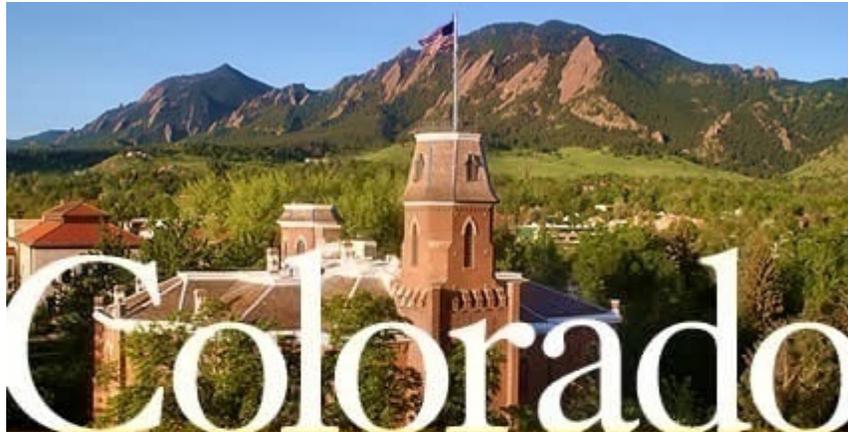


*Toward understanding micro-macro relations of  
solids flow with an eye on process performance*



**Christine Hrenya**

**University of Colorado**

**Chemical & Biological Engineering**

IFPRI Powder Flow Workshop  
Amsterdam, The Netherlands  
January 2017

## **The charge from the organizers...**

---

**“The syndicate sessions have been framed around three questions:**

- (1) Characterize the state-of-the-art in powder flow
- (2) Confront the "grand challenge" to relate particle properties, microstructure, and bulk flow behavior
- (3) Define three scientific questions that IFPRI and other funding sources should promote

**In this context, we hope that your talk will address the ‘big picture’ suggested by these three questions.”**

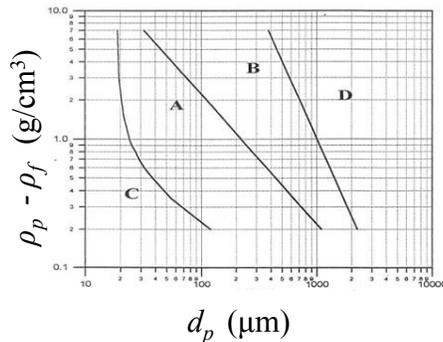
**Approach: Discuss in terms of “case study” – cohesive-particle flow project**

# State of the Art

## General comments

- today: rely too heavily on experience, correlations
- goal: accurate prediction of large-scale devices

## Case study: Cohesive-particle flows (applicable to other phenomena)



### Geldart's classification (1973)

- dimensional quantities  $\Rightarrow$  *not universal*
  - van der Waals
  - atmospheric T/P
  - fluidized beds

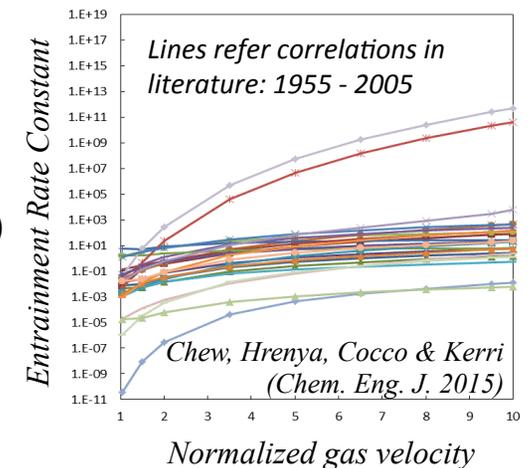
### Correlations for Entrainment Rates (2015)

- *orders of magnitude differences* between various correlations

### Predicting Agglomerate Size (2012)

- *order of magnitude difference* between various correlations (Shabanian, Jafari, & Chaouki, 2012)

In-house shadowgraphy: 49 μm particles in fluidized bed riser



# **Grand Challenge**

---

***“MACRO-SCALE BEHAVIOR BASED ON MICRO-SCALE PROPERTIES”***

**Step 1: Microscopic Understanding**

**Step 2: Micro-macro Link**

**Step 3: Macroscopic Predictions**

# Grand Challenge

---

***“MACRO-SCALE BEHAVIOR BASED ON MICRO-SCALE PROPERTIES”***

## **Step 1: Microscopic Understanding**

- today: *assumed* particle-particle (DEM-type) models and inputs
- goal: *validated* models

## **Step 2: Micro-macro Link**

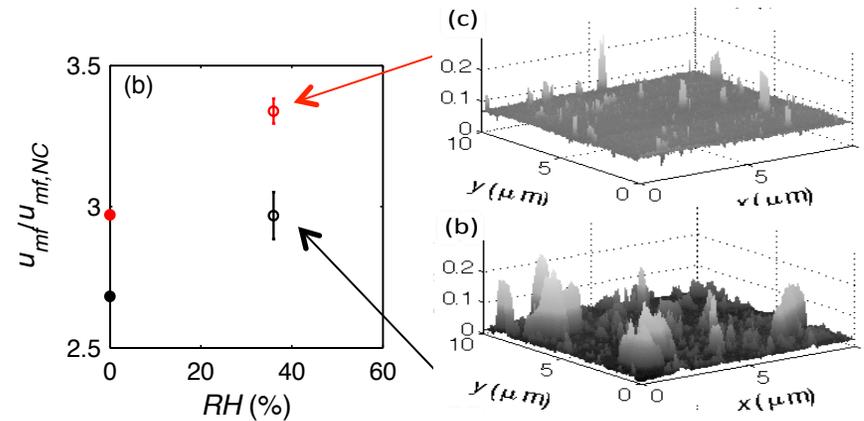
## **Step 3: Macroscopic Predictions**

# Scientific Question #1: Micro

*Q1: Do we have a validated microscopic understanding of phenomenon of interest (cohesion, non-spherical particles, etc.)?*

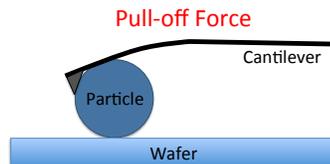
## Key elements

- Inputs
  - Experimental particle prop's & ambient conditions often omitted



## • Outputs/Validation

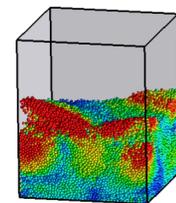
- Micro-level (particle-particle)
  - » difficult for complex particle (e.g., non-spherical)



*LaMarche, Leadley, Liu, Kellogg & Hrenya (Chem. Eng. Sci. 2017)*

- Macro-level (many-particle systems)
  - » System-size independent measurement

*Liu, LaMarche, Kellogg, Leadley & Hrenya (AIChE J. 2016)*



$N_p \sim 10^7$



$N_p \sim 10^{10}$

# Grand Challenge

---

## ***“MACRO-SCALE BEHAVIOR BASED ON MICRO-SCALE PROPERTIES”***

### Step 1: Microscopic Understanding

- today: *assumed* particle-particle (DEM-type) models
- goal: *validated* models

### Step 2: Micro-macro Link

- today: sensitivity analysis of *specific macro system* to *assumed micro model*
- goal: seek *universal and robust* micro-macro relationships (key physics)
  - Universal = dimensionless
  - Robust = applicable to wide variety of systems

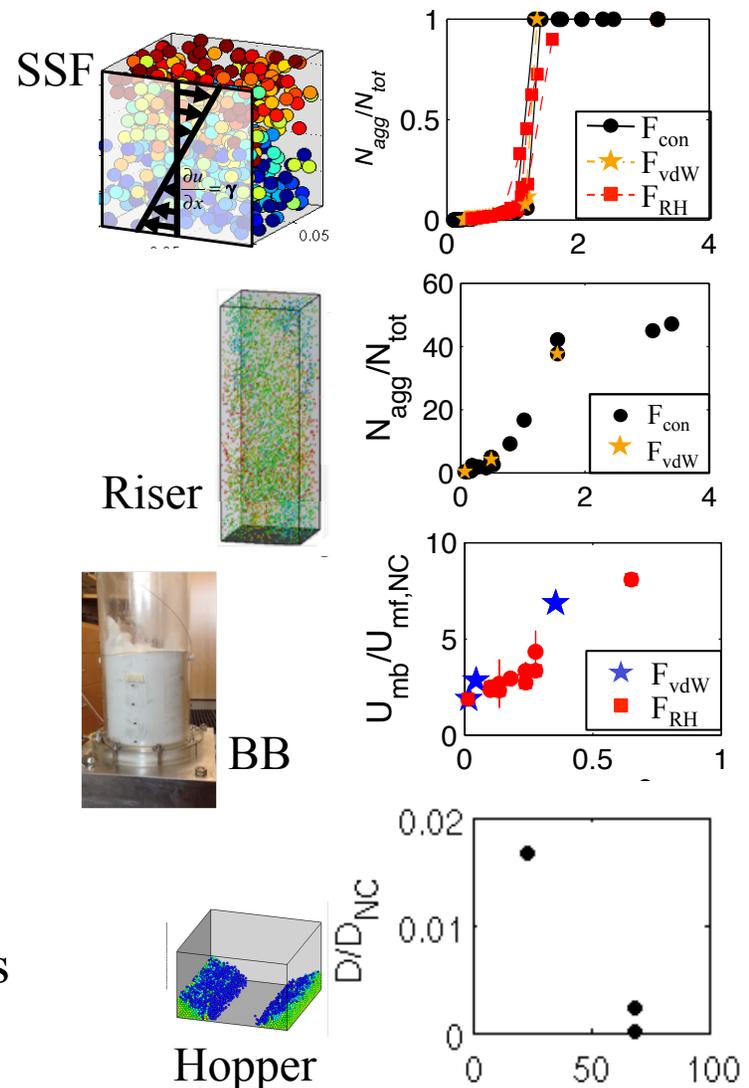
### Step 3: Macroscopic Predictions

## Scientific Question #2: Micro-macro link

*Q2: Do we have a universal and robust understanding of the micro-macro link?*

### Key elements

- Step 1: Non-dimensional groups
  - Robust (type of cohesion, system, etc.)
  - Key physics
    - » relevant microscopic quantities (roughness, force, energy?)
    - » measurement techniques (AFM vs. macro?)
- Step 2: Use validated *micro* models to drive development of *macro* models
  - e.g., population balance



# Grand Challenge

---

## ***“MACRO-SCALE BEHAVIOR BASED ON MICRO-SCALE PROPERTIES”***

### Step 1: Microscopic Understanding

- today: *assumed* particle-particle (DEM-type) models
- goal: *validated* models

### Step 2: Micro-macro Link

- today: sensitivity analysis of *specific macro system* to *assumed micro model*
- goal: seek *universal and robust* micro-macro relationships (key physics)
  - Universal = dimensionless
  - Robust = applicable to wide variety of systems

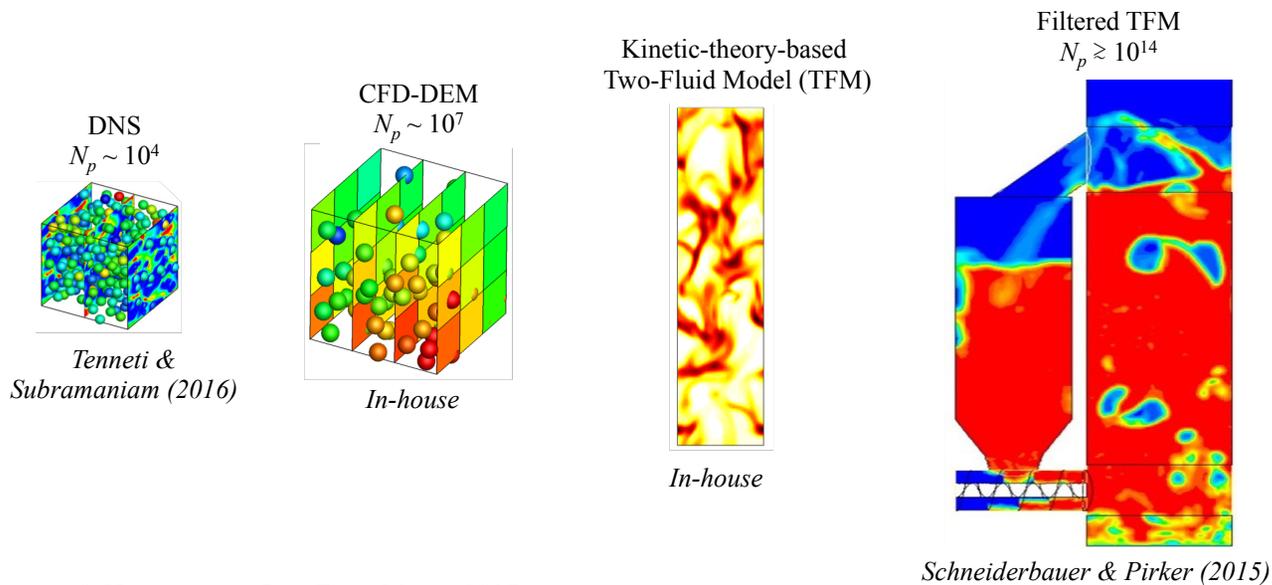
### Step 3: Macroscopic Predictions

- today: predict behavior of *small-scale* systems and extrapolate to industrial systems (mostly *qualitative*)
- goal: seek *accurate, quantitative* predictions of *industrial-scale* units

## Scientific Question #3: Macro

*Q3: Can we perform accurate, quantitative predictions of industrial units?*

- Key elements
  - Modeling advancements (DNS, DEM, continuum, filtered, hybrid):  
incorporate micro-level understanding to macro-level models
  - Computational advancements (collaboration with HPC scientists)
  - Transportable to commercial code (technology transfer)



Fullmer & Hrenya (*Ann. Rev. Fluid Mech.*, 2017)

Schneiderbauer & Pirker (2015)

*(data-driven closures and physical insight)*

## **Industrial funding – lessons learned & key elements**

---

- Significant financial backing for significant period of time
  - Ability to pursue expt/DEM/continuum simultaneously
  - Flexibility to change directions with preliminary results
  - Project is prioritized
- Work on all parts for given phenomenon: micro, micro-macro, macro
- True collaboration between academia and industry
  - Keeps each other focused and builds “team” effort, open communication, vested in each other’s success
  - Same is true for academic collaborations – productive collaborations based on papers etc. may be different than accomplishing big-picture scientific goals
- Focus on science and not reporting
  - Monthly .ppt updates rather than reports
- Ability to publish
  - Contract set up such that experiments/simulations done on both proprietary and non-proprietary materials – good for both since publications are essentially required for academics/trainees, and industry does not want to give up any secrets. Does not take up significant extra time since most time is spent building models/experiments, and less on running them