

Chemical Reactor Modeling using Computational Fluid Dynamics

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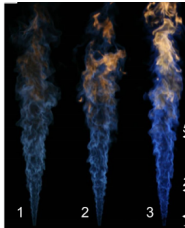
Iowa State University, USA

Saint-Gobain CREE

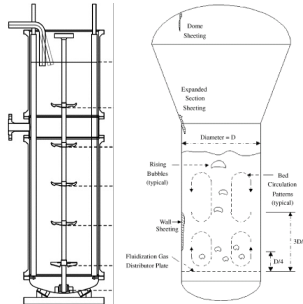
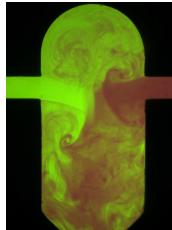
March 3, 2017

Technologically Relevant Flow Reactors

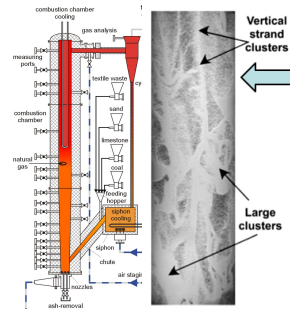
Turbulent flames



Chemical reactors



Multiphase flows



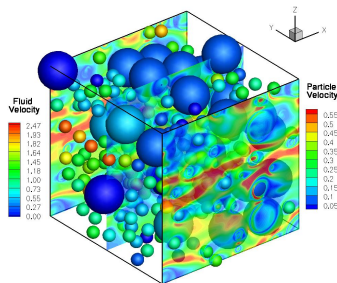
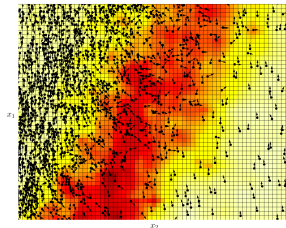
Outline

- 1 **Introduction**
- 2 CFD for Turbulent Flows
- 3 Turbulent Flow Reactors
- 4 Bubbly Flow Reactors
- 5 Particle-Laden Flow Reactors
- 6 Conclusions

What is Computational Fluid Dynamics?

Principal steps:

- 1 Create computational grid
- 2 Select conservation eqns and closures
 - Mass
 - Chemical species
 - Momentum
 - Energy
 - multiphase, population balance, ...
- 3 Discretize conservation equations
 - Finite volume for space
 - Stiff ODE solver for reactions
 - Moment method for population balance
 - Lagrangian method for particles, etc.
- 4 Solve discretized equations
- 5 Post-process results



Step 1: Computational Grid

Difficulty depends on flow geometry

- Academic cases: simple geometry

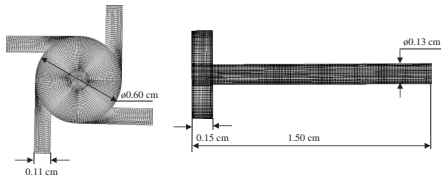
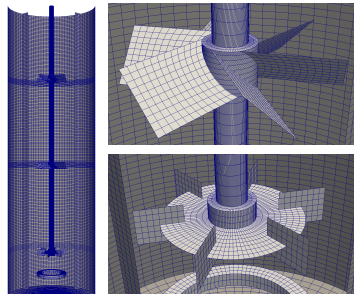
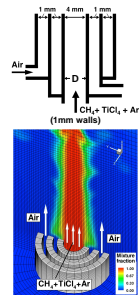


Fig. 4. Geometry and grids of the main mixing chamber.

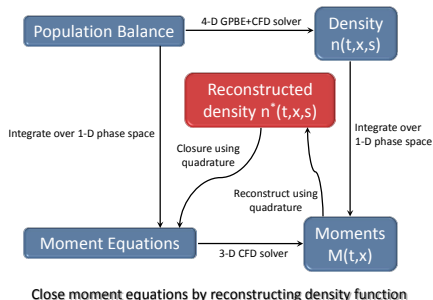
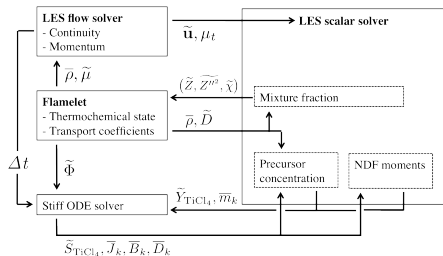
- Industrial cases: complex geometry
 - Grid quality determines solution accuracy
 - Compromise between capturing geometric complexity and solver accuracy
 - Non-negligible time and cost!



Step 2: Computational Model

Difficulty depends on flow physics

- Single-phase flow
 - Direct numerical simulation (DNS)
 - Turbulence model for unresolved scales (RANS, LES)
- Reacting flow
 - DNS for gas phase
 - RANS or LES for liquid phase
 - Complex chemistry and closures for unresolved scales
- Multiphase flow
 - DNS for "simple" flows
 - Multi-fluid model with closures
 - Multi-scale model key to success



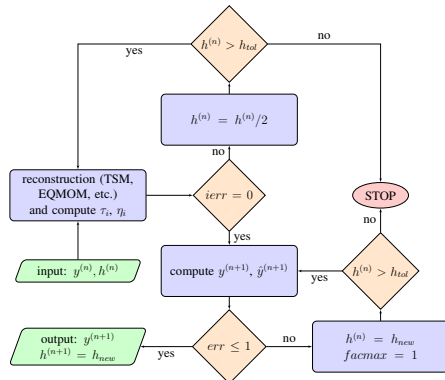
Step 3: Computational Method

Difficulty depends on flow model

- Single-phase flow
 - Finite volume in space
 - Explicit/implicit in time
- Reacting flow
 - Look-up table for chemistry
 - Realizable solver for moments
- Multiphase flow
 - Coupled solver for phase exchanges (mass/momentum)
 - Operator splitting for source terms (reactions, aggregation)
 - Lagrangian and/or Eulerian solver for disperse phase

$$\left. \begin{pmatrix} m_0 \\ \vdots \\ m_{2N-1} \\ m_{2N} \end{pmatrix} \right\} \xleftarrow{\sigma} \left\{ \begin{pmatrix} m_0^*(\sigma) \\ \vdots \\ m_{2N-1}^*(\sigma) \\ m_{2N}^*(\sigma) \end{pmatrix} \right\} \xrightarrow{\text{quadrature}} \{w_\alpha(\sigma), \xi_\alpha(\sigma)\}$$

$\xleftarrow[\text{problem}]{\text{scalar nonlinear}}$
 $\xleftarrow{\sum w_\alpha(\sigma) \xi_\alpha(\sigma)^{2N}}$



Step 4: Solver Implementation

Difficulty depends on algorithm

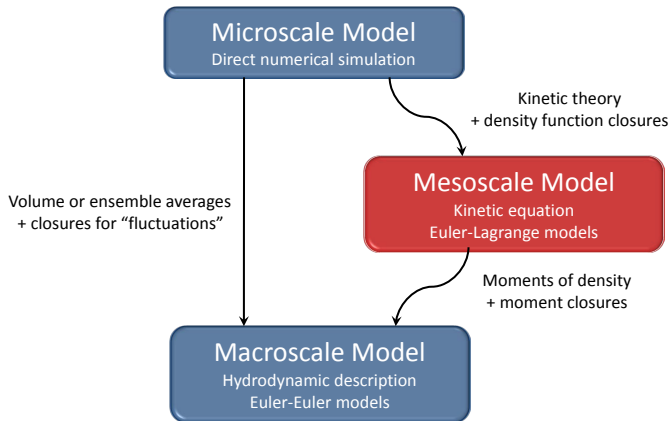
- Multi-CPU workstation
 - Small problems with simple models
 - Single-phase RANS
- Multi-CPU cluster
 - Larger problems with simple models
 - Single-phase LES
 - Simple multiphase flows
- Peta/Exascale computer
 - Very large problems with simple models
 - DNS of canonical single-phase turbulent flows
 - LES of disperse multiphase flows

Step 5: Post-processing

Difficulty depends on data set

- RANS simulations
 - Small data sets
 - Simple plots
- Single-phase DNS/LES
 - Large data sets
 - Time-dependent velocity/scalar fields
 - Simple plots, 3-D animations
- Multiphase DNS/LES
 - Very large data sets
 - Time-dependent velocity/scalar fields for each phase
 - Simple plots, 3-D animations

Multiscale Modeling Approach



Mesoscale model incorporates more microscale physics in closures!

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Passive Scalar Mixing

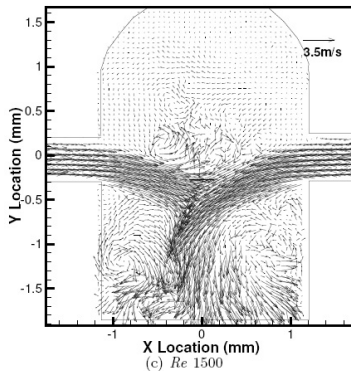
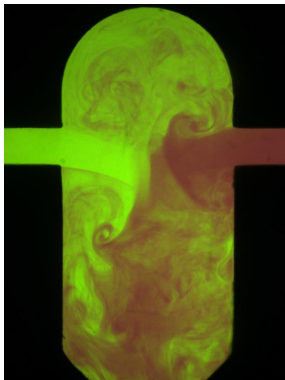
Planar jet in a channel: two downstream locations



Courtesy of Dr. B Kong

Passive Scalar Mixing

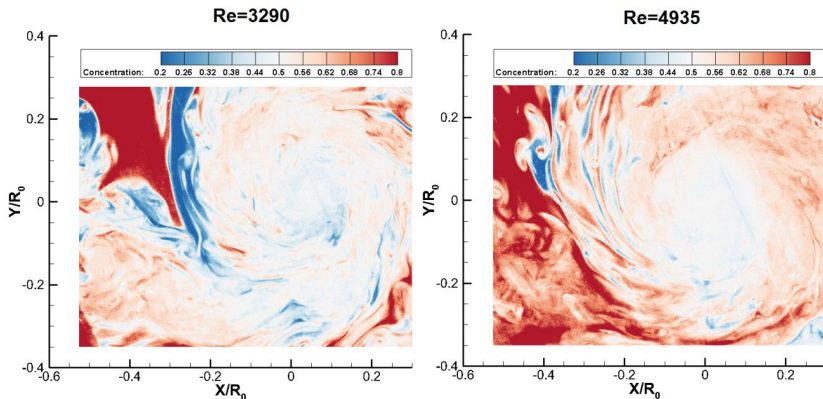
Confined impinging jets



Courtesy of Dr. Y Shi

Passive Scalar Mixing

Multi-inlet vortex mixer

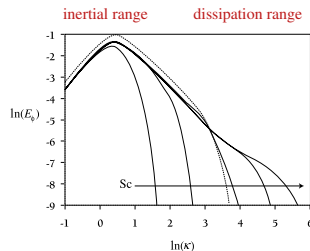
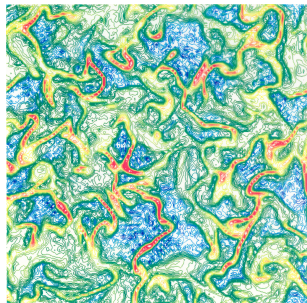


Courtesy of Dr. Z Liu and E Hitimana

Computational Model

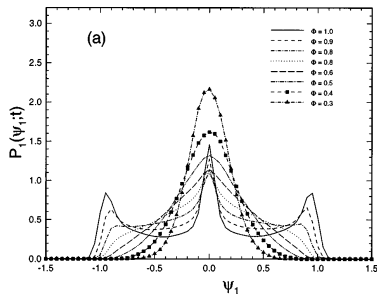
Choice depends on Re and Sc

- Laminar flow
 - Direct numerical simulation (DNS)
 - Mixing model for unresolved scales ($Sc \gg 1$)
- Turbulent flow
 - RANS or LES for liquid phase
 - Closures for unresolved scales
- Probability density function (PDF) method
 - PDF transport equation
 - Moments of PDF: mean and variance
 - Closures for transport, mixing

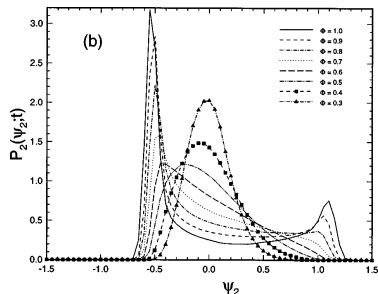


Evolution of PDFs from DNS

Ternary mixing



Binary mixing

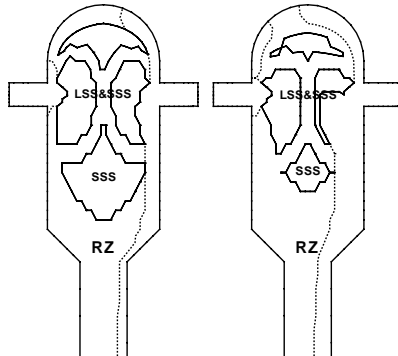
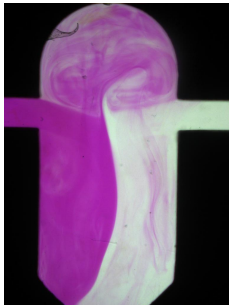


- Means are **constant** $\langle \phi_1 \rangle$ and $\langle \phi_2 \rangle$
- Variances decrease: $\langle \phi_1'^2 \rangle$ and $\langle \phi_2'^2 \rangle$
- CFD model solves for these variables

CFD Model for Scalar Mixing

$$\frac{\partial \langle \phi \rangle}{\partial t} + \langle \mathbf{u} \rangle \cdot \nabla \langle \phi \rangle = \nabla \cdot (\Gamma_T \nabla \langle \phi \rangle) \implies \text{LSS: large-scale segregation}$$

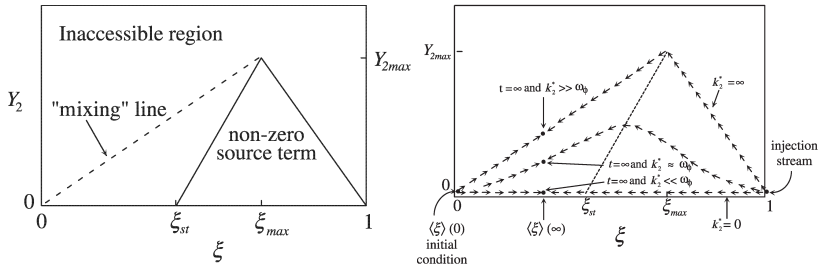
$$\frac{\partial \langle \phi^2 \rangle}{\partial t} + \langle \mathbf{u} \rangle \cdot \nabla \langle \phi^2 \rangle = \nabla \cdot (\Gamma_T \nabla \langle \phi^2 \rangle) - \varepsilon_\phi \implies \text{SSS: small-scale segregation}$$



Reactive Scalars: $A + B \rightarrow R, B + R \rightarrow S$

Joint PDF $f(\xi, Y_2)$ for mixture fraction ξ and progress variable Y_2

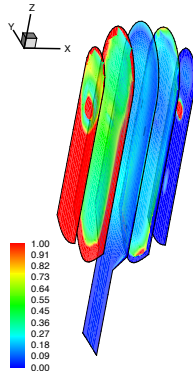
Reaction source term for Y_2



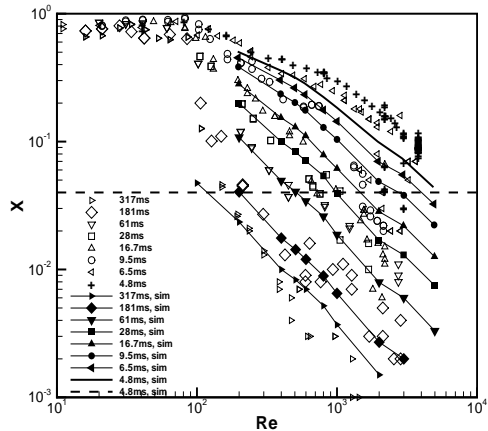
- PDF is “discretized” using moment methods
- CFD code solves moment transport equations

Confined Impinging-Jets Reactor

Damköhler number



Conversion of undesired product



lines: CFD; symbols: Johnson & Prud'homme (2003)

Multi-Inlet Vortex Reactor

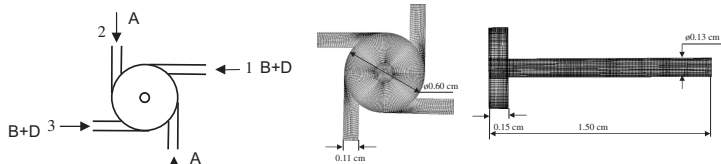


Fig. 4. Geometry and grids of the main mixing chamber.

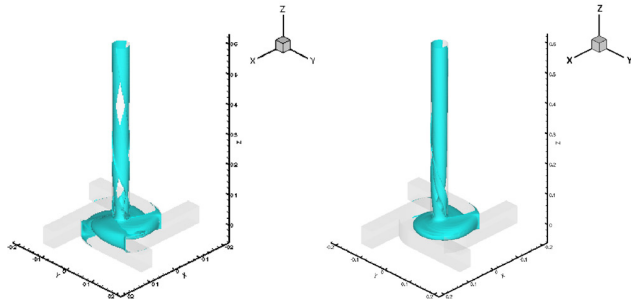


Fig. 12. Acid concentration at $Re = 1371$ for symmetric arrangement of the inlet streams (a) and asymmetric arrangement of the inlet streams (b).

CFD Validation for MIVR

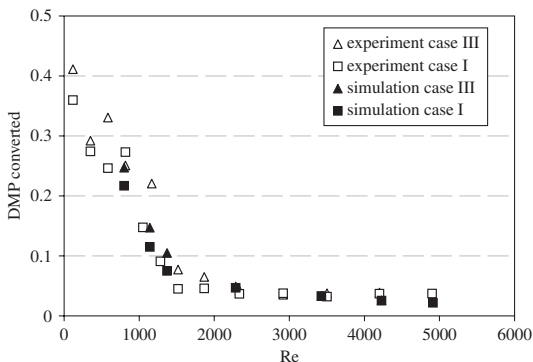
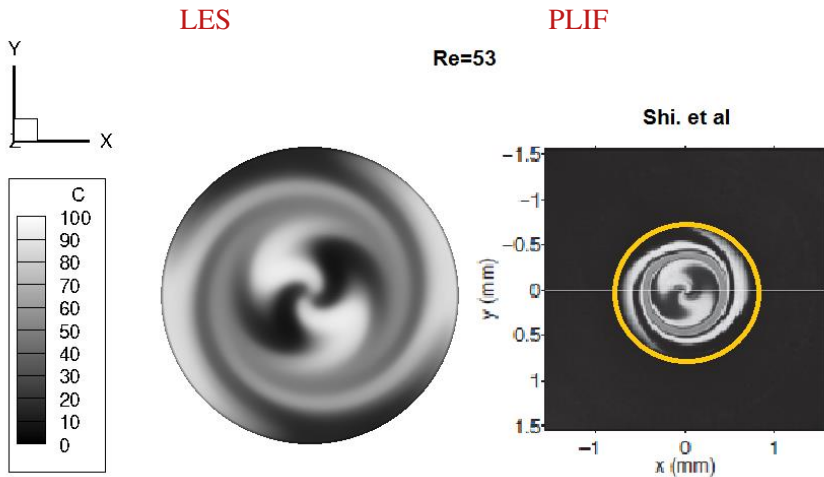


Fig. 10. Conversion of DMP vs. Re in the MIVM (\blacksquare , numerical simulation data for case I; \blacktriangle , numerical simulation data for case III; \square , experimental measurement for case I; Δ , experimental measurement for case III).

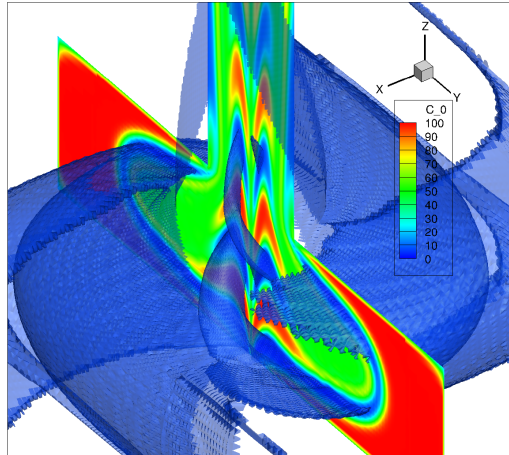
Large-Eddy Simulation of MIVR



Courtesy of Dr. Z Liu

LES of MIVR

Bypassing fluid arrives from bottom of mixer



Courtesy of Dr. Z Liu

Scale Up of MIVR

Excellent predictions compared to SPIV

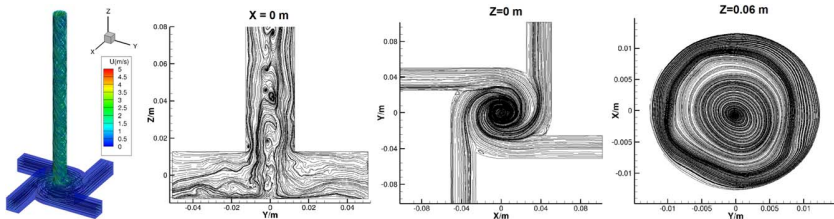


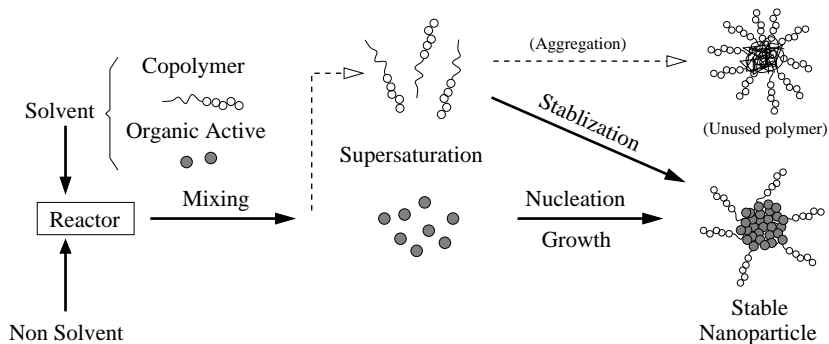
Figure 6. Instantaneous velocity field (left: contour plot of velocity magnitude, middle left: vertical crosssection through center of outlet, middle right: horizontal cross-section through center of inlets, right: horizontal cross-section at outlet).

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Nanoparticles in Turbulent Flow Reactors

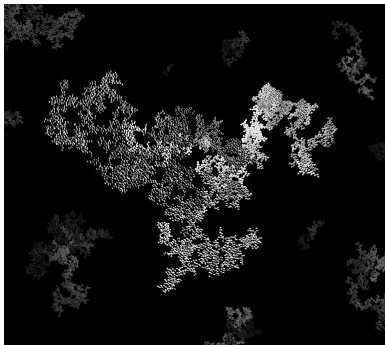
Flash Nanoprecipitation



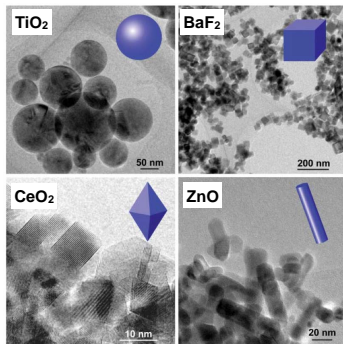
Produced in CIJR & MIVR

Nanoparticles in Turbulent Flames

Soot



Metal oxides



(Strobel & Pratsinis 2007)

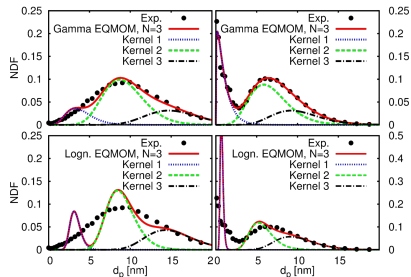
Produced in turbulent flames

Computational Model

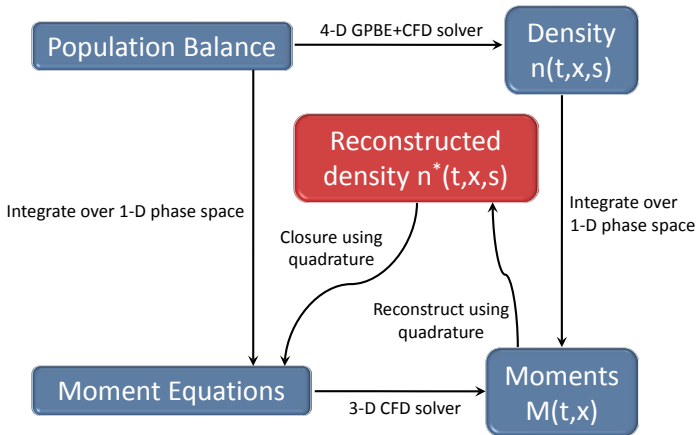
Particle size distribution (PSD)

- Population balance equation
 - Solve for NDF $n(v)$
 - Coupled to velocity and reactive scalars
 - Non-linear integro-PDE
- Moment methods
 - Solve for moments of NDF
 - Close by reconstructing $n(v)$

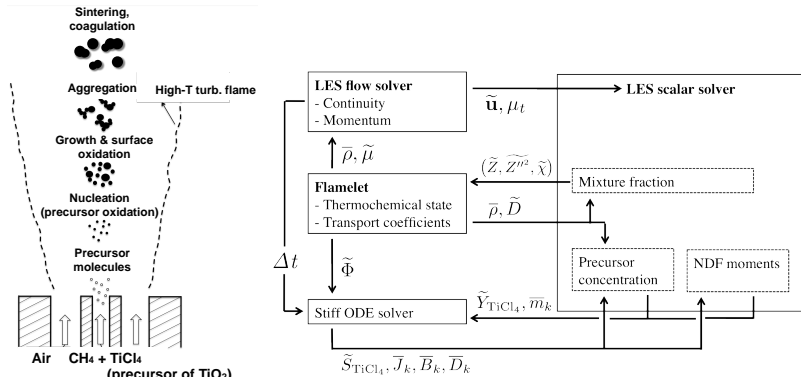
$$\underbrace{\frac{\partial n(v)}{\partial t}}_{\text{(Rate of change)}} + \underbrace{\nabla \cdot (\mathbf{u} n(v))}_{\text{(Convection)}} = \underbrace{\nabla \cdot (\Gamma(v, \Phi) \nabla n(v))}_{\text{(Particle diffusion)}} + \underbrace{J(\Phi) f(v_0)}_{\text{(Nucleation)}} + \underbrace{\int_0^\infty \beta(v-v', v') n(v-v') n(v') dv'}_{\text{(Aggregation-birth)}} - \underbrace{\int_0^\infty \beta(v, v') n(v) n(v') dv'}_{\text{(Aggregation-death)}},$$



Quadrature-Based Moment Methods

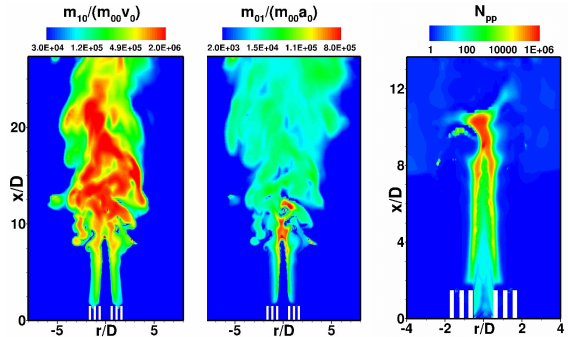


Flame Synthesis of Metal Oxide Nanoparticles



- Flamelet model for combustion
- Moment closure for volume–surface NDF $n(v, a)$
- Account for nucleation, growth, aggregation, and sintering

LES Results

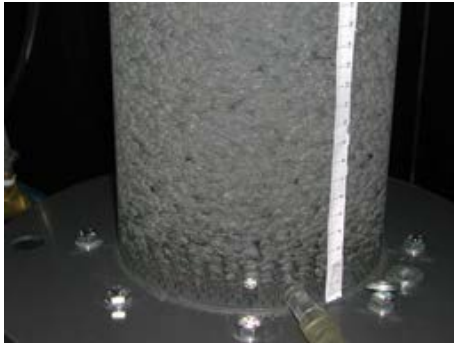


- m_{10} mean particle volume
- m_{01} mean particle surface area
- N_{pp} primary particles (nuclei)

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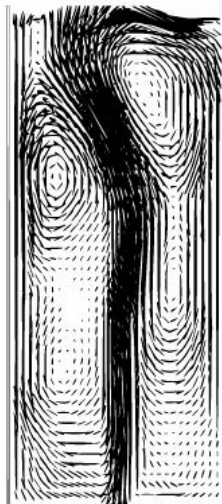
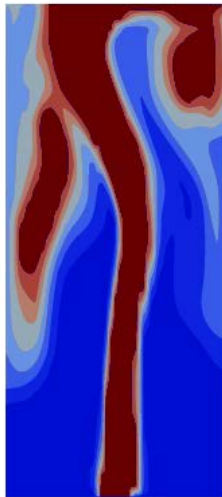
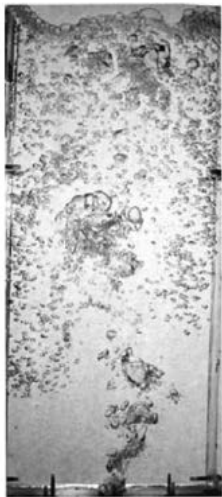
Bubbly Flow Reactors



Homogeneous

Heterogeneous

Polydisperse Bubbly Flows



Computational Model

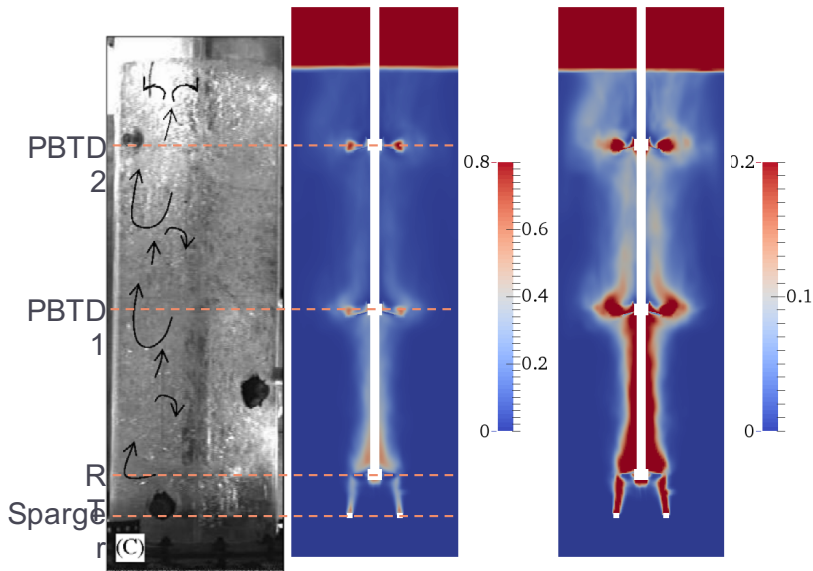
Two phases: gas and liquid

- Mass & momentum balances
 - Buoyancy & drag forces
 - Added mass & lift forces
 - Strong phase coupling
 - Flow regime depends on forces

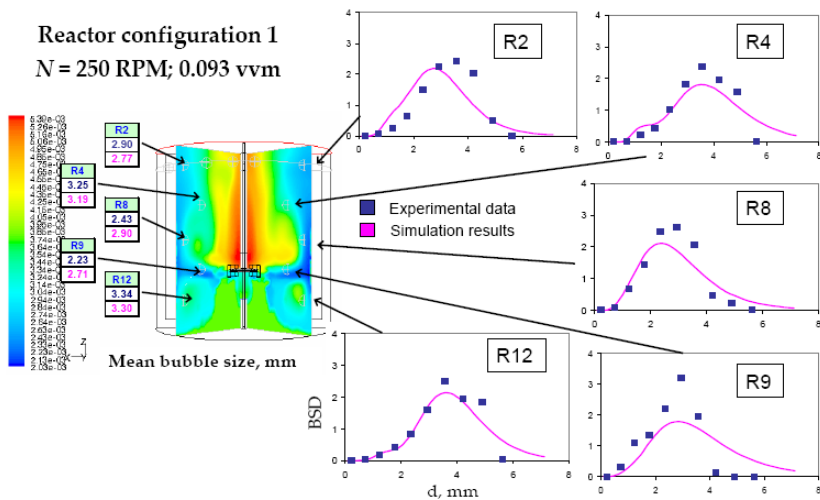
Bubble size distribution (BSD)

- Population balance equation
 - Solve for NDF $n(v)$
 - Size-conditioned bubble velocity
 - Non-linear integro-PDE
- Moment methods
 - Solve for moments of NDF
 - Close by reconstructing $n(v)$

Stirred Reactor with Gas Sparger



Stirred Reactor with Bubble Size Distribution



Courtesy of Dr. DL Marchisio

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Particle-Laden Flow Reactors

Volume fraction

Fluid velocity

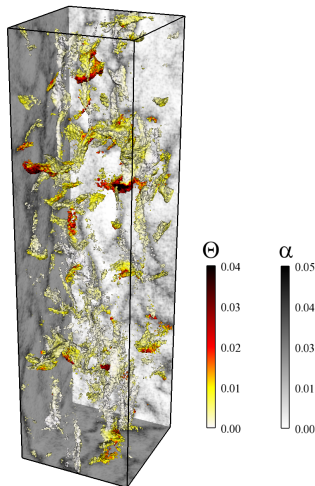
Computational Model

Two phases: solid and gas

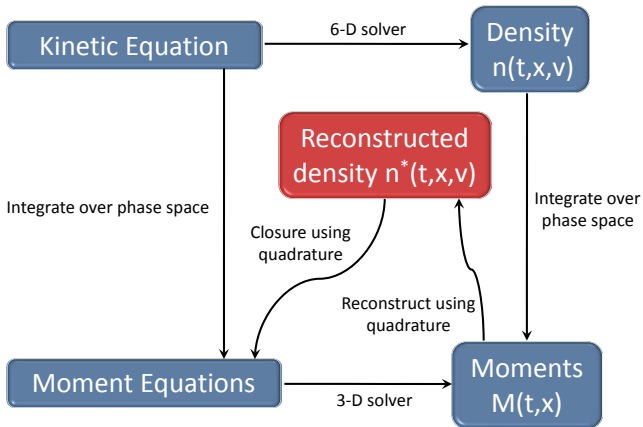
- Mass, momentum & energy balances from Kinetic Theory of Granular Flow
 - Buoyancy & drag forces
 - Granular temperature
 - Strong phase coupling due to drag

Euler-Euler (EE) & Euler-Lagrange (EL)

- Kinetic equation
 - NDF of particle velocity
 - EL solver tracks individual particles
 - EE solver finds moments of NDF
 - Use more moments to capture high Knudsen number flows



Quadrature-Based Moment Method



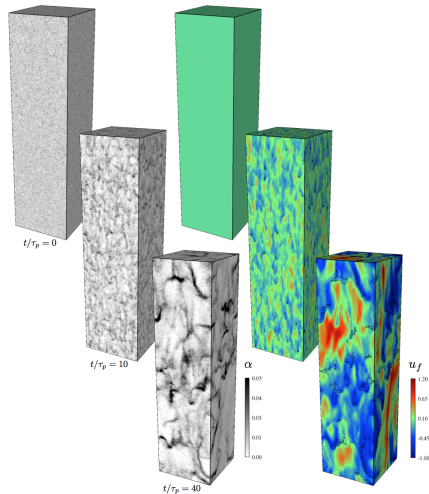
Close moment equations by reconstructing density function

Particle Trajectory Crossing

Kinetic equation without collisions

Courtesy of R Patel

Cluster-Induced Turbulence



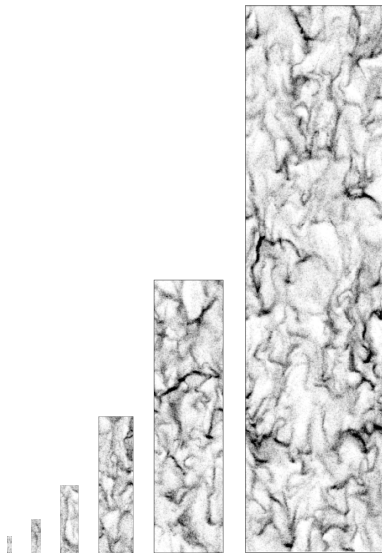
- Particles fall due to gravity
- Fluid velocity is zero due to pressure gradient
- Clusters form spontaneously
- Clusters drag fluid downward, create wakes
- Fluid turbulence breaks up clusters

Do Eulerian and Lagrangian Models Agree?

Cluster-induced turbulence

- Average volume fraction: $\alpha_p = 0.01$
- $\rho_p/\rho_g = 1000$, $\text{Re}_p = 0.5$
- terminal velocity: $\mathcal{V} = 0.1$ m/s
- cluster length: $\mathcal{L} = 2.5$ mm
- $L_x/\mathcal{L} = 129$ ($2048 \times 512 \times 512$)

Euler-Lagrange and Euler-Euler simulations
performed on same grid, but not with same
numerical schemes



Qualitative Comparison of Clustering

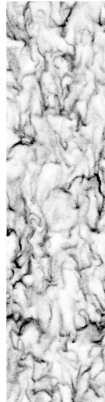
Case 2



Case 4

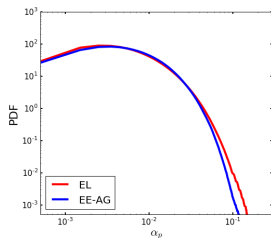


Case 6

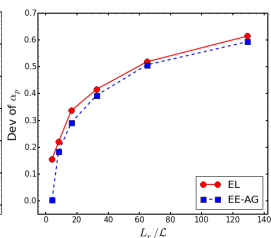


Similar shapes, but EE has slightly longer/wider clusters

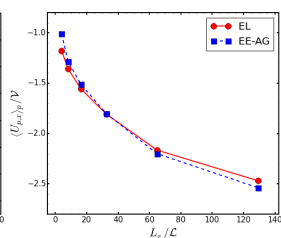
Quantitative Comparison

 α_p PDF

Inhomogeneity



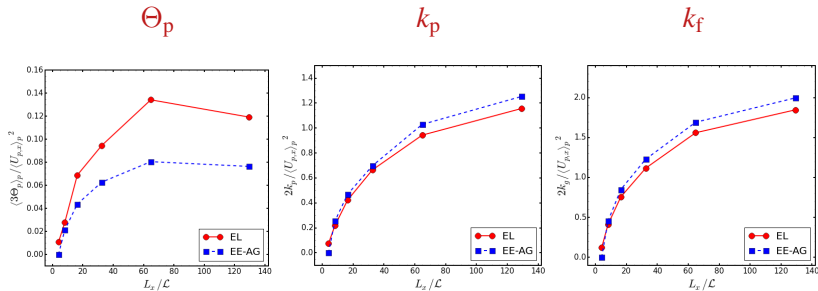
Drift velocity



EE has slightly fewer high α_p values (due to numerics?)

EE has slightly higher drift velocity (due to larger clusters?)

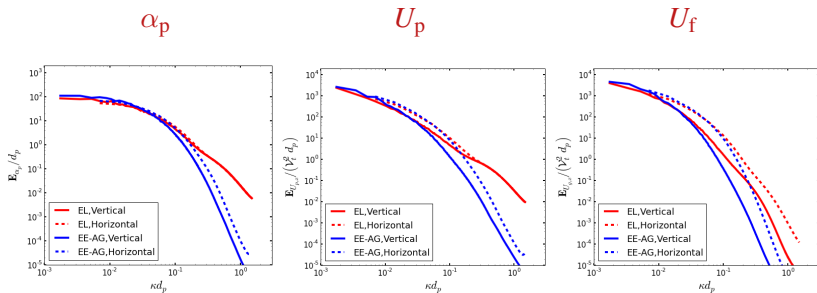
Quantitative Comparison of TKE Statistics



EE has lower uncorrelated TKE (due to EL post-processing?)

EE has higher correlated TKE (due to larger clusters?)

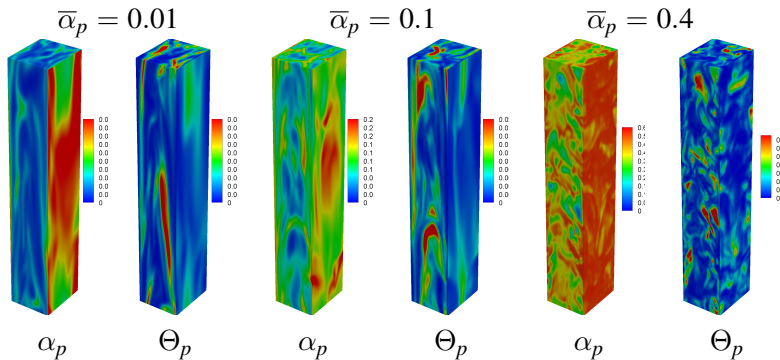
Quantitative comparison of energy spectra



Good agreement at small wavenumbers ($\kappa d_p < 0.1$)

EE has less energy than EL at large wavenumbers
(due to EL filter for coupling, numerics?)

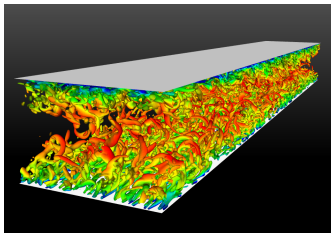
Particle-Laden Channel Flow



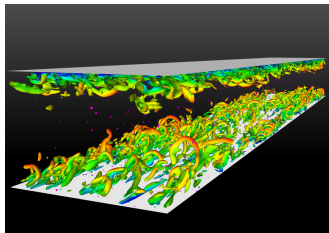
Transition from clusters to bubbles

Effect of Increasing Particle Mass Loading

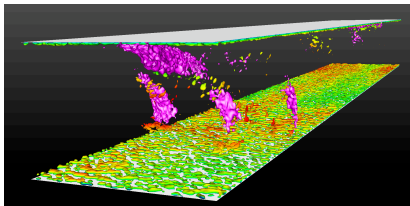
0.2



1.2



20



Courtesy of Dr. J Capecelatro

Bubbling Fluidized Bed Reactor

 α_p h_2 $U_{p,y}$ Θ_p $\sigma_{p,xy}$

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Conclusions

- **Computational fluid dynamics** can be applied to a wide range of technologically relevant flow reactors
- **Multi-scale modeling** is required to treat the disparate length and time scales present in most applications
- **Development of computational models** based on fundamental physics and chemistry is a key step
- **Computational methods** targeted at accurately solving the computational models are equally important

**Successful CFD modeling requires a team effort
with complementary skill sets**

OpenQBMM Project (www.openqbmm.org)


Polydisperse flow simulation tools in OpenFOAM

**Open
QBMM**

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An open-source implementation of Quadrature-Based Moment Methods


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The project

OpenQBMM is a suite of solvers to simulate polydisperse multiphase flows using Quadrature-Based Moment Methods (QBMM) based on OpenFOAM®.


[Read more](#)



Get started

Get started using OpenQBMM! Find information on and instructions on how to install and run the OpenQBMM solvers and tutorials.

[Read more](#)



Contribute

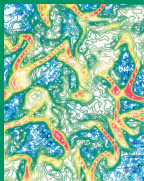
Report a problem, describe a solution to a bug, provide a new test case or contribute a piece of code to improve OpenQBMM.

[Read more](#)

Funded by the NSF Division of Advanced Cyberinfrastructure

Further Reading

Computational Models for Turbulent Reacting Flows

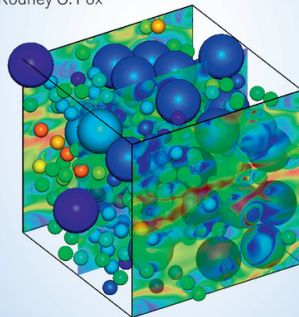


Rodney O. Fox

CAMBRIDGE

Computational Models for Polydisperse Particulate and Multiphase Systems

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Thanks for your attention!

Questions?