



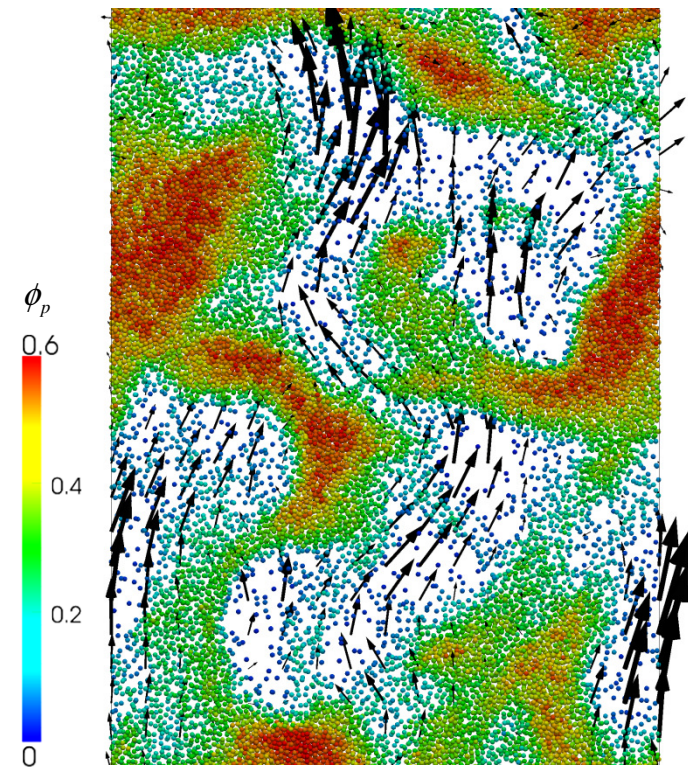
Effective Drag Law for Parcel-Based
Approaches

What Can We Learn from CFD-DEM?

Stefan Radl, Matthew Girardi,
Sankaran Sundaresan

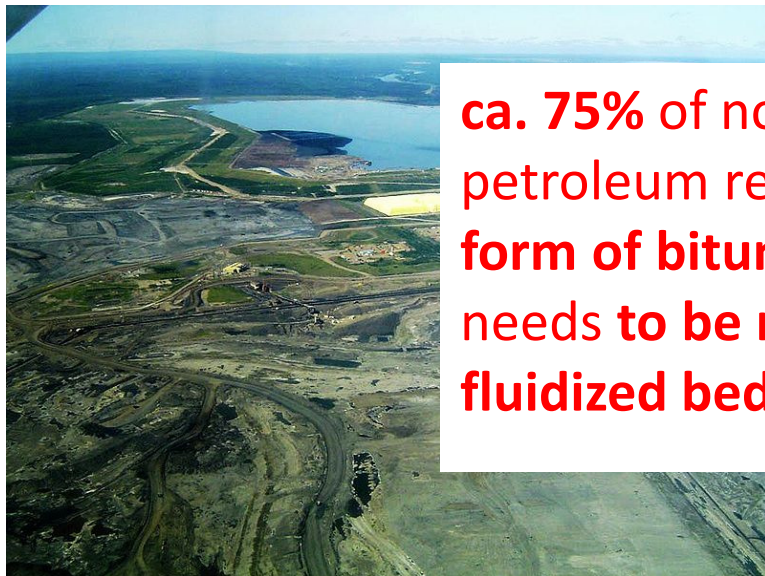
European Congress on Computational
Methods in Applied Sciences and
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Vienna, September 11, 2012

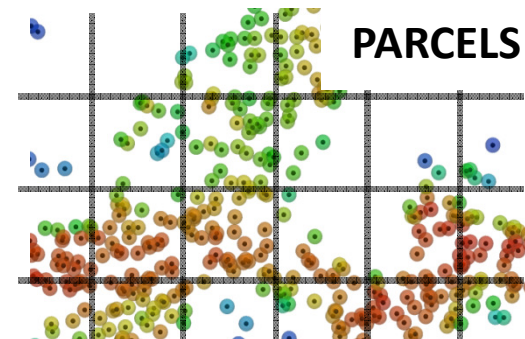
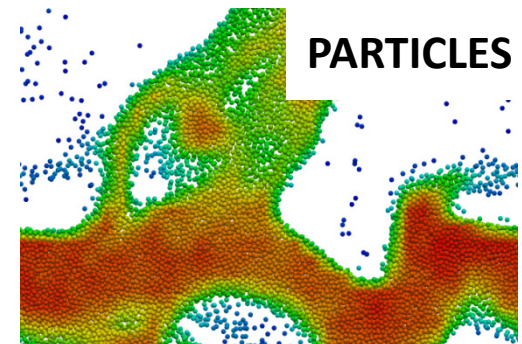
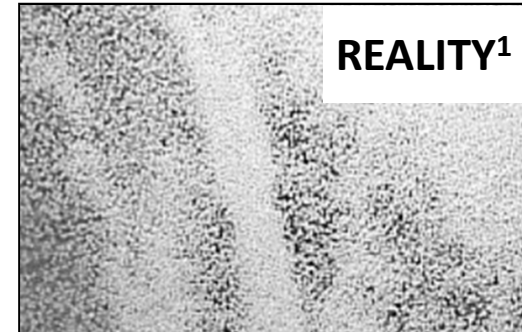


Outline

- Motivation
- Computational Tools
- A Validation Study
- An Effective Drag Law



ca. 75% of north america's petroleum reserves are in form of bitumen, which needs to be refined in fluidized beds.

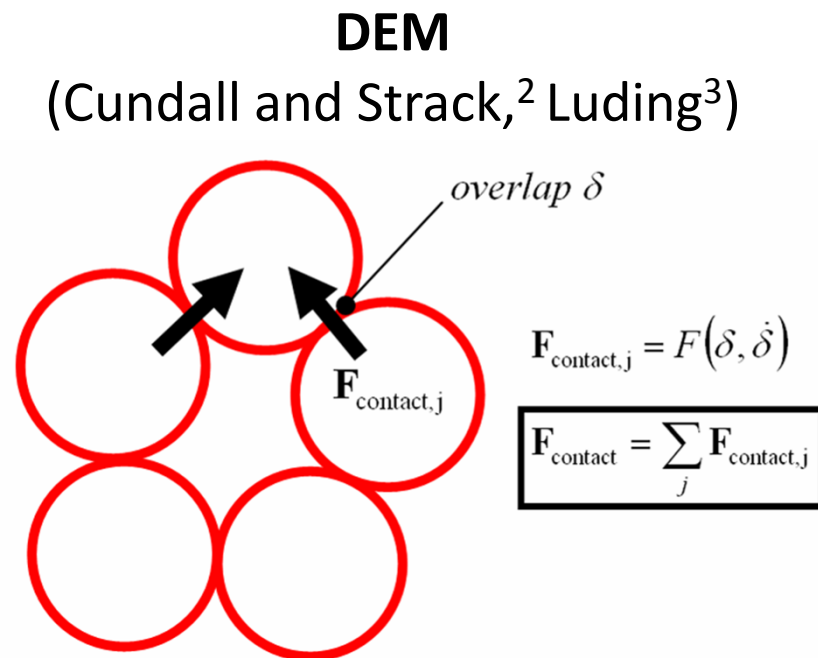


¹Courtesy: Franklin Shaffer, NETL, Morgantown, WV (2009).

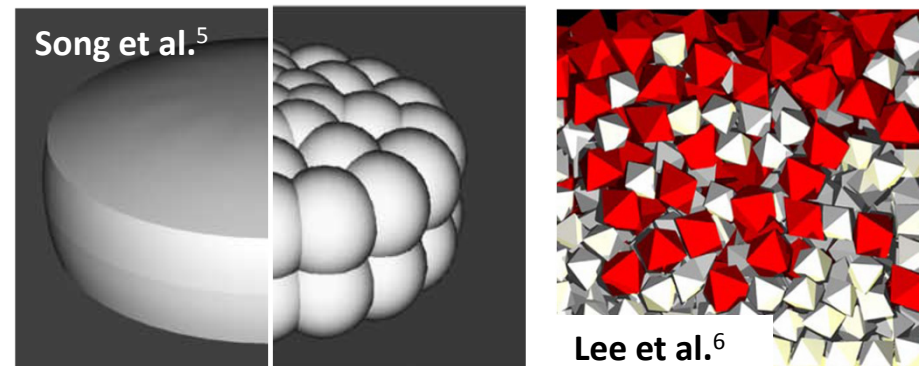
How? - Computational Tools

Handling of Dense Regions - Particles & Parcels

- The „standard“ Discrete Element Method (DEM) approach requires the **computation of all collisions** to calculate **contact forces and torques**.



- Particle shape considered via **glued-sphere approach**, **super-quadrics**,⁴ or other „smart“ approaches.^{5,6}



²Cundall and Strack, *Geotechnique* 29 (1979). ³Luding, *Granular Matter* 10 (2008).

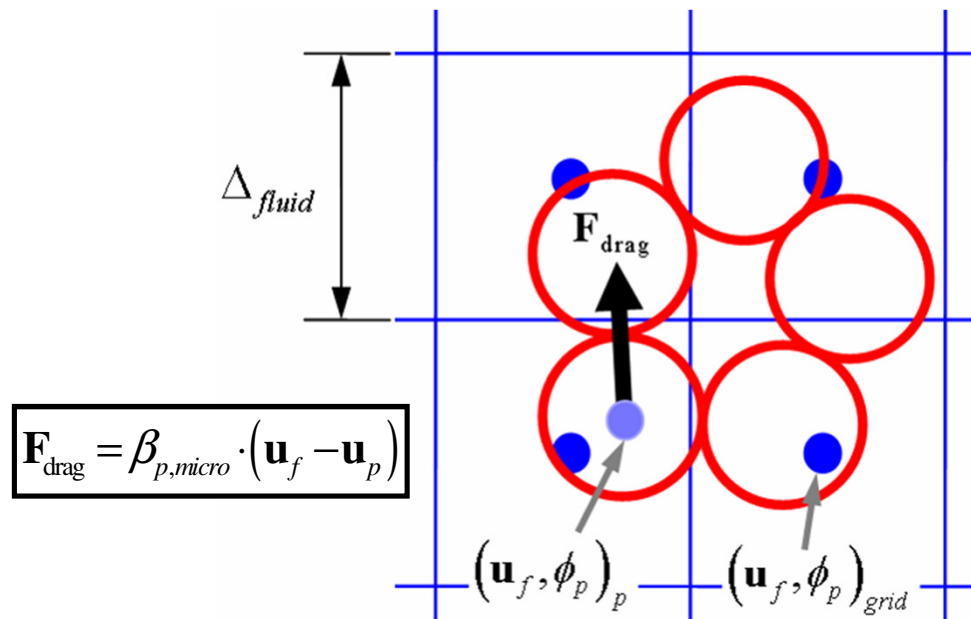
⁴Hilton et al., *CES* 65 (2010). ⁵Song et al., *Powder Tech* 161 (2006). ⁶Lee et al., *Granular Matter* 11 (2009).

How? - Computational Tools

- In the CFD-DEM^{7,8} the fluid flow is calculated on a **computational grid that is larger than the particles** - „microscopic“ drag law.
- In the CFD-DPM one computes **virtual „contact“ forces** via a DEM-like tracking of **parcel collisions**.⁹ **Scaling of interaction parameters.**

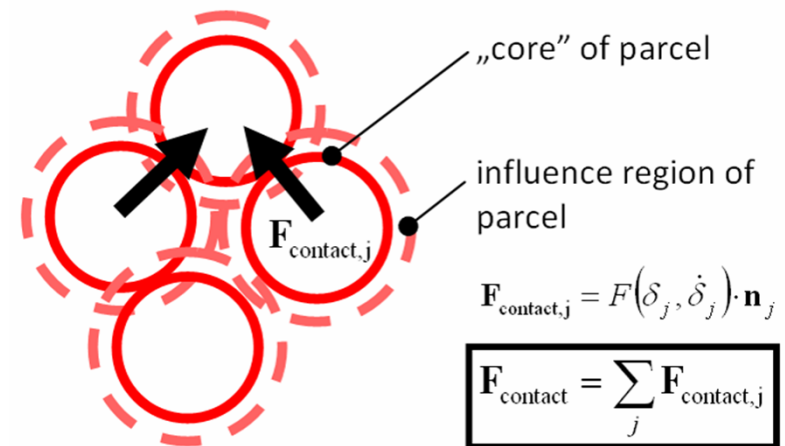
CFD-DEM

(Zhou et al.,⁷ Link et al.⁸)



(CFD-)DPM

(Patankar and Joseph⁹)



SOFT-SPHERE APPROACH BECAUSE WE WANT TO BE ABLE TO MODEL STICKY PARTICLES!

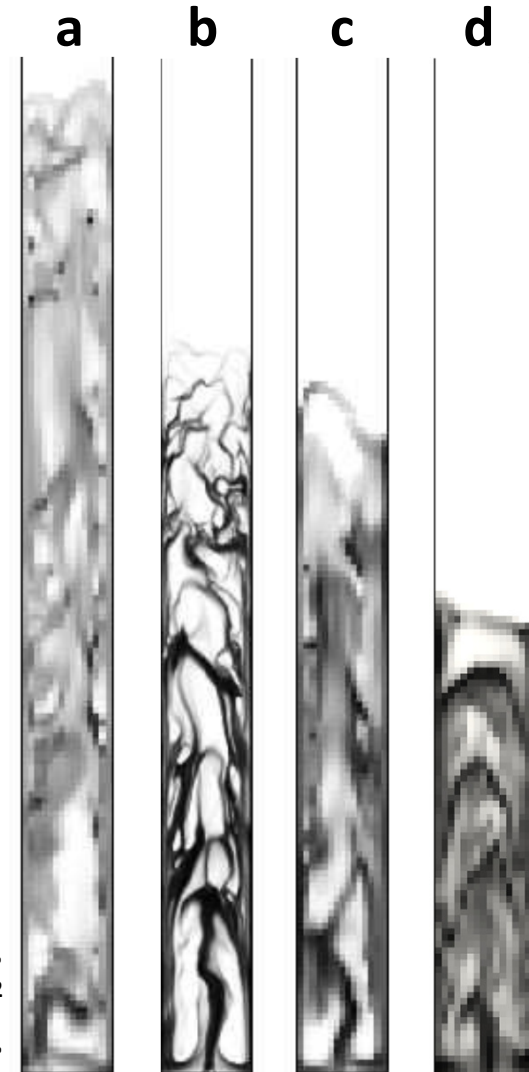
⁷Zhou et al., *JFM* 661 (2010) , ⁸Link et al., *Powder Tech* 189 (2009), ⁹Patankar and Joseph, *IJMF* 27 (2001).

Why a New Drag Model?

Well Accepted Facts

- The ‘uniformly fluidized state’ is **unstable**.¹⁰ A rough estimate for the characteristic cluster size is $L_{ref} = u_t^2 / g$ (ca. **5 mm** for 75 μm particles in air at ambient conditions).
- Instability reflected by a **strong grid-dependency** of simulation results (e.g., slip velocity).
- **Previous work**^{11,12} **was based on two-fluid models (TFMs)**, supplemented with closures from **kinetic theory (KT)** for the particle-phase stress.

Particle volume fraction distribution in a 3 [cm] wide riser.
a: standard drag model;¹² b: fully resolved;¹² c: Parmentier drag model;¹²
d: Igci drag model,¹¹ no stress model.

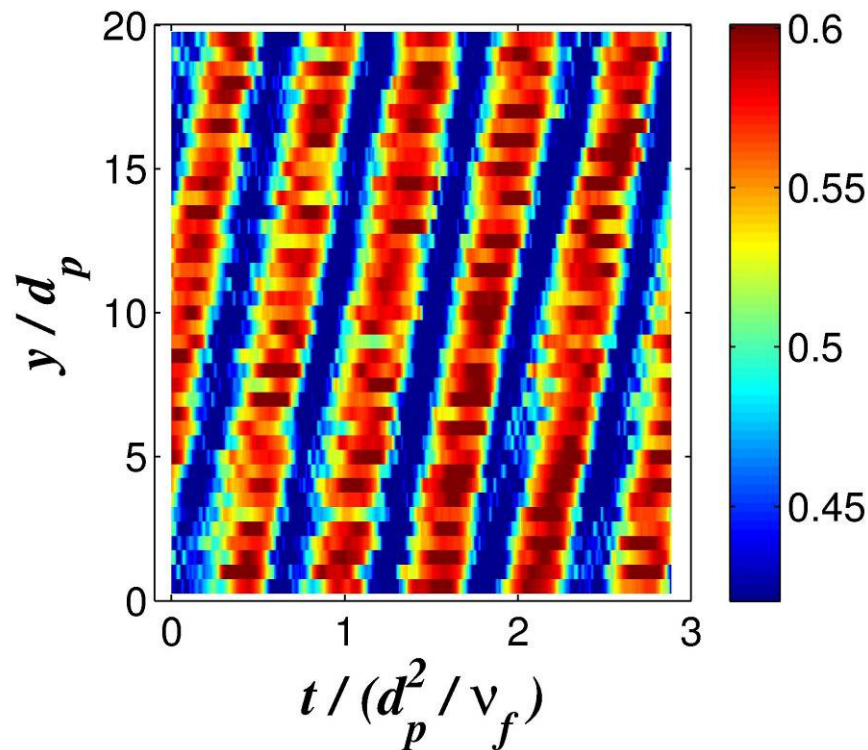


¹⁰Jackson, *Trans Inst Chem Eng* 41 (1963). ¹¹Igci and Sundaresan, *I&EC Res* 50 (2011).

¹²Parmentier et al., *AIChE J* 58 (2012).

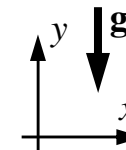
CFD-DEM Validation

- Setup

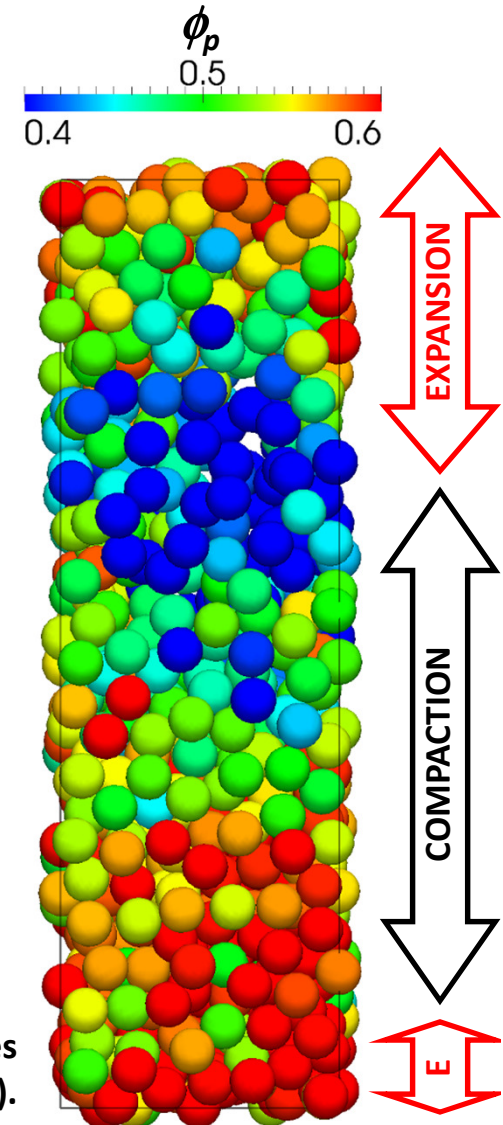


Space-time plot of the particle volume fraction in a liquid-fluidized bed.

- 685 μm particles, liquid fluidized.
- Reference data by Duru et al.,¹³ as well as Derksen and Sundaresan.¹⁴
- CFD-DEM with Beetstra drag¹⁵ predicts **wave profile** and **wave speed** accurately.



Liquid-fluidized particles ($\langle \phi_p \rangle = 0.505$).



¹³Duru et al., *JFM* 453 (2002), ¹⁴Derksen and Sundaresan, *JFM* 587 (2007), ¹⁵Beetstra et al., *AIChE J* 53 (2007).

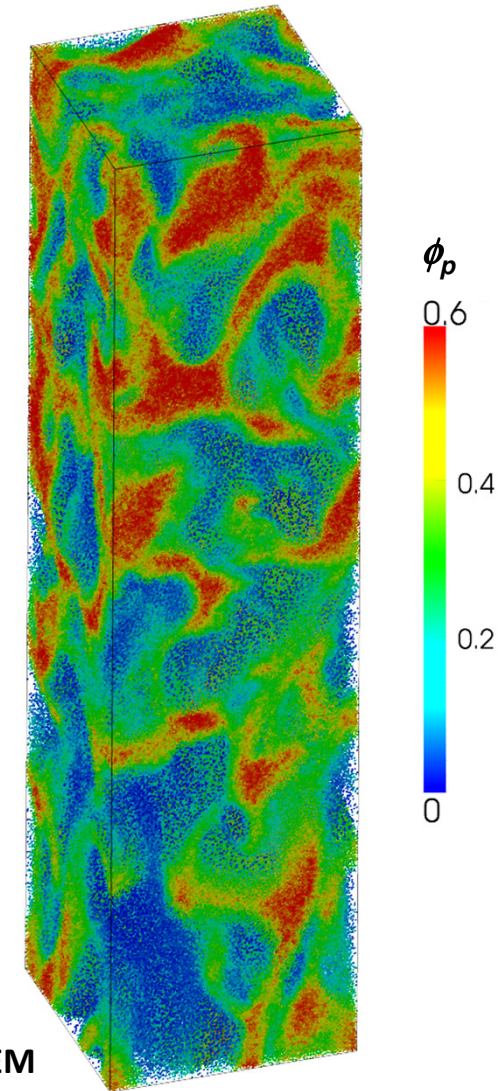
Gas-Particle System

- Setup

- Sedimentation in a **periodic box** (8x32x8 mm)
- Gas-particle system ($\rho_p/\rho_f \approx 1000$).
- Low Re system (75 μm ; $u_t = 0.22$ m/s, $\text{Re} \approx 1$).

- Sensitivity Studies

- Microscopic drag model (Wen-Yu, Beetstra; stochastic drag model; hydrodynamic torque) **Small, if normalized**
- Mapping and interpolation
- Domain size **Relevant for overall slip**
- Fluid grid resolution **Key factor!**



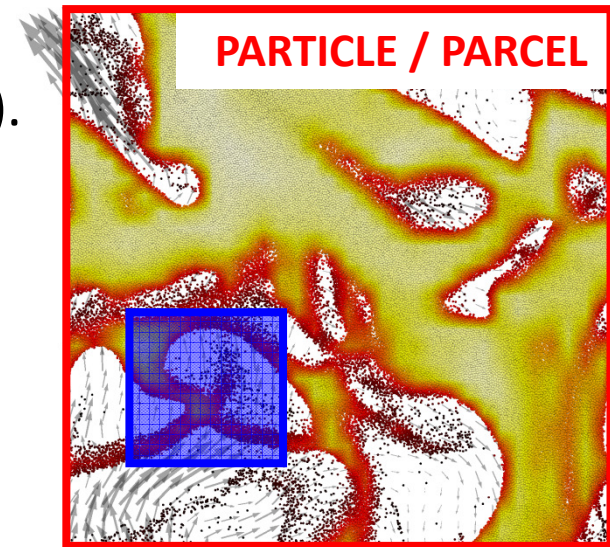
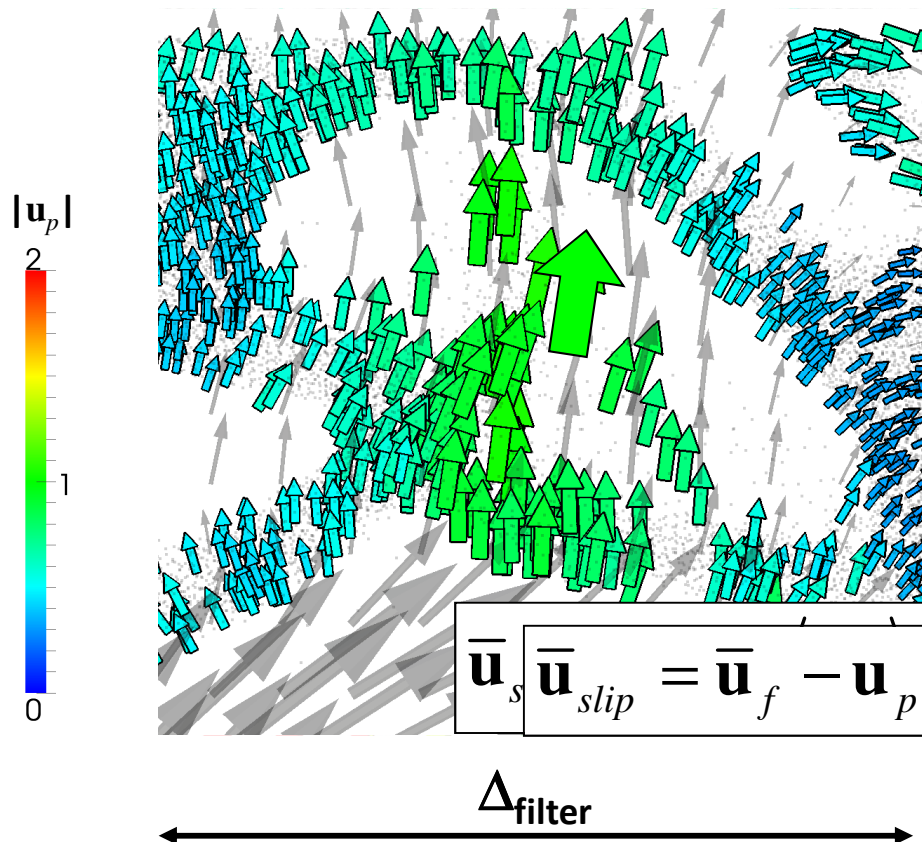
Clustering predicted by CFD-DEM
($2.3 \cdot 10^6$ particles, $\langle \phi_p \rangle = 0.25$).

Filtered Drag Model

- How do we filter?

1 - We define a filtered velocity for the fluid phase.

2 - We *can* define a filtered velocity for the particle phase (results are based on **CFD-DEM**).



$$\bar{\mathbf{u}}_f = \frac{\mathbf{u}_f \cdot (1 - \phi_p)}{1 - \phi_p}$$

fluid

$$\langle \mathbf{u}_p \rangle = \frac{\sum_{N_p} \mathbf{u}_{p,i} \cdot m_{p,i}}{\sum_{N_p} m_{p,i}}$$

particles

Filtered Drag Model

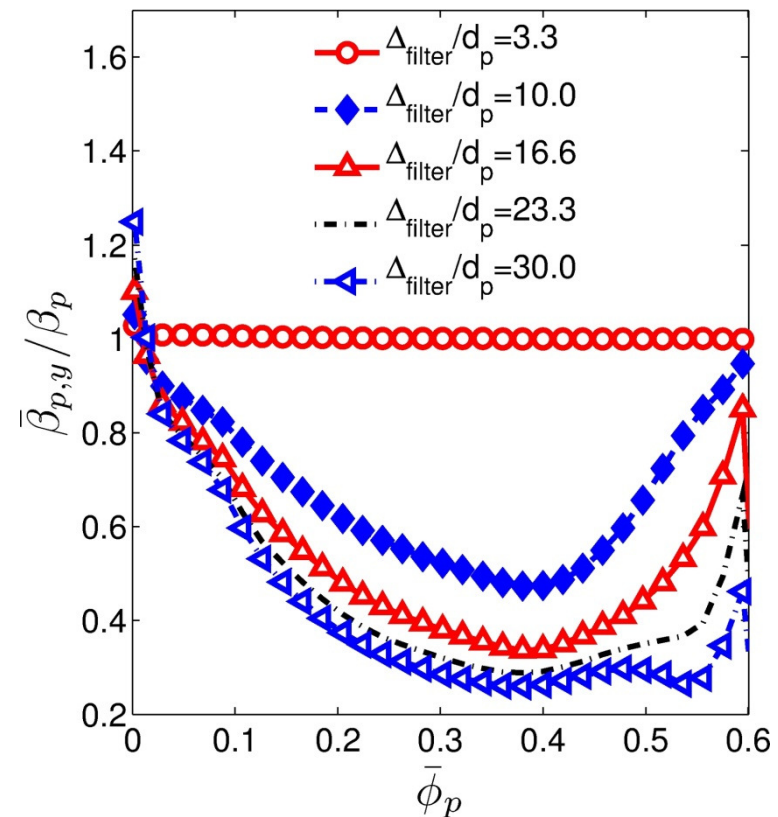
- The Idea Behind “Filtered” Drag
 - “Filter-Out” fluid velocity seen by the particle, and compute a **filtered drag coefficient for a single particle.**

$$\bar{\beta}_{p,i} = \frac{1}{\bar{\mathbf{u}}_{f,i}|_{\mathbf{x}_p} - \mathbf{u}_{p,i}} \cdot \left[\begin{array}{l} - \left(\nabla \cdot \boldsymbol{\sigma}_f \Big|_{\mathbf{x}_p} \right)_i + \left(\nabla \cdot \bar{\boldsymbol{\sigma}}_f \Big|_{\mathbf{x}_p} \right)_i \\ + \beta_p \left(\mathbf{u}_{f,i} \Big|_{\mathbf{x}_p} - \mathbf{u}_{p,i} \right) \end{array} \right]$$

“Fully-resolved” quantities at particle location

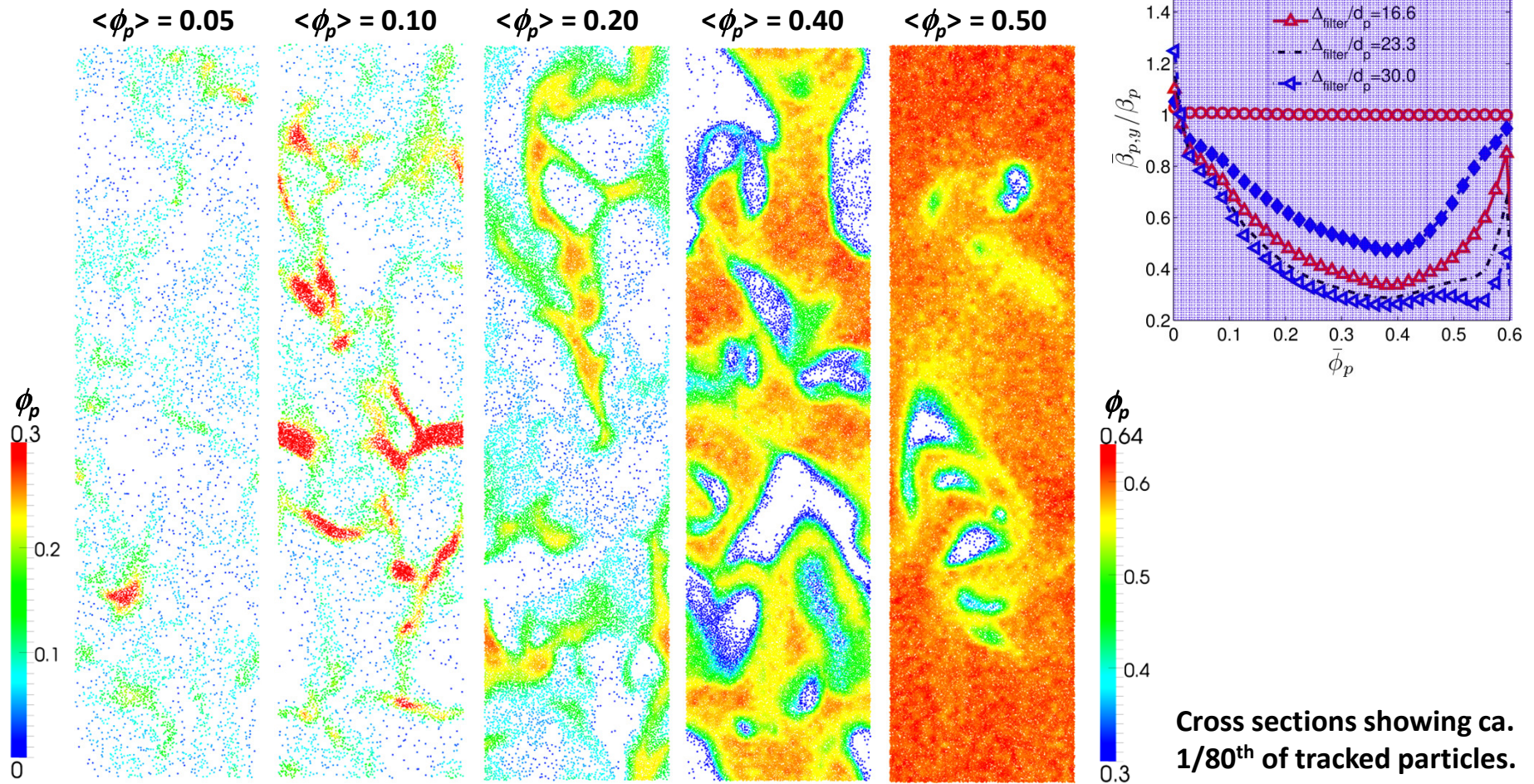
Filtered quantities at particle location

- Filtered Drag - Results
 - Clustering leads to a **drag reduction** for $\phi_p > 0.02$.
 - The correction is huge (**-75%**).



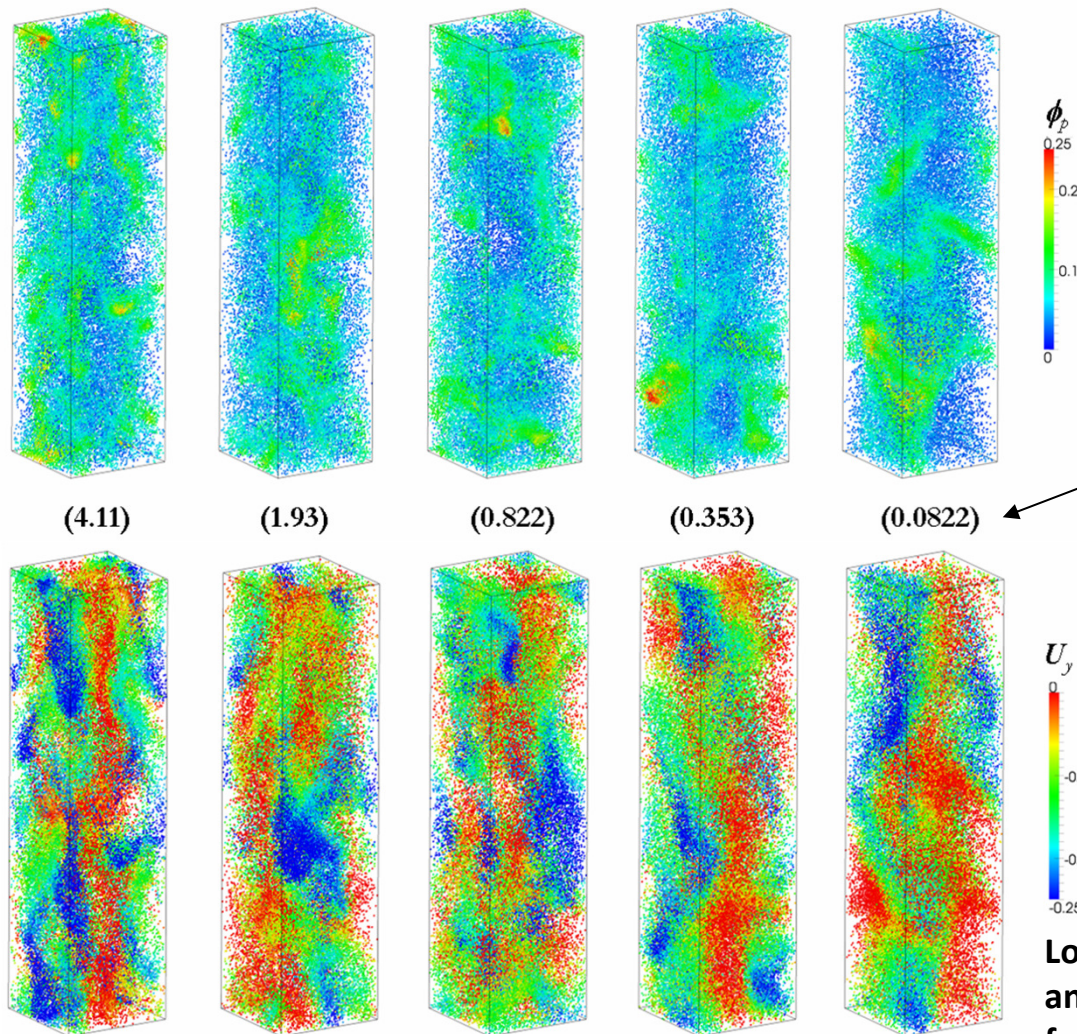
Filtered Drag Model

- Clustering and its Effect on Drag



Filtered Drag Model

- Reference Length Scale Justification



Q: Does our model also work for systems **other** than $d_p = 75 \mu\text{m}$ and $Re \approx 1$?

Δ_{domain}/L_{ref}

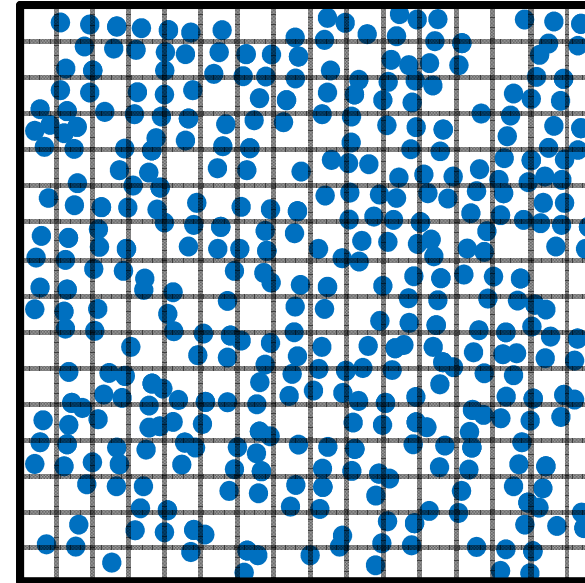
...obviously, we should take $L_{ref} = u_t^2 / g$ into account when using a filtered model!

Local particle volume fraction (top row)
and vertical particle velocity (bottom row)
for various dimensionless domain sizes.

Coarse Grid Simulations

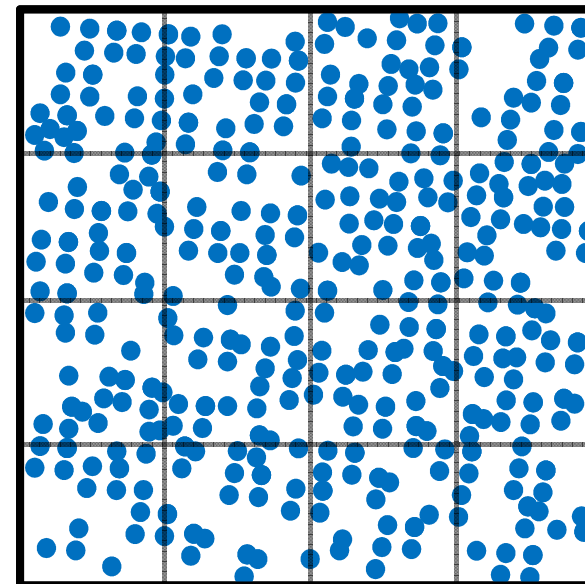
1. CFD-DEM

- Micro-scale drag law
- **Fine fluid grid**
- Track **all the particles**
- Obtain filtered drag law #1



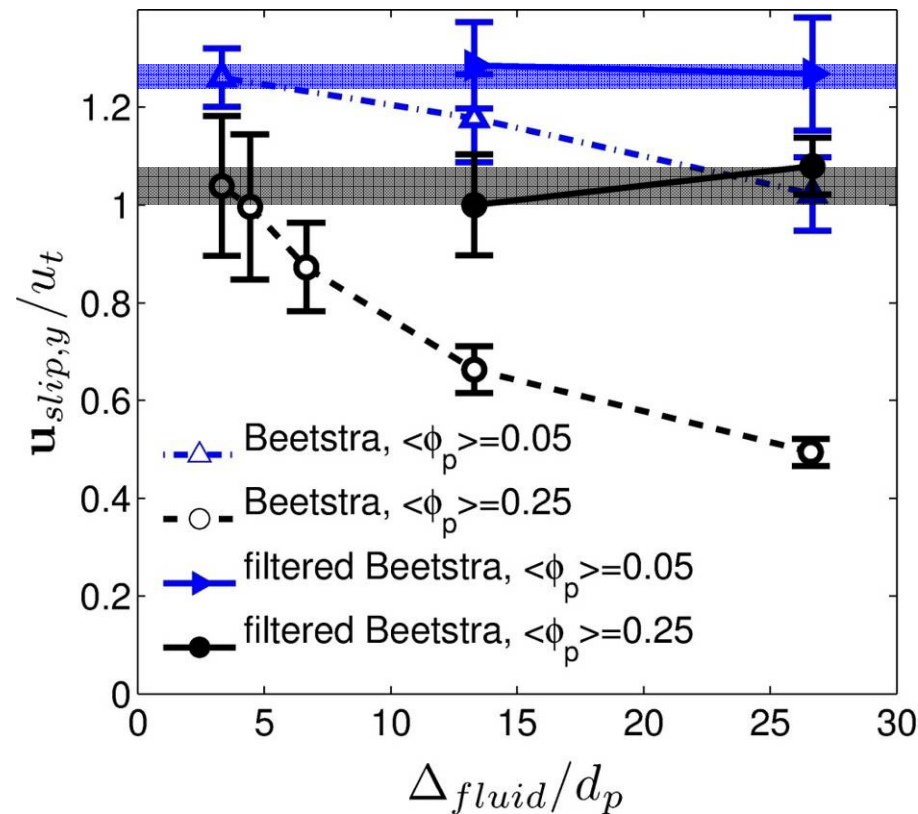
2. Coarse Grid CFD-DEM

- Use filtered drag law #1
- **Coarse fluid grid**
- Track **all the particles**



Coarse Grid Simulations

Q4: Do CFD-DEM and Coarse Grid CFD-DEM yield the same results?



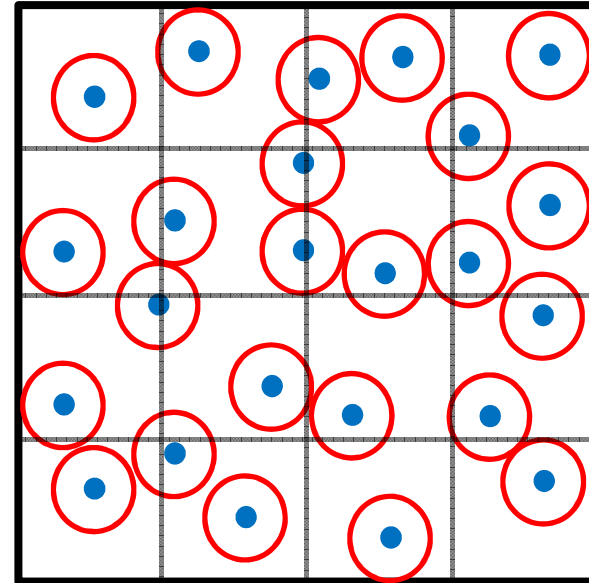
- Large decrease of slip velocity if using “**standard**” Beetstra drag law **(-53% for $\langle \phi_p \rangle = 0.25$)**.
- Coarse Grid CFD-DEM with **filtered drag law** is within **+2% ($\langle \phi_p \rangle = 0.05$)** and **$\pm 3.8\%$ ($\langle \phi_p \rangle = 0.25$)** of well-resolved CFD-DEM!

75 μm particles, 8 x 32 x 8 mm domain, 0.46M - 2.32M particles.

Coarse Grid Simulations

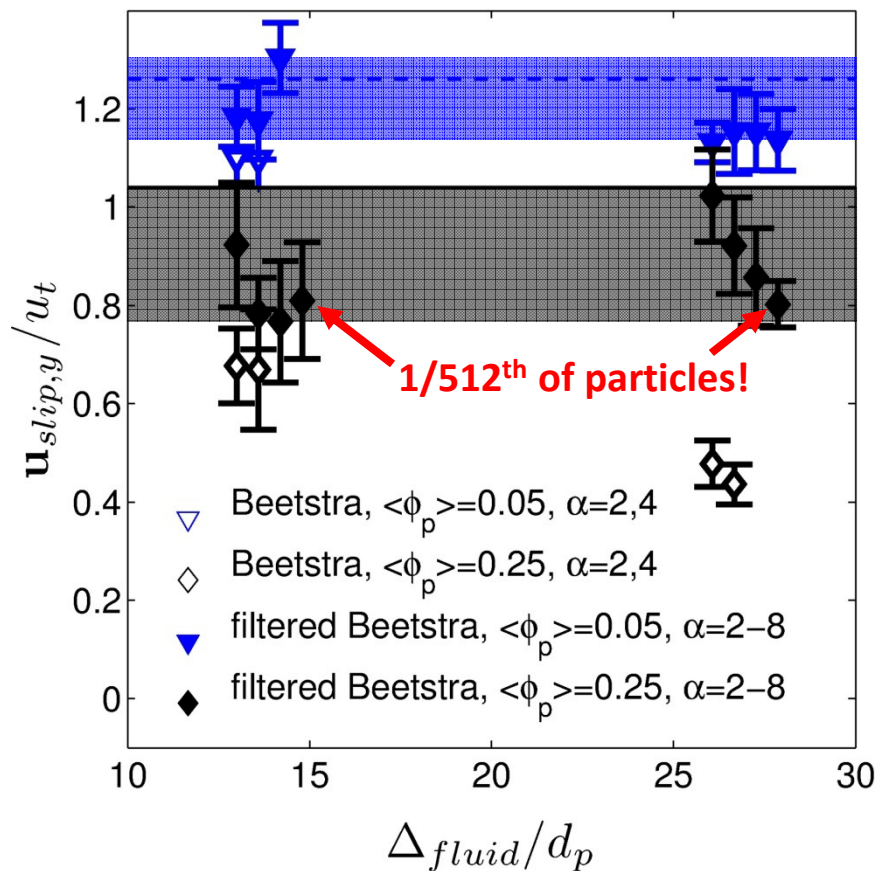
3. CFD-DPM

- Use filtered drag law #1
- **Coarse fluid grids**
- Track **parcels**
- Obtain filtered drag law #2
(future work)



Coarse Grid Simulations

Q5: Do **CFD-DEM** and **CFD-DPM** yield the same results?



- CFD-DPM with “standard” drag law significantly under-predicts slip (**-58% for $\langle \phi_p \rangle = 0.25$**).
- **Filtered drag law** improves results, but still significant under prediction: **-22% ($\langle \phi_p \rangle = 0.25$)**
- Now, we introduce a correction to **account for parcel size**:

$$c_{corr} = \exp[-k(\alpha - 1)]$$

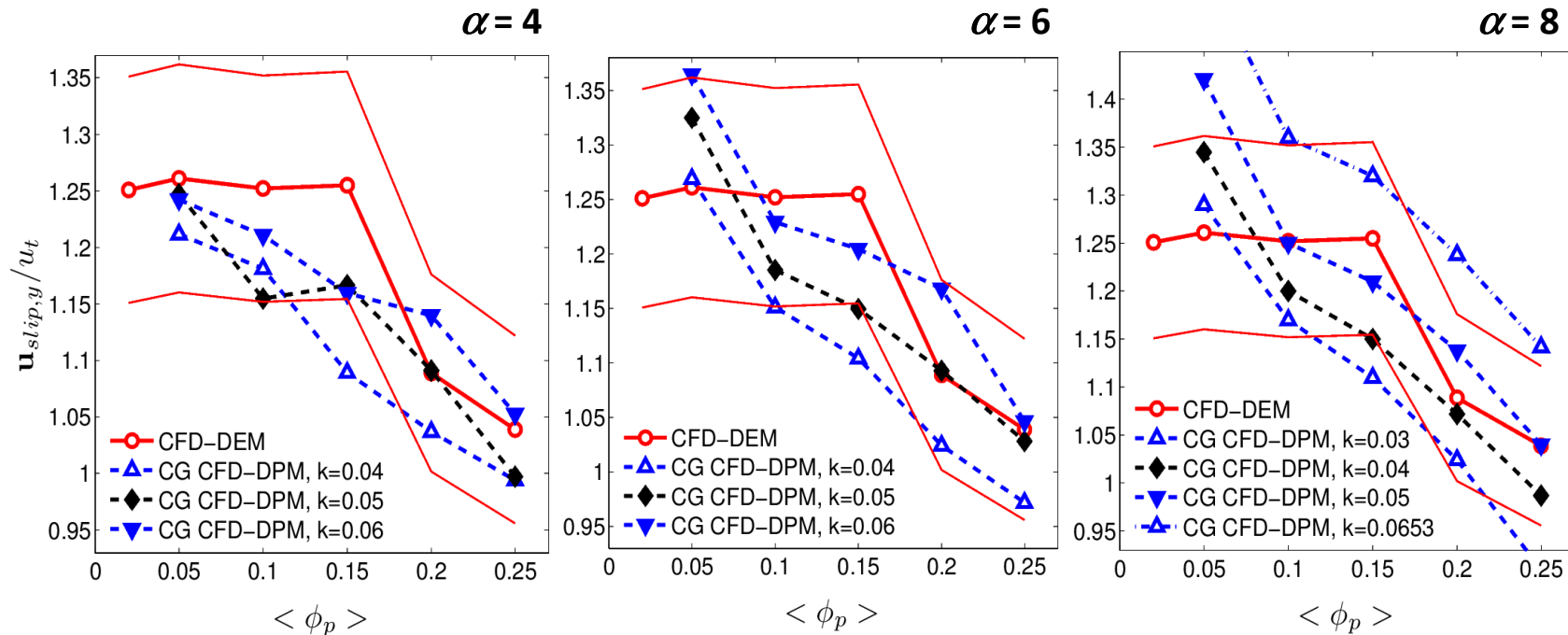
k ... model constant.

75 μm particles, 8 x 32 x 8 mm domain, 0.46M - 2.32M particles, pairs of symbols represent result for $\alpha=2$ (left) and $\alpha=4(8)$ (right), horizontal lines are results for well-resolved CFD-DEM.

Coarse Grid Simulations

Q5: Do **CFD-DEM** and **CFD-DPM** yield the same results?

- Final form of the effective drag model:
$$\frac{\bar{\beta}_p}{\beta_{p,micro}} = c_{corr}(\alpha) \left[1 - f(F_f, \bar{\phi}_p) h(\bar{\phi}_p) \right]$$
- Error now within 8% of resolved CFD-DEM:**



Time-averaged slip velocities (filtered drag model) for various parcel sizes and domain-averaged particle volume fractions $\langle \phi_p \rangle$ (CG...coarse-grid; thin red line indicate a 8% error corridor around the resolved CFD-DEM data).

Summary

Slip Velocity, Wave Speed and Stress

- **Excellent agreement** of CFD-DEM with **fully-resolved simulation** when looking at **clustering and wave speed**.
- Stress (and particle velocity fluctuations / granular temperature) prediction by CFD-DEM **is more challenging for very dense flows of liquid fluidized beds**. A simple fix (i.e., fluctuating drag coefficient¹⁶) did not help – artificially **high friction coefficient yielded acceptable results**.

Filtered Drag Model

- **Grid resolution is essential** for intermediate ϕ_p .
- This applies to **particles (DEM) and parcels (DPM)**!
- **CFD-DPM (1/512th of particles tracked!) within 8%** of resolved CFD-DEM.

¹⁶Kriebitzsch et al., *AIChE J* (in press).

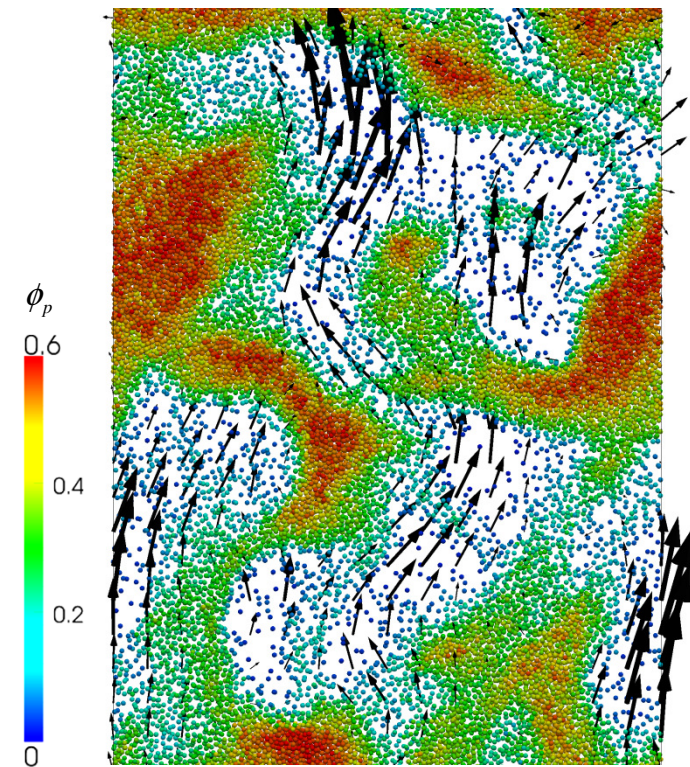
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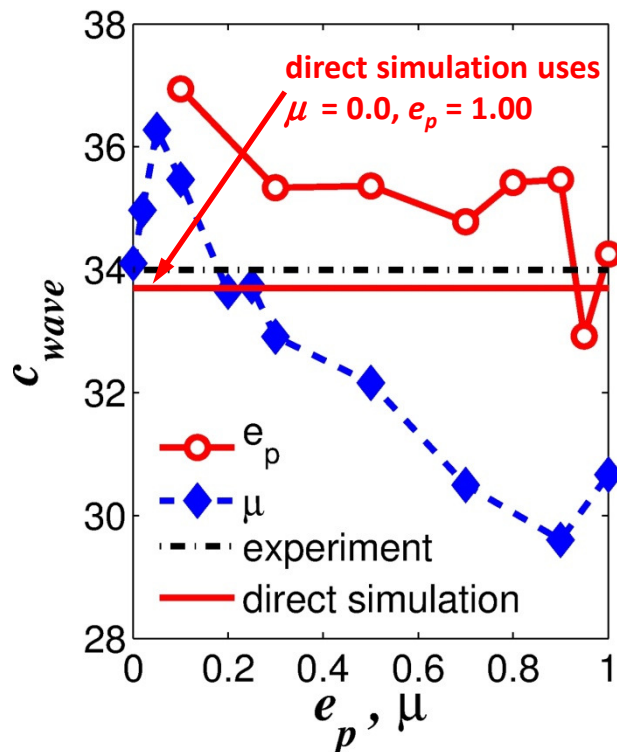
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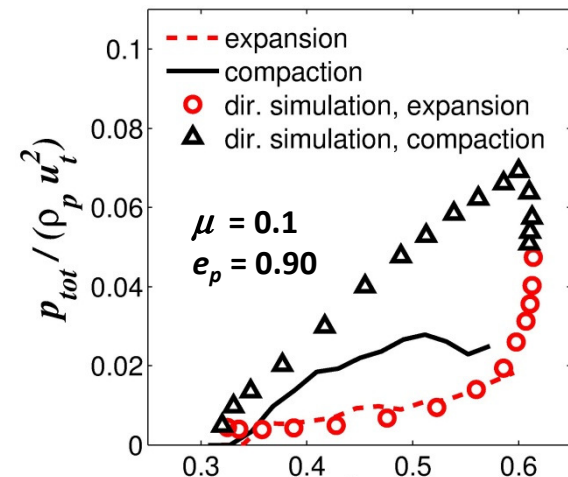
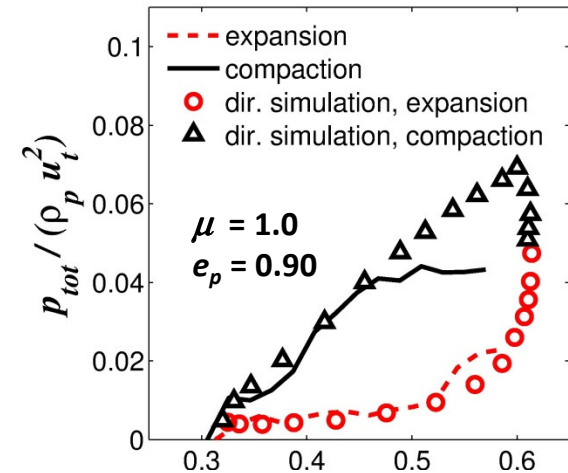
CFD-DEM Validation

Results



Dimensionless wave speed for various particle interaction parameters (base case: $\mu = 0.1, e_p = 0.90$).

- Excellent agreement for the **wave speed**.
- **Stress more challenging.** Good agreement for expansion, however, significant **differences for compaction**.
- **CFD-DEM problematic for extremely dense regions ($\phi_p > 0.50$) in liquid-fluidized beds.**



Particle-phase pressure for extremely frictional (top) and slightly frictional particles (bottom).

Open Positions

ANDRITZ**Christian-Doppler Laboratory
on Particulate Flow Modelling**

1 PhD Researcher

- Computational Modeling of Gas-Liquid-Solid Processes

5 Master Thesis Students

- Experimental Investigation Wet Powder Processes
- Computational Modeling of Gas-Solid Processes