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MICRO-SCALE ~ 50µm-mm



Newton's equations of motion for each particle, Navier-Stokes equations for the fluid flow in the interstices.





the interstices.





2 /16

Development of Filtered Two-Fluid Models



- Hydrodynamics (Igci et al, 2011)
 - Filtered drag *
 - Filtered pressure
 - Filtered viscosity

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 - Filtered reaction rate

Development of Filtered Two-Fluid Models



- Hydrodynamics (Igci et al, 2011)
 - Filtered drag *
 - Filtered pressure
 - Filtered viscosity
- Reacting flows (Holloway & Sundaresan, 2012)
 - Filtered reaction rate
- Thermal energy & interphase transport (present work)
 - Filtered energy dispersion
 - Filtered interphase heat transfer
 - Filtered scalar dispersion (no interphase transport)
 - Helium Tracer/Solid Particle Tracer

*Li & Kwauk, 1994; Parmentier et. al, 2011

Two-Fluid Model Equations





Filtered Equations



Filter

$$\overline{\phi_s}(\boldsymbol{x},t) = \int_{V_{\infty}} G(\boldsymbol{x},\boldsymbol{y}) \phi_s(\boldsymbol{x},t) d\boldsymbol{y}$$

 $\int_{V_{\infty}} G(\boldsymbol{x},\boldsymbol{y})(\boldsymbol{x},t) d\boldsymbol{y} = 1$

Filtered Equations



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Favre Filter
$$\widetilde{\alpha_s}(\boldsymbol{x},t) = \frac{\int_{V_{\infty}} G(\boldsymbol{x},\boldsymbol{y}) \alpha_s(\boldsymbol{x},t) \phi_s(\boldsymbol{x},t) d\boldsymbol{y}}{\int_{V_{\infty}} G(\boldsymbol{x},\boldsymbol{y}) \phi_s(\boldsymbol{x},t) d\boldsymbol{y}}$$

Filtered Equations



Filter

$$\overline{\phi_s}(\boldsymbol{x},t) = \int_{V_{\infty}} G(\boldsymbol{x},\boldsymbol{y}) \phi_s(\boldsymbol{x},t) d\boldsymbol{y}$$

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Filtered Solids Thermal Energy Equation

$$\rho_{s}C_{p_{s}}\left[\frac{\partial}{\partial t}(\overline{\phi_{s}}\widetilde{T_{s}})+\nabla\cdot(\overline{\phi_{s}}\widetilde{v_{s}}\widetilde{T_{s}})\right] = \nabla\cdot(\overline{k_{s}}\nabla\overline{T_{s}}) + \overline{\gamma(T_{s}-T_{g})} + \rho_{s}C_{p_{s}}\nabla\cdot\left[\overline{\phi_{s}}\widetilde{v_{s}}\widetilde{T_{s}} - \overline{\phi_{s}}\widetilde{v_{s}}T_{s}\right]$$

$$\uparrow$$

$$\mathsf{'dispersive' flux}$$

Applying Mean Temperature Gradient



Temperature Gradient

$$T_{s} = T_{s}' + \theta(x)$$
$$T_{g} = T_{g}' + \theta(x)$$

$$\frac{\partial \theta}{\partial x} = \chi = constant$$



Applying Mean Temperature Gradient



Temperature Gradient

$$T_{s} = T_{s}^{'} + \theta(x) \qquad \qquad \frac{\partial \theta}{\partial x} = \chi = constant$$
$$T_{g} = T_{g}^{'} + \theta(x)$$



Thermal Energy

$$\rho_s C_{p_s} \left[\frac{\partial}{\partial t} (\phi_s T_s^{'}) + \nabla \cdot (\phi_s \boldsymbol{v}_s T_s^{'}) \right] = \nabla \cdot (k_s \nabla T_s^{'}) + \gamma (T_s^{'} - T_g^{'}) + \chi \frac{\partial k_s}{\partial x} - \rho_s C_{p_s} \phi_s v_{s_x} \chi$$

$$\rho_g C_{p_g} \left[\frac{\partial}{\partial t} (\phi_g T_g^{'}) + \nabla \cdot (\phi_g \boldsymbol{v}_g T_g^{'}) \right] = \nabla \cdot (k_g \nabla T_g^{'}) - \gamma (T_s^{'} - T_g^{'}) + \chi \frac{\partial k_g}{\partial x} - \rho_g C_{p_g} \phi_g v_{g_x} \chi$$

'New' source terms

Applying Heat Sources/Sinks

Solids Heat Source

$$\dot{Q}_s \phi_s \qquad \qquad \int_D \dot{Q}_s \phi_s dV = \dot{Q}_s \overline{\phi}_s V$$

 ϕ_s





0.6

0.5

7 /16

Applying Heat Sources/Sinks

Solids Heat Source

$$\dot{Q}_s \phi_s \qquad \qquad \int_D \dot{Q}_s \phi_s dV = \dot{Q}_s \overline{\phi}_s V$$

Gas Heat Sink

$$\dot{Q}_g \phi_g = \dot{Q}_s \frac{\overline{\phi}_s}{\overline{\phi}_g} \phi_g \qquad \qquad \int_D \phi_g$$

$$\int_D \dot{Q}_g \phi_g dV = \dot{Q}_s \overline{\phi}_s V$$





Applying Heat Sources/Sinks

Solids Heat Source

$$\dot{Q}_s \phi_s \qquad \qquad \int_D \dot{Q}_s \phi_s dV = \dot{Q}_s \overline{\phi}_s V$$

 $\dot{Q}_g \phi_g = \dot{Q}_s \frac{\overline{\phi}_s}{\overline{\phi}_a} \phi_g \qquad \qquad \int_D \dot{Q}_g \phi_g dV = \dot{Q}_s \overline{\phi}_s V$

Gas Heat Sink

Thermal Energy

$$\rho_s C_{p_s} \left[\frac{\partial}{\partial t} (\phi_s T_s) + \nabla \cdot (\phi_s \boldsymbol{v}_s T_s) \right] = \nabla \cdot (k_s \nabla T_s) + \gamma (T_s - T_g) + \dot{Q}_s \phi_s$$
$$\rho_g C_{p_g} \left[\frac{\partial}{\partial t} (\phi_g T_g) + \nabla \cdot (\phi_g \boldsymbol{v}_g T_g) \right] = \nabla \cdot (k_g \nabla T_g) - \gamma (T_s - T_g) - \dot{Q}_g \phi_g$$

'New' source/sink terms





Simulations and Filtering Procedure



2-D periodic domain with mean vertical pressure drop in gas phase set to balance weight of mixture.

Computational Domain: 32cm x 32cm Discretization: 256 x 256 cells Particle diameter: 75µm

Simulations are for FCC particles in air. Results are suitably scaled so that they are applicable to other systems.



2-D periodic domain with mean vertical pressure drop in gas phase set to balance weight of mixture.

Shaded squares illustrate regions over which a filtering operation is performed.





$$\alpha_{s_{filt}} = \frac{k_{s_{filt}}}{\rho_s C_{p_s}} = \frac{\overline{\phi_s} \left(\widetilde{\boldsymbol{v}_{s_x}} \widetilde{T_s} - \widetilde{\boldsymbol{v}_{s_x}} T_s \right)}{\frac{\partial \widetilde{T_s}}{\partial x}}$$





$$\alpha_{s_{filt}} = \frac{k_{s_{filt}}}{\rho_s C_{p_s}} = \frac{\overline{\phi_s} \left(\widetilde{\boldsymbol{v}_{s_x}} \widetilde{T_s} - \widetilde{\boldsymbol{v}_{s_x}} T_s \right)}{\frac{\partial \widetilde{T_s}}{\partial x}}$$

Curves correspond to different filter sizes.

Dimensionless filter Δ size shown in legend $\overline{v_t^2/g}$



FCC particles in air

Dimensionless filter size of 2.056 corresponds to 1 cm.





Filtered Gas Thermal Dispersion





Filtered Gas Thermal Dispersion

12

$$\alpha_{g_{filt}} = \frac{k_{g_{filt}}}{\rho_g C_{p_g}} = \frac{\overline{\phi_g} \left(\widetilde{\boldsymbol{v}_{g_x}} \widetilde{T_g} - \widetilde{\boldsymbol{v}_{g_x}} T_g \right)}{\frac{\partial \widetilde{T_g}}{\partial x}}$$





 $(Fr_{\Delta})^{-1}$ 2 0^L 0 0.2 0.1 0.3 **Filtered Solids Volume Fraction**

Curves correspond to different filter sizes.

Dimensionless filter size shown in legend

FCC particles in air

Dimensionless filter size of 2.056 corresponds to Icm.



2.056 4.112

8.224

16.448

0.5

0.4





$$\widehat{\alpha}_{s_{filt}} = \frac{\alpha_{s_{filt}}}{\left(v_t^3/g\right)}$$





$$\widetilde{S_s} = \frac{1}{2} \left(\nabla \widetilde{v_s} + \nabla \widetilde{v_s}^T \right) - \frac{1}{3} \left(\nabla \cdot \widetilde{v_s} \right) \boldsymbol{I}$$

$$\frac{\widehat{\alpha}_{s_{filt}}}{\widehat{\Delta}^2 |\widehat{\widetilde{S_s}}|} \longleftarrow$$

Dimensionless Filtered Solids Shear Rate

$$\widetilde{S_s}| = \sqrt{2\widetilde{S_s} : \widetilde{S_s}}$$







$$\widehat{\alpha}_{g_{filt}} = \frac{\alpha_{g_{filt}}}{\left(v_t^3/g\right)}$$



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Connection to Momentum Transfer



 In single phase turbulent flows, heat transfer often modeled through a turbulent Prandtl number.

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- For gas-solid flows we may define a filtered Prandtl number for each phase.

Connection to Momentum Transfer



- In single phase turbulent flows, heat transfer often modeled through a turbulent Prandtl number.
- For gas-solid flows we may define a filtered Prandtl number for each phase.
- Based on earlier studies of turbulent momentum transfer in gas-solid flows we find^{1,2}

$$\overline{Pr}_s \sim 0.5$$

 $\overline{Pr}_g \sim 1$

^{1,2}Igci et. al. (2011)/Milioli et. al (in preparation)

Filtered Interphase Heat Transfer Coefficient



$$\frac{\gamma filt}{\gamma(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip})} \qquad \gamma_{filt} = \frac{\overline{\gamma(T_s - T_g)}}{(\widetilde{T_s} - \widetilde{T_g})}$$

• Look for the form

 $\frac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip})} = f\left(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip}, \Delta\right)$

Filtered Interphase Heat Transfer Coefficient







• Look for the form

 $\frac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip})} = f\left(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip}, \Delta\right)$

Reduction in heat transfer coefficient
 ~ 2-3 orders of magnitude.

Dimensionless filter size of 2.056 (1cm).

Breault (2006); Dong et. al (2008); Kashyap & Gidaspow (2010,2011)



$$1 - rac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{oldsymbol{v}}_{slip})}$$



Look for the form

$$\frac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip})} = f\left(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip}, \Delta\right)$$

Reduction in heat transfer coefficient
 ~ 2-3 orders of magnitude.

Dimensionless filter size of 2.056 (1cm).



$$1 - \frac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip})}$$



• Look for the form

 $\frac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip})} = f\left(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip}, \Delta\right)$

- Reduction in heat transfer coefficient
 ~ 2-3 orders of magnitude.
- Weak function of filter size/slip velocity at larger slip velocities.
- Most realizations with lows slip velocities occur in regions of high solids concentration.
- Behavior similar to filtered interphase drag coefficient, but the effect is more pronounced.

Dimensionless filter size of 8.224 (4cm).



$$1 - rac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{oldsymbol{v}}_{slip})}$$



Look for the form

 $\frac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip})} = f\left(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip}, \Delta\right)$

- Reduction in heat transfer coefficient
 ~ 2-3 orders of magnitude.
- Weak function of filter size/slip velocity at larger slip velocities.
- Most realizations with lows slip velocities occur in regions of high solids concentration.
- Behavior similar to filtered interphase drag coefficient, but the effect is more pronounced.
- In practice for large filter size we may employ

$$\frac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip})} \sim f\left(\overline{\phi_s}\right)$$



 Smagorinsky type model for filtered dispersion coefficient

$$\frac{\widehat{\alpha}_{g_{filt}}}{\widehat{\Delta}^2 |\widehat{\widetilde{S_g}}|} = h(\overline{\phi_s})$$

$$\frac{\widehat{\alpha}_{s_{filt}}}{\widehat{\Delta}^2 |\widehat{\widetilde{S_s}}|} = g(\overline{\phi_s})$$



- Smagorinsky type model for filtered dispersion coefficient
- Filtered Prandtl Numbers

$$\frac{\widehat{\alpha}_{g_{filt}}}{\widehat{\Delta}^2 |\widehat{\widetilde{S_g}}|} = h(\overline{\phi_s}) \qquad \qquad \frac{\widehat{\alpha}_{s_{filt}}}{\widehat{\Delta}^2 |\widehat{\widetilde{S_s}}|} = g(\overline{\phi_s})$$

$$\overline{Pr}_s \sim 0.5$$
 $\overline{Pr}_g \sim 1$



- Smagorinsky type model for filtered dispersion coefficient $\frac{\widehat{\alpha}_{g_{filt}}}{\widehat{\Delta}^2 |\widehat{S_g}|} = h(\overline{\phi_s})$ $\frac{\widehat{\alpha}_{s_{filt}}}{\widehat{\Delta}^2 |\widehat{S_s}|} = g(\overline{\phi_s})$ • Filtered Prandtl Numbers $\overline{Pr_s} \sim 0.5$ $\overline{Pr_g} \sim 1$
 - Filtered interphase heat transfer coefficient

$$\frac{\gamma_{filt}}{\gamma(\overline{\phi_s},\widetilde{\boldsymbol{v}}_{slip})} \sim f(\overline{\phi_s}) << 1$$



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- Filtered interphase heat transfer coefficient $\frac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slip})} \sim f(\overline{\phi_s}) << 1$
- Results carry over to mass transfer and tracer dispersion



- Smagorinsky type model for filtered dispersion coefficient $\frac{\widehat{\alpha}_{g_{filt}}}{\widehat{\Delta}^2 |\widehat{S_g}|} = h(\overline{\phi_s})$ $\frac{\widehat{\alpha}_{s_{filt}}}{\widehat{\Delta}^2 |\widehat{S_s}|} = g(\overline{\phi_s})$ • Filtered Prandtl Numbers $\overline{Pr_s} \sim 0.5$ $\overline{Pr_g} \sim 1$
- Filtered interphase heat transfer coefficient $\frac{\gamma_{filt}}{\gamma(\overline{\phi_s}, \widetilde{\boldsymbol{v}}_{slin})} \sim f(\overline{\phi_s}) << 1$
- Results carry over to mass transfer and tracer dispersion

Further areas for investigation

- Impact of going from 2-D to 3-D
 - Results for hydrodynamics suggest the effect is small (*lgci et. al, 2011*)

Acknowledgements



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 $\frac{\gamma_{filt}}{\gamma(\overline{\phi_s},\widetilde{\boldsymbol{v}}_{slip})} << 1$

Mass Transfer & Dispersion Coefficients In the Literature



Experimental Data in the literature show considerable variation

Mass transfer coefficients differ by several orders of magnitude

Dispersion coefficients differ by several orders of magnitude

Modeling efforts suggest origins of variance related to inadequate representation of meso-scale structures (clusters/bubbles)

R.W. Breault / Powder Technology (2006)





$Nu = (7 - 10\phi_g + 5\phi_g^2)(1 + 0.7Re_p^{0.2}Pr^{1/3}) + (1.33 - 2.4\phi_g + 1.2\phi_g^2)Re_p^{0.7}Pr^{1/3}$



Filtered Transport Properties



Filtered Interphase Heat Transfer Coefficient

$$\gamma_{filt} = \frac{\overline{\gamma(T_s - T_g)}}{(\widetilde{T_s} - \widetilde{T_g})}$$

Filtered Transport Properties



Filtered Interphase Heat Transfer Coefficient

$$\gamma_{filt} = \frac{\overline{\gamma(T_s - T_g)}}{(\widetilde{T_s} - \widetilde{T_g})}$$

Filtered Thermal Dispersion Coefficient

$$\alpha_{filt} = \frac{k_{filt}}{\rho_s C_{p_s}} = \frac{\overline{\phi_s} \left(\widetilde{\boldsymbol{v}_{s_x}} \widetilde{T_s} - \widetilde{\boldsymbol{v}_{s_x}} T_s \right)}{\frac{\partial \widetilde{T_s}}{\partial x}}$$

Filtered Transport Properties



Filtered Interphase Heat Transfer Coefficient

$$\gamma_{filt} = \frac{\overline{\gamma(T_s - T_g)}}{(\widetilde{T_s} - \widetilde{T_g})}$$

Filtered Thermal Dispersion Coefficient

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Calculated in Simulations as follows:

$$\gamma_{filt} = \frac{\left\langle \overline{\gamma(T_s - T_g)} \right\rangle}{\left\langle (\widetilde{T_s} - \widetilde{T_g}) \right\rangle} \qquad \alpha_{filt} = \frac{\left\langle \overline{\phi_s} \left(\widetilde{v_{s_x}} \widetilde{T_s} - \widetilde{v_{s_x}} T_s \right) \right\rangle}{\left\langle \frac{\partial \widetilde{T_s}}{\partial x} \right\rangle} \qquad \qquad \left\langle \frac{\partial \widetilde{T_s}}{\partial x} \right\rangle = \chi$$