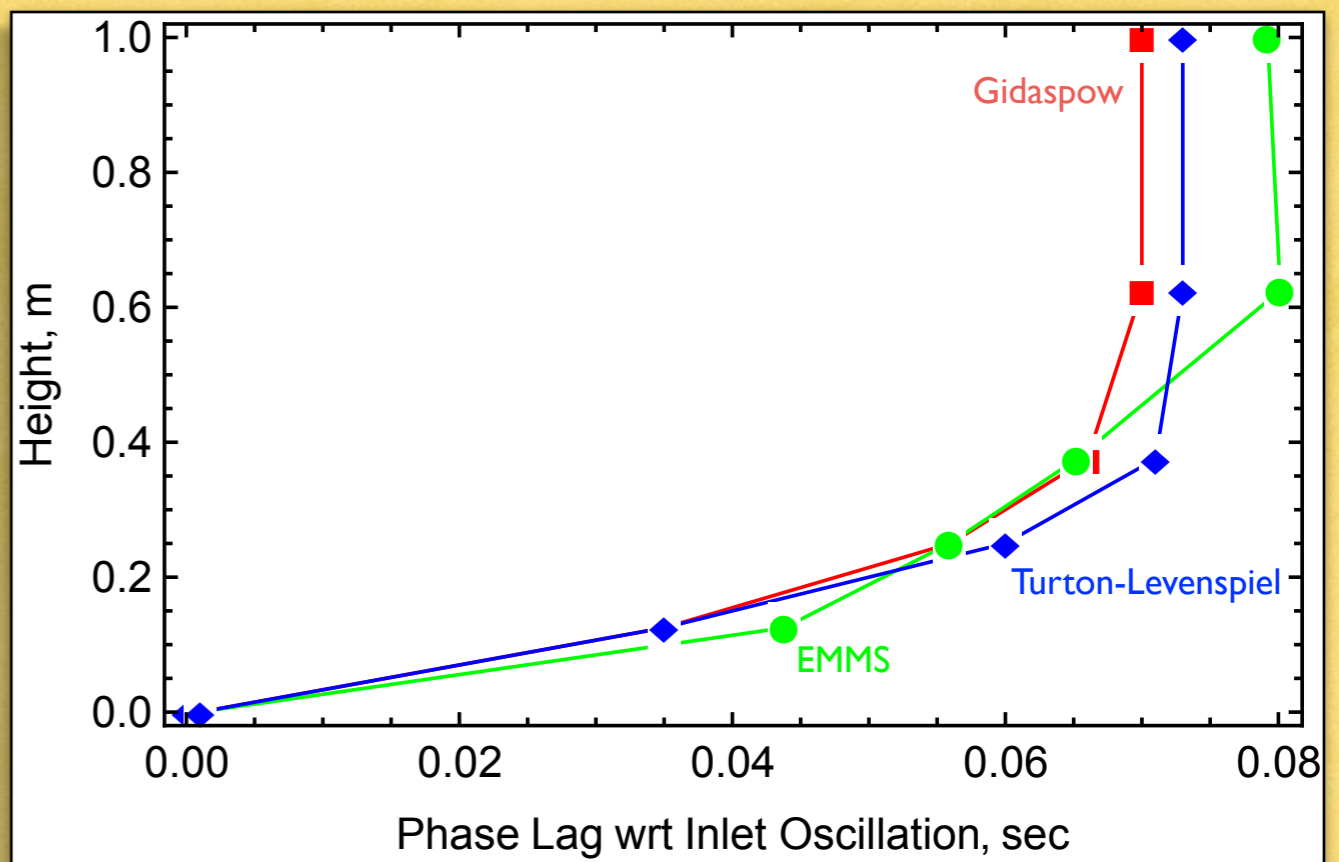
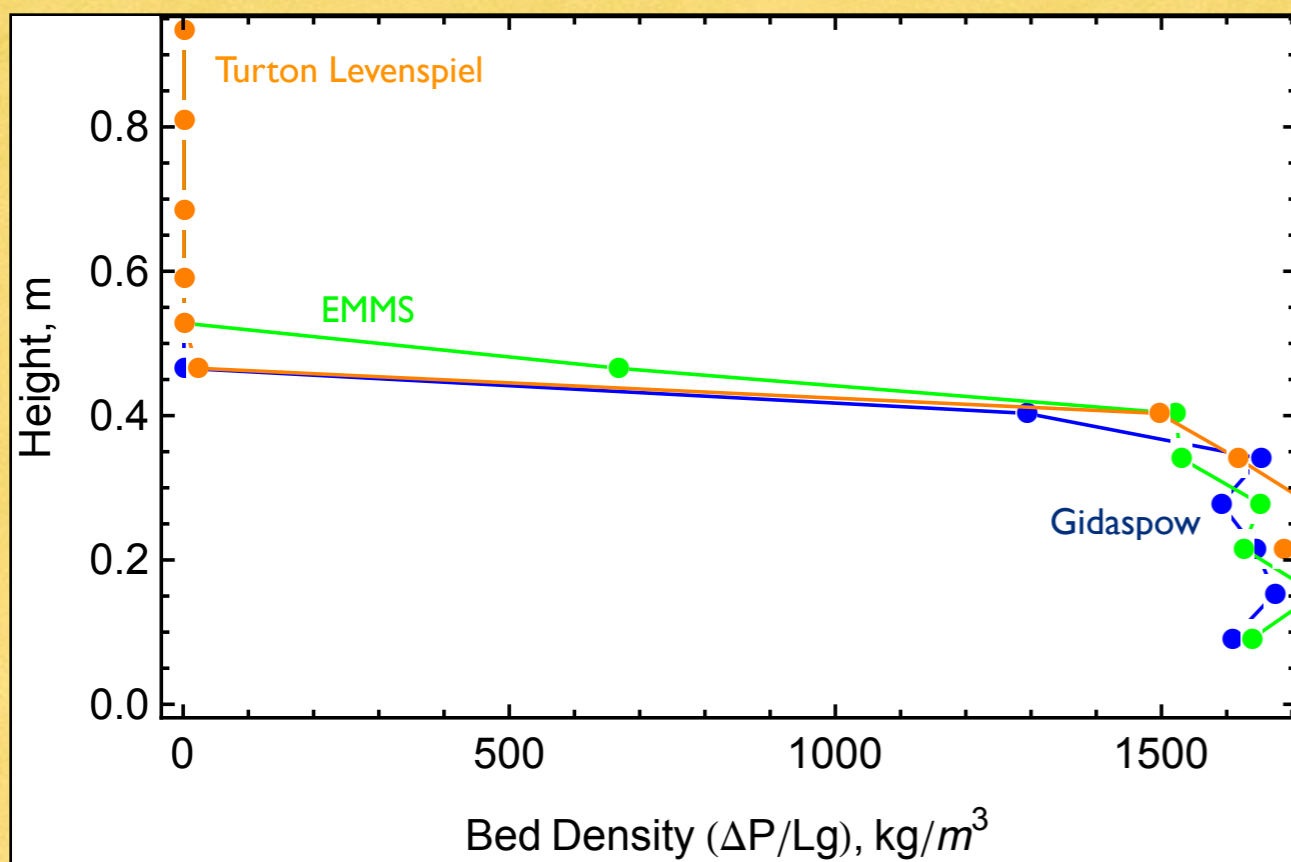
# “Phase Shift” As Gas Flows Through Bed



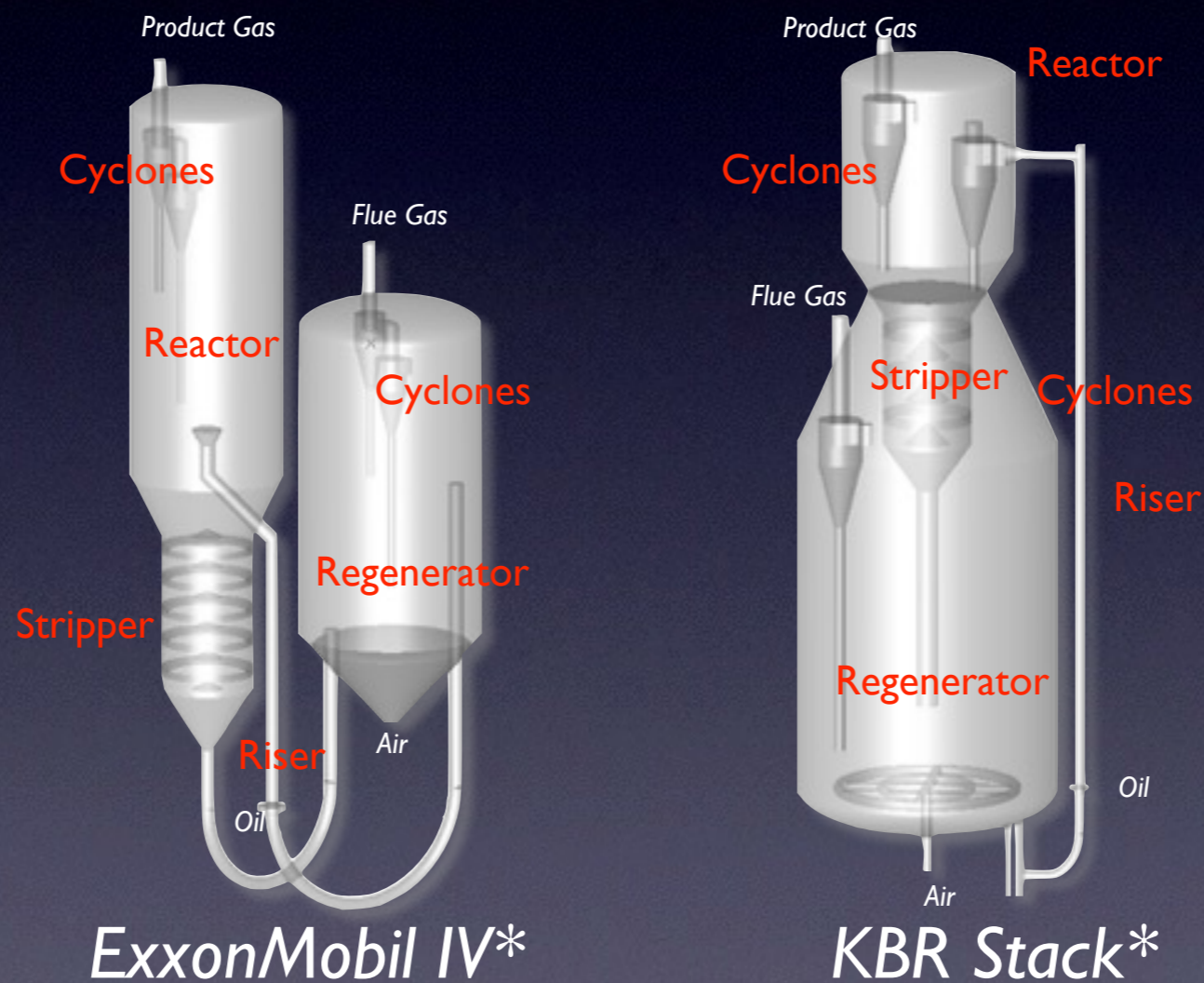
Cross-correlation used to determine how the gas fluctuation periods shift with increasing axial position



# Discerning Drag with Phase Shifts in Gas Velocity?



# What About CFB Risers?



\*Based on D. Kunii, O. Levenspiel, Fluidization Engineering, 2nd, Butterworth-Heinemann, 1991

# Question



- Do we need to develop experimental methods for model “fitting”
  - As well as continued efforts with model development
- Do we need to completely understand particle interactions or can we come up with clever experiment(s) to bridge that gap?