

# CCSI<sup>2</sup>

Carbon Capture Simulation for Industry Impact

## Multiscale Modeling: Micro-Encapsulated Carbon Sorbent (MECS) Technology

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# Outline

## □ What is MECS & Challenges for Modeling MECS

### How Can CCSI<sup>2</sup> Help?

## □ Process Modeling of MECS

- Screening the design of reactor
- Developing optimal design of process

## □ Bench-Scale CFD Model for MECS: A Discrete Particle Model

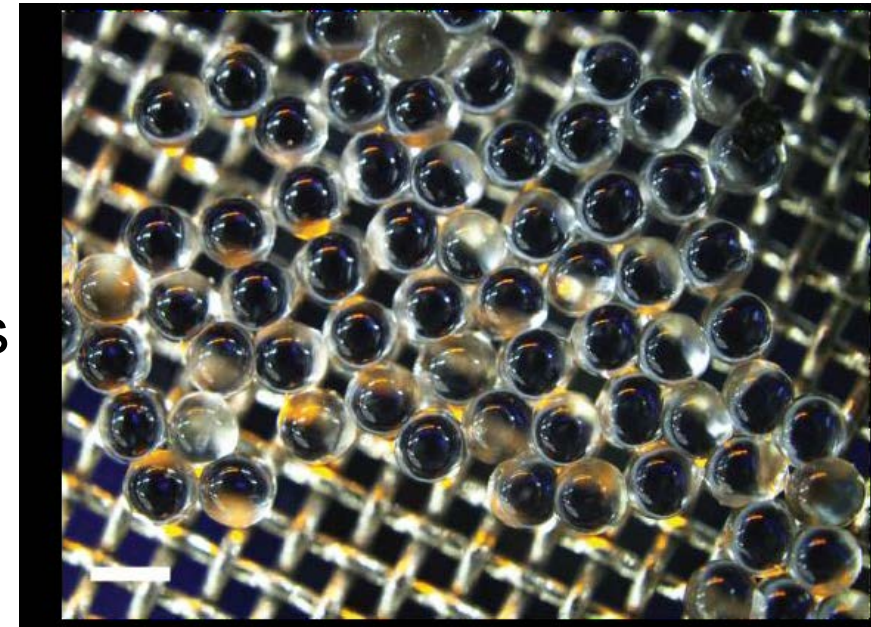
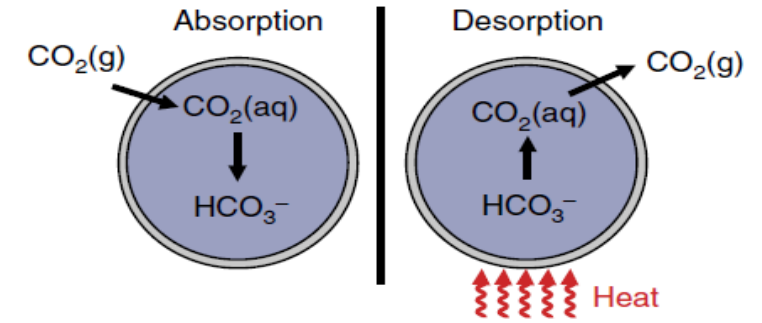
- Understanding the MECS behavior at particle scale
- Calibrating models/parameters at bench-scale for use at device-scale
- Experiment test bed for validation of device scale

## □ Device-Scale Model for MECS Performance in Absorber

- Enabling device-scale prediction of MECS (~100 $\mu$ m) in Absorber (~10m)
- Understanding complex flow and adsorption kinetics to support process design

# MECS Technology

- **Shell\***
  - made of silicone
  - commercially available as Semicosil
- **Core fluid/material**
  - contains solvent (encapsulated by the shell)
  - Strong potential for solvents that are highly viscous and/or form solid precipitate upon  $\text{CO}_2$  absorption

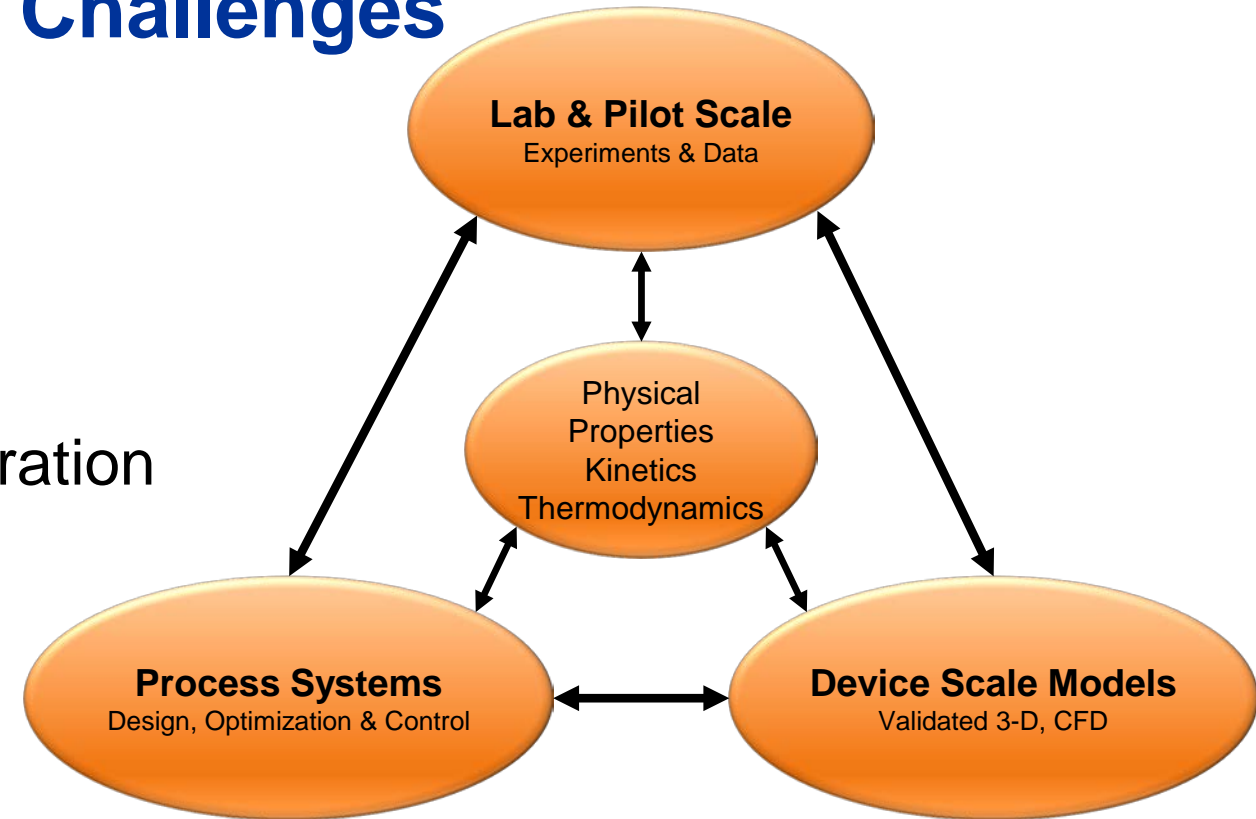


Polymer microcapsules filled with sodium carbonate

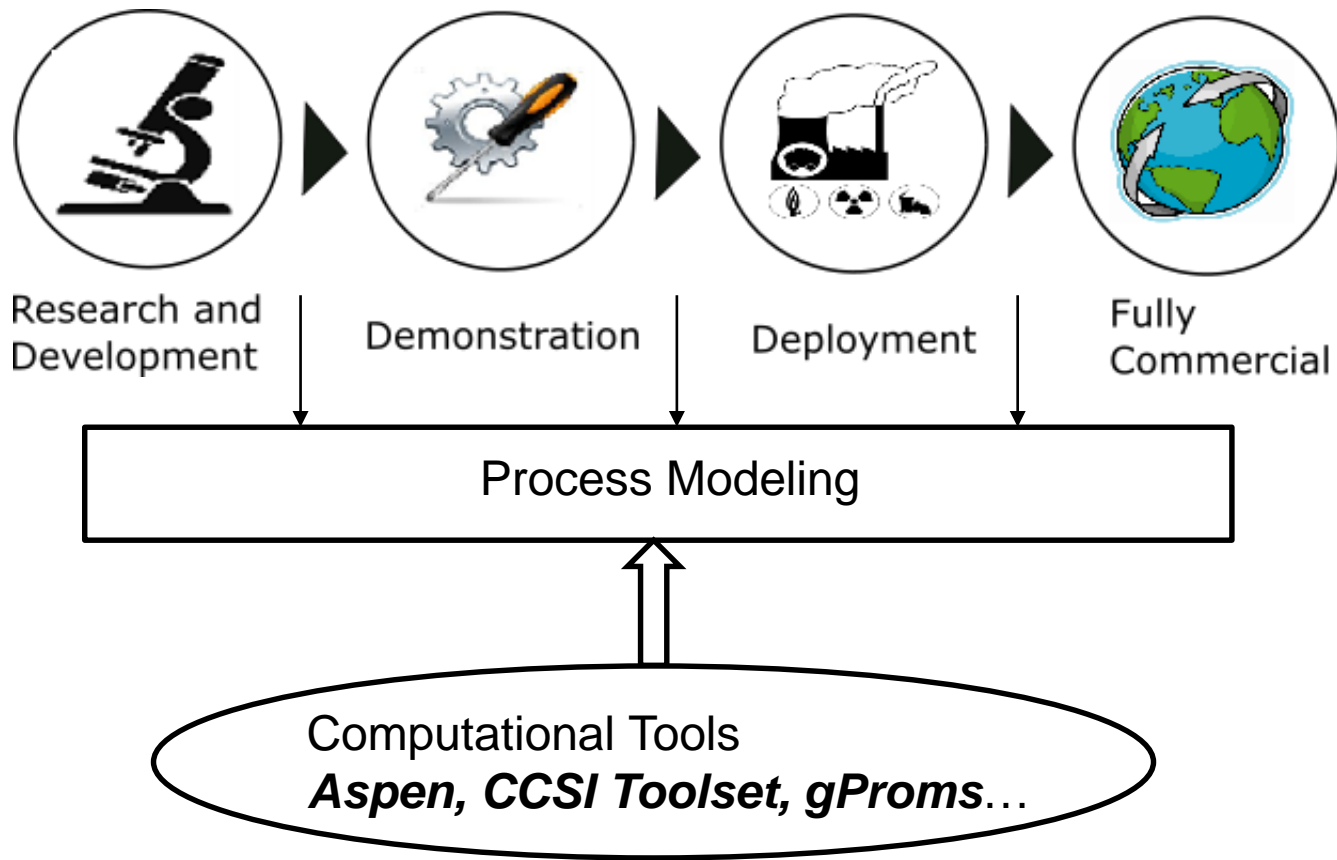
\* Vericella, J. J. et al. Encapsulated liquid sorbents for carbon dioxide capture. Nat. Commun. 6:6124 doi: 10.1038/ncomms7124 (2015).

# Modeling Challenges

- Elastic, deformable shell
- Capsule size/density change
- Precipitation inside capsule
- Water loss/uptake during capture regeneration
- Hydrodynamics of gas-particle flow
- Disparity in scales
- Impractical to measure solvent concentration and loading-difficulty in parameter estimation and model validation
- During operation, solvent concentration and loading need to be estimated



# Specific Objectives of Process Modeling for MECS

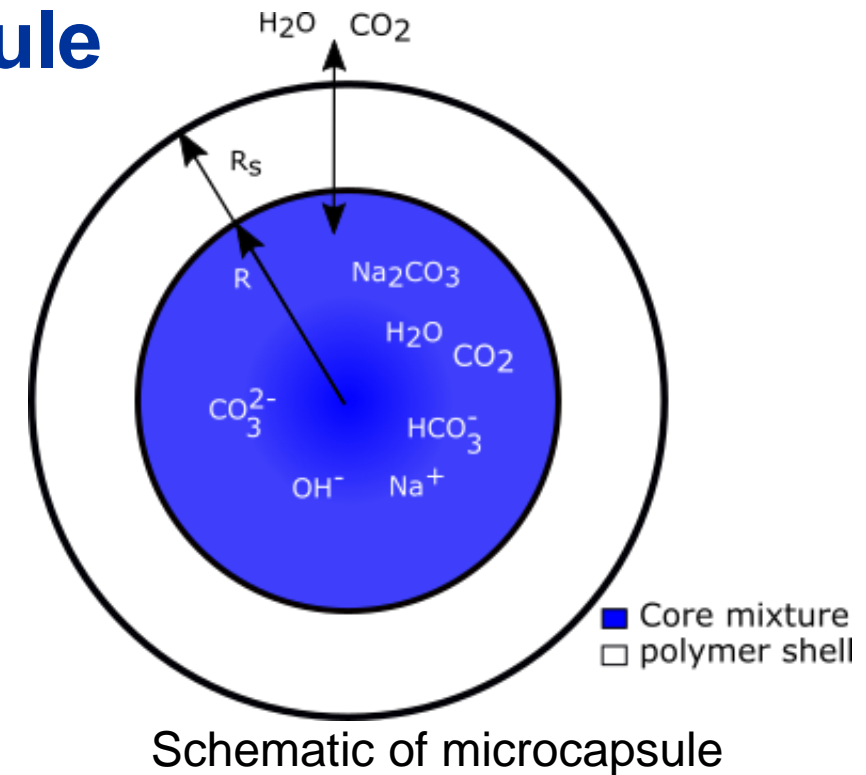


- Understand rate-limiting mechanisms at the commercial scale to identify where resources should be focused
- Estimate model parameters
- Develop optimal contactor type and design
- Synthesize optimal configuration and operating conditions
- Helps to develop optimal design of experiments
- Study transient performance and develop control strategies

# Model of a single capsule

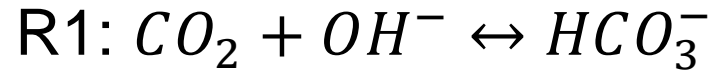
## Assumptions:

- All capsules are perfectly spherical.
- No accumulation in the shell.
- Core is well mixed.
- Shrinking or swelling is neglected (initial version).
- Uniform ambient conditions.
- Mass transfer through the shell only through diffusion.
- No loss of the solvent through the membrane.

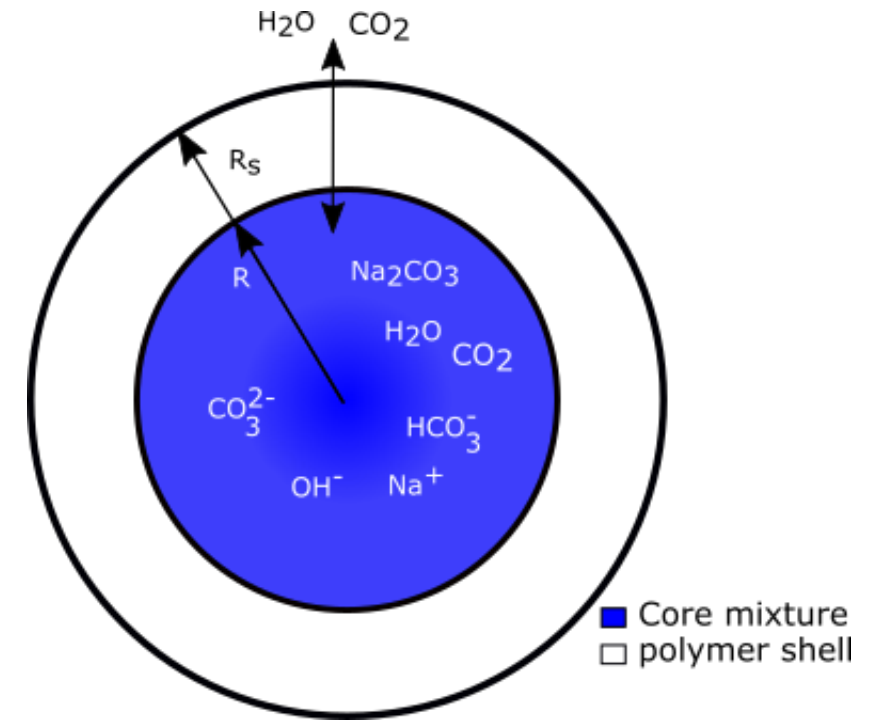
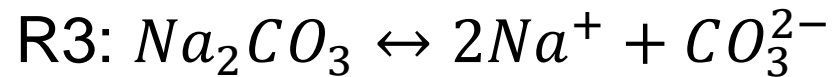
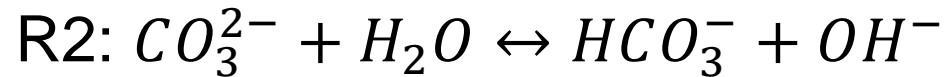


# Reactions

- Kinetically controlled:



- Equilibrium Limited:



Pinsent B.R., Pearson L., Roughton F.J.W., "The Kinetics of Combination of Carbon Dioxide with Hydroxide Ions", Trans. Faraday Soc., 52, 1512-1520, 1956

Astarita G., Savage, D. W., Longo, J. M., "Promotion of Mass Transfer in Carbonate Solutions", Chemical Engineering Science, 36, 581, 1981

# Capsule Model Overview

- Mass transfer from the bulk to the capsule surface:

$$N_{i,surf} = -k_{i,G}(C_{i,G,bulk} - C_{i,surf})$$

- Mass transfer through the shell:

$$\frac{1}{r^2} \frac{\partial}{\partial r} \left( D_{i,shell} r^2 \frac{\partial C_{i,shell}}{\partial r} \right) = 0 \quad D_{i,shell} = C_{1,i} \exp\left(-\frac{C_{2,i}}{T}\right)$$

- Mass transfer from the interface to the liquid core :

$$N_{i,L} = E k_{i,L} C_{tot,L} (x_{i,int} - x_i^*) \quad E = Ha = \frac{\sqrt{k_1 C_{OH^-} D_{CO_2,L}}}{k_{CO_2,L}} \quad D_{CO_2,L} = f(\mu_L, x, T, C_{1L,CO_2}, C_{2L,CO_2})$$

- Chemical Equilibrium:

$$K_{eq1} = \frac{[C_{HCO_3^-}]}{[CO_2^*][C_{OH^-}]}; K_{eq2} = \frac{[C_{HCO_3^-}][C_{OH^-}]}{[CO_3^{2-}][H_2O^*]}; K_{eq3} = \frac{[C_{Na^+}]^2 [C_{CO_3^{2-}}]}{[C_{Na_2CO_3}^*]}$$

- Phase Equilibrium at interface:

$$\phi_{CO_2} P y_{CO_2,int} = H e_{CO_2} \gamma_{CO_2} x_{CO_2,int}$$

$$\phi_{H_2O} P y_{H_2O,int} = x_{H_2O,int} \gamma_{H_2O} f_{H_2O}^L$$



# Model of a Single Shell (contd.)

- Mass transfer Coefficients\*:

## Liquid Phase

$$\frac{k_{i,L} d_{int}}{D_{i,L}} = C_L \left( \frac{d_{int}^3 \Delta \rho g}{\rho_L \mu_L^2} \right)^{\frac{1}{3}} \left( \frac{\mu_L}{D_{i,L}} \right)^{\frac{1}{2}}$$

## Gas Phase

$$\frac{k_{i,G} d_{surf}}{D_{i,G}} = 2 + C_G \left( \frac{d_{surf}^3 d^3 \Delta \rho g}{\rho_G \mu^2} \right)^{\frac{1}{4}} \left( \frac{\mu_G}{D_{i,G}} \right)^{\frac{1}{3}}$$

- Diffusion coefficients:

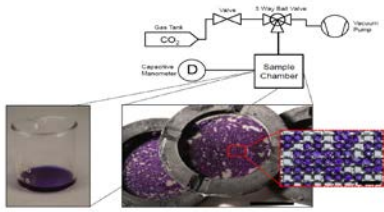
## Diffusivity of CO<sub>2</sub> in liquid:

$$D_{CO_2,L} = f(\mu_L, x, T, C_{1L,CO_2}, C_{2L,CO_2})$$

Cussler, E. L. *Diffusion: Mass transfer in fluid systems*. (Cambridge, 1984).

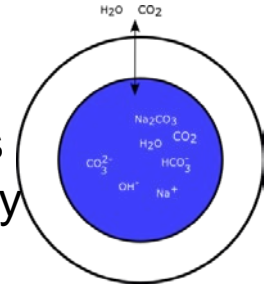
# Estimation of Model Parameters

## Experiments



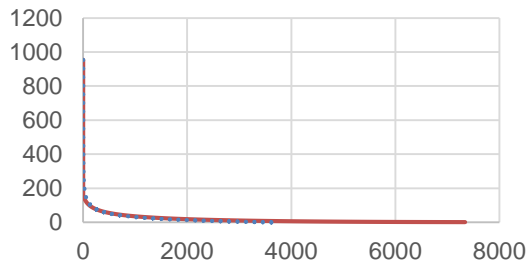
## Capsule Model

- Input capsule properties
- Initial values of boundary conditions



## Estimation

- Parameter identifiability analysis
- Maximum likelihood estimate of model parameters



$$\max_{\theta, \gamma} \left\{ -\frac{1}{2} \sum_{i=1}^{N_{meas}} \left( n_i \log(2\pi + 1) + n_i \log \left[ \frac{1}{n_i} \sum_{j=1}^{N_{dyn}} \sum_{k=1}^{M_{ij}} w_j^2 \frac{(Z_e(t_{ijk}) - Z_m(t_{ijk}))^2}{Z_{m,ijk}^{\gamma_i}} \right] + \gamma_i \sum_{j=1}^{N_{dyn}} \sum_{k=1}^{M_{ij}} \log w_j Z(t_{ijk}) \right) \right\}$$

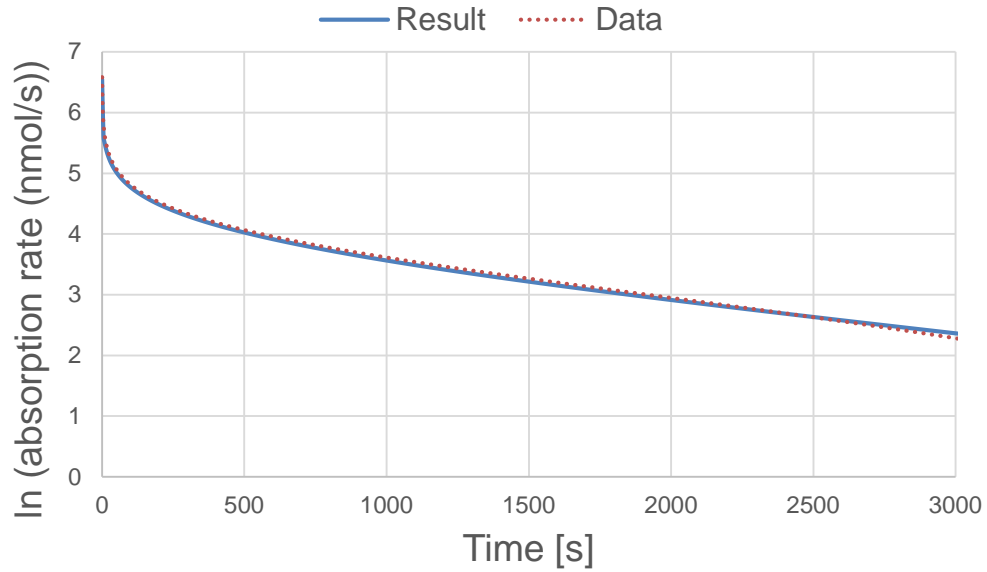
**Subject to**  $\dot{x} = f(x, Z, u, \theta)$

$$g(x, Z, u, \theta) \leq 0$$

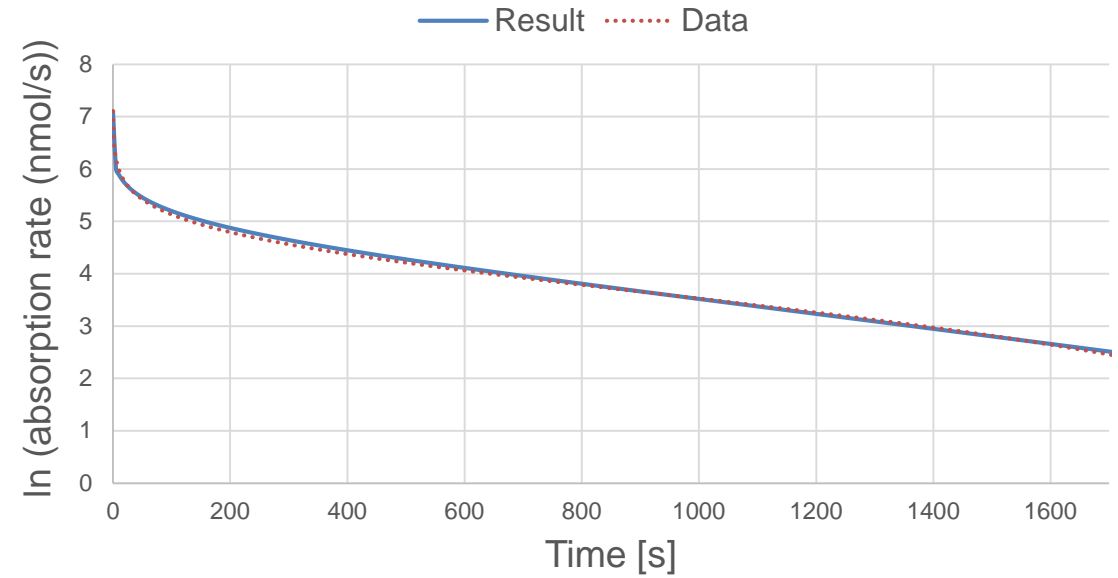
$$g(x, Z, u, \theta) \leq 0$$

# Validation of Capsule Model

25°C



40°C



# Development of a Fixed Bed Model

- Can be used for studying mass and heat transfer characteristics, especially through the membrane and into the core
- Investigate feasibility of a fixed bed contactor
- Mass and energy balance for the gas phase:

$$\epsilon_{bed} \frac{\partial c_{i,g}}{\partial t} = -\frac{\partial(u_g c_{i,g})}{\partial z} + \epsilon_{bed} \frac{\partial}{\partial z} \left( D_{ax} \frac{\partial c_{i,g}}{\partial z} \right) - (1 - \epsilon_{bed}) * n_{capsules} * a_v * N_{i,surf}$$

$$\epsilon_{bed} C_{T,g} C_{v,g} \frac{\partial T_g}{\partial t} = -u_g C_{T,g} C_{p,g} \frac{\partial T_g}{\partial z} + \frac{\partial}{\partial z} \left( \lambda \frac{\partial T_g}{\partial z} \right) - (1 - \epsilon_{bed}) a_p h_{gs} (T_g - T_s) - \frac{4h_{gw}}{D_r} (T_g - T_w)$$

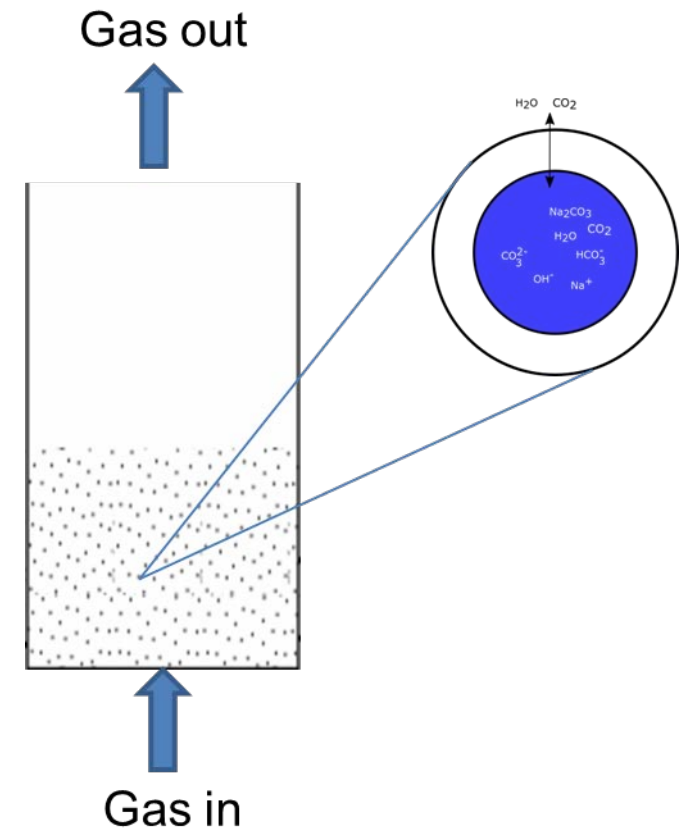
- Momentum balance:

$$-\frac{\partial P_g}{\partial z} = \frac{150 \mu (1-\epsilon)^2 u_g}{\epsilon^3 d_p^2} - \frac{1.75(1-\epsilon) \rho_g |u_g| u_g}{\epsilon^3 d_p}$$

- Energy balance between wall and gas:

$$\rho_w \overline{C_{p,w}} \frac{\partial T_w}{\partial t} = a_{w1} h_{gw} (T_g - T_w) - a_{w2} U (T_w - T_{amb}) = 0$$

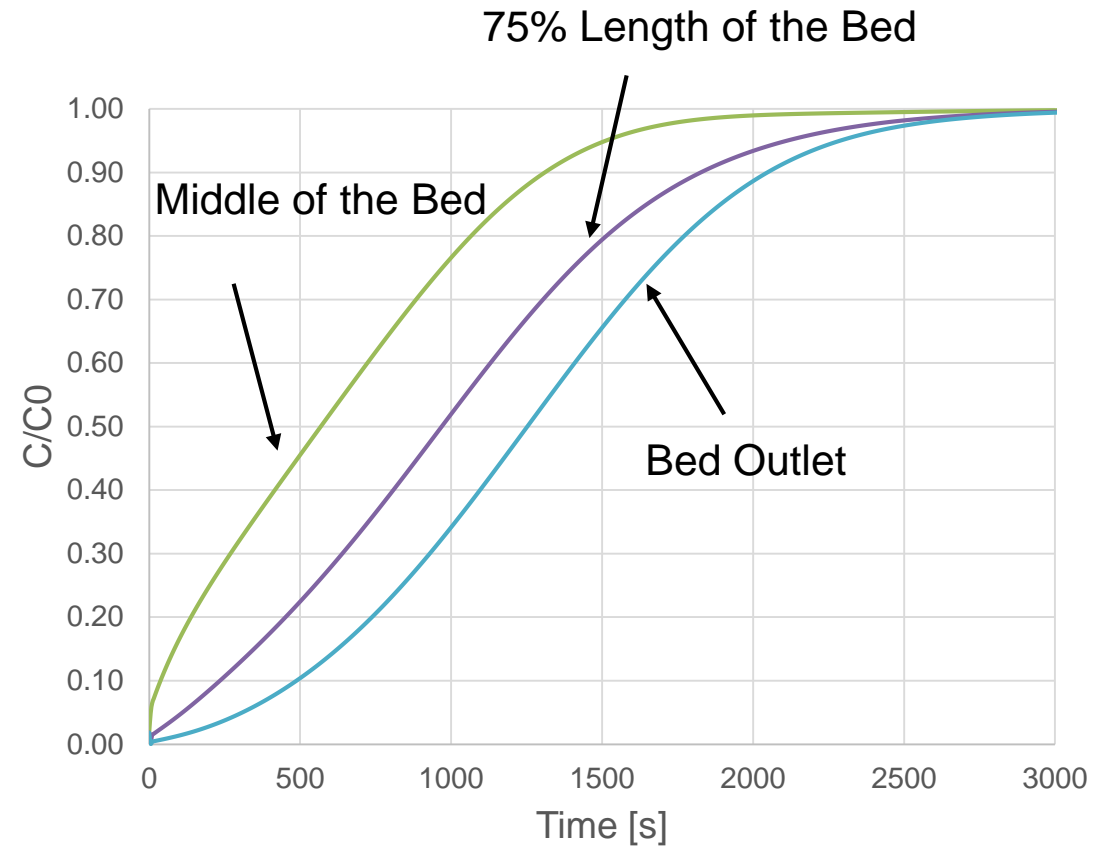
- Capsule model is embedded in the contactor model



# Fixed Bed Results- Base Case

## Operating conditions

Pressure	1.1	bar
Temperature	40	°C
Bed Length	10	m
Bed Diameter	3	m
Flowrate	150	mol/s
Solvent loading	10%	wt



Breakthrough Curves at Different Sections of the Bed

# Breakthrough Time

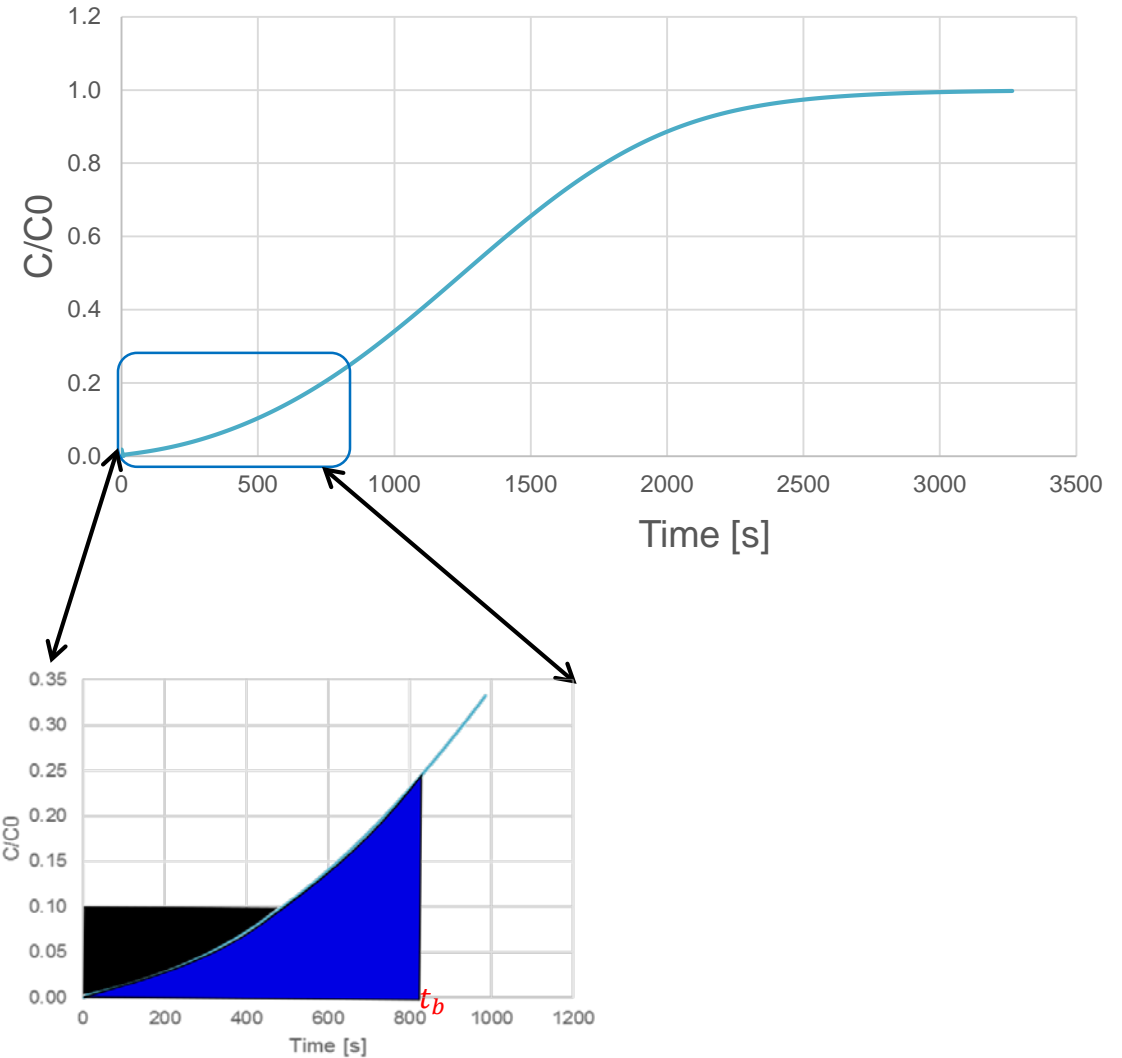
- Breakthrough Time for Overall 90% CO<sub>2</sub> Capture:

$$F_{in} Z_{CO_2,in} * 0.1 * t_b = \sum_{i=1}^n F_{out,i} Z_{CO_2,out,i} \Delta t$$

Where  $n = \frac{(t_b - t_o)}{\Delta t}$

- Approximate number of beds for a 550 MWe net subcritical PC plant:

182



# Fixed Bed Results-Possible Scenarios

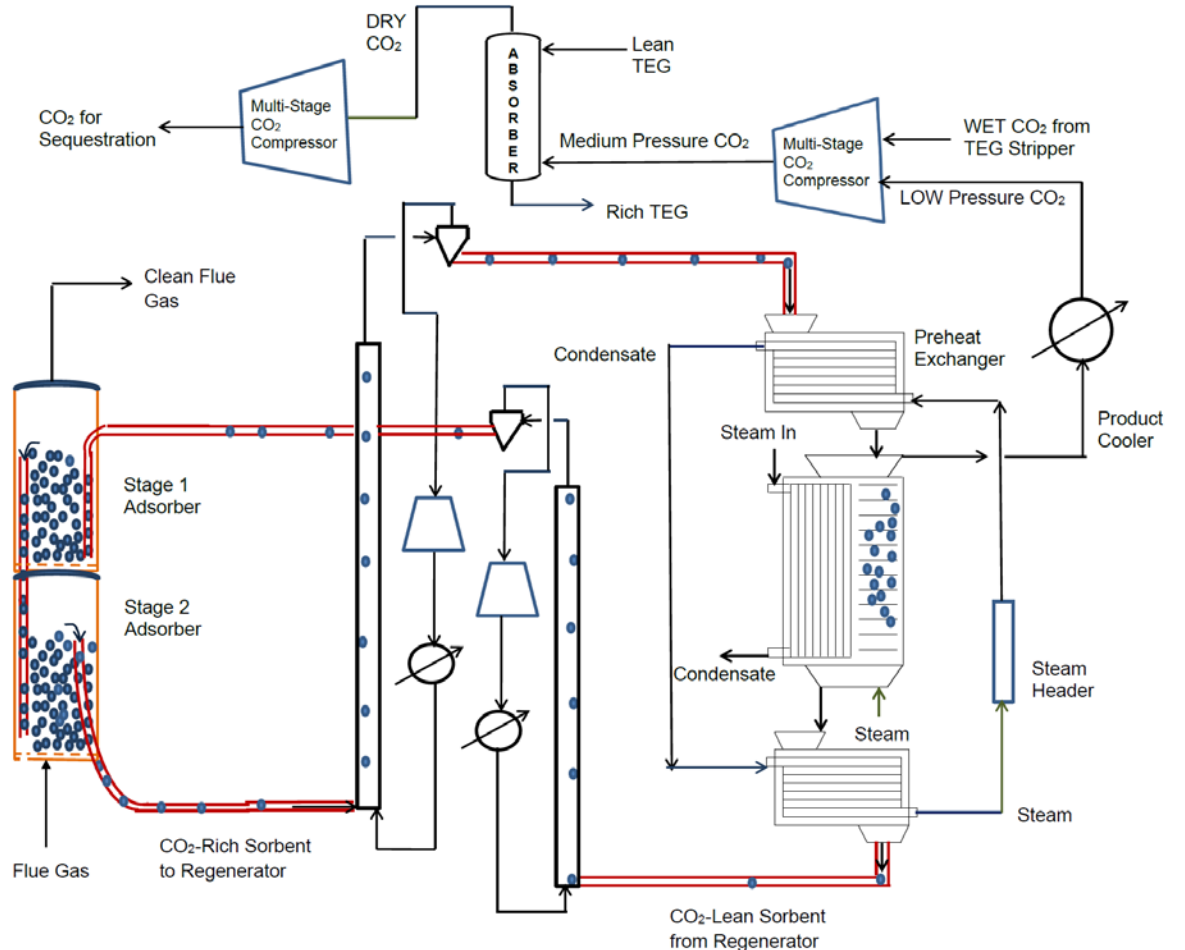
- Assuming mass transfer resistance do not increase with solids formation-best case scenario analysis

Solvent Concentration (wt%)	Bed length (m)	Bed diameter (m)	No of parallel Beds
10	10	3	~182
10	15	3	~ 83
20	15	3.5	~ 67
30	15	3.5	~ 60
50	15	3.5	~ 55

- At 105°C, number of beds decreases to around 50
- Fixed bed may not be right configuration for the MECS under consideration

# Conclusions and Future Work

- Based on our preliminary analysis, it appears that the fixed bed contactors are not suitable for the MECS system with carbonate solutions. Conclusions may change for other solvents and if a highly active catalyst is available.
- Investigate other types of contactors such as BFB, MB, CFB
- Synthesize optimal configuration and operating conditions
- Quantify uncertainty leveraging the CCSI toolset.





# Objective of CFD Modeling for MECS

**CCSI<sup>2</sup> Goal:** *Enable device-scale predictive capability for CO<sub>2</sub> capture using MECS technology to accelerate development and deployment.*



Fluidized bed test



FIG: MECS Fluidization Demonstration<sup>1</sup>

## Design Considerations

- Capsule size?*
- Shell Thickness?*
- Solvent type?*
- Circulating solids?*
- Fixed bed?*
- Fluidized bed?*
- Reactor Dimensions?*
- Cooling tubes?*

<sup>1</sup>Vericella et al., Nature Comms, v. 6, 2015;

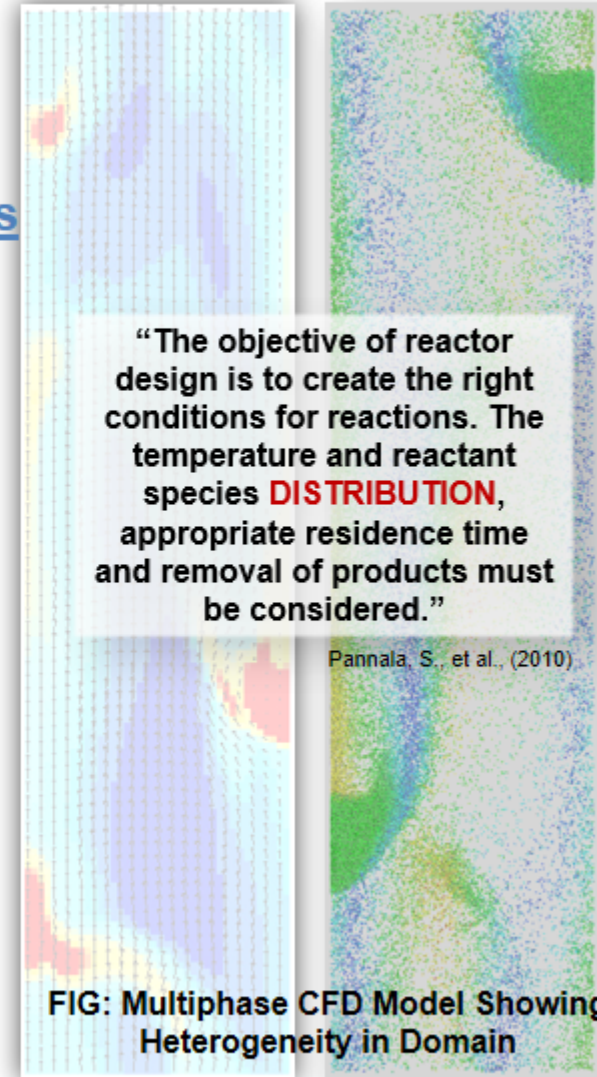
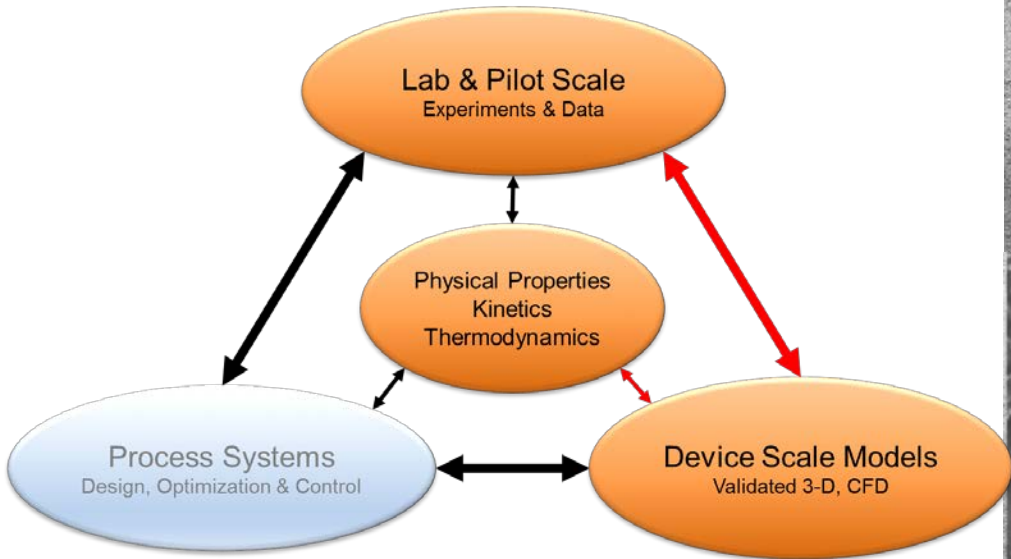


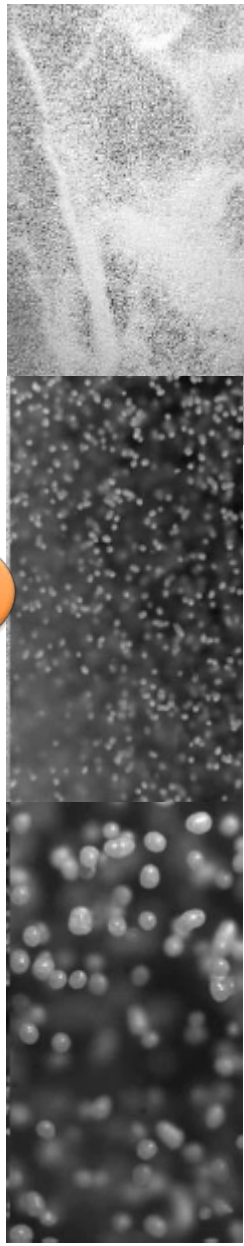
FIG: Multiphase CFD Model Showing Heterogeneity in Domain

# Approach



## Requires

- Integration of accurate physics and chemistry models
- A comprehensive understanding of all the significant competing and interacting mechanisms:



IMG: Streamers, clusters, particles in CFB<sup>2</sup>

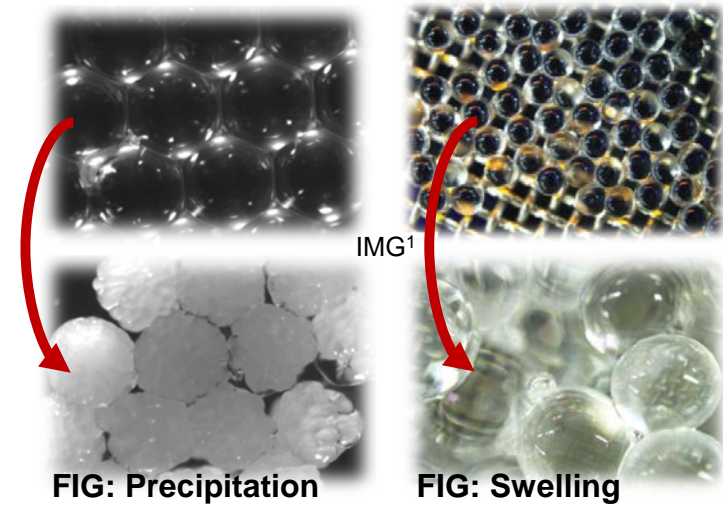
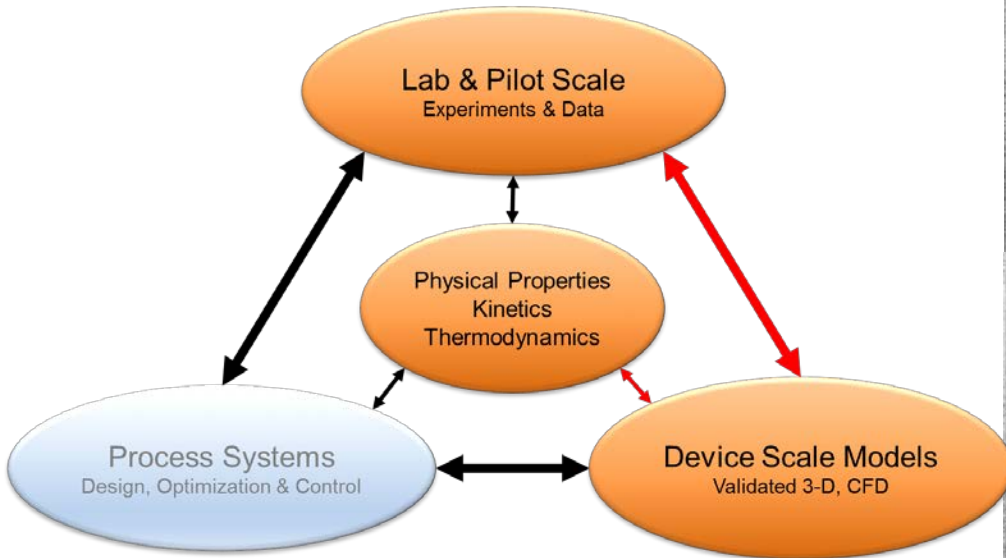


FIG: Precipitation

FIG: Swelling

<sup>1</sup>Vericella et al., Nature Comms, v. 6, 2015; Shaffer, F., et al., NETL MFSW, 2010.

# Approach



## Requires

- Integration of accurate physics and chemistry models
- A comprehensive understanding of all the significant competing and interacting mechanisms:

*Model the effect of small-scale fluctuations that are too expensive to simulate directly*

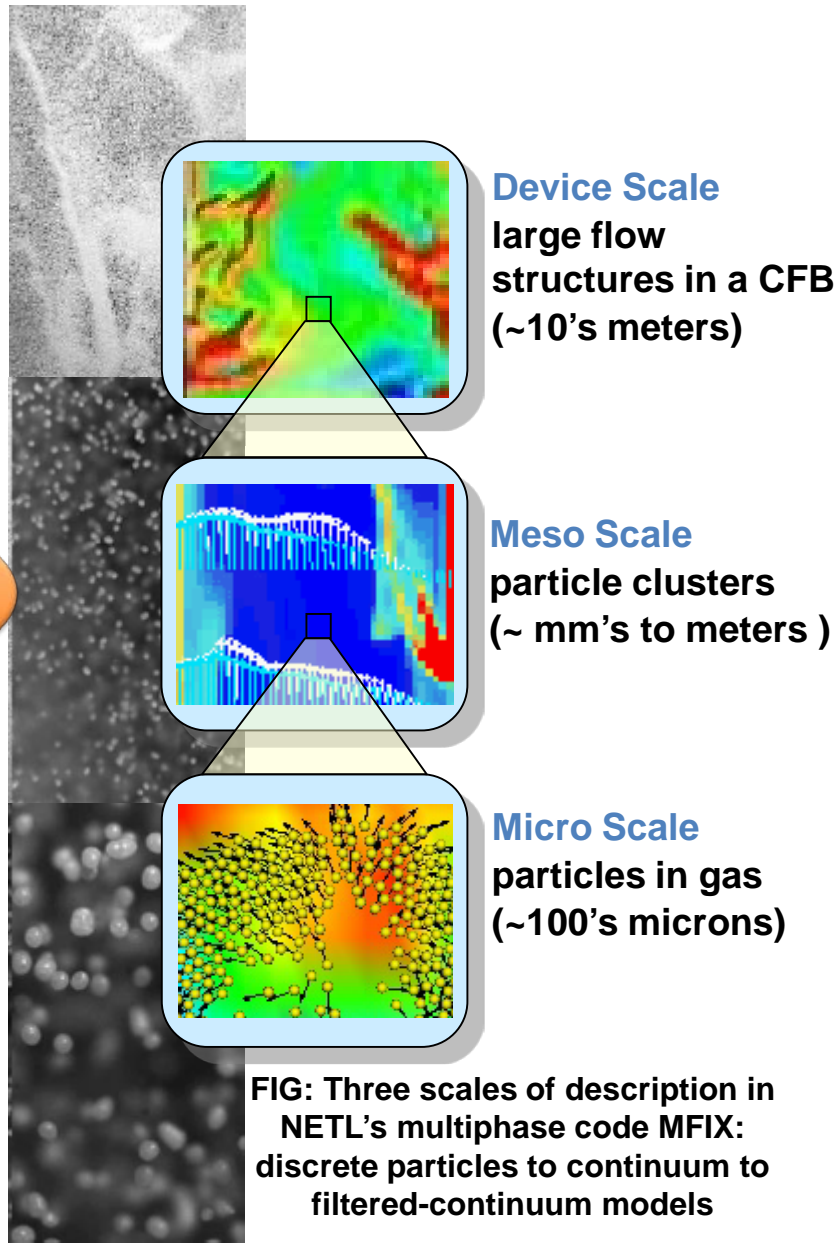
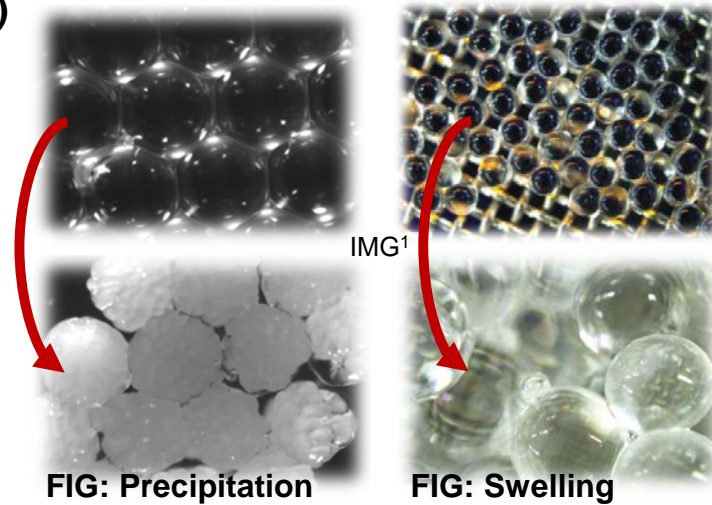


FIG: Three scales of description in NETL's multiphase code MFIX: discrete particles to continuum to filtered-continuum models

IMG: Streamers, clusters, particles in CFB<sup>2</sup>

## Model Challenges

- Elastic, deformable shell
- Capsule size/density change
- Precipitation inside capsule
- Water loss/uptake during capture regeneration
- Hydrodynamics of gas-particle flow
- Disparity in scales



<sup>1</sup>Vericella et al., Nature Comms, v. 6, 2015; Shaffer, F., et al., NETL MFSW, 2010.

# Accomplishments: Tool Development

- ✓ Implemented chemistry, heat and mass transfer into a CFD-DEM simulation model/framework

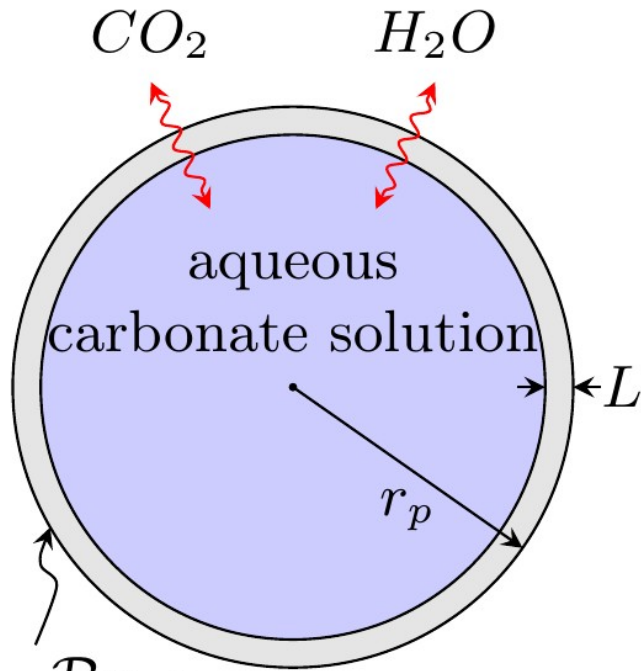
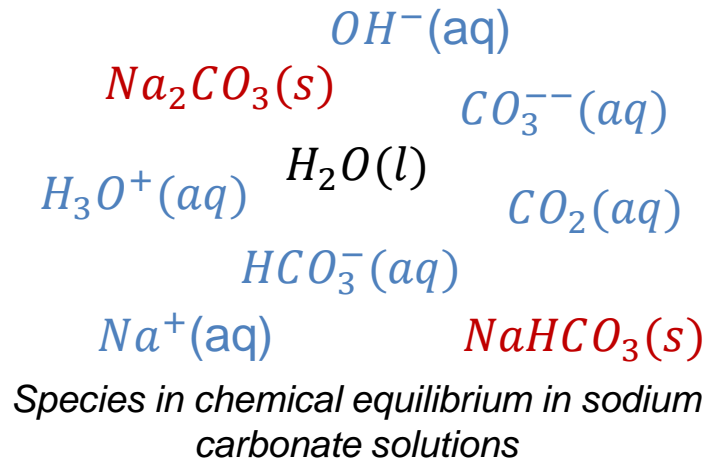


FIG: MECS schematic

## Considerations

- Shell permeable to  $CO_2$  and  $H_2O$
- Solvent: aqueous  $Na_2CO_3$
- Bulk liquid composition governed by 5 equilibrium reactions
- $NaHCO_3$  precipitate when solubility limit exceeded
- Capsule size/density changes
- Physical properties *mostly* available from literature



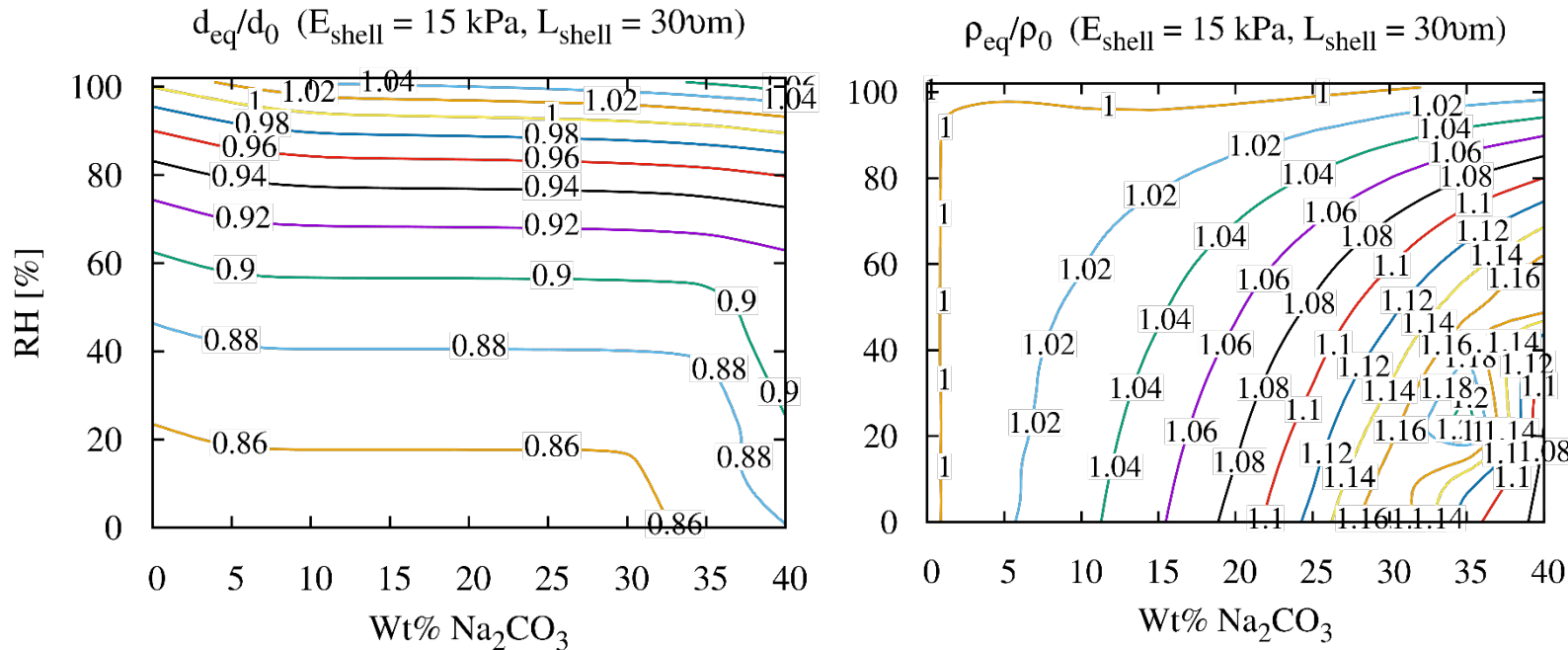
$CO_2(g) \rightleftharpoons CO_2(aq)$ Chemically Enhanced Mass Transfer
$N_{CO_2} = k_{ov,CO_2} a_p (p_{CO_2} - H_{CO_2} [CO_2] - p_{shell})$
$\frac{1}{k_{ov,CO_2}} = \frac{1}{k_g} + \frac{1}{k_{shell}} + \frac{1}{k_l}$
$k_g = f(Re_p, Sc_p)$
$k_{shell} = \mathcal{P}_{shell}^{CO_2} / L_{shell}$
$k_l = k_l^0 E / H_{CO_2}$

$H_2O(g) \rightleftharpoons H_2O(l)$ Physical Mass Transfer
$N_{H_2O} = k_{ov,H_2O} a_p (p_{H_2O} - y_{H_2O}^{liq} p_{H_2O}^{sat}(T_p) - p_{shell})$
$\frac{1}{k_{ov,H_2O}} = \frac{1}{k_g} + \frac{1}{k_{shell}}$
$k_g = f(Re_p, Sc_p)$
$k_{shell} = \mathcal{P}_{shell}^{H_2O} / L_{shell}$

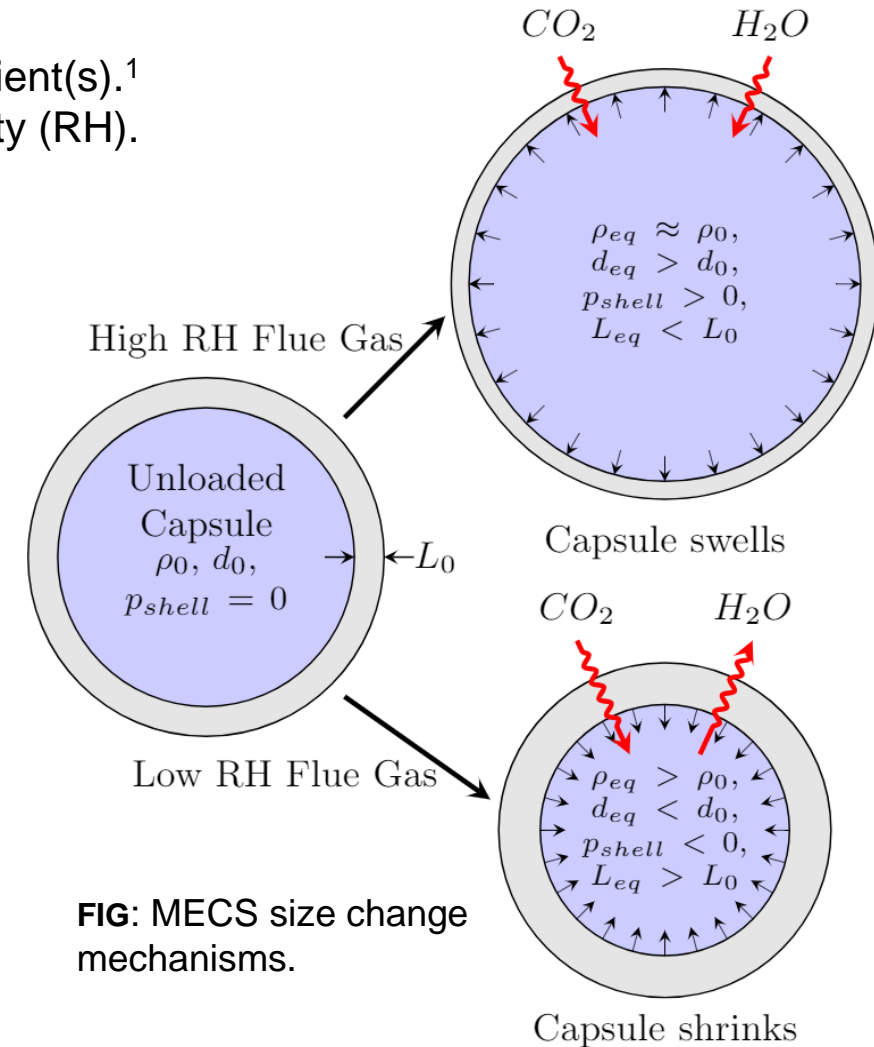
# Accomplishments: Tool Development

## ✓ Developed a model to represent particle size and density changes

- At equilibrium the shell pressure ( $p_{shell}$ ) balances mass transfer pressure gradient(s).<sup>1</sup>
- Direction of  $H_2O$  transfer depends on solution strength and gas relative humidity (RH).
- $CO_2$  absorption can also drive  $H_2O$  desorption.



**FIG:** Predicted Eq. capsule size (left) and density (right) after exposure to flue gas at 1atm pressure and  $T=40C$ .



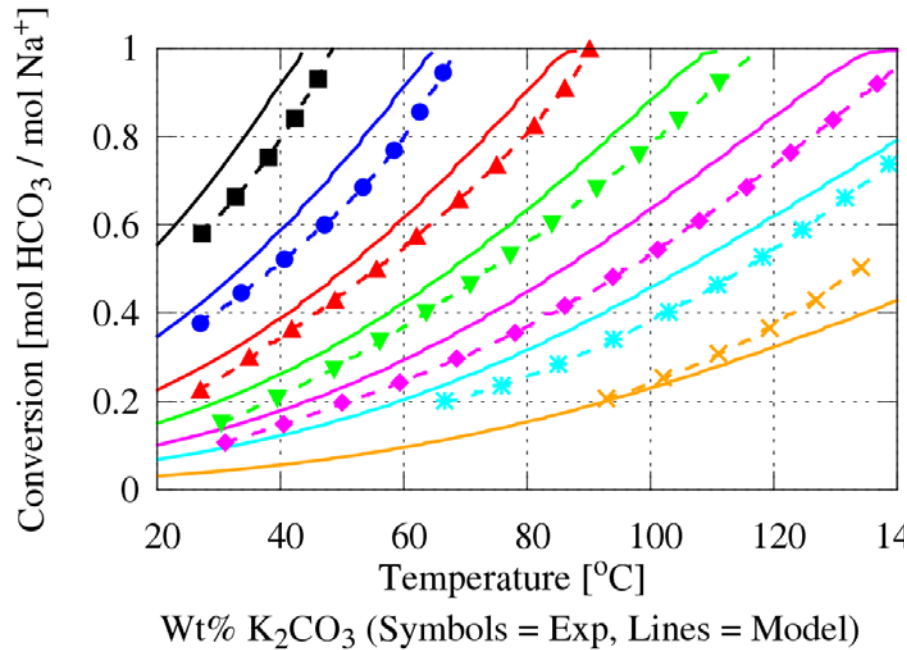
**FIG:** MECS size change mechanisms.

<sup>1</sup>Nabavi et al., Langmuir, v. 32, 2016;

# Accomplishments: Validation

✓ Conducted limited validation studies on *chemistry* using literature data and LLNL experimental data

Onset of precipitation for loaded carbonate solution<sup>2</sup>



25% ■ 30% ● 35% ▲ 40% ▼ 45% ◆ 50% \* 60% ×

FIG: Threshold of potassium bicarbonate precipitation comparison with Kohl & Nielsen<sup>2</sup>

Vapor-liquid equilibrium (composition of loaded carbonate<sup>1</sup>)

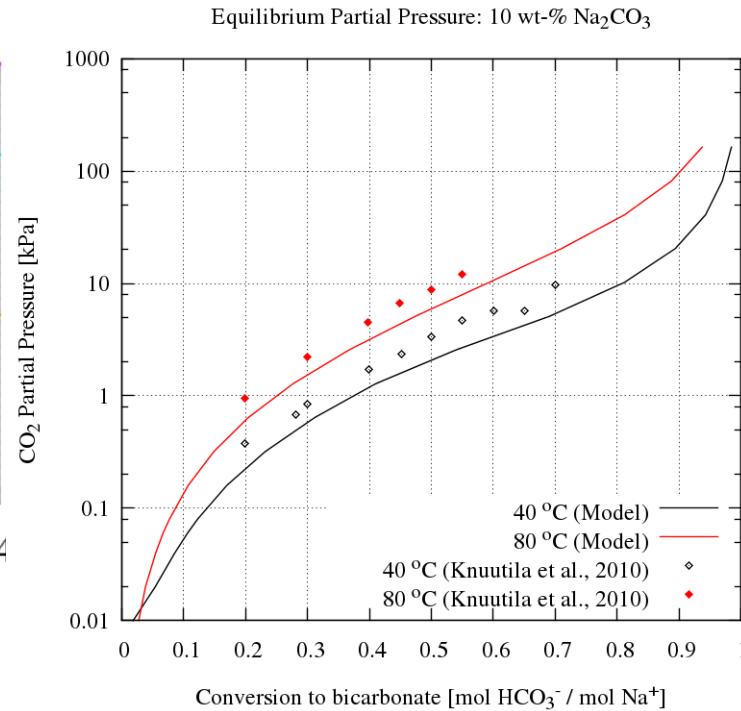
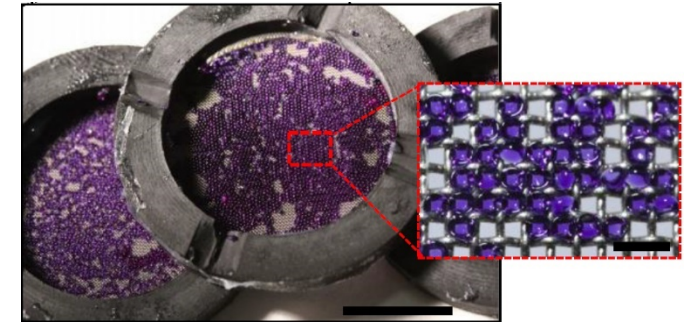


FIG: VLE comparison with Knuutila et al<sup>1</sup>

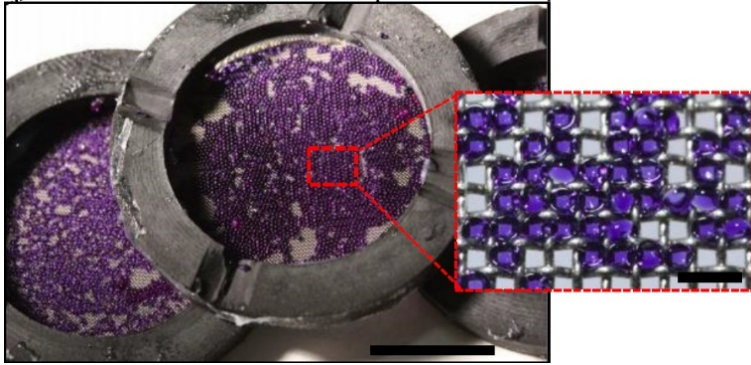
CO<sub>2</sub> absorption rate measurements<sup>3</sup>



IMG: MECS in LLNL absorption chamber<sup>4</sup>

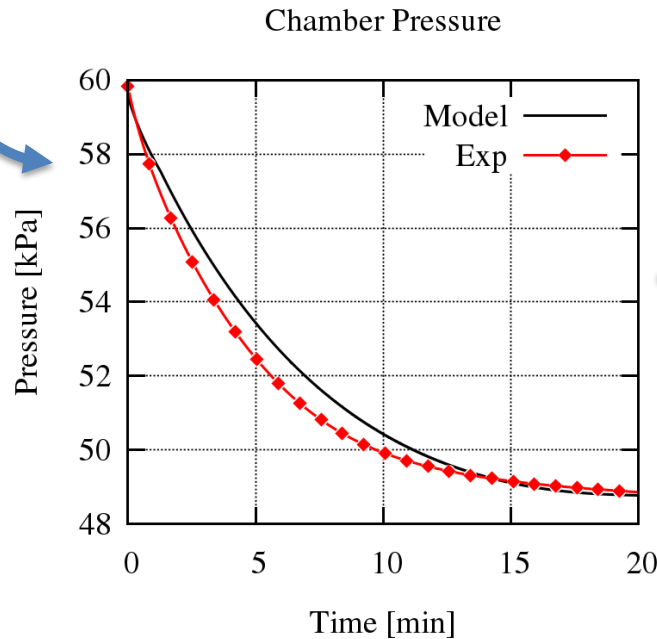
<sup>1</sup>Knuutila et al., CES, v. 65, 2010(a,b,c);  
<sup>2</sup>Kohl and Nielsen, Gas Purification, 1997;  
<sup>3</sup>LLNL Data, Private Communication, July 2017;  
<sup>4</sup>Vericella et al., Nature Comms, v. 6, 2015

# Accomplishments: Validation



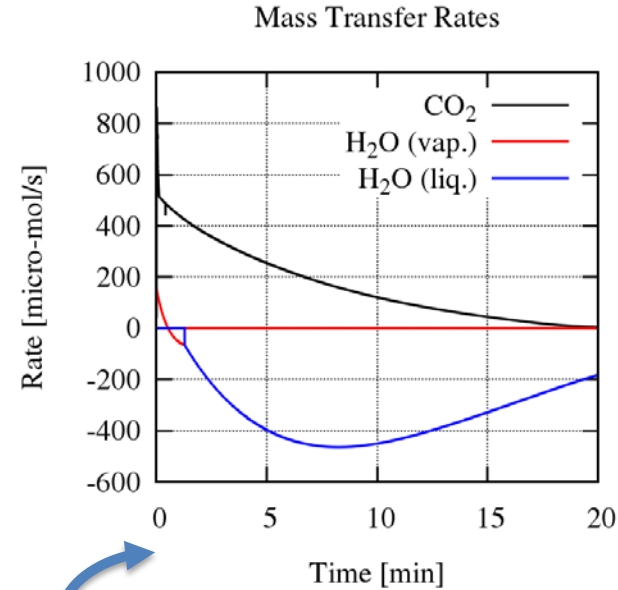
IMG: Vericella/LLNL<sup>1,2</sup>

## 2. Tune Enhancement Factor\*

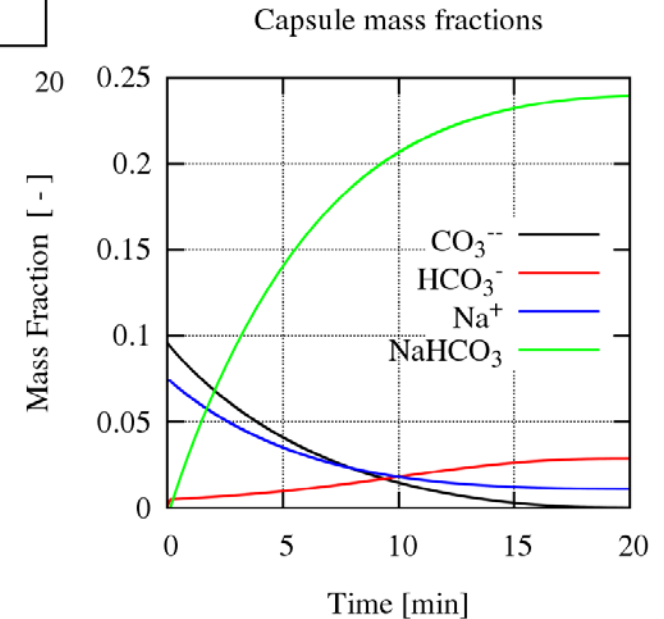


\* $E$  is tuned by adjusting  $k_{OH^-}$  and  $D_{CO_2}$

## 3. Use calibrated model to infer MECS behavior



- $NaHCO_3$  precipitates
- $p_{shell}$  buildup as  $CO_2$  is absorbed forces  $H_2O$  out.
- $H_2O$  leaves first as vapor, then liquid as gas become saturated.



## 1. LLNL absorption measurements

- MECS exposed to high  $CO_2$  pressures in a sealed chamber.
- 17wt%  $Na_2CO_3$
- $d_p = 480\mu m$
- $L_{shell} = 30\mu m$
- 100% RH in chamber

<sup>1</sup>LLNL Data, Private Communication, July 2017;

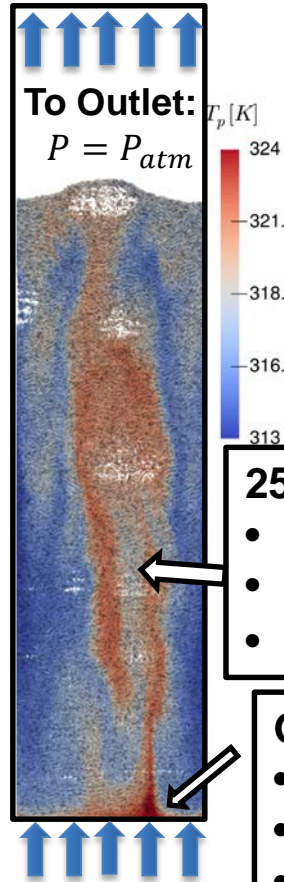
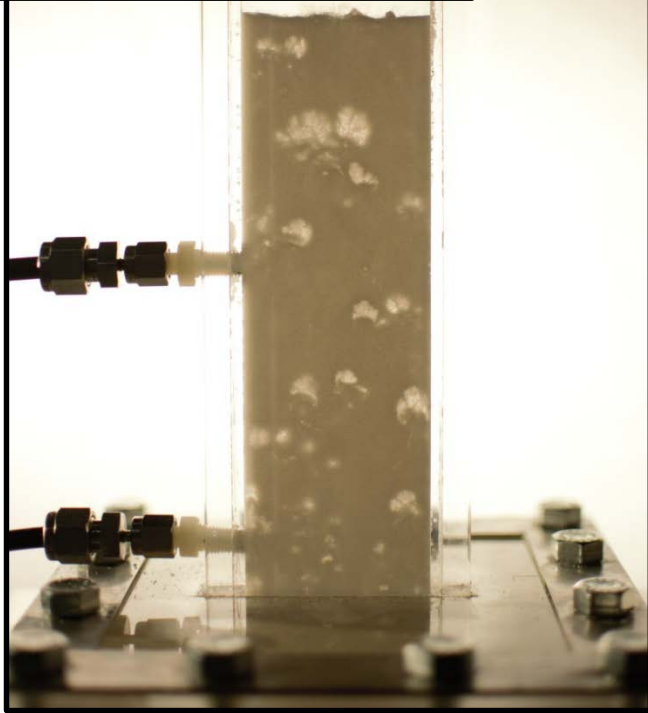
<sup>2</sup>Vericella et al., Nature Comms, v. 6, 2015

# Bench Scale Simulation of MECS Carbon Capture

## Bubbling fluidization in NETL's $\mu$ Fluidized Bed

### NETL's $\mu$ Fluidized Bed:

- 5cm x 45cm x 0.32cm
- Detailed exp. possible



### 250,000 MECS:

- 17 wt%  $Na_2CO_3$
- $d_{po} = 480\mu m$
- $L_0 = 15\mu m$

### Gas Inlet:

- $T=40C$
- 12%  $CO_2$
- 20% RH
- $U_g = 1.3U_{mf}$

FIG:  $\mu$ Fluidized bed in laboratory (left) and MFIX-DEM simulation setup with MECS particles (right) colored by temperature.

## CFD Setup:

- Pseudo-3D domain:  $L_z = 6.67d_p$
- 32x288x1 Grid  $\Rightarrow \Delta_x, \Delta_y \approx 3.2d_p$
- Hertzian contact model for soft silicon capsules:
  - $E = 15GPa, \nu = 0.5$
  - $e_n, e_t = 0.9$
- Isothermal walls ( $T=313K$ )
- Enhanced kinetics ( $100 \times k_{OH}$ )
- $\Delta t_p \approx 3 \times 10^{-6}s, \Delta t_f \approx 1 \times 10^{-4}s$



FIG: Simulated bubbling behavior



# Bench Scale Simulation of MECS Carbon Capture

- 75% capture efficiency in bubbling regime with a bed height of 15cm using enhanced kinetics ( $100 \times k_{OH}$ ).
- Interesting effects during  $CO_2$  absorption:
  - Rapid  $H_2O$  loss that humidifies the gas.
  - $NaHCO_3$  precipitation is very exothermic.
  - $H_2O$  condenses as gas cools above the bed region.

$H_2O$  Vapor      Condensed  $H_2O$

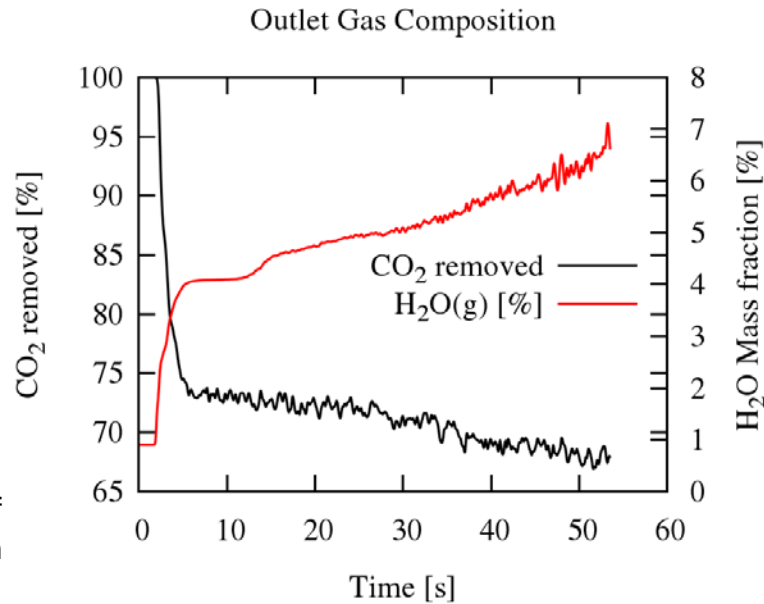


FIG: Time evolution of outlet gas composition

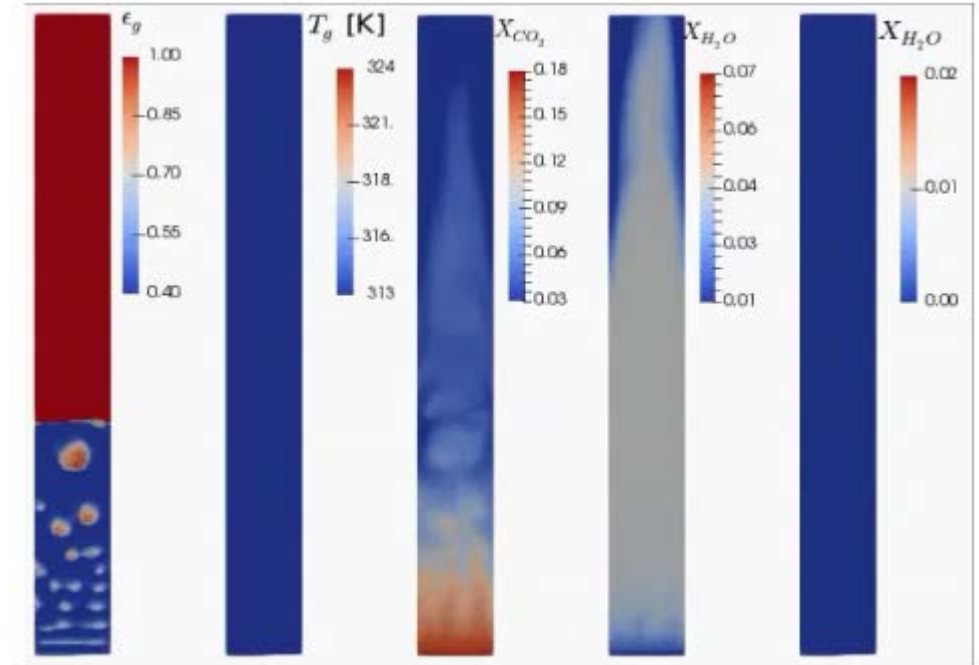


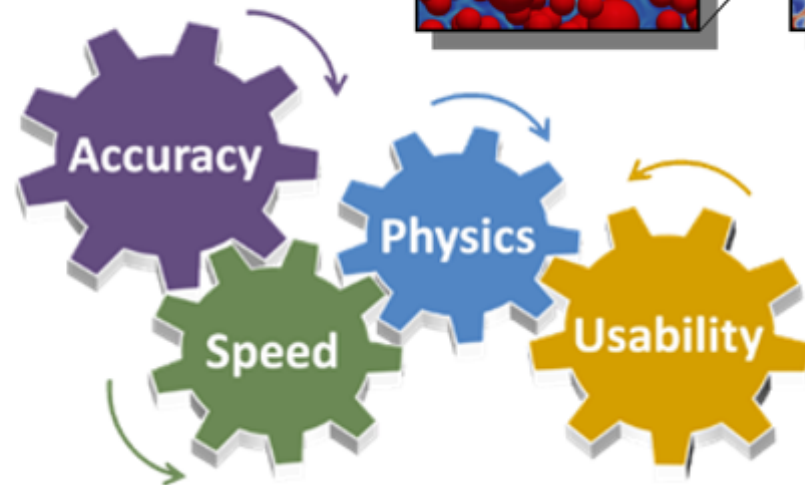
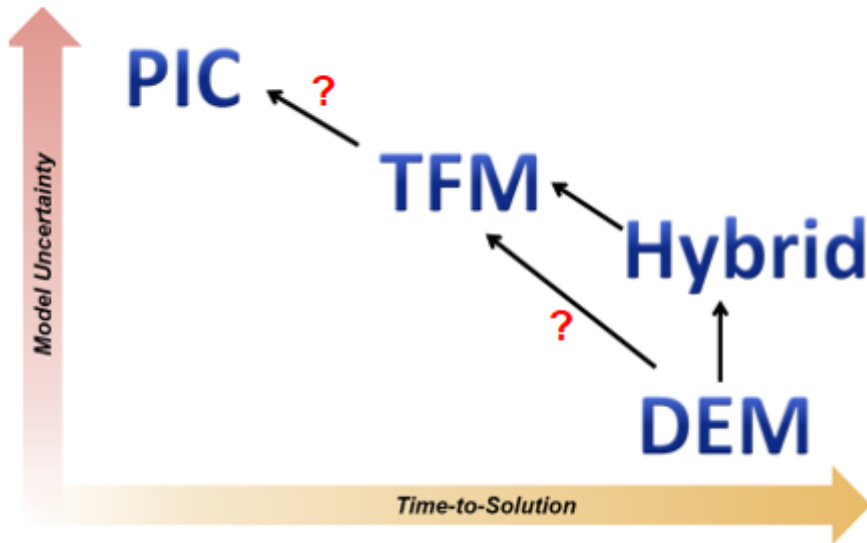
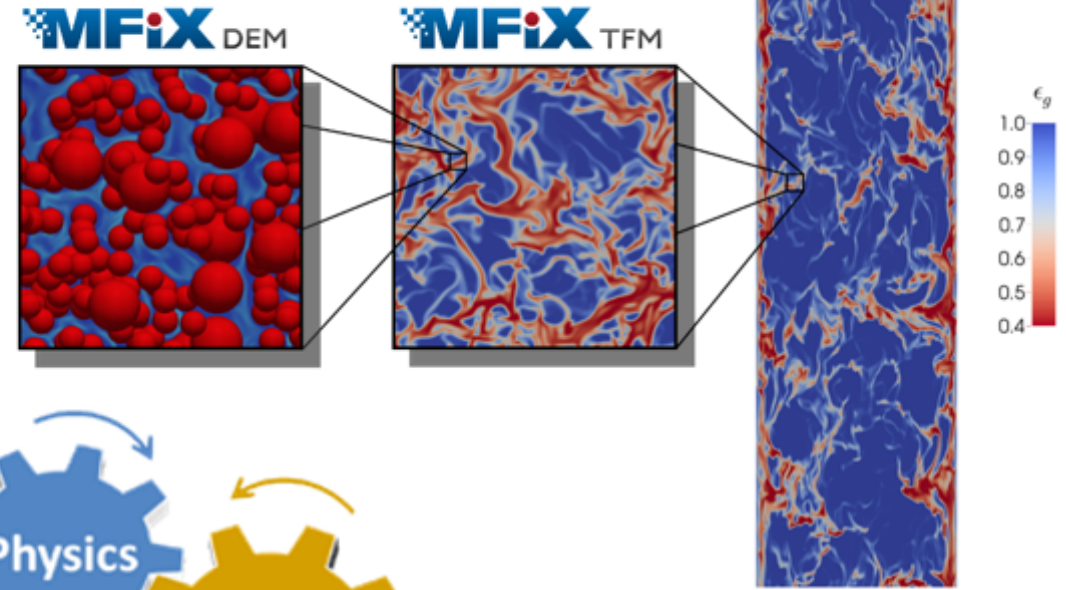
FIG: From left to right: gas vol. fraction, gas temp.,  $CO_2$  mass fraction,  $H_2O$  vapor mass fraction, condensed  $H_2O$  mass fraction.

# Tools and Capabilities

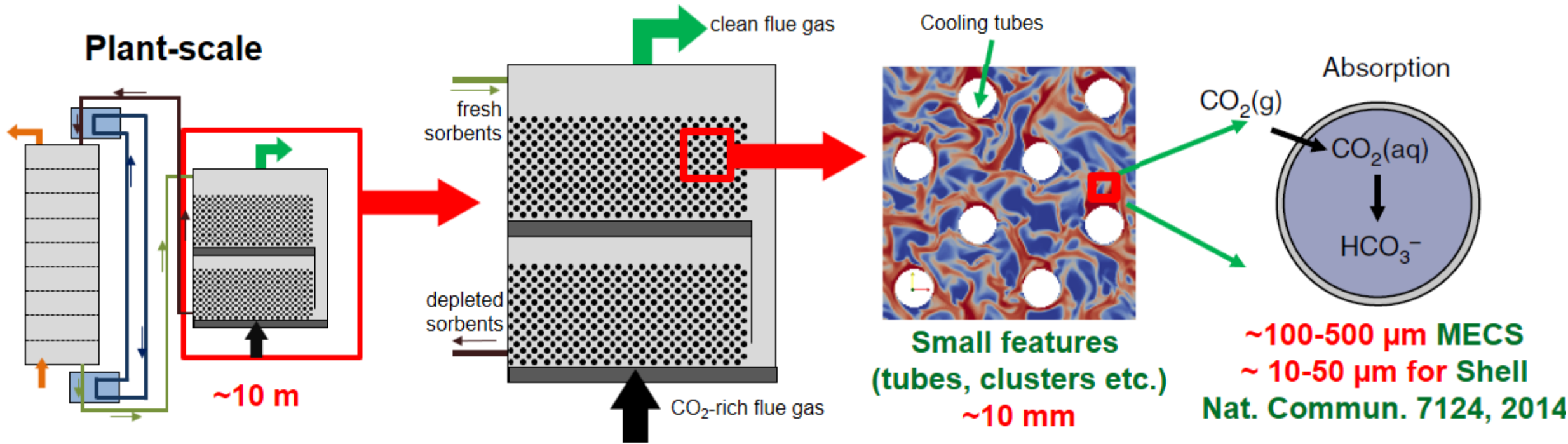
- ✓ Incorporated chemistry, heat and mass transfer into CFD framework for base case solvent (carbonate)
- ✓ Incorporated size and density changes into CFD framework
- ✓ Validated model with literature data and new data from LLNL
- ⚠ Perform simulations of MECS technology in different reactor configurations

*“The open-source MFIX code ... is technically mature to predict well fluidization phenomena based on the Eulerian-Eulerian method.”*

Herzog et al. (2012) Comput. Chem. Eng. v39, p46



# Objective & Challenges for MECS at Device-Scale



## Objectives

- ❑ Development of Framework for Device Scale MECS
- ❑ Understanding MECS behavior in absorber
- ❑ Virtual experiment with different operating conditions
  - Effect of MECS particle size
  - Effect of gas flow rate

## Challenges

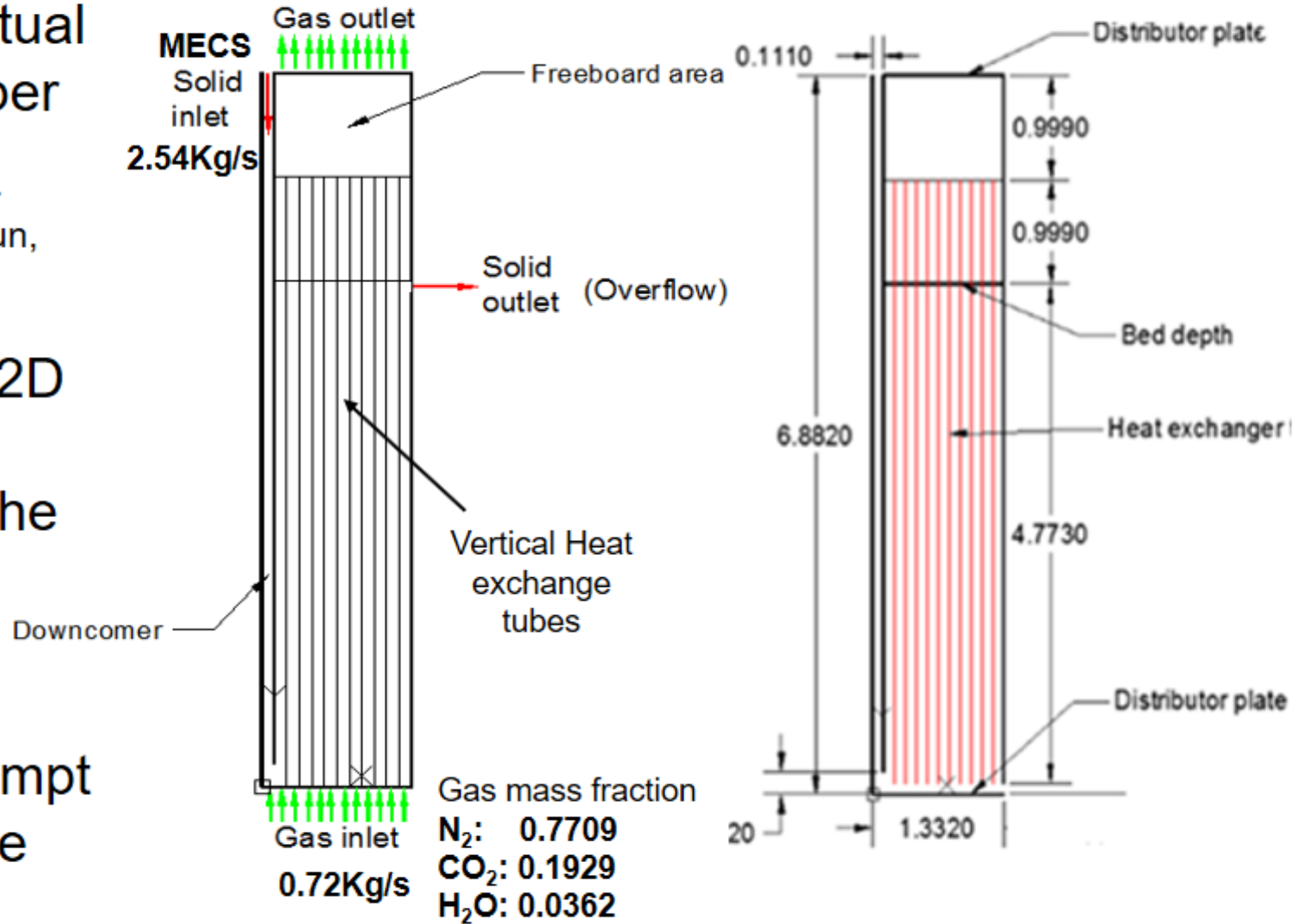
- ❑ Multiscale (scale disparity  $\sim 10^{4-5}$ )
  - Tubes and particles
- ❑ Multiphysics+chemical absorption /desorption
- ❑ Lack of device-scale design for MECS
- ❑ Particle size/density variation with loading

# CFD Model Geometry and Dimension

- Using 1MW pilot scale conceptual design for fluidized bed absorber

Zhijie Xu, Canhai Lai, Peter William Marcy, Jean-François Dietiker, Tingwen Li, Avik Sarkar, Xin Sun, *Powder Tech.* 312 (2017) 58

- Originally designed for NETL32D
- Using the same chemistry as the bench-scale discrete particle model for MECS
- Though preliminary, a first attempt to model MECS at device-scale fluidized bed (CCSI<sup>2</sup> value)

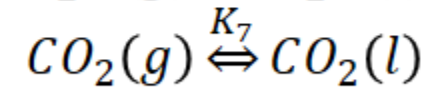
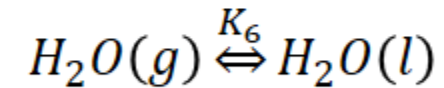
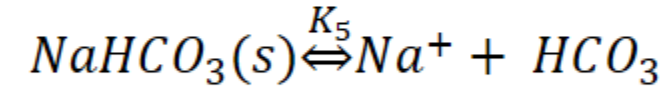
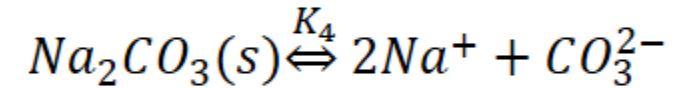
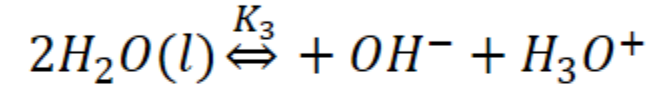
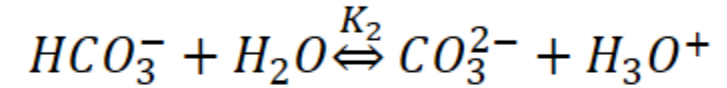
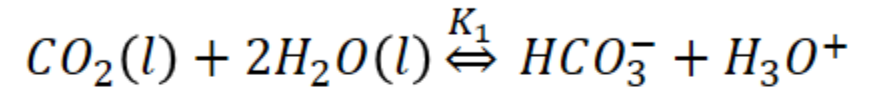


Model geometry and dimension (m)

# Properties for MECS

Physical Parameters	MECS
Particle size	120, 240, 360 and 480 $\mu\text{m}$
Particle density	1000 kg/m <sup>3</sup>
Shell thickness	7.5, 15, 22.5 and 30 $\mu\text{m}$
Shell permeability (Highly permeable)	$10^{-12}$ mol / (m s pa) ( $10^{-14} \sim 10^{-13}$ for polymeric membranes)
Minimum fluidization velocity ( $u_{mf}$ )	0.0122~0.1952 m/s
Solvent: $\text{Na}_2\text{CO}_3$	13 wt%

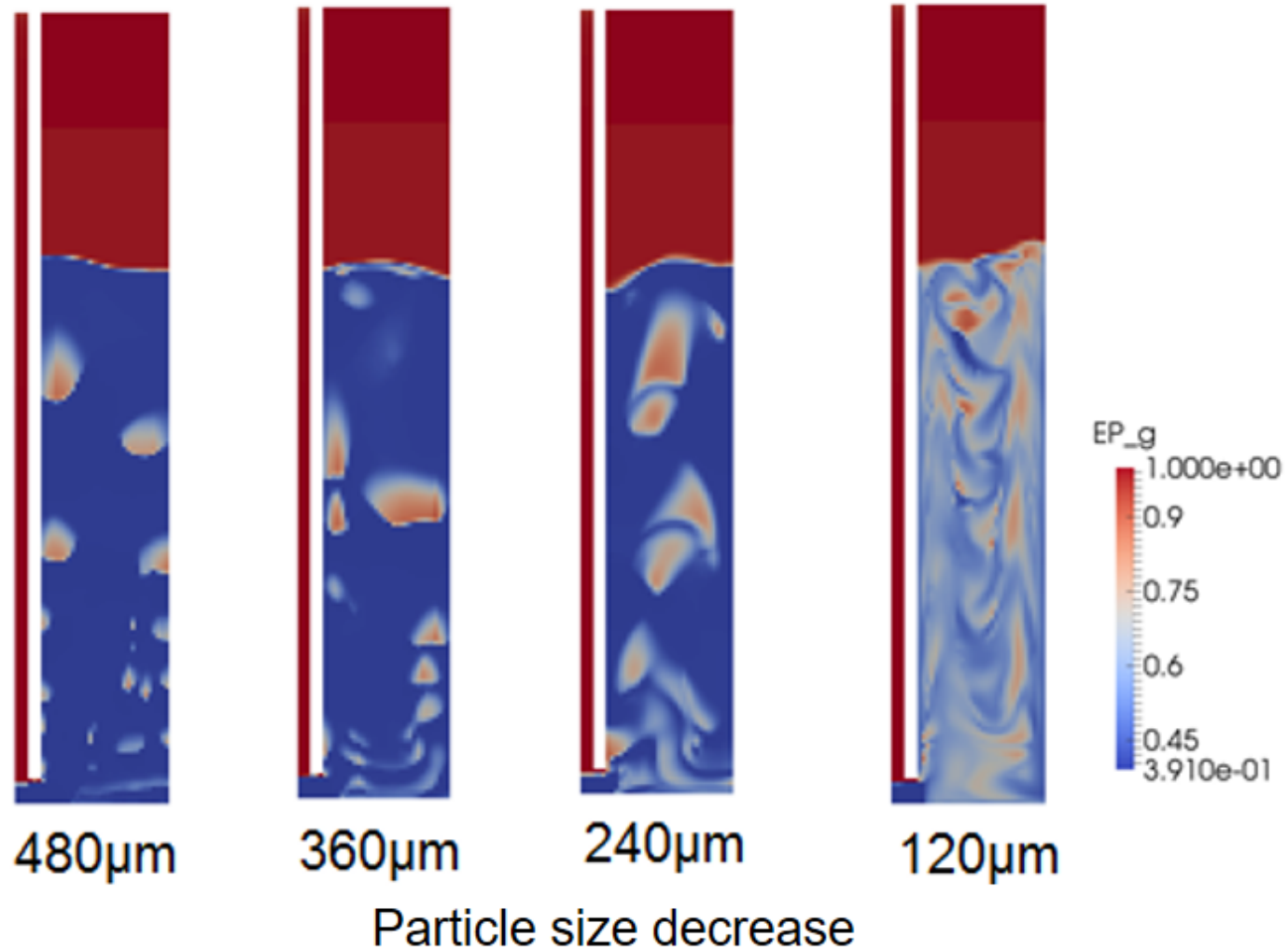
## MECS: $\text{CO}_2/\text{Na}_2\text{CO}_3$



$$u_{mf} = \frac{d_s^2(\rho_s - \rho_g)g\varepsilon_{mf}^3}{150\mu_g(1 - \varepsilon_{mf})}$$

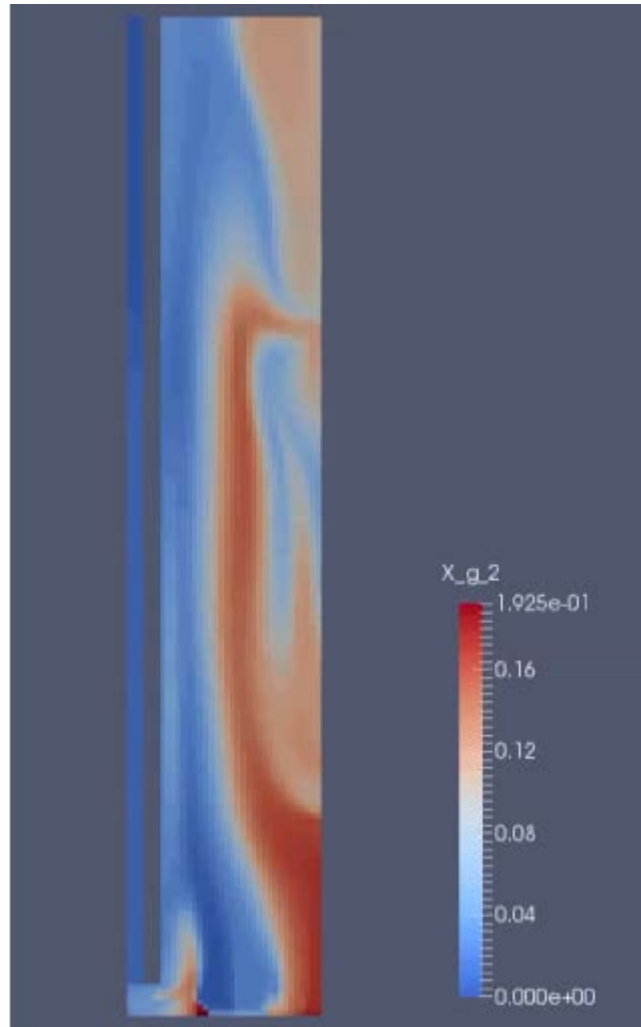
# Hydrodynamics Only

Gas phase volume fraction for gas flow 0.72kg/s

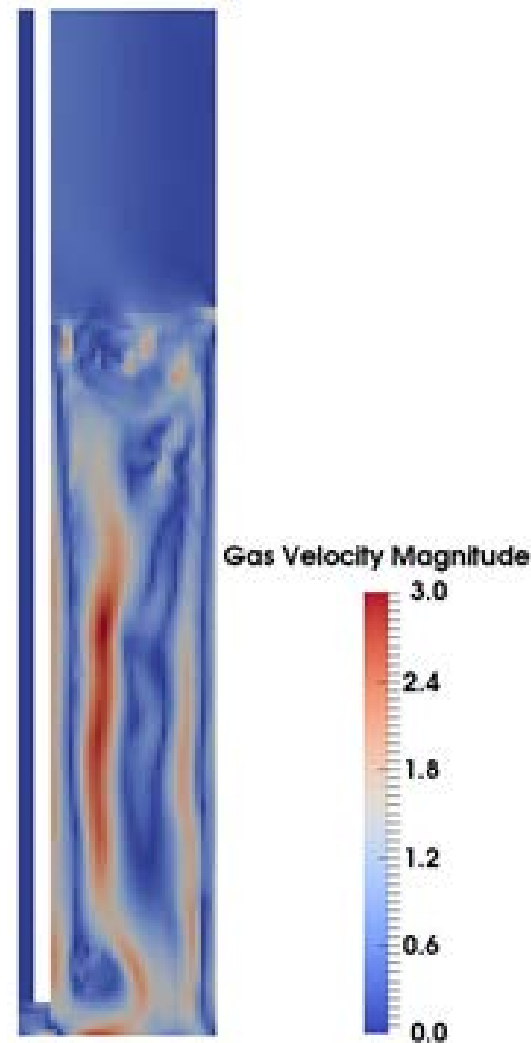


# Hydrodynamics + Chemical Absorption

CO2 Mass Fraction



Gas Velocity



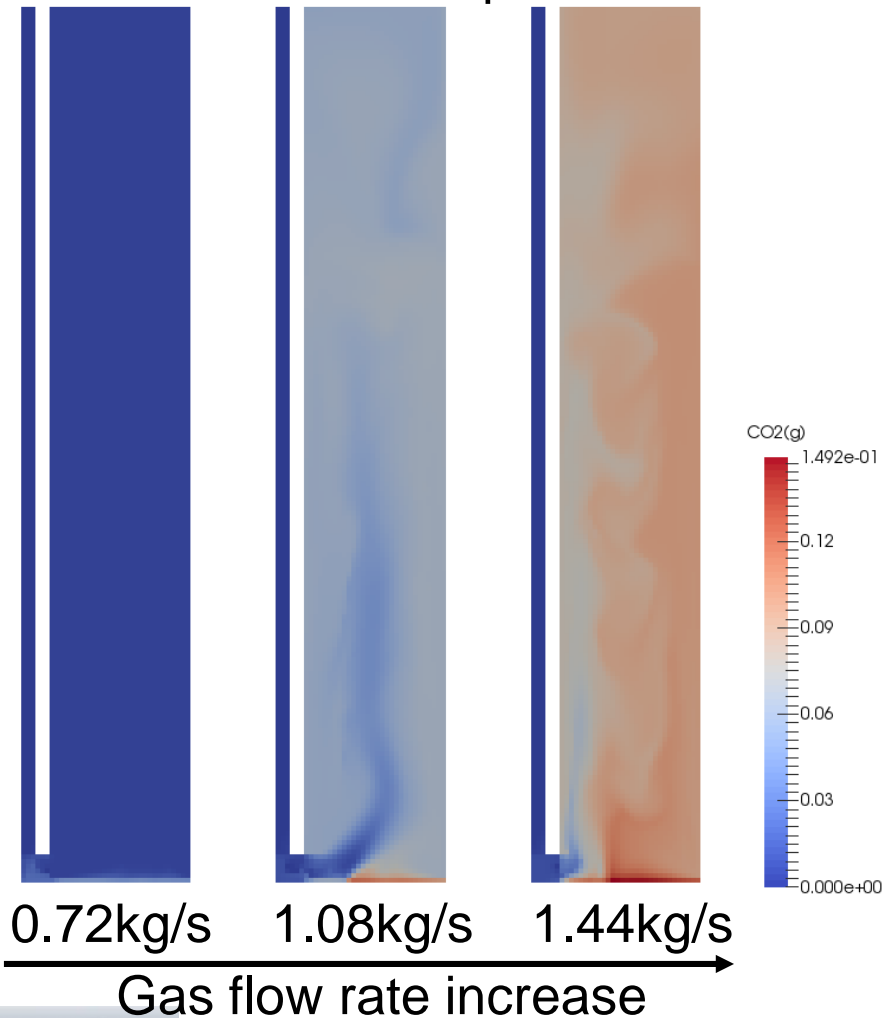
Particle size: 120  $\mu\text{m}$   
Gas flow rate: 0.72kg/s  
CO2 at gas inlet: 19%

CFD value: effect of tubes  
(size, spacing, orientation...)

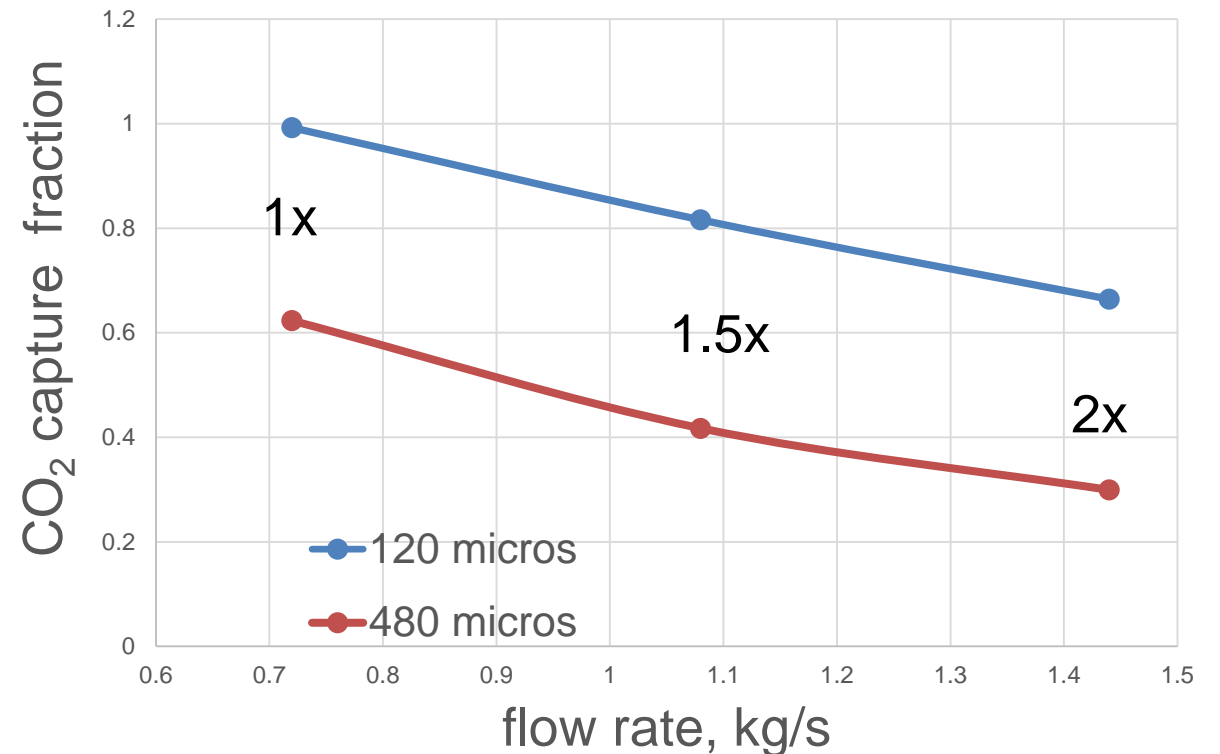
- Vertical cooling tubes affects hydrodynamics /absorption
- Gas forms fast flow channels along tubes: channeling

# Chemical Reactions + Hydrodynamics cont'd

Distribution of CO<sub>2</sub> Mass Fraction in absorber for 120 μm MECS



- Baseline gas flow rate: 0.72kg/s
- MECS particle sizes: 120 μm and 480μm
- Capture fraction decreases with gas flow rate
- Absorption better with smaller particle size





# Conclusions

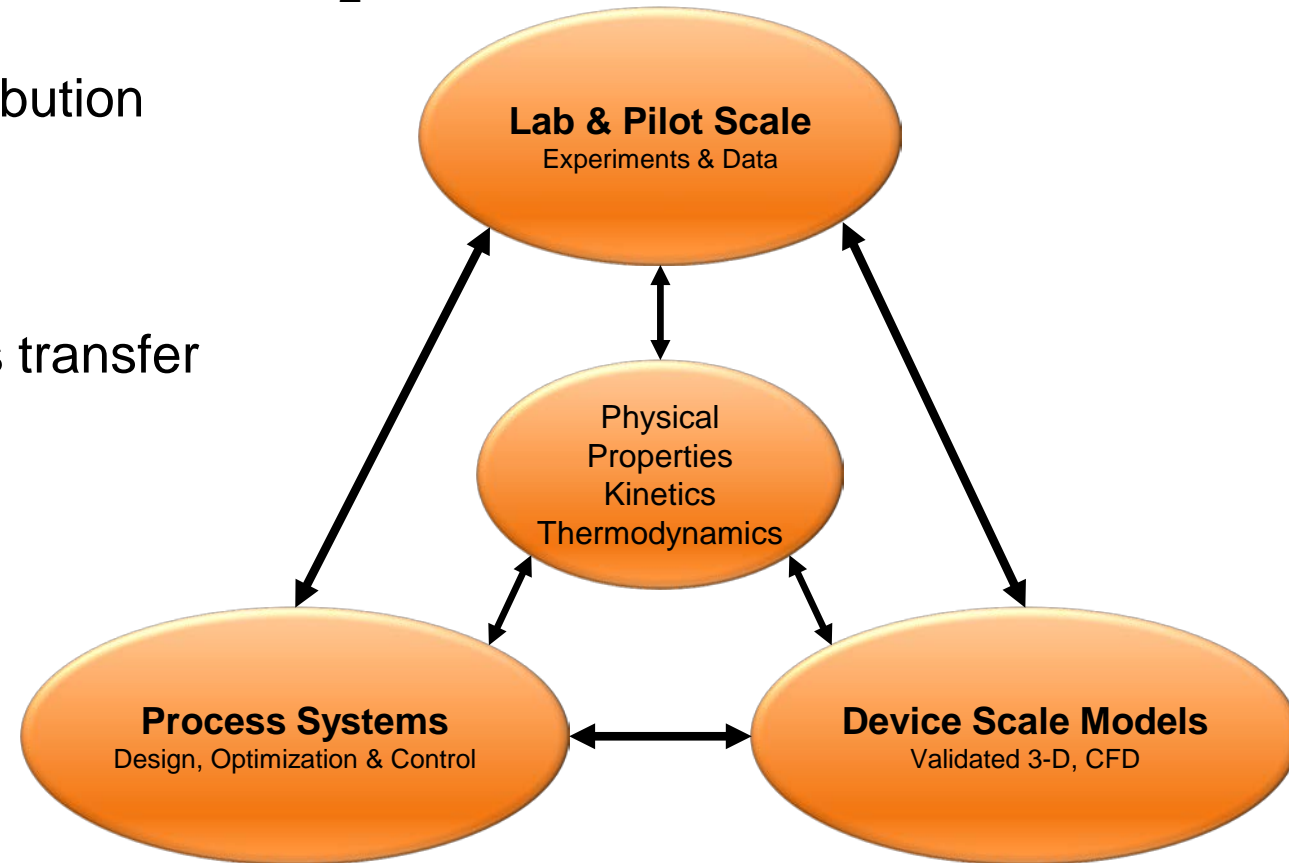
- Models built for MECS particles in a conceptual absorber
  - 1MW conceptual design of absorber for MECS
  - Filtered method to resolve large scale disparity for tubes
  - Fully coupled chemistry module for absorption/desorption
  - Limitations and future work:  
size/density variation, heat transfer, heat of reaction, drag models .....
  
- Virtual experiment for MECS
  - Preliminary results on effects of MECS size and gas flow rate
  - CO<sub>2</sub> absorption decreases with gas flow rate
  - Smaller MECS particle might lead to a better performance

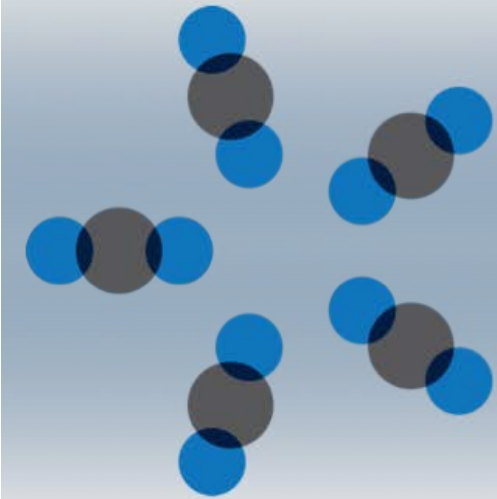
# CCSI<sup>2</sup> Value

## □ Enabling predictive capability for MECS based CO<sub>2</sub> capture

- Overall CO<sub>2</sub> capture depends
  - Particle fluidization and spatially distribution
  - CO<sub>2</sub> partial pressure
  - Temperature
  - Physical Properties: shell & solvent
  - Reaction parameters – kinetics, mass transfer

## □ Different tiers of modeling used together to advance/screen new technology for CO<sub>2</sub> capture





# CCSI<sup>2</sup>

Carbon Capture Simulation for Industry Impact

**For more information**

<https://www.acceleratecarboncapture.org/>

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