# MFiX - Multiphase Flow with Interphase Exchanges



Software tools and expertise to address multiphase flow challenges in research, design, and optimization

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# Use Simulation Tools to Predict Performance



Gas-solid fluidization is very challenging to accurately model

• Fluidized bed: solid particles are suspended in a fluid-like state

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• With Increasing of gas velocity, several fluidization regimes can be observed – often in the same reactor!



### MFiX Suite of Multiphase CFD Software Capabilities and Benefits



is N dyr

is NETL flagship computational fluid dynamic (CFD) code

- Versatile toolset for understanding the behavior and characterizing the performance of energy conversion processes
- Accelerate reactor development and reduce cost by using multiphase flow reactor modeling and simulation tools
- **Optimizes performance** for equipment and unit operations, enabling more throughput and less process downtime
- **Reduces design risks** when validated by predictive science-based calculations, lowering risk in obtaining return on investment





### MFix Suite of Multiphase CFD Software Managing the tradeoff between accuracy and time to solution Direct Numerical Simulation: fine scale, accurate simulations for limited size domain Discrete Element Method: Track individual particles and resolve collisions Two-Fluid Model: Gas and solids form an interpenetrating continuum 86.60 s 0 Particle-in-Cell: Track parcels of particles and approximate collisions Ś Exascale: New code for new generation of computers Reduced Order Models: Simplified models with limited application Model Uncertainty





Continuous and disperse phases (e.g., gas and solids) are treated as coexisting continua.

#### Highlights

- Long track record of successfully supporting DOE-FE priorities
- Computationally efficient
- Historical workhorse for largescale FE applications

#### **Technical limitations**

- Unable to efficiently model
   phenomena like particle size
   distributions
- Relies on complex constitutive relations to approximate solid stresses
- Ad hoc extension to multiple solids phases

Fluid continuity equation:

$$\frac{\partial}{\partial t} (\varepsilon_g \rho_g) + \nabla \cdot (\varepsilon_g \rho_g \boldsymbol{u}_g) = \mathcal{S}_g$$

Fluid momentum equation:

$$\frac{\partial}{\partial t} (\varepsilon_g \rho_g \boldsymbol{u}_g) + \nabla \cdot (\varepsilon_g \rho_g \boldsymbol{u}_g \boldsymbol{u}_g)$$
$$= -\varepsilon_g \nabla p_g + \nabla \cdot \boldsymbol{\tau}_g + \varepsilon_g \rho_g \boldsymbol{g} + \sum_m \boldsymbol{\mathcal{I}}_{g,m}$$

Solids continuity equation:

$$\frac{\partial}{\partial t}(\varepsilon_m \rho_m) + \nabla \cdot (\varepsilon_m \rho_m \boldsymbol{u}_m) = \mathcal{S}_m$$

#### Solids momentum equation:

$$\frac{\partial}{\partial t} (\varepsilon_m \rho_m \boldsymbol{u}_m) + \nabla \cdot (\varepsilon_m \rho_m \boldsymbol{u}_m \boldsymbol{u}_m) \\ = -\nabla p_m + \nabla \cdot \boldsymbol{\tau}_m + \varepsilon_m \rho_m \boldsymbol{g} - \boldsymbol{J}_{g,m}$$





### **MFiX-DEM : Discrete Element Model**



Fluid is a continuum and particles are individually tracked, resolving particle-particle-wall collisions

#### **Advantages**

- Uses first principles to account for particle interactions, reducing model complexity.
- Fewer complex closures results in less overall model uncertainty.
- Only open-source, fully coupled CFD-DEM code designed for reacting flows.

#### **Technical limitations**

- Computationally expensive, limiting the size of systems that can be modeled.
- Fluid-particle interaction is closed using drag models.

Fluid continuity equation:

$$\frac{\partial}{\partial t} (\varepsilon_g \rho_g) + \nabla \cdot (\varepsilon_g \rho_g \boldsymbol{u}_g) = \mathcal{S}_g$$

Fluid momentum equation:  

$$\frac{\partial}{\partial t} (\varepsilon_g \rho_g \boldsymbol{u}_g) + \nabla \cdot (\varepsilon_g \rho_g \boldsymbol{u}_g \boldsymbol{u}_g)$$

$$= -\varepsilon_g \nabla p_g + \nabla \cdot \boldsymbol{\tau}_g + \varepsilon_g \rho_g \boldsymbol{g} + \sum_p \boldsymbol{\mathcal{I}}_{g,p}$$

#### Particle continuity equation:

 $\frac{\partial}{\partial t}(m_p) = \mathcal{S}_p$ 

#### Particle momentum equations:

$$m_p \frac{\partial \boldsymbol{u}_p}{\partial t} = m\boldsymbol{g} + \boldsymbol{F}_{coll} - \boldsymbol{\mathcal{I}}_{g,p}$$
$$I_p \frac{\partial \boldsymbol{\omega}_p}{\partial t} = \boldsymbol{\mathcal{T}}$$





#### Solver time: Fluid Solid



#### P-P and P-W collisions are resolved (soft sphere)

Fewer complex closures results in less overall model uncertainty.

Fluid is a continuum and particles are individually tracked, resolving particle-particle-wall collisions

Only open-source, fully coupled CFD-DEM code designed for reacting flows.

Uses first principles to account for

particle interactions, reducing model

#### **Technical limitations**

Advantages

complexity.

•

- Computationally expensive, limiting the ٠ size of systems that can be modeled.
- Fluid-particle interaction is closed ٠ using drag models.



Fluid continuity equation:

### Fluid momentum equation: $\frac{\partial}{\partial t} (\varepsilon_g \rho_g \boldsymbol{u}_g) + \nabla \cdot (\varepsilon_g \rho_g \boldsymbol{u}_g \boldsymbol{u}_g)$

$$= -\varepsilon_g \nabla p_g + \nabla \cdot \boldsymbol{\tau}_g + \varepsilon_g \rho_g \boldsymbol{g} + \sum_p \boldsymbol{\mathcal{I}}_{g,p}$$

**Particle continuity equation:** 

 $\frac{\partial}{\partial t}(m_p) = \mathcal{S}_p$ 

**Particle momentum equations:** 

$$m_p \frac{\partial \boldsymbol{u}_p}{\partial t} = m\boldsymbol{g} + \boldsymbol{F}_{coll} - \boldsymbol{\mathcal{I}}_{g,p}$$
$$I_p \frac{\partial \boldsymbol{\omega}_p}{\partial t} = \boldsymbol{\mathcal{T}}$$

MFiX-DEM : Discrete Element Model

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### **MFiX-PIC : (Multiphase) Particle-in-Cell**

Fluid is a continuum and particles are tracked as parcels, solid-stress model approximates collisions

#### **Advantages**

- Computationally efficient
- Able to track particle-scale phenomena like time-histories and size distributions
- Only open-source, PIC model

#### **Technical limitations**

- Relies on a continuum stress model to approximate particleparticle interactions
- Strong dependence on implementation

#### Formally released: April, 2019

Fluid continuity equation:

 $\frac{\partial}{\partial t} (\varepsilon_g \rho_g) + \nabla \cdot (\varepsilon_g \rho_g \boldsymbol{u}_g) = \mathcal{S}_g$ 

# Fluid momentum equation: $\frac{\partial}{\partial t} (\varepsilon_g \rho_g \boldsymbol{u}_g) + \nabla \cdot (\varepsilon_g \rho_g \boldsymbol{u}_g \boldsymbol{u}_g)$ $= -\varepsilon_g \nabla p_g + \nabla \cdot \boldsymbol{\tau}_g + \varepsilon_g \rho_g \boldsymbol{g} + \sum_p \boldsymbol{\mathcal{I}}_{g,p}$

Parcel continuity equation:

 $\frac{\partial}{\partial t}(m_p) = \mathcal{S}_p$ 

Parcel momentum equation:  $m_p \frac{\partial \boldsymbol{u}_p}{\partial t} = m\boldsymbol{g} + \nabla \tau_p - \boldsymbol{\mathcal{I}}_{g,p}$ 



#### Parcel collisions are not resolved

Solid

Solver time: Fluid



# Graphical User Interface (GUI)

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- Open-source (https://mfix.netl.doe.gov)
- Motivation: Better serve MFiX community
  - Improve usability of MFiX
  - Support Linux, macOS and Windows OS
  - Decrease time to setup, reduce error
- Solution: Graphical User Interface
  - Released in 2017
  - Between 1 and 4 releases per year









# MFiX usability improvement

MFS NETL Multiphase Flow Science Home of the MFIX Software Suite. https://mfix.netl.doe.gov





👌 📒 🖆

User interaction

## Preprocessor development









# Enabling large Scale simulations



DEM example

Height = 0.68 m

Particle diameter = 800 microns

Particle count = 500,000 particles





# Enabling large Scale simulations







# Multiphase Particle In Cell (MP-PIC)

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Use MP-PIC for computational speed and averaged accuracy





# Multiphase Particle In Cell (MP-PIC)



### **Basic Set-Up Information**

The PIC model	Model Regions Fluid	II     II     II       Materials     TFM     DEM		
parameters	Solids Scalars IC	Void fraction at close pack 0.4 $1-\epsilon_{cp}$ Frictional solids stress model parameters		
are clustered under the Solids tab.	PS IS Chemistry	Volume fraction exponential scale factor 3.0 Y Pressure linear scale factor 100.0 P		
	Numerics Output Monitors Run	Empirical dampening factor 0.85 Non-singularity constant 1.0000e-07 8		
	Dash Advanced	Wall parameters		
		Normal restitution coefficient     0.85       Tangential restitution coefficient     0.85		
		PIC time step control		
		CFL value 0.1		
		Parcel fraction threshold 0.01		
		CFL control method Maximum 👻		
		Advanced		
		Solids slip velocity scale factor       1.0         Image: Ima		

New in 20.2: PIC CFL setting

- Need for CFL identified by QA program
- Allows consistent results with large Fluid time step
- Showed speed up of 3 for a cyclone simulation

Some parameters that a user defines directly influence the momentum equation through solids stress calculation.



Other parameters act as scale factors for energy exchange between parcels and their surroundings.





#### Simulation of industrial scale multi-phase flow devices is within MFiX's grasp!

MFiX-PIC couples the MFiX Eulerian fluid solver with new Lagrangian solids stress model. Excellent matching to pressure drop, temperature profiles and chemical species production at industrial scale. Tractable time to solution.



# Coarse Grain DEM

Particles are lumped together to create a CG particle •

Assumptions in

- CG particles collide with each other
- Heat transfer, chemical reactions •
- MFiX-CGDEM formal release: 12/31/2020  $\bullet$

Same Velocity



Original system with  $N_{\rm p}$  particles (color stands for different species fraction and temperature, vector stands for velocity)

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Same species fraction



Same Temperature

Lumped into a sphere







# Coarse Grain DEM

### CG-DEM Simulation of 2-inch Fluidized Bed Pyrolysis Reactor







# Moving geometry

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### Several options to represent moving geometry

Moving STL walls through tangential velocity

- Add Collection of UDFs and tutorials
- Rotating drum
- Conveyor belts







# Moving geometry

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### Several options to represent moving geometry

Freeze or set particle velocity



Time: 0.00 sec.







# Polydispersity (DEM)

- Available in 20.3 Release (September 2020)
- Merge and complement ASU implementation
- Initial and Boundary (mass inflow) conditions
- DEM Particle size distribution •
  - Normal ٠
  - Log-normal •
  - Custom (user-defined) •
- Improvement in IC seeding
  - Robust
  - Lattice ٠
  - Spacing ٠
  - Flexibility in input ٠
    - Volume fraction
    - Solid inventory ٠
    - Particle count



**Cubic lattice** 





**Hexagonal lattice** 

-1027 -1026 -1026 -1026









# Polydispersity (DEM)

### Polydispersity examples









Initial + Boundary Conditions

6.5



Particle coating



# **Non-spherical particles (SuperDEM) Superquadric particles** • Superquadrics are a family of geometric shapes defined as $\left[\left(\frac{x}{a_1}\right)^{\frac{2}{\varepsilon_2}} + \left(\frac{y}{a_2}\right)^{\frac{2}{\varepsilon_1}}\right]^{\frac{\varepsilon_2}{\varepsilon_1}} + \left(\frac{z}{a_3}\right)^{\frac{2}{\varepsilon_1}} = 1$

• Can represent ~ 80% of all shapes by varying five parameters







## SuperDEM examples

Cylinder candy

static packing

M&M candy

static packing

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M&M candy discharging from a hopper

# Validation experiment



Time.s



Particle properties including the volume equivalent diameter  $d_e$ -dass, the particle dimensions, the sphericity  $\phi$ , the particle density  $\rho_p$ , the bed height *L* and the averaged porosity  $\varepsilon$  for the initial, unfluidized setup.



Experiment: Vollmari K, Jasevičius R, Kruggel-Emden H. Experimental and numerical study of fluidization and pressure drop of spherical and non-spherical particles in a model scale fluidized bed. Powder Technology. 2016;291:506-521.



## Massively Parallel SuperDEM Simulation





- The solver was parallelized using MPI.
- Simulation on NETL supercomputer Joule 2 (80K cores), World Top 60, 2020
- Non-spherical particles fluidization simulation, 100 million (6800 cores)



# Hundredfold Speedup of MFiX-DEM using GPU

- DEM solver was ported to GPU (prototype)
- 170 fold speedup with double precision, 243 fold with single precision
- Re-use CFD, interphase coupling, and chemical reaction modules in MFiX





Time = 1.0 s Time = 2.0 s



# MFiX Quality Assurance

### **Building Confidence in Simulation Results**

- Verification
  - Code verification Does the code do what we expect?
  - Solution verification Is the answer any good?
- Validation How does the answer compare to the real world?
- Uncertainty Quantification
  - Where is the error in my solution coming from?
  - What happens to my answer when I change an input to my model?

#### Accomplishments

- MFiX Verification and Validation Manual 2<sup>nd</sup> Ed. (PDF & html)
- PIC theory guide (May 2020)







## MFiX Quality Assurance

### **Building Confidence in Simulation Results**

- PIC parameter sensitivity and calibration
  - How sensitive are PIC simulations to PIC model parameters?
  - Recommend parameter values for a given type of application

#### Cases selected to cover a broad range of flow conditions

- Particle Settling:  $U/U_{mf} < 1.0 (P_0 \sim 1)$  (Analytical solution)
- Bubbling Fluidized bed:  $U/U_{mf} \sim 1 (P_0 \sim 10)$
- Circulating Fluidized bed:  $U/U_{mf} >> 1.0 (P_0 \sim 100)$

#### Summary of model parameters used:

	t1 Pressure linear scale factor	t2 Volume fraction exponential scale factor	t3 Statistical weight	t4 Volume fraction at maximum packing	t5 Solid slip velocity factor
C1: Particle Settling	[1,20]	[2,5]	[3,20]	[0.35,0.5]	[0.5,1.0]
C2: Fluidization	[1,100]	[2,5]	[10,100]	[0.4,0.5]	[0.85,0.98]
C3: Circulating Fluidized Bed	[1,250]	[2,5]	[4]	[0.4,0.5]	[0.85,0.98]

\*Parameters selected based on prior sensitivity study







# C1: Particle settling

#### Problem setup







# C1: Particle settling



### Sensitivity analysis and Deterministic calibration

Response surface <sup>3D plot of the data-fitted surrogate model</sup> constructed from 55 samples

Sobol indices show the following:

- main effects (first oder)
- interactive effects (second order)

Code-to-Code comparison with PSUADE





#### Parameters obtained through deterministic calibration

Parameter	Default	Range	Calibrated
t1 Pressure linear scale factor	100	[1,20]	14.309
t2 Vol. fraction exponential scale factor	3.0	[2,5]	2.165
t3 Statistical weight	5.0	[3,20]	12.241
t4 Vol. fraction at maximum packing	0.42	[0.35,0.5]	0.399
t5 Solid slip velocity factor	1.0	[0.5,1.0]	0.828



# Outreach: User base

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Still going strong amid pandemic crisis Q2FY20 (Jan-March 2020) : 158 registrations, 831 MFiX Downloads Q3FY20 (April-June 2020) : 161 registrations, 815 MFiX Downloads All-time registrations = 6,264 (June 30<sup>th</sup> 2020)



Registrations location (Q2FY20 + Q3FY20)



# Outreach: All-time MFiX Stats

### **Stakeholders and Technology Transfer**

• All-time MFiX registrations = 6,264



- Industry = 910
- Nat. Labs = 392
- Other = 533



• 81 countries, Top 5:













# MFiX-How to get started?



- Website: https://mfix.netl.doe.gov
- Register
- Download / Install MFiX
- Read documentation
- Run tutorials / templates
- Decide best modeling approach for chosen application
- Review questions / Submit questions / report issues on the Forum
- New users are encouraged to use the GUI
- Advanced users/developers can use command line







# **MFiX Documentation**

EC	NETL Multiphase Flow Science		
	Home of the MFX Software Suite.		

https://mfix.netl.doe.gov/doc/mfix/19.2.0



#### User manual

V&V manual

#### Html and pdf

#### Text and video tutorials





#### Docs » 4. MFIX-DEM Code Verification Test Cases » 4.5. DEM05: Oblique particle collision

View page source

#### 4.5. DEM05: Oblique particle collision

This case serves to verify the normal and tangential components of both the linear spring-dashpot and Hertzian collision models in MFIX DEM. This case is based on the modeling work of Di Renzo and Di Maio [15] and utilizes the experimental data of Kharaz, Gorham, and Salman [10].

#### 4.5.1. Description

In the experiments of Kharaz, Gorham, and Salman [10], a spherical particle is dropped from a fixed height such that it collides with a rigid surface at a known velocity. The angle of the ridged surface is varied to test impact angles ranging from normal to glancing. The rebound angle, post-collision angular velocity, and observed tangential restitution coefficient were reported.

In the experiment, the particle strikes an angled anvil as illustrated in Fig. 4.11 (a). Rather than modeling an angled surface, the wall is kept level (flat) and the particle is given an initial trajectory corresponding to the angle found in the experiment as shown in Fig. 4.11 (b). The particle is initially positioned close to the wall and gravity is suppressed in the simulations to eliminate the effects of the rotated geometry with respect to the experimental apparatus.



Fig. 4.11 Experimental setup of Kharaz, Gorham, and Salman [10] of a particle striking a fixed, angled anvil. (b) Simulation setup whereby the particle is given an initial velocity to replicate the particle striking an angled surface.

4.5.2. Setup



# MFiX Forum

EC	NETL Multiphase Flow Science		
	Home of the 🏧 F 🗙 Software Suite.		

https://mfix.netl.doe.gov/forum



#### User support

#### Categories

- Installation
- How to
- Bug report
- Share

#### Topics (threads)

#### File attachment

Searchable









This work was performed in support of the US Department of Energy's Fossil Energy Crosscutting Technology Research Program. The Research was executed through the NETL Research and Innovation Center's Advanced Reaction Systems. Research performed by Leidos Research Support Team staff was conducted under the RSS contract 89243318CFE000003.





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# Preprocessor development



User setup (.mfx file) greatly improved by GUI

Increased demand for complex geometry

Mesh generation

- Workflow challenge
- Geometry input (STL file)
- Preprocessing (cut cells)
- Mesh quality
- Difficult to troubleshoot
- Specific constrains for TFM, DEM and PIC







# Moving geometry

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### Several options to represent moving geometry

• Ability to control flow rate









# Validation-Pressure drop



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- Both drag models consider the effects of particle orientation and cell voidage
- Di Felice-Holzer/Sommerfeld drag correctly capture the pressure in both fixed bed and fluidized bed regimes for each shape particles.
- Unresolved SuperDEM-CFD can not capture the channeling flow. Particle-resolved DEM-CFD may be tested in the future.

# SuperDEM development progress

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#### • Summary

- Oriented bounding box (OBB) algorithm has been implemented and verified
- Superquadric contact algorithm has been implemented and verified
- Quaternion theory for object orientation (rotation between local and global) has been implemented and verified
- VTP (xml) was modified to output tensor for superquadric particle visualization
- Superquadric particle collision with wall (plane, STL)
- Non-linear forces between superquadric particles
- Parallelization (MPI)
- 100 million non-spherical particles large scale simulation on 6800 cores
- A new interpolation scheme (DPVM-Satellites) was developed.
- Non-spherical drag models (Di Felice-Gansor and Di Felice Holzter/SommerFeld) considering particle orientation and cell voidage were implemented
- A new general scheme to calculate the projection area of non-spherical particle perpendicular to the flow was developed.
- 100 million non-spherical particles fluidization simulation on 6800 cores

- Future work
  - Heat transfer, mass transfer, chemical reaction
  - Coupling with other sub-models
  - Multi-superquadric particles to model moving internals, such as baffle, moving wall, etc.
  - Advanced superquadric contact algorithm



### Hundredfold Speedup of MFiX-DEM using GPU Computation

NETL Multiphase Flow Science

avi Fix



#### **GPU Solver & MFiX coupled solver**

х	Start	Allocate memory, generate/read particles	
	store TOverlap To Unsorted Array	Store tangential overlap based on unsorted particle ID	
ಸ	calcHash	Map particles into searching cells	
Generate neighbor lis	sortParticles	Sort particles based on ID of cells.	
	reorderDataAndFindCellStart	<ol> <li>Rearranging particle data into sorted arrays.</li> <li>Mark the first and last particles in each cell</li> </ol>	
	generateNeighborList	<ol> <li>For each particle, calcBinPos, loop over particles in each neighbor bin, store neighbor particles 2) copy tangential overlaps</li> </ol>	
	collide	1) collision with neighbor particles 2) collision with boundaries	
	updatePosVelOmg	Update pos/vel/omega	
х	End	Release memory	



Algorithm of GPU-MFiX data exchange through pipes. Multiple small arrow lines on CPU side indicate MPI parallel processes. DEM is limited to one GPU card.



#### Speedup in Simulations of particle packing (up) & Fluidized bed (bottom)



MFiX-CPUDEM



Particle Parallel (PP)

Collision Pair Parallel (CPP)

## Heat transfer & chemical reactions (biomass drying)



- > DEM solver is ported to GPU
- 170 fold speedup with double precision, 243 fold with single precision
- Re-use CFD, interphase coupling, and chemical reaction modules in MFiX



# C1: Particle settling



### **Deterministic calibration (using 120 samples and PSUADE)** Testing calibrated parameters at "unseen" settings

**Scatterplot Matrix** :2:beta 3.5 t3:StatWeight 20 t4:ep\_g' 0.34 t5:VelfacCoeff 0.9 0.8 0.7 0.6 0 5 10 15 2 3 0.340.4 0.46 4 5 10 15 t1:P 0 t2:beta t3:StatWeight t4:ep\_g\*





With calibrated settings for all 5 parameters both over-predicting with default settings

22.99%

VS

-0.96%

