

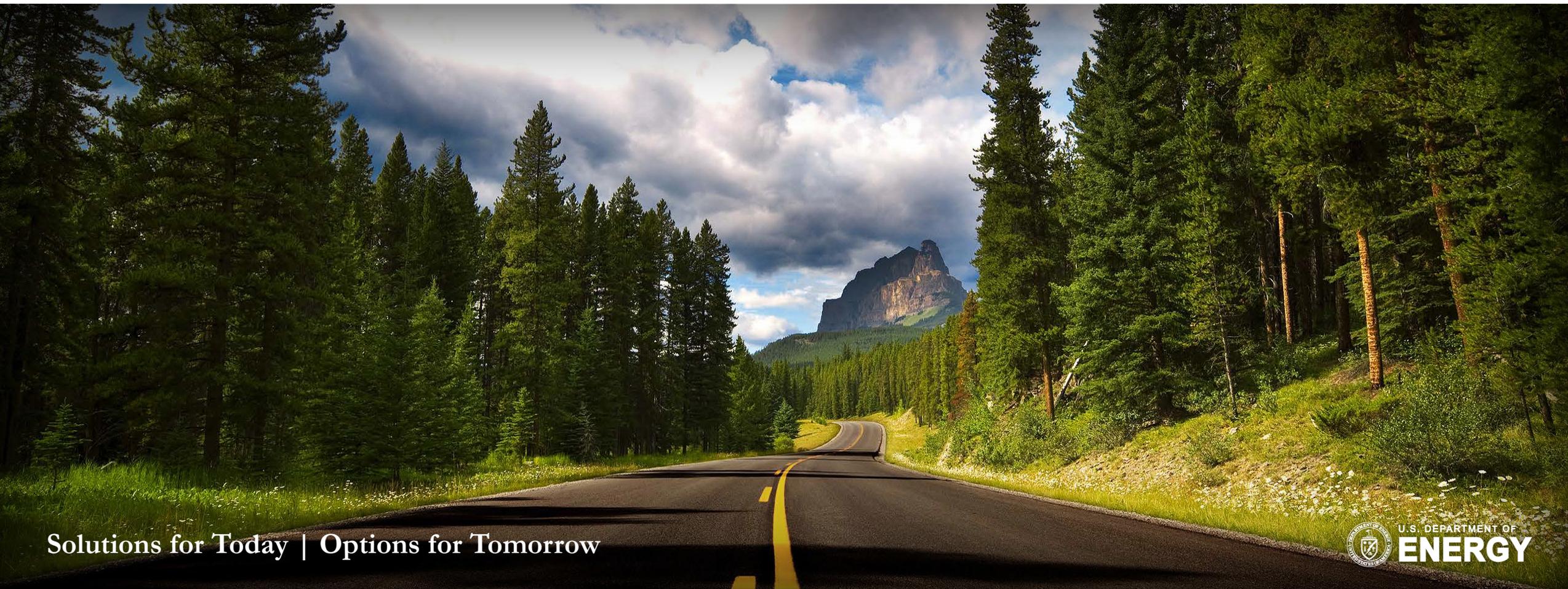
Application of an Efficient Discrete Particle Model to Simulate an Industrial FCC Regenerator



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NETL

2017 NETL Workshop on Multiphase Flow Science

Aug 8, 2017, Morgantown, W.V.



Solutions for Today | Options for Tomorrow

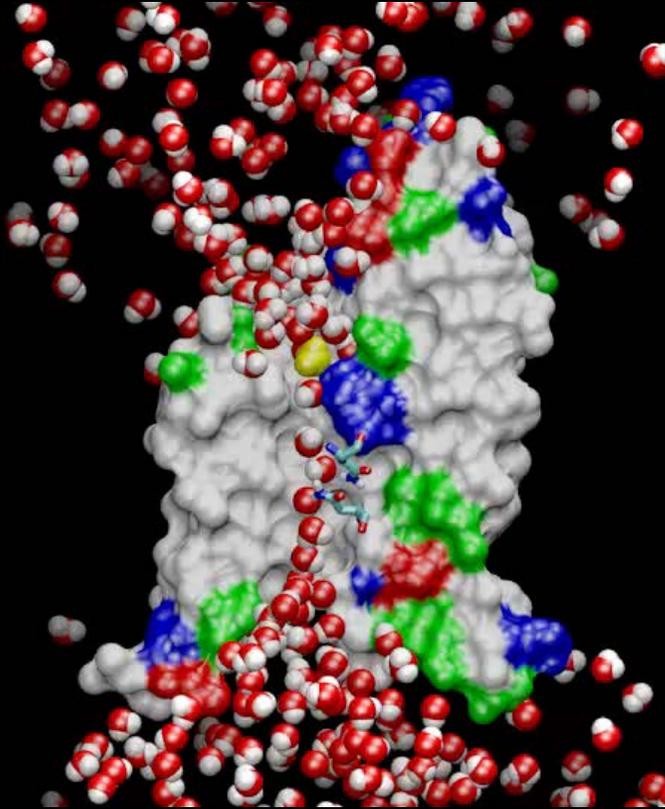


Outline

1. **General Introduction of Discrete Particle Models**
2. Coarse Grained Hard Sphere (CGHS)
3. Verification and Validation of CGHS
4. Simulation of an industrial FCC regenerator using CGHS
5. Concluding remarks

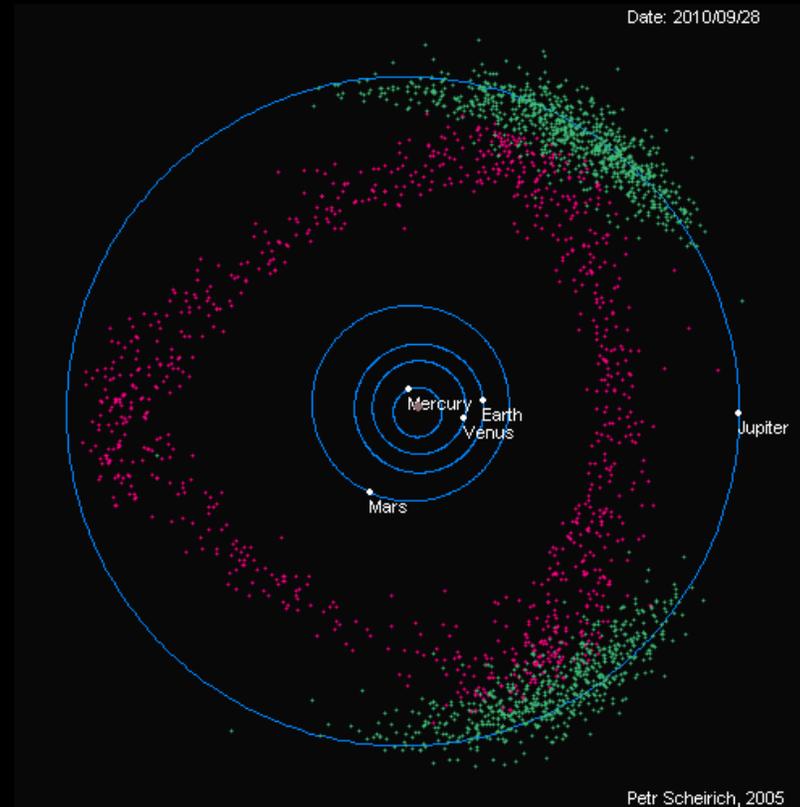
Discrete Particle Models: From Atoms to Planets

Water Molecular in Cell Membrane



<http://www.ks.uiuc.edu/Gallery/Movies/ChannelProteins/>

Asteroids in Solar System



<http://sajri.astronomy.cz/asteroidgroups/groups.htm>

$$dx/dt = v; dv/dt = F/m$$

Based on the **SCALES** of **PARTICLES** and their **INTERACTIONS**

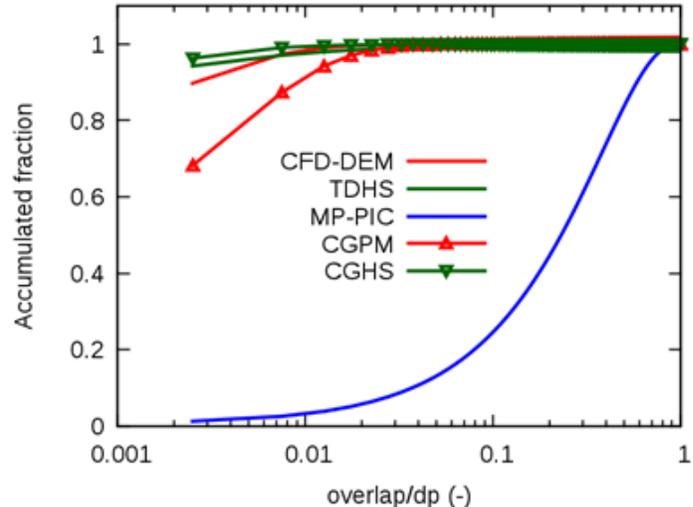
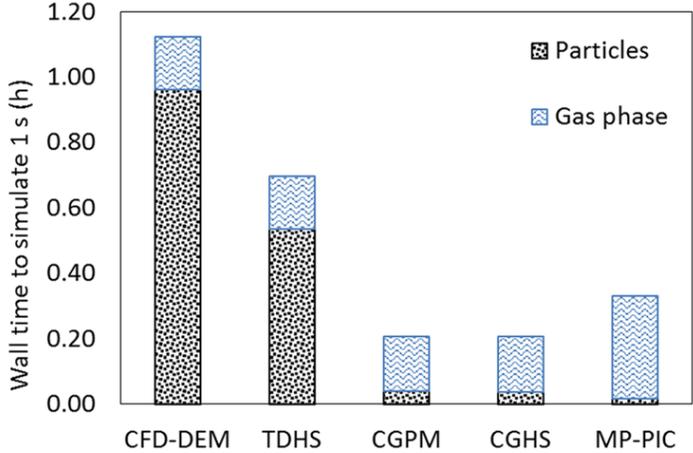
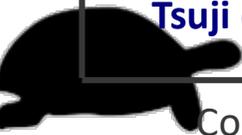
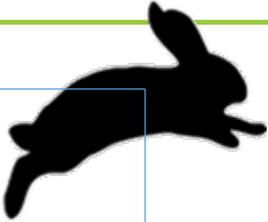
- Molecular Dynamic
- Dissipative Particle Dynamic
- Pseudo-Particle Method
- Hard-Sphere Method
- Discrete Element Method
- Coarse Grained Hard Sphere
- Coarse Grained DEM
- Particle In Cell
- Smooth Particle Hydrodynamics



There is nothing cannot be simulated with DPM. If there is one, just make the particle smaller or larger.

Discrete Particle Models: widely used DPMs in gas-solids flow

Scales		Parcel	
		Particle	
Collision Resolved	<p>CGPM Coarse Grained Particle Method Masaaki et al. 2000 Patankar and Joseph, 2001</p>	<p>CGHS Coarse Grained Hard Sphere Lu et al., 2017</p>	<p>MP-PIC Multi Phase Particle In Cell Andrews and O'Rourke, 1996</p>
	<p>CFD-DEM Computation Fluid Dynamic-Discrete Element Method Tsuji et al., 1993</p>	<p>ED/TD HS Event Driven/ Time Driven Hard Sphere Hoomans et al., 1996 Ouyang and Li, 1999</p>	
		Solid Stress Gradient	P-P Interactions

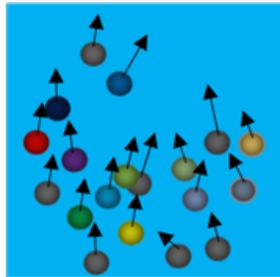


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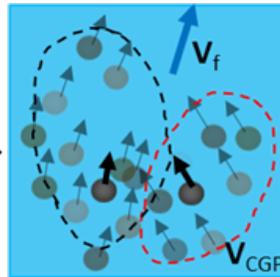
CGHS: Basic Assumptions and different models in CG

Assumptions:

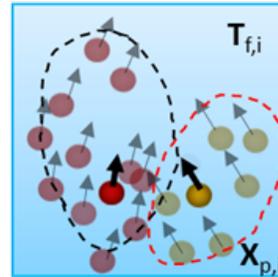


CGPM
 N_p/W

Same Velocity



Same Temperature



A CFD cell of original system
(color stands for different species fraction and temperature, vector stands for velocity)

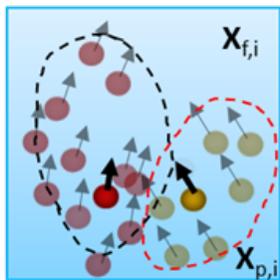
$$\mathbf{I}^{\text{CG}} = \frac{1}{V_{\text{cell}}} \sum_{i=1}^{N_{\text{CGP}}} W_i \mathbf{F}_{\text{drag},i}$$

(a) Drag force

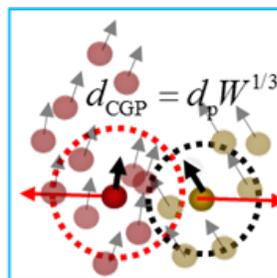
$$S_{st}^{\text{CG}} = \frac{1}{V_{\text{cell}}} \sum_{i=1}^{N_{\text{CGP}}} W_i Q_{i,conv}$$

(b) Heat transfer

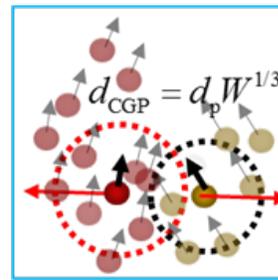
Same species fraction



Lumped into a sphere



Lumped into a sphere



$$R_{f_n}^{\text{CG}} = \frac{1}{V_{\text{cell}}} \sum_{i=1}^{N_{\text{CGP}}} W_i R_{f_n}^i$$

(c) Chemical reactions

$$\mathbf{F}_c = \sum_{j=1, j \neq i}^N (\mathbf{F}_{ij}^n + \mathbf{F}_{ji}^t) / W$$

(d) Collision force

$$\mathbf{T} = \sum_{j=1, j \neq i}^N (\mathbf{L}_n \times \mathbf{F}_{ij}^t) / W^{5/3}$$

(e) Collision torque

	Spring	Dashpot	Friction
M1	$k_{\text{CGP}} = k_p$	$e_{\text{CGP}} = e_p$	$\mu_{\text{CGP}} = \mu_p$
M2	$k_{\text{CGP}} = W k_p$	$e_{\text{CGP}} = e_p$	$\mu_{\text{CGP}} = \mu_p$
M3	$k_{\text{CGP}} = W k_p$	$\ln e_{\text{CGP}} = W^{1/2} \ln e_p$	$\mu_{\text{CGP}} = \mu_p$
M4	$k_{\text{CGP}} = W^{1/3} k_p$	$e_{\text{CGP}} = e_p$	$\mu_{\text{CGP}} = \mu_p$
M5	$k_{\text{CGP}} = k_p$	$e_{\text{CGP}} = (1 - (e_p^2 - 1) W^{1/3})^{1/2}$	$\mu_{\text{CGP}} = \mu_p$

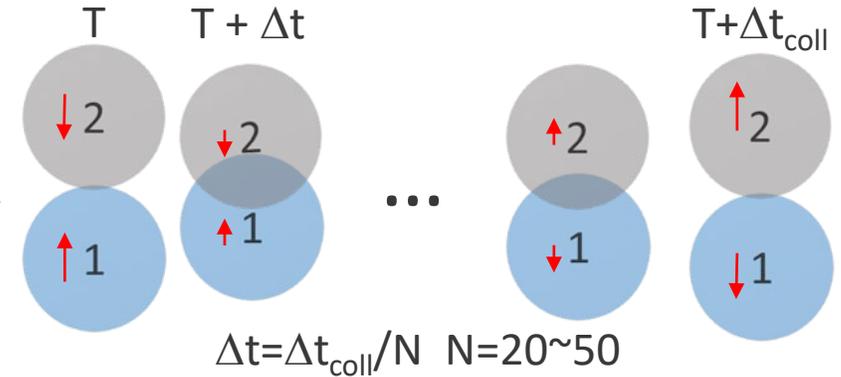
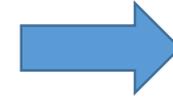
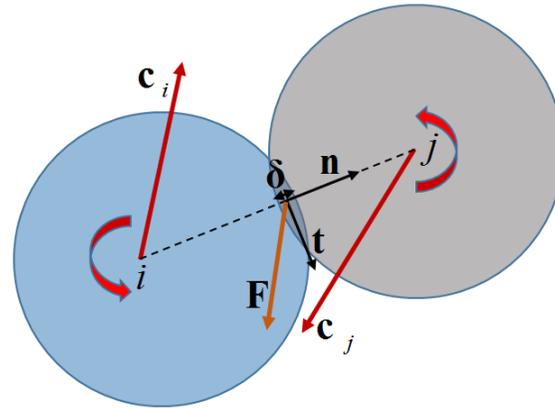
M1	Sakano et al., 2000, Jan. J. Multi. Flow.; Patankar and Joseph, 2001, Int. J. Multi. Flow
M2	Sakai et al. 2009, CES
M3	Benyahia and Galvin, 2010, I&ECR
M4	Radl et al. 2011, 8 th Conf. CFD in Oil & Gas; Thakur et al., 2016 Pow. Tec.
M5	Lu et al. 2014, CES

- Soft-sphere

$$m \frac{d\mathbf{c}_i}{dt} = \mathbf{F}$$

$$I \frac{d\boldsymbol{\omega}_i}{dt} = \frac{d}{2} (\mathbf{n} \times \mathbf{F})$$

\mathbf{F} : contact force

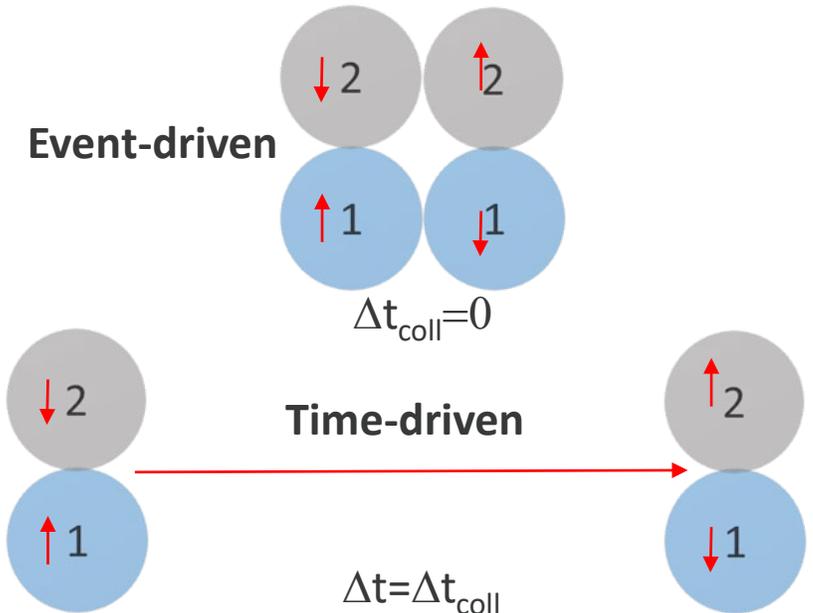
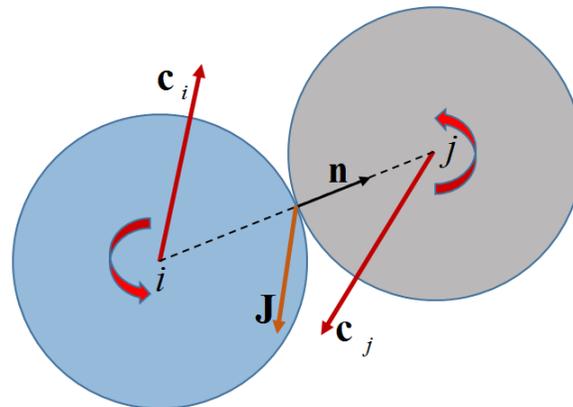


- Hard-sphere

$$m(\mathbf{c}'_i - \mathbf{c}_i) = \mathbf{J}$$

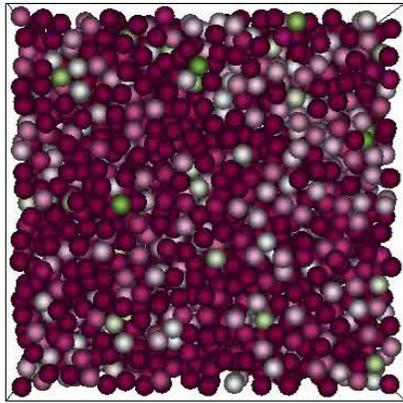
$$I(\boldsymbol{\omega}'_i - \boldsymbol{\omega}_i) = \frac{d}{2} (\mathbf{n} \times \mathbf{J})$$

\mathbf{J} : impulse

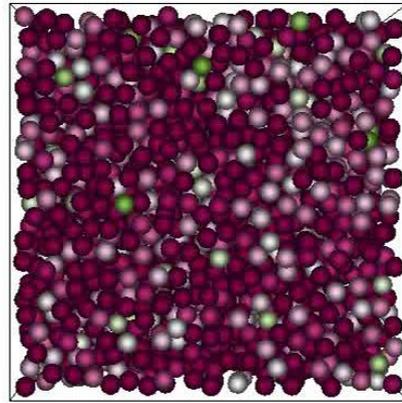


CGHS: Eliminating unphysical overlaps in HS

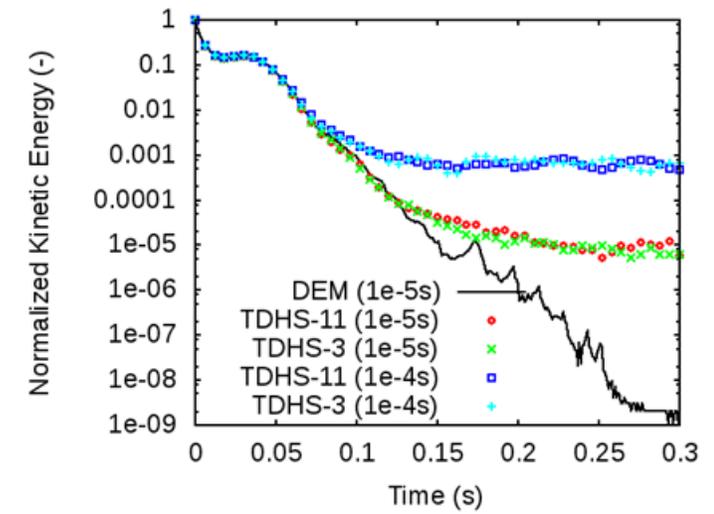
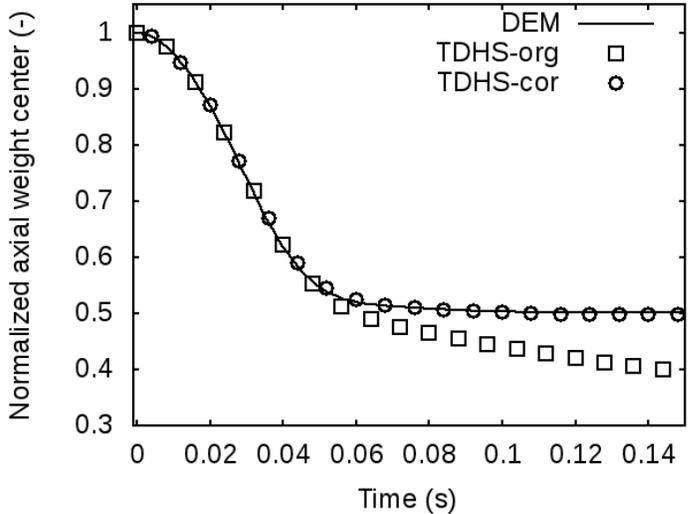
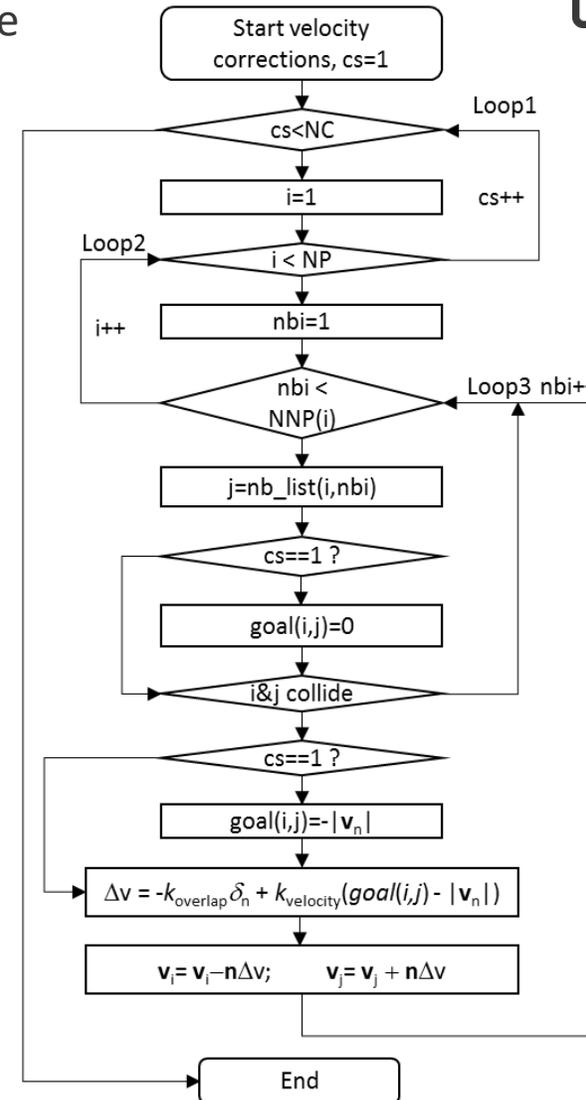
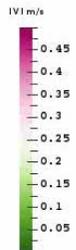
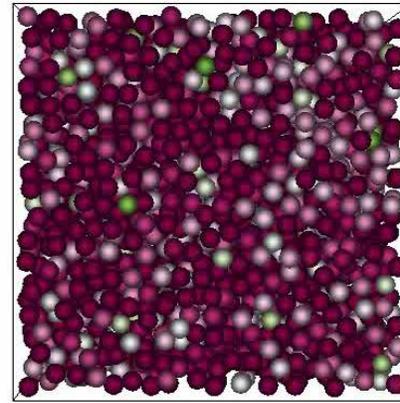
Soft-sphere



Stand hard-sphere



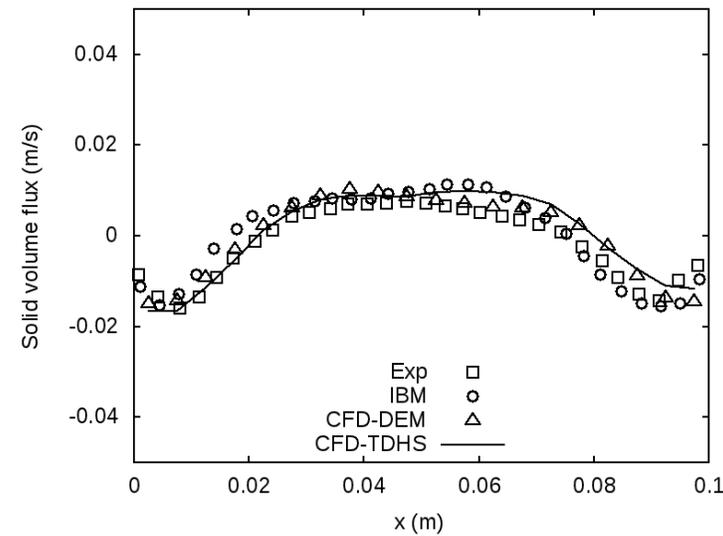
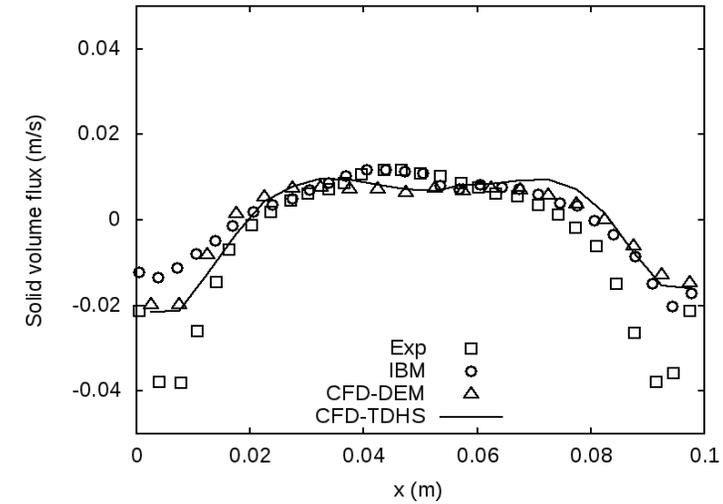
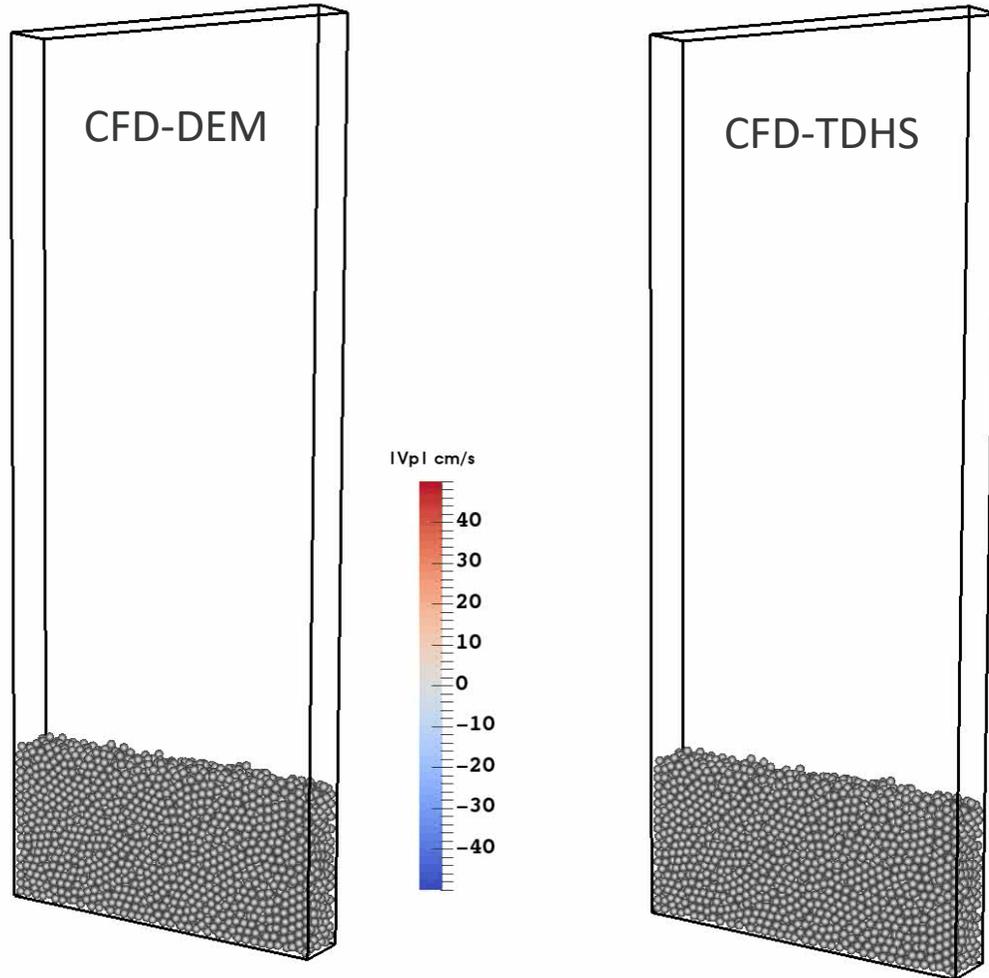
Corrected Hard-sphere



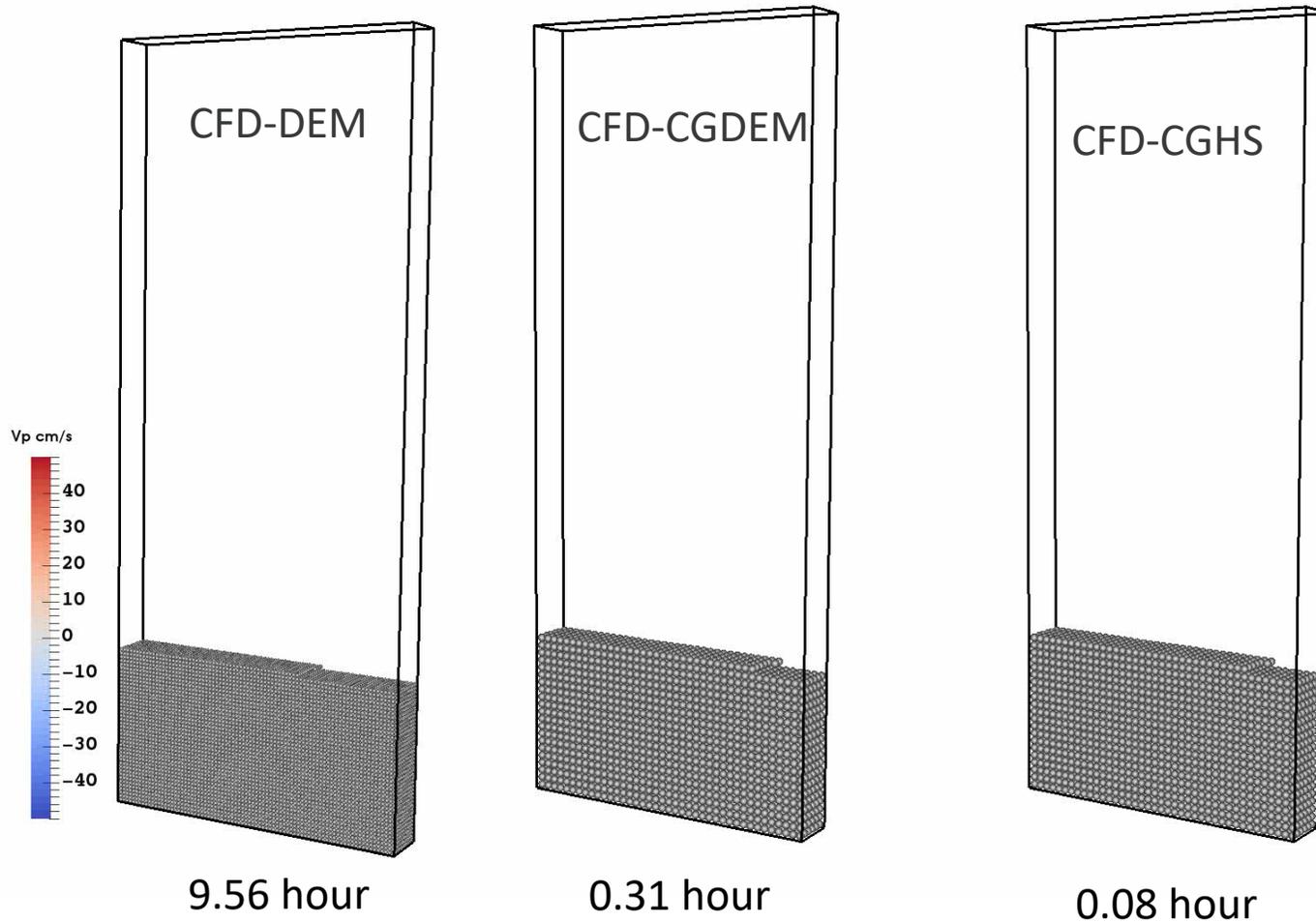
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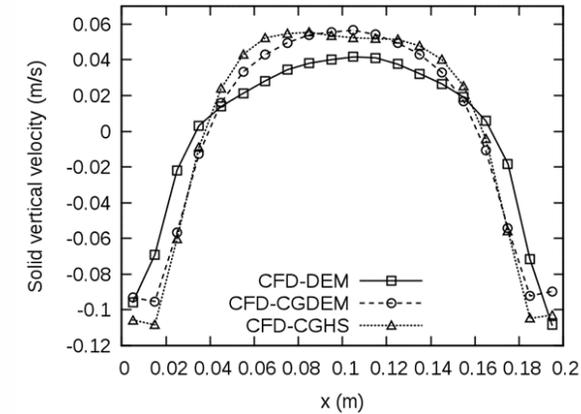
V&V: TDHS in small bubbling fluidized bed



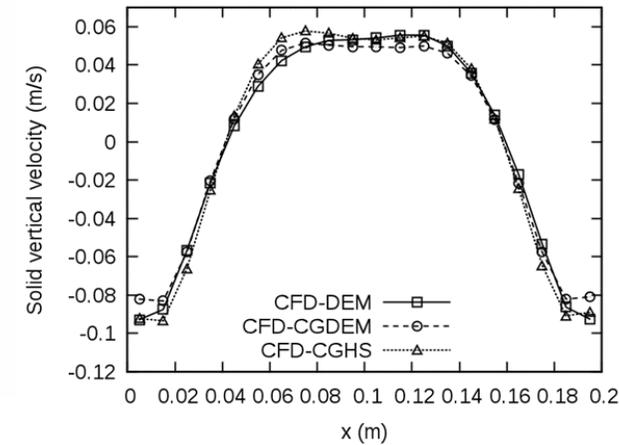
V&V: Verification of CGHS in a virtual bubbling fluidized bed



CPU time for solids phase



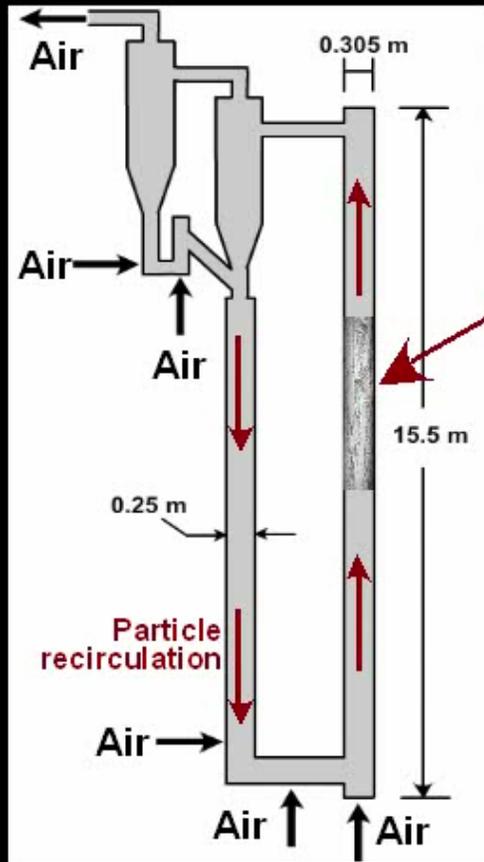
(b) Height = 0.11 m



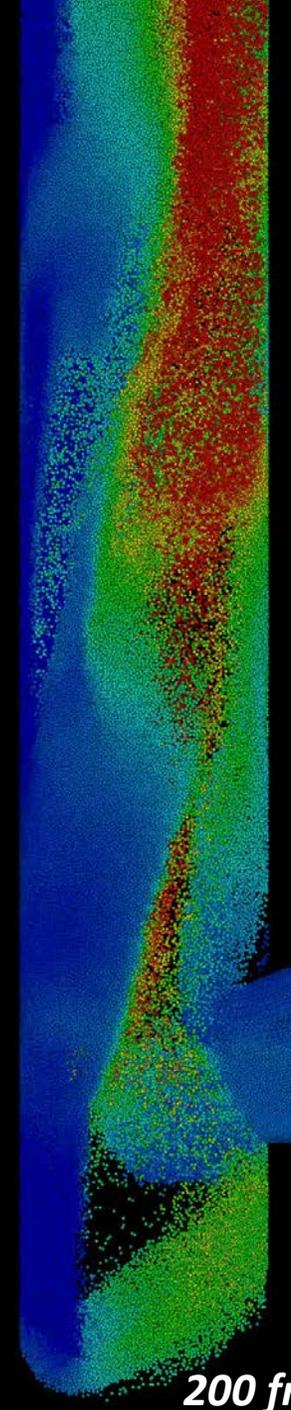
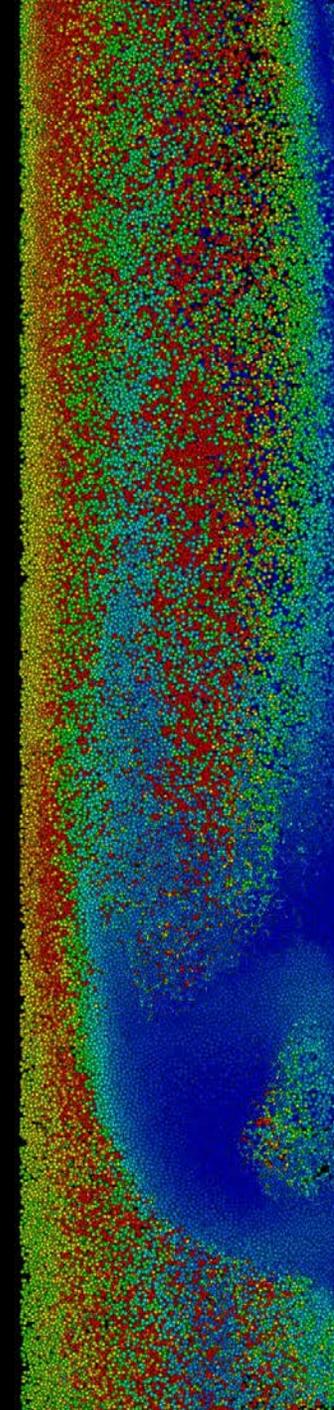
(a) Height = 0.05 m

V&V of CGHS: Validation in large circulating fluidized bed

Particle flow field in NETL's Circulating Fluidized Bed (CFB) system.



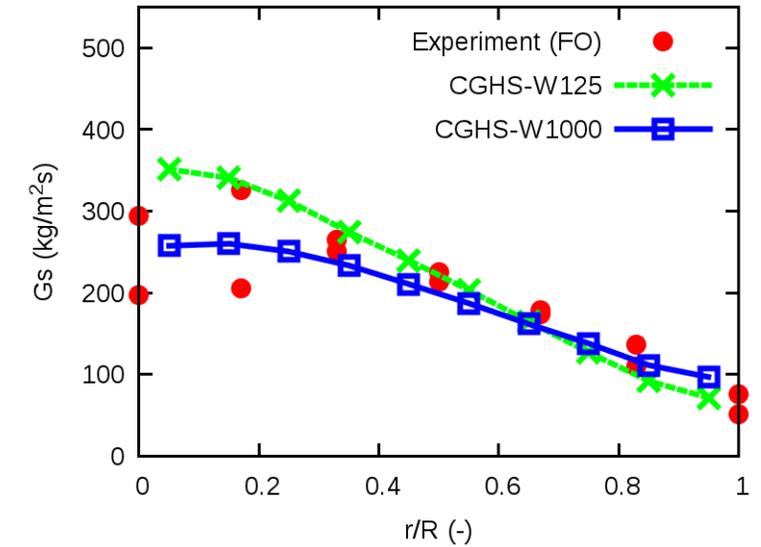
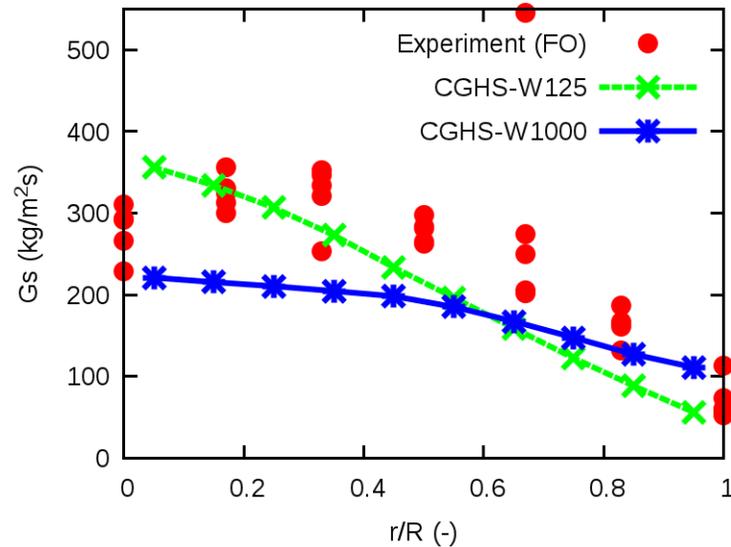
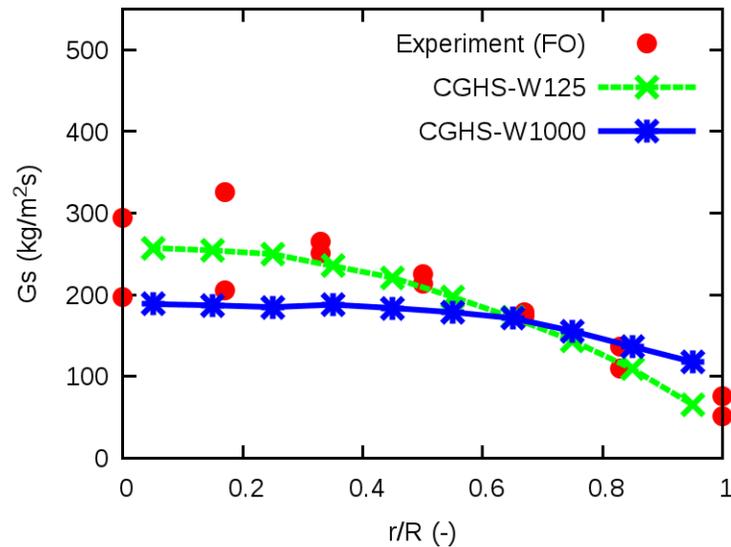
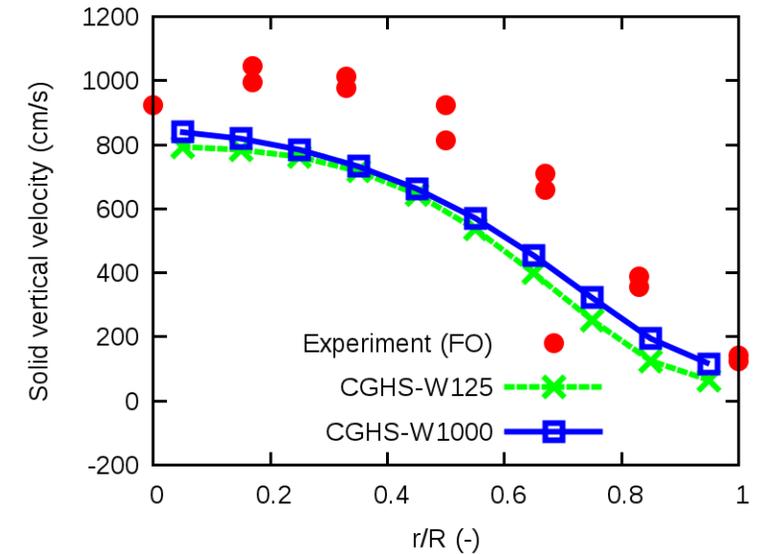
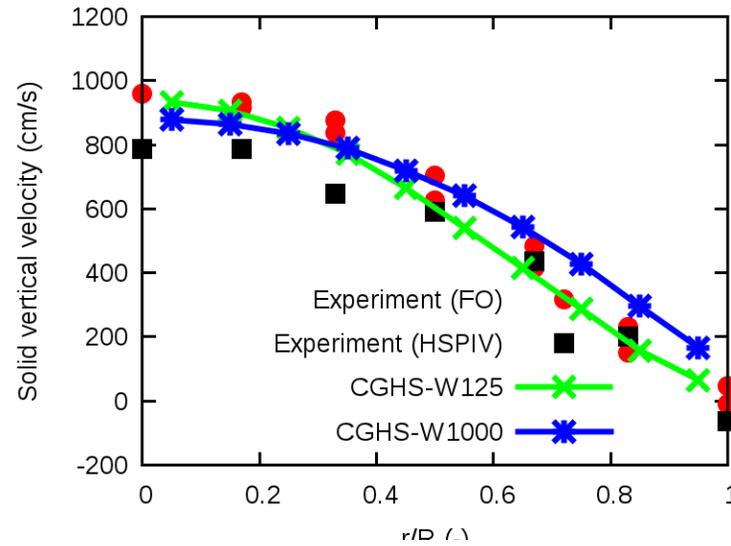
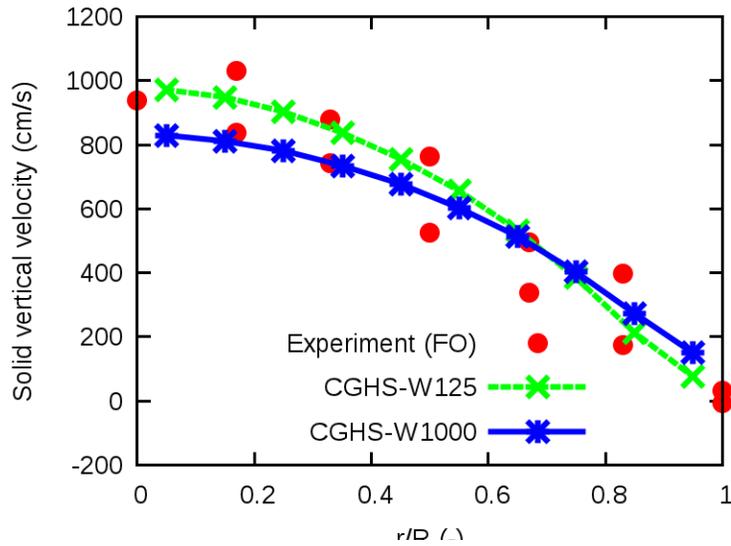
1 m 500 frames/sec

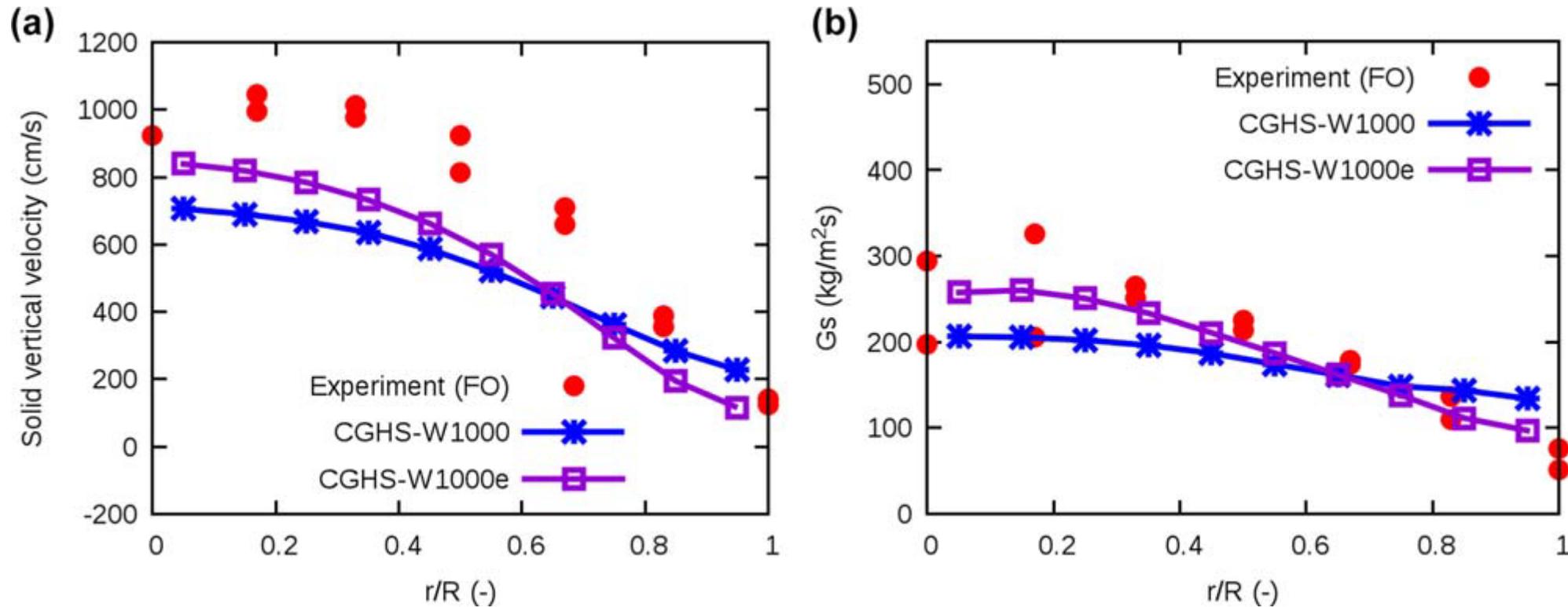


200 frames/sec

Shaffer & Gopalan, PIV

V&V of CGHS: Validation in large circulating fluidized bed





Improvements in radial profiles of solids vertical velocity and flux at height 13.33 m from case W1000 ($e = 0.5$) to case W1000e ($e = 0.14$).

- **Collision parameters**

- [Benyahia S, Galvin JE. 2010, Estimation of Numerical Errors Related to Some Basic Assumptions in Discrete Particle Methods. *Ind. Eng. Chem. Res.* 49\(21\):10588-10605.](#)
- [Lu, L., Xu, J., Ge, W., Yue, Y., Liu, X., Li, J., 2014. EMMS-based discrete particle method \(EMMS–DPM\) for simulation of gas–solid flows. *Chemical Engineering Science* 120, 67-87.](#)

- **Chemical reactions**

- [Lu, L., Yoo, K., Benyahia, S., 2016. Coarse-Grained-Particle Method for Simulation of Liquid–Solids Reacting Flows. *Industrial & Engineering Chemistry Research* 55, 10477-10491.](#)

- **Heat transfer**

- [Lu, L.; Morris, A.; Li, T.; Benyahia, S., 2017. Extension of a coarse grained particle method to simulate heat transfer in fluidized beds. *Int. J. Heat Mass Transfer*, 111, 723-735.](#)

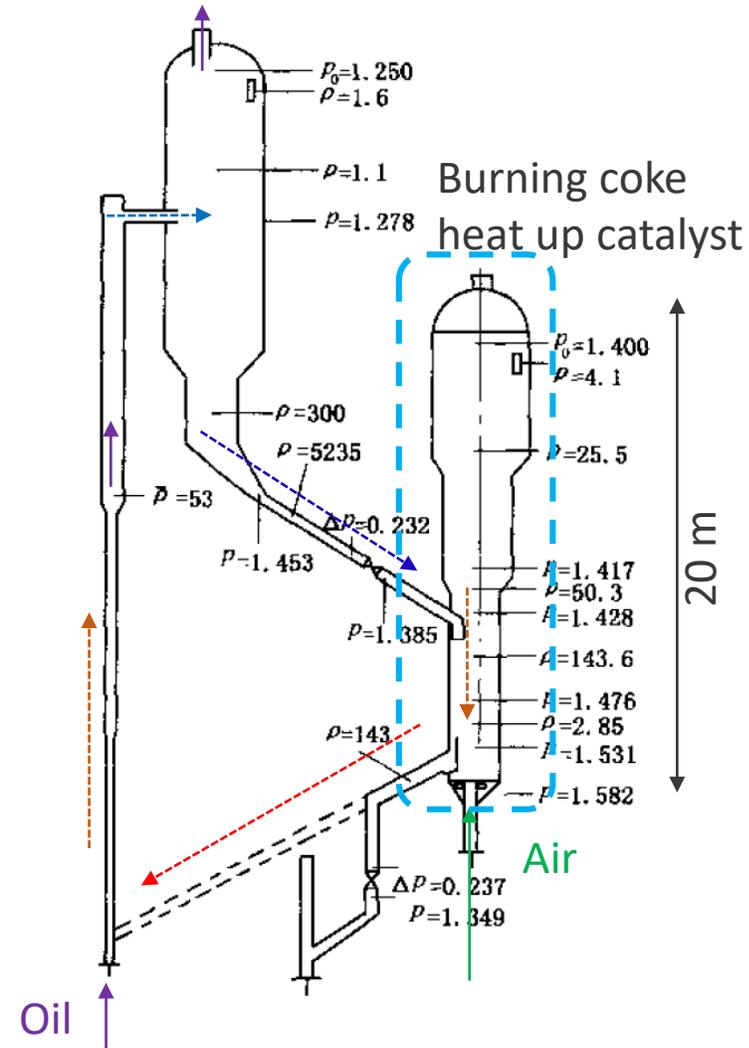
- **Drag corrections/CFD grid/parcel size**

- [Lu, L.; Konan, A.; Benyahia, S., 2017. Influence of grid resolution, parcel size and drag models on bubbling fluidized bed simulation. *Chemical Engineering Journal*, 326, 627-639.](#)

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FCC Regenerator: Geometry and boundary conditions



Boundary conditions

Term	Simulation Value	Industrial data
Bottom inlet air velocity, m/s	0.495	NA (not available)
Bottom inlet air pressure, kPa	160	160
Bottom inlet air temperature, K	573	573
Bottom inlet air oxygen mass fraction	0.2320	0.2320
Bottom inlet air carbon dioxide mass fraction	0.0005	0.0005
Bottom inlet air carbon monoxide mass fraction	0.0000	0.0000
Bottom inlet air water vapor mass fraction	0.0000	0.0000
Bottom inlet air nitrogen mass fraction	0.7675	0.7675
Top outlet pressure, kPa	140	140
Spent catalyst inlet air velocity, m/s	0.5	NA (not available)
Spent catalyst inlet air pressure, kPa	140	NA
Spent catalyst inlet air temperature, K	735	NA
Spent catalyst inlet air oxygen mass fraction	0.0212	NA
Spent catalyst inlet air carbon dioxide mass fraction	0.2617	NA
Spent catalyst inlet air carbon monoxide mass fraction	0.0093	NA
Spent catalyst inlet air water vapor mass fraction	0.0416	NA
Spent catalyst inlet air nitrogen mass fraction	0.6662	NA
Spent catalyst mass flow rate, kg/s	22.7	22.7
Spent catalyst carbon mass fraction	0.00900	0.00900
Spent catalyst hydrogen mass fraction	0.00072	0.00072
Spent catalyst Temperature, K	753	753
Spent catalyst inlet voidage	0.9	NA
Regenerated catalyst outlet pressure, kPa	140	NA
Regenerated catalyst outlet solid mass flow rate, kg/s	22.7	22.7
Walls Momentum transfer	Non slip	NA
Walls Heat transfer	Adiabatic	NA
Walls Species transfer	Zero flux	NA

FCC Regenerator: Numerical parameters

Numerical parameters

Term	Simulation Value
Cartesian grid in x direction	15
Cartesian grid in y direction	90
Cartesian grid in z direction	15
Convection term discrete scheme	Superbee
Linear equation solver	BICGS
Hydrodynamic residual	1.0×10^{-3}
Temperature residual	1.0×10^{-3}
Species residual	1.0×10^{-3}
Gas phase time step, s	Adaptive and no larger than 1.0×10^{-3}
Solid phase time step, s	1.0×10^{-3}
Coarse grained particle diameter, m	0.048
Particle-particle restitution coefficient	0.1
Particle-particle spring constant, kg/s ²	1000
Particle-particle friction coefficient	0.1
Particle-wall restitution coefficient	0.1
Particle-wall spring constant, kg/s ²	1000
Particle-wall friction coefficient	0.1

Computation Speed: 1000 s for 5 days using only 64 cores

Catalyst Space time: 200 s

Correlations for the gas mixture properties

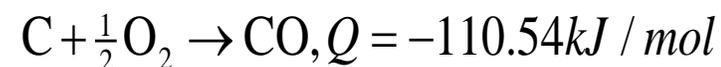
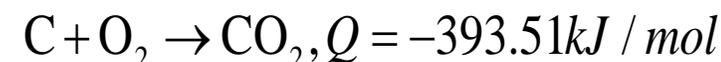
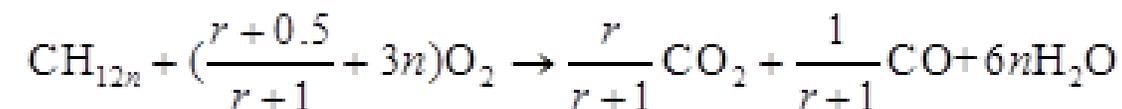
Property	Corrections
Density	$\rho_g = P / RT \sum \frac{Y_{gi}}{M_{gi}}$
Viscosity	$\mu_g = 1.672 \times 10^{-6} \sqrt{T} - 1.058 \times 10^{-5}$
Thermal conductivity	$\lambda_g = 5.526 \times 10^{-5} \sqrt{T} + 0.01155$
Heat capacity	$C_g = \sum Y_{gi} C_{gi}$
Molecular weight	$M_g = 1 / \sum \frac{Y_{gi}}{M_{gi}}$

Drag corrections

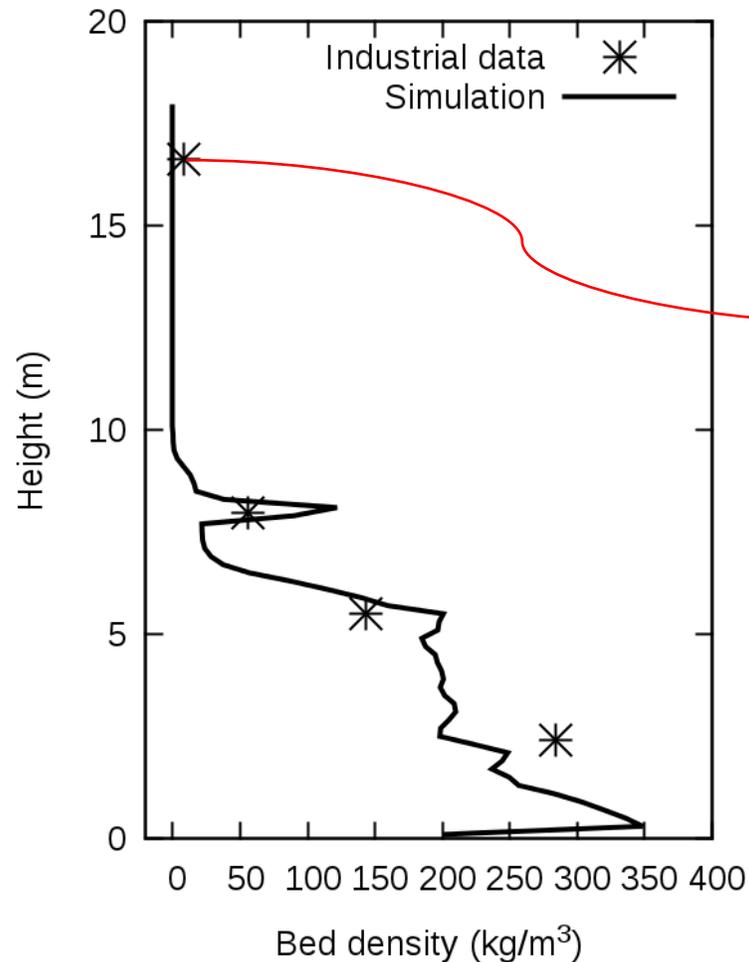
$$\beta_{Gao} = \begin{cases} 150 \frac{(1-\varepsilon_f)^2 \mu_f}{\varepsilon_f d_{p^*}^2} + 1.75 \frac{(1-\varepsilon_f) \rho_f |\mathbf{v}_f - \mathbf{v}_p|}{d_{p^*}}, & \varepsilon_f \leq 0.800 \\ \frac{5 \varepsilon_f (1-\varepsilon_f) \rho_f |\mathbf{v}_f - \mathbf{v}_p|}{72 d_{p^*} (1-\varepsilon_f)^{0.293}} C_{D^*}, & 0.800 < \varepsilon_f \leq 0.933 \\ \frac{3 \varepsilon_f (1-\varepsilon_f) \rho_f |\mathbf{v}_f - \mathbf{v}_p|}{4 d_p} C_{D0} \varepsilon_f^{-2.65}, & 0.933 < \varepsilon_f \leq 0.990 \\ \frac{3 \varepsilon_f (1-\varepsilon_f) \rho_f |\mathbf{v}_f - \mathbf{v}_p|}{4 d_p} C_{D0}, & 0.990 < \varepsilon_f \leq 1.000 \end{cases}$$

Gao, J., Lan, X., Fan, Y., Chang, J., Wang, G., Lu, C., Xu, C., 2009. CFD modeling and validation of the turbulent fluidized bed of FCC particles. *AIChE Journal* 55, 1680-1694.

Chemical reactions and Heat transfer



Chang, J., Wang, G., Lan, X., Gao, J., Zhang, K., 2013. Computational Investigation of a Turbulent Fluidized-bed FCC Regenerator. *Industrial & Engineering Chemistry Research* 52, 4000-4010.

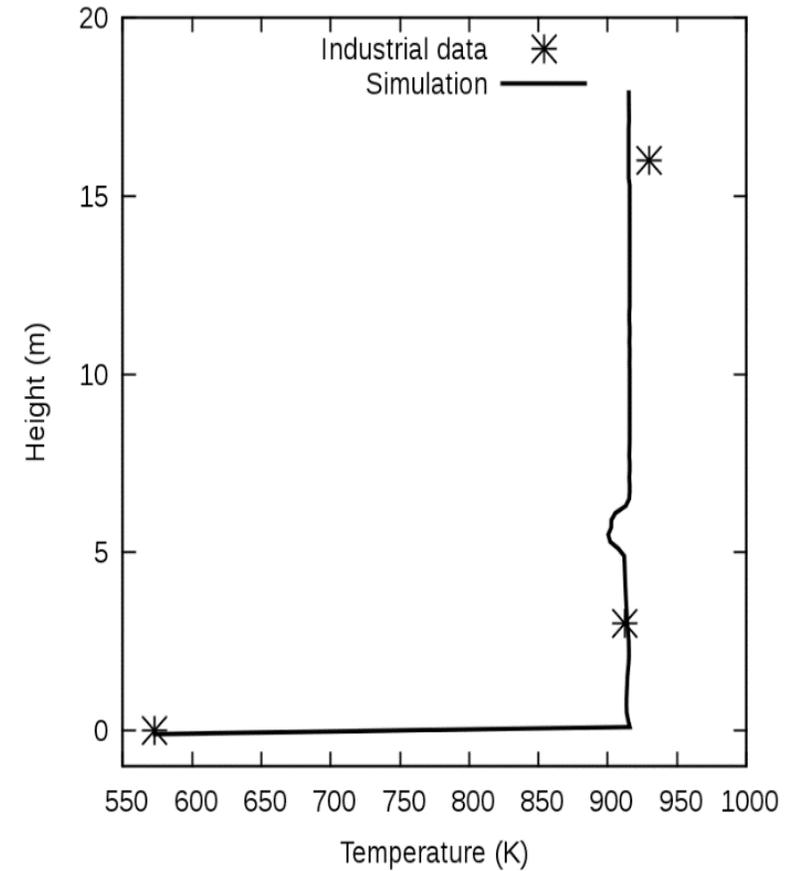
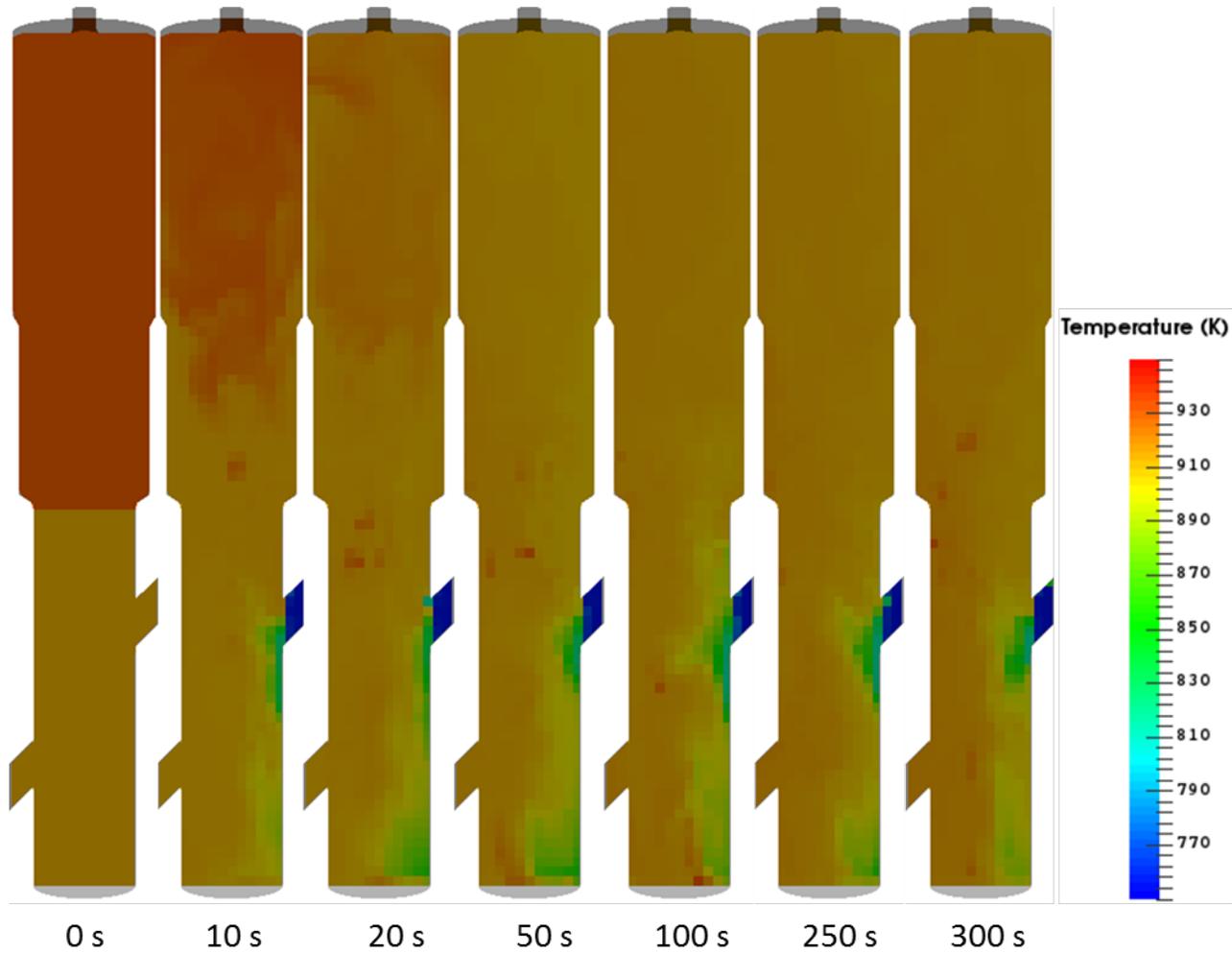


- Exp: very small but still measurable
- Sim: 0

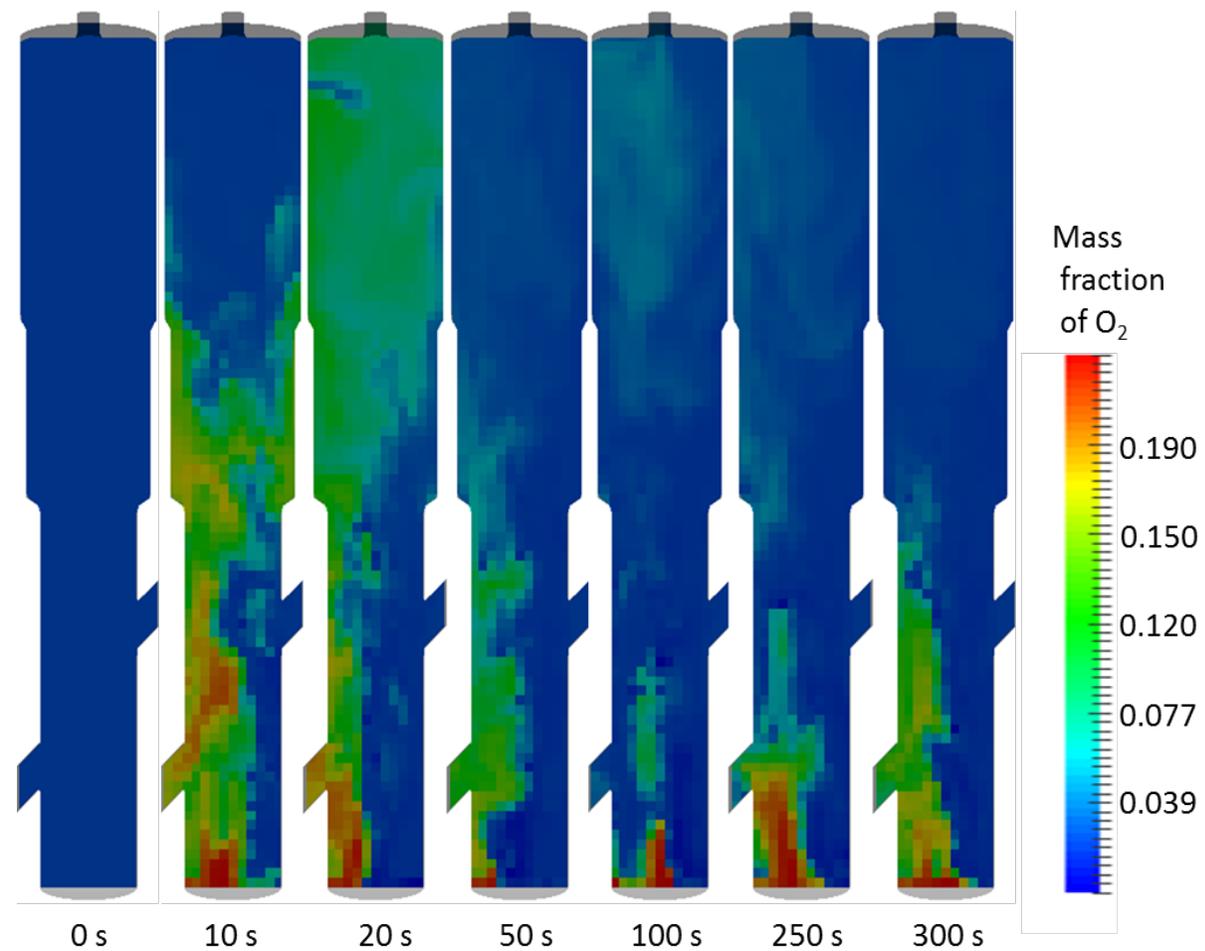
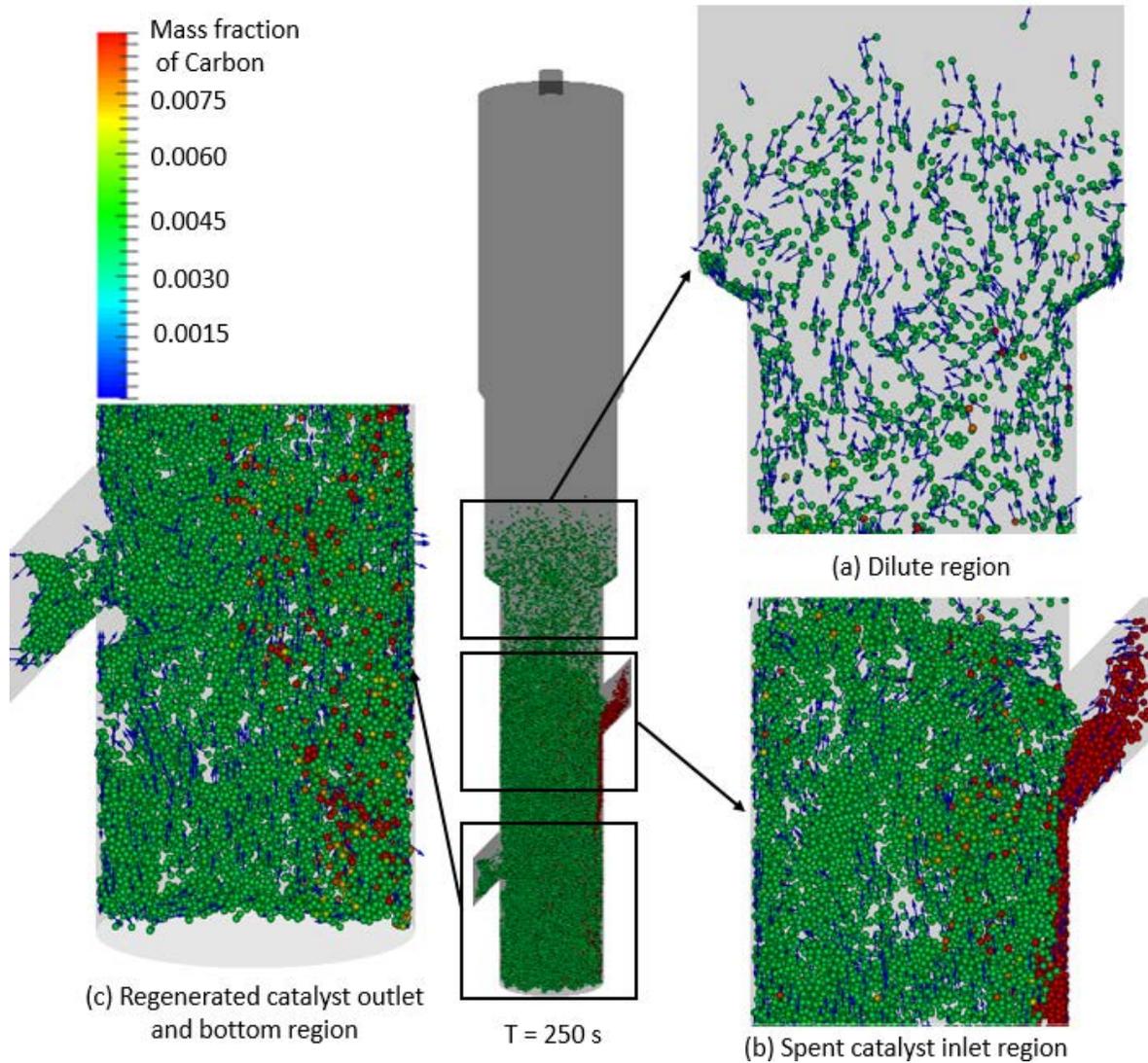
- This PSD was not provided by the industrial data and, so, was not considered in the simulation.
- In reality, small particles, or fines, in a PSD will generally be entrained to the freeboard region. [Grace and Sun, 1991]

Figure 1. Comparison of predicted (averaged from 500 s to 1000 s) bed densities with industrial data

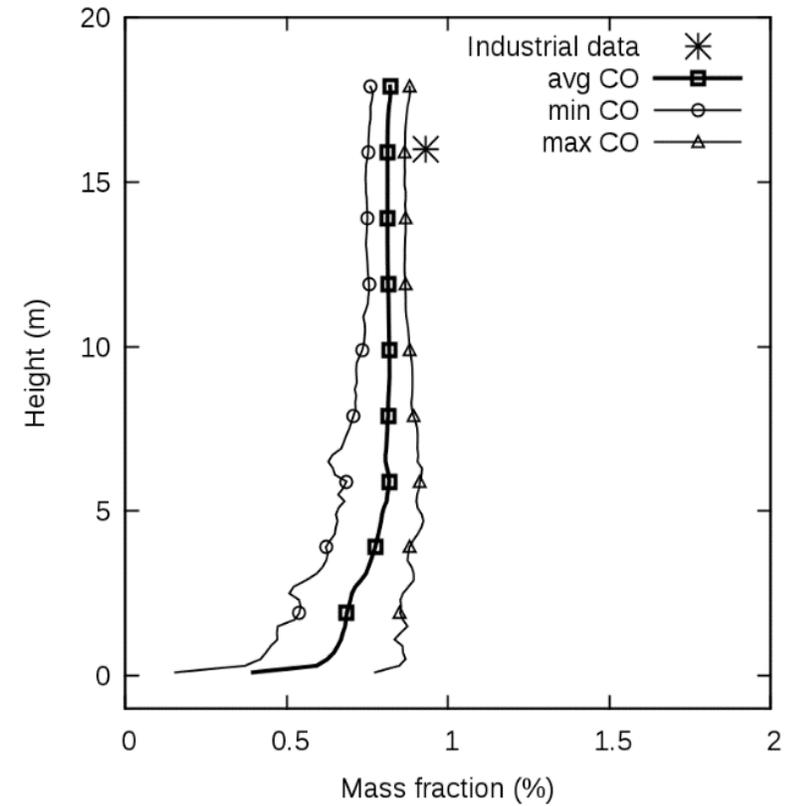
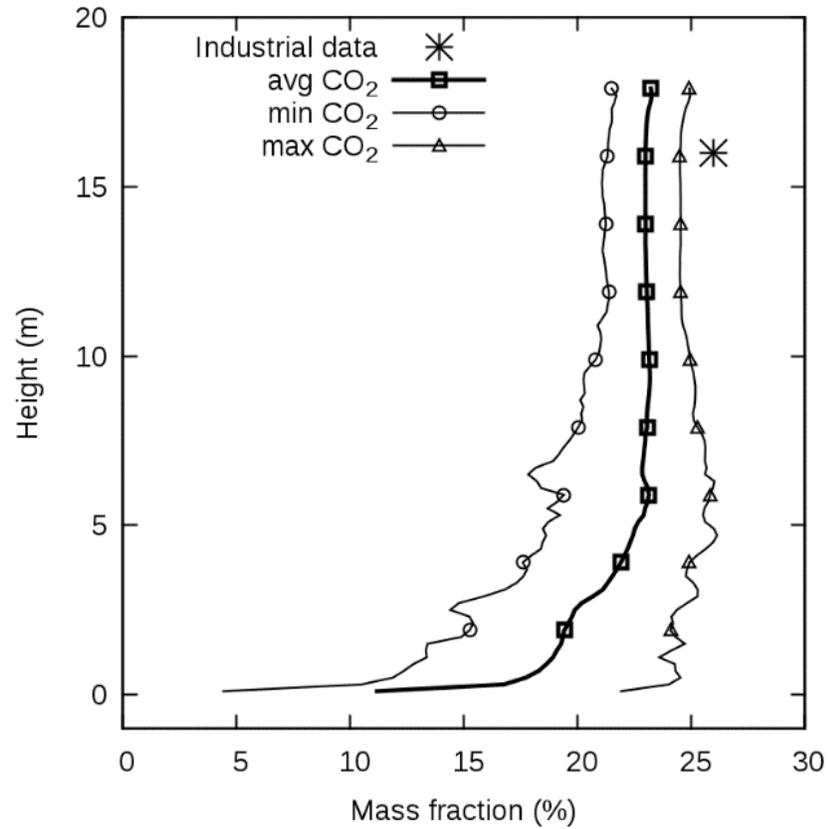
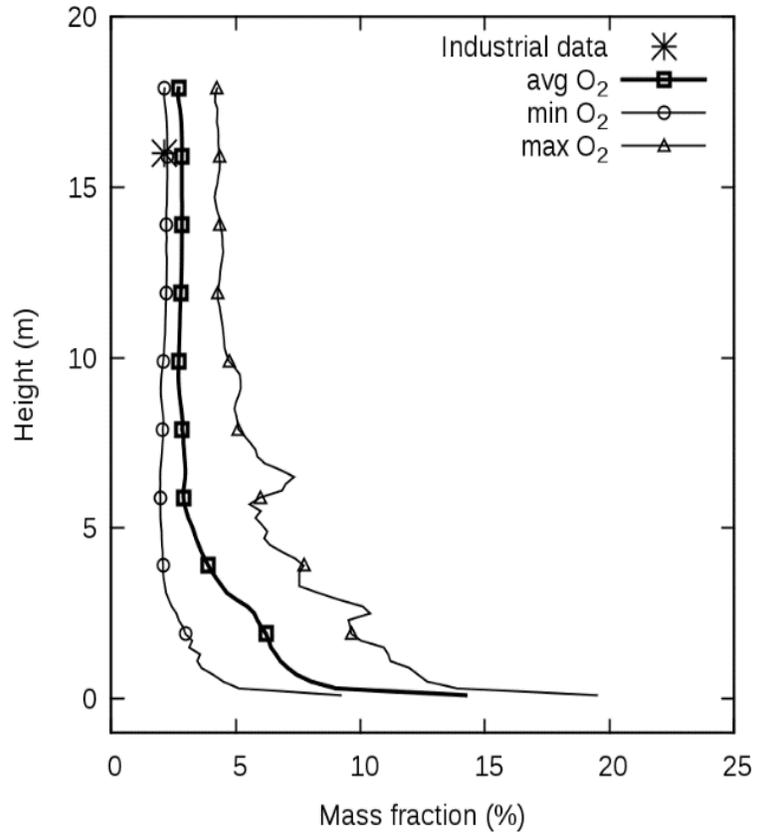
FCC Regenerator: Temperature



FCC Regenerator: Species



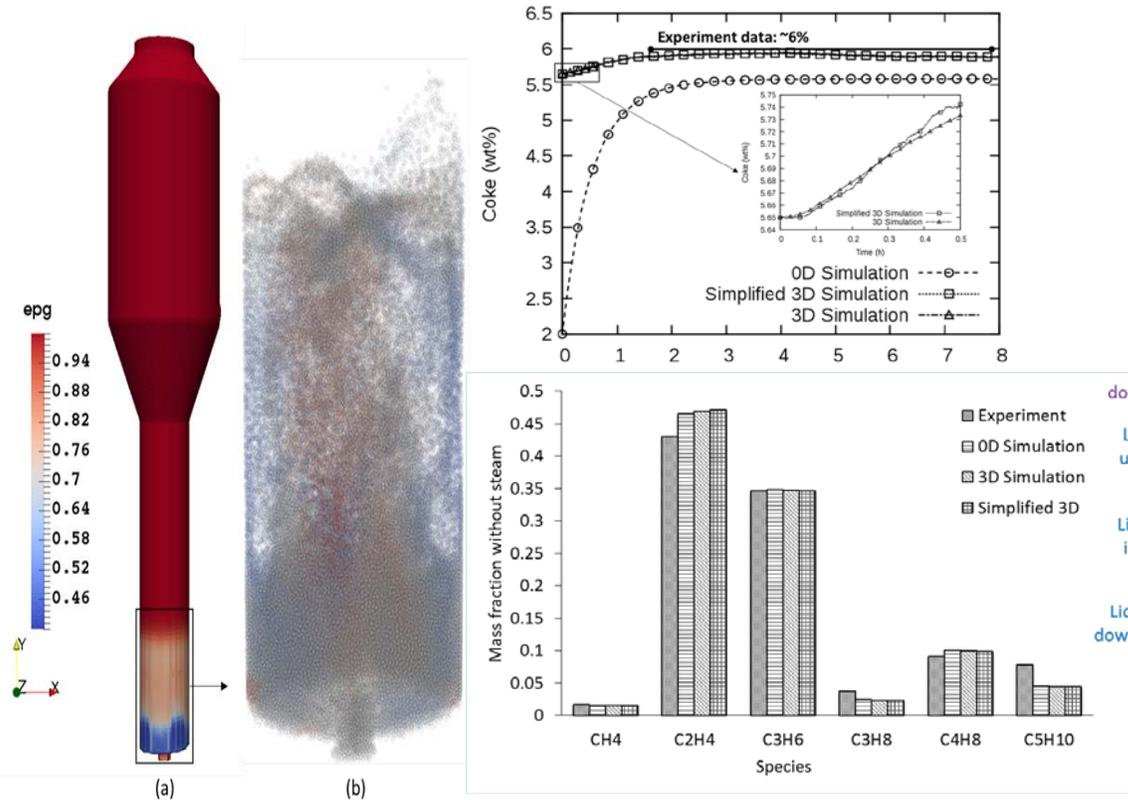
FCC Regenerator: Species



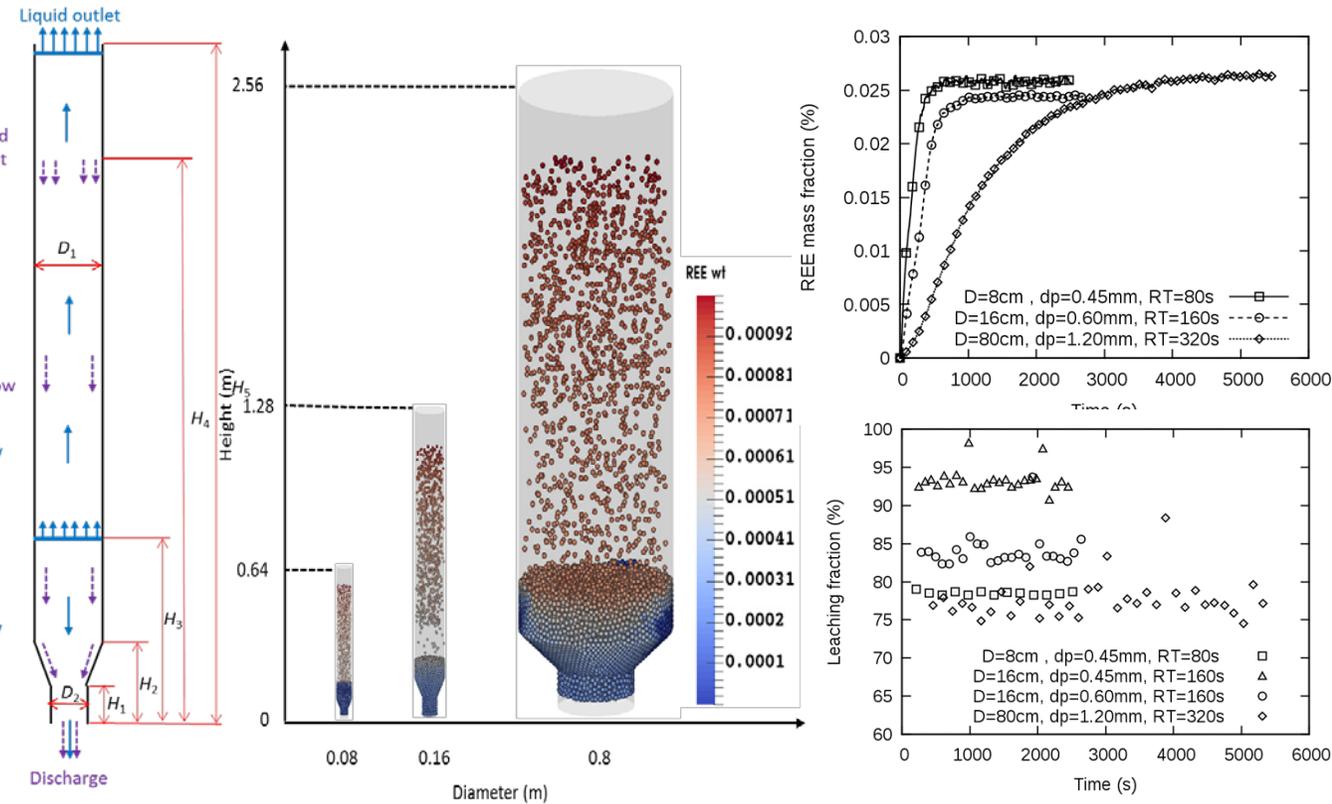
Concluding Remarks

- Simulation of large-scale reactors can be achieved in just few days of wall-clock time using minimal computer resources using CGHS
- The computation accuracy can be improved by reducing time step and parcel size

Methanol-To-Olefins (MTO) Reactor



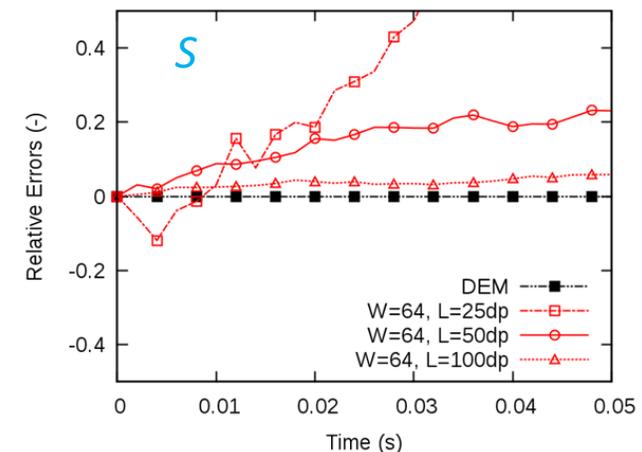
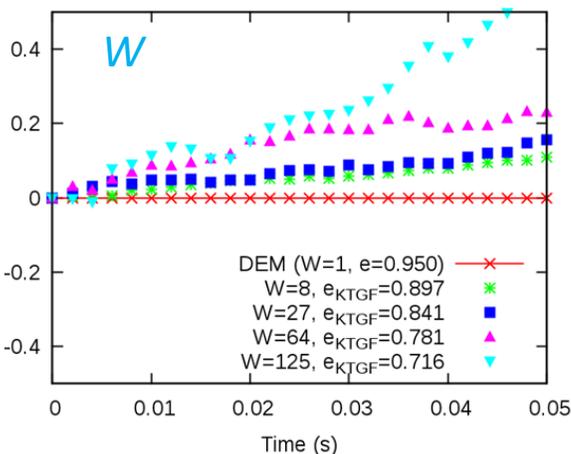
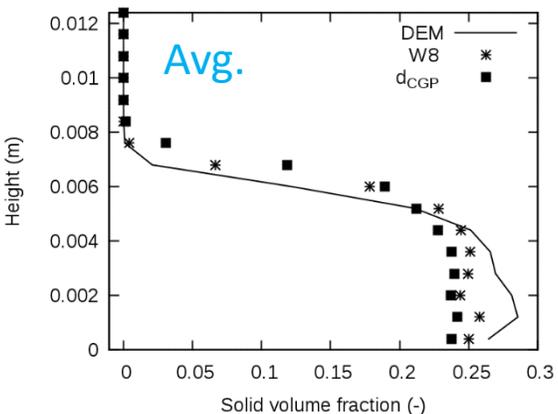
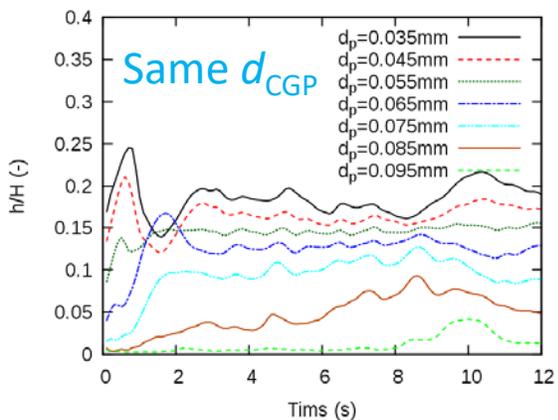
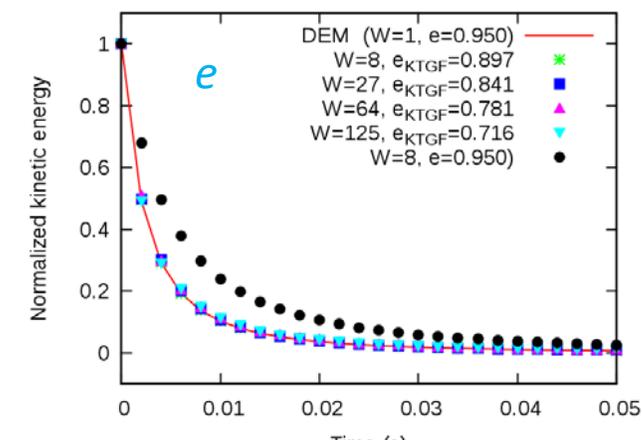
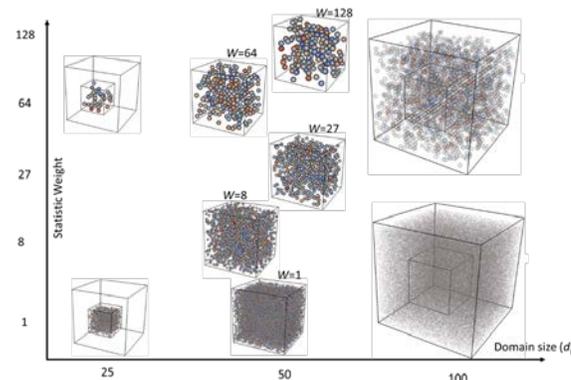
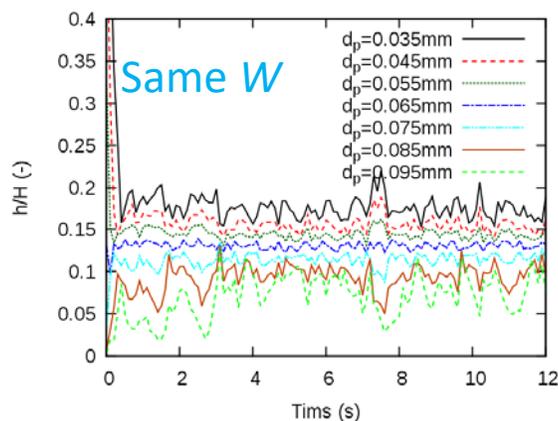
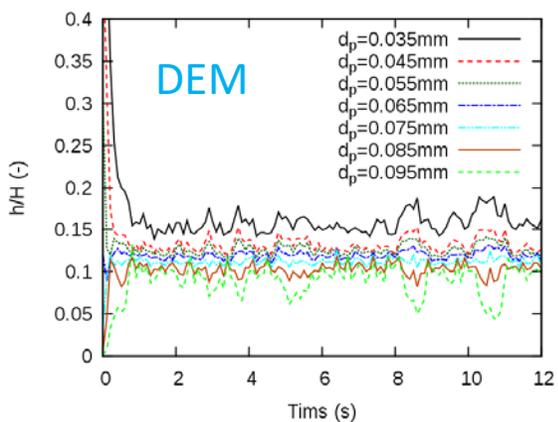
Rare-Earth-Element Leaching Reactor



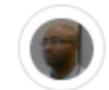
Ongoing Researches

Extension to polydisperse system: FCC particles as an example

Uncertainty Quantifications: Homogeneous cooling as an example



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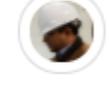
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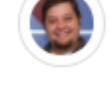
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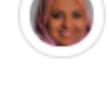
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