



# MODEL-DERIVED CHEMICAL-LOOPING SYSTEM DESIGNS

George M. Bolas

Department of Chemical & Biomolecular Engineering  
University of Connecticut

<http://pdsol.engr.uconn.edu>



# About

## ● Diploma in Chemical Engineering

- Aristotle University of Thessaloniki – Greece



## ● Ph.D. in Chemical Engineering

- Aristotle University of Thessaloniki – Greece



## ● Postdoc in Chemical Engineering

- Massachusetts Institute of Technology – USA



## ● Assistant Professor University of Connecticut

- NSF CAREER Award 2011
- ACS-PRF DNI Award 2013
- >\$2M in research grants in 2010-2013
- 9 graduate researchers
- 10 undergraduate researchers



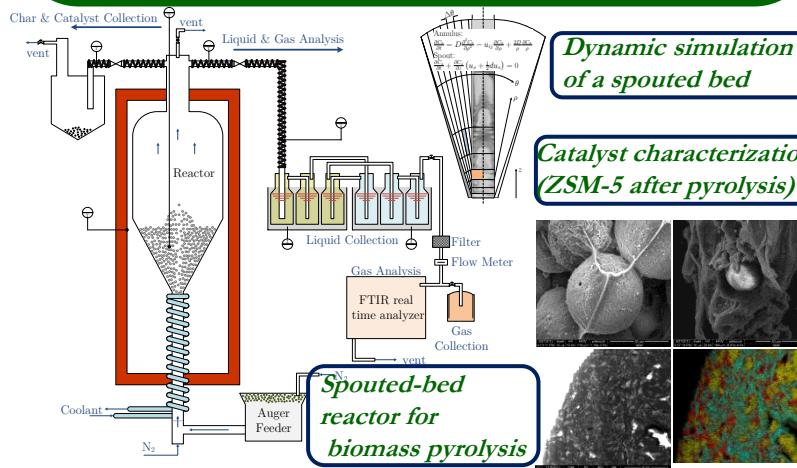


# Research Group (PDSOL)

*Enabling emerging energy technologies via integration of modeling with experimentation of processes lacking fundamental understanding*

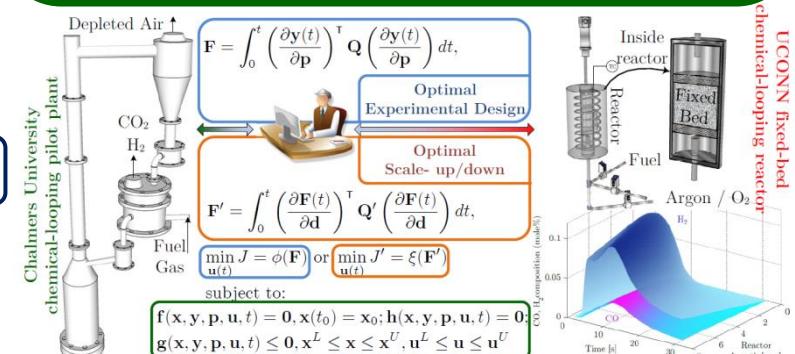
## Catalysis for renewable fuels

- Novel spouted-bed reactor for biomass thermochemical processes (pyrolysis, gasification, chemical-looping combustion)
- Comprehensive catalyst characterization and catalyst activity dynamic simulation



## Process Design, Scale-up & Control

- Dynamic simulation & optimization  
Optimal experimental design
- Model-assisted scale-up based on dynamic sensitivity analysis
- Chemical-looping combustion & reforming

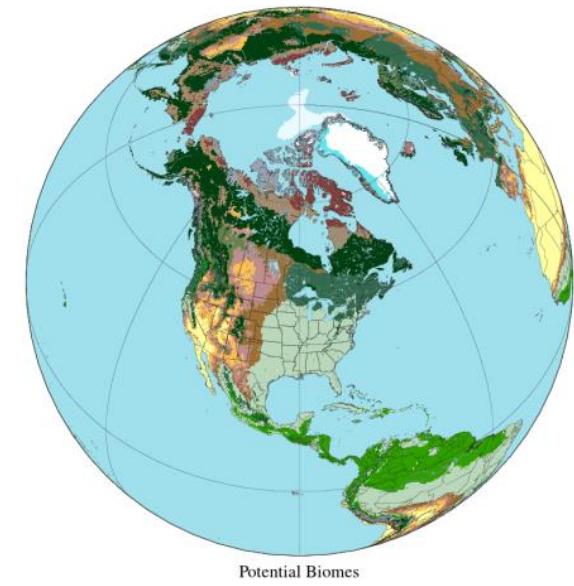
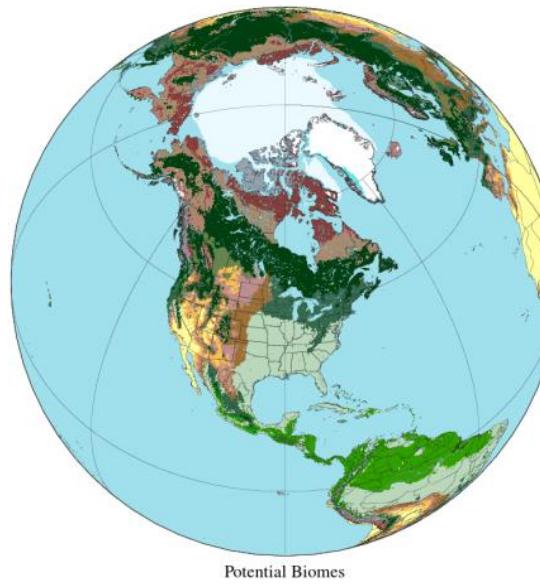
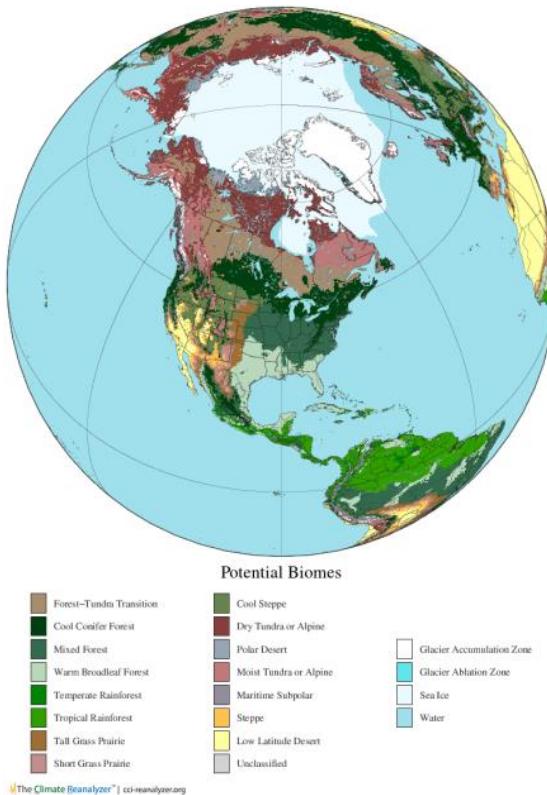


*Fixed-bed reactor developed and simulated in PDSOL. Application of Optimal Experimental Design on the laboratory reactor. Scale-up based on sensitivity analysis of the bench-scale reactor.*



# Climate change urgency

- Carbon capture needs to be deployed to effectively lower the global CO<sub>2</sub> portfolio

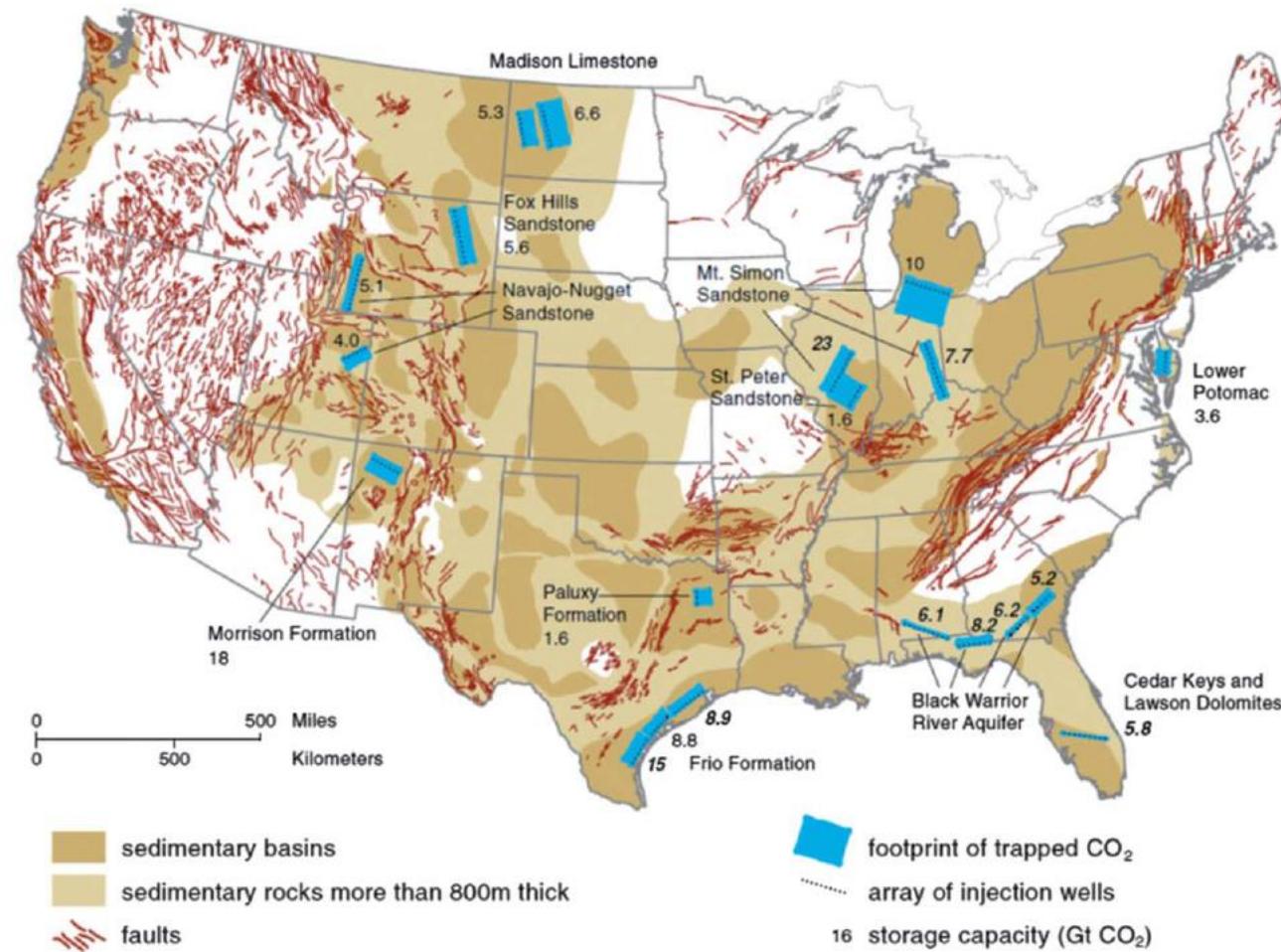


**Fig.1:** University of Maine Environmental Change Model (UM-ECM) potential biomes calculated for modern climate. From left to right: input cooled by 4°C; todays input; input warmed by 2.5°C. Note the effect on the arctic sea ice. Data/images obtained using Climate Reanalyzer™ (<http://cci-reanalyzer.org>), Climate Change Institute, University of Maine, USA.



# US-wide CO<sub>2</sub> storage capacity

- Estimated total storage capacity of over 100 Gt in the continental US

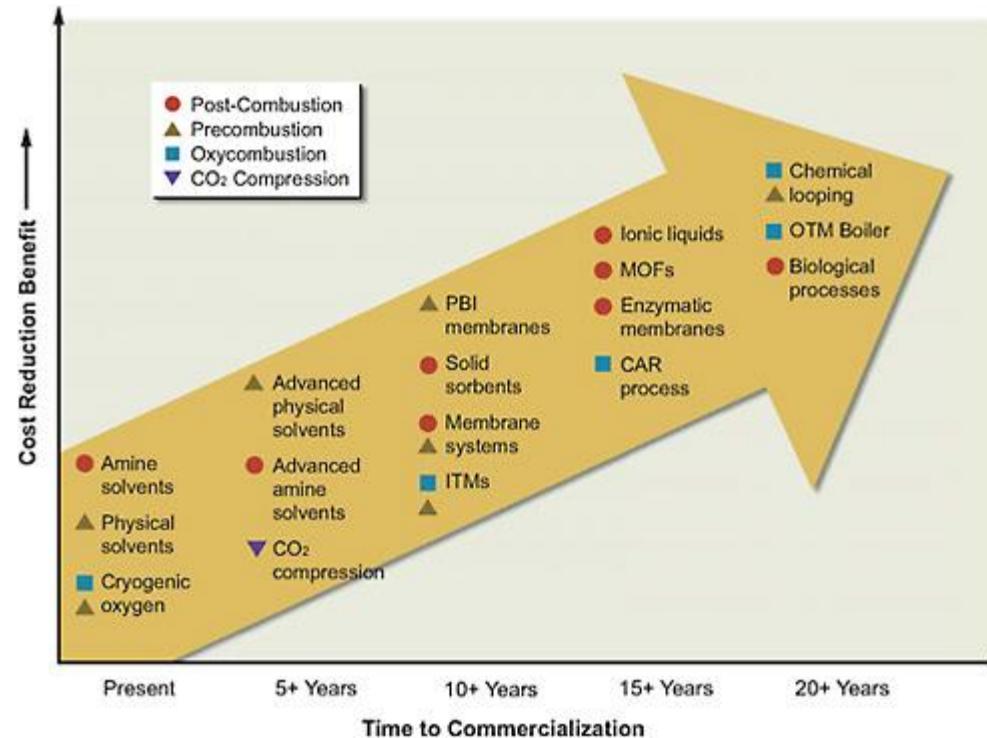




# CO<sub>2</sub> Capture Options

## Back in 2008

Resource: America's Energy Future Technology And Transformation, Committee On America's Energy Future, National Academy Of Sciences, National Academy of Engineering, National Research Council of The National Academies, The National Academies Press





# Chemical-looping progress

- Boot-Handford ME, Abanades JC, Anthony EJ, Blunt MJ, Brandani S, Mac Dowell N, et al. Carbon capture and storage update. Energy Environ Sci 2014.

**Table 4** Testing in chemical-looping combustors<sup>a</sup>

Location	Unit	Oxides tested	Time	Fuel\references	Year
Chalmers	10 kW	NiO, Fe <sub>2</sub> O <sub>3</sub>	1410	Nat. gas <sup>575–578</sup>	2004
KIER	50 kW	NiO, CoO	28	Nat. gas <sup>579,580</sup>	2004
CSIC	10 kW	CuO, NiO	120	Nat. gas <sup>581,582</sup>	2006
Chalmers	0.3 kW	NiO, Mn <sub>3</sub> O <sub>4</sub> , Fe <sub>2</sub> O <sub>3</sub> , ilmenite, CaMnO <sub>3</sub>	810	Nat. gas, syngas <sup>227,241,583–591</sup>	2006
Chalmers	10 kW-SF	Ilmenite, manganese ore	149	Coal, petcoke <sup>245,259,592–595</sup>	2008
CSIC	0.5 kW	CuO, NiO, Fe <sub>2</sub> O <sub>3</sub>	820	Nat. gas <sup>228,254,596–606</sup>	2009
KAIST	1 kW	NiO + Fe <sub>2</sub> O <sub>3</sub>	?	CH <sub>4</sub> <sup>607</sup>	2009
Vienna UT	140 kW	Ilmenite, NiO	390	Nat. gas, CO, H <sub>2</sub> <sup>262,608–617</sup>	2009
Alstom	15 kW	NiO	100	Nat. gas <sup>4</sup>	2009
Nanjing	10 kW-SF	NiO, Fe <sub>2</sub> O <sub>3</sub>	230	Coal, biom. <sup>618–621</sup>	2009
KIER	50 kW	NiO, CoO	300	Nat. gas, syngas <sup>622</sup>	2010
Nanjing	1 kW-SF	Fe <sub>2</sub> O <sub>3</sub> (ore)	>10	Coal, biomass <sup>244,623</sup>	2010
IFP-Lyon	10 kW-GSF	NiO	>90	CH <sub>4</sub> , coal, syngas <sup>624,625</sup>	2010
Stuttgart	10 kW	Ilmenite	?	Syngas <sup>261</sup>	2010
Xi'an Jiaotong	10 kW-Pr	CuO/Fe <sub>2</sub> O <sub>3</sub>	15	Coke oven gas <sup>626</sup>	2010
CSIC	0.5 kW-SF	Ilmenite, CuO, Fe <sub>2</sub> O <sub>3</sub>	164	Coal <sup>260,265,627,628</sup>	2011
Chalmers	0.3 kW-LF	NiO, Mn <sub>3</sub> O <sub>4</sub> , CuO	116	Kerosene <sup>214,215</sup>	2011
Chalmers	100 kW-SF	Ilmenite	24	Coal <sup>629–632</sup>	2012
Hamburg	25 kW-SF	Ilmenite	21	Coal <sup>633</sup>	2012
Ohio	25 kW-SF	Fe <sub>2</sub> O <sub>3</sub>	~72	Coal <sup>634</sup>	2012

<sup>a</sup> SF – solid fuel, GSF – gaseous & solid fuel, Pr – pressurised, LF – liquid fuel.



# Chemical-looping combustion (CLC)

- A method for inherent CO<sub>2</sub> separation

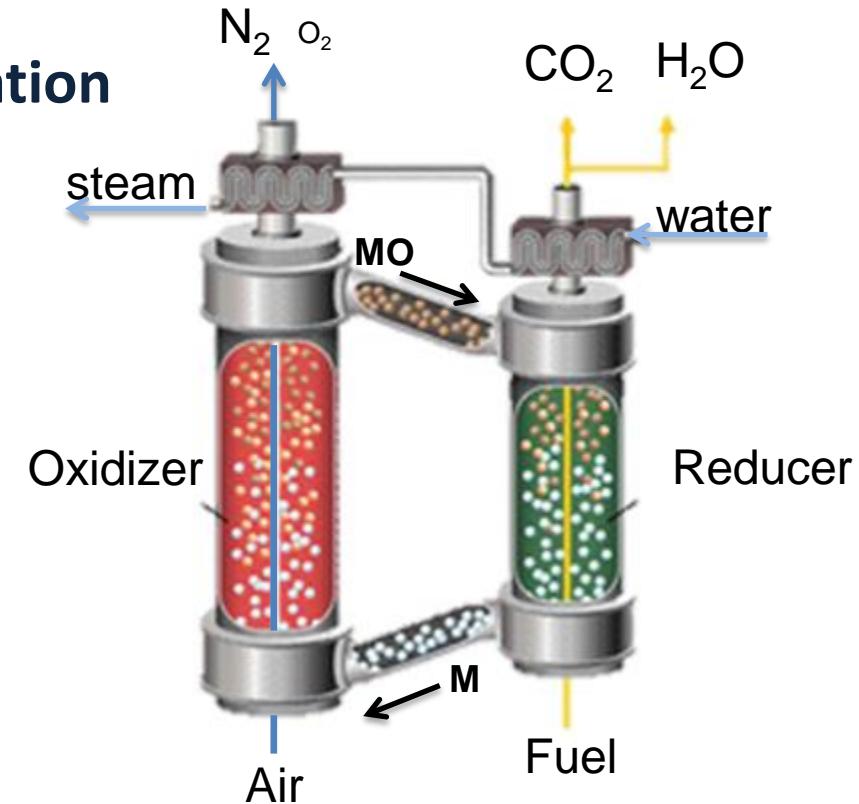
Oxygen carriers

- M : metal
- MO : metal oxide

**Reduction:** endothermic



**Oxidation:** exothermic

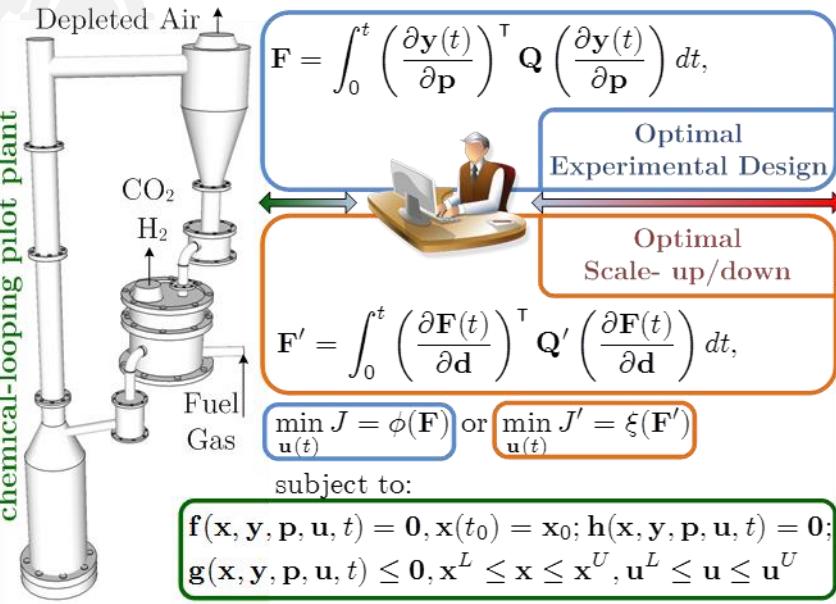


- Circulating oxygen carrier: active metal oxides (Ni, Cu, Fe, Mn) supported over Al<sub>2</sub>O<sub>3</sub>, MgAl<sub>2</sub>O<sub>4</sub>, NiAl<sub>2</sub>O<sub>4</sub>, YSZ, TiO<sub>2</sub>, ZrO<sub>2</sub>.
- Reactivity testing: TGA, fixed-bed, interconnected fluidized-beds.

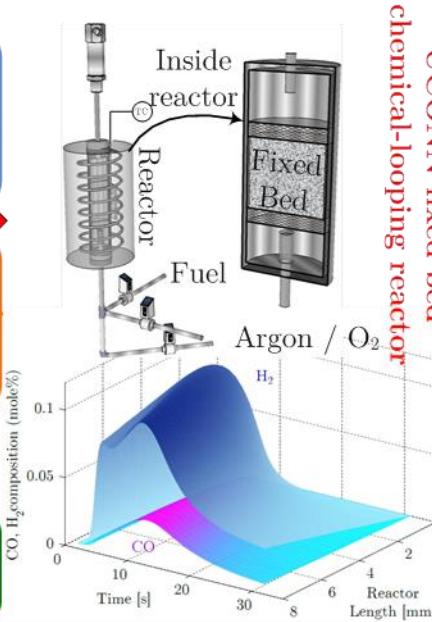


# Our work

- [1] Zhou Z, Han L, Bollas GM. Model-based analysis of bench-scale fixed-bed units for chemical-looping combustion. *Chem Eng J* 2013;233:331–48.
- [2] Han L, Zhou Z, Bollas GM. Heterogeneous Modeling of Chemical-Looping Combustion. Part 1: Reactor Model. *Chem Eng Sci* 2013;104:233 – 249.
- [3] Han L, Zhou Z, Bollas GM. Heterogeneous Modeling of Chemical-Looping Combustion. Part 2: Particle Model. *Chem Eng Sci* 2014;in press.
- [4] Zhou Z, Han L, Bollas GM. Overview of Chemical-Looping Reduction in Fixed Bed and Fluidized Bed Reactors Focused on Oxygen Carrier Utilization and Reactor Efficiency. *Aerosol Air Qual Res* 2014;14:559–71.
- [5] Zhou Z, Han L, Bollas GM. Kinetics of NiO reduction by H<sub>2</sub> and Ni oxidation at conditions relevant to chemical-looping combustion and reforming. *Int J Hydrogen Energy* 2014;in press.
- [6] Han L, Zhou Z, Bollas GM. *Chemical-looping combustion in a reverse-flow fixed-bed reactor. Appl Energy* 2014;in review.
- [7] Zhou Z, Han L, Bollas GM. Model-assisted analysis of fluidized bed chemical-looping reactors. *AIChE J* 2014;in review.
- [8] Han L, Zhou Z, Bollas GM. Optimal Experimental Design for Fixed Bed Chemical-Looping Experiments. *Comput Chem Eng* 2014;in preparation.



# The “dream concept”



- maximize information content of experiments
- integrate experimentation with reactor design
- obtain scale-independent process models
- estimate model parameters that increase the accuracy of process scale-up/scale-down
- reduce risk of technology scale-up/scale-down.

## OED for process scaling of chemical-looping:

Measurements of bench- and pilot- scale processes are used to develop state/space models. These models are subsequently used to identify time-varying experimental conditions that maximize the statistical significance of the measurements with respect to process scale, subject to constraints.

# Fixed-bed model description

## Heterogeneous model

### Fluid phase

$$\varepsilon_b \frac{\partial C_i}{\partial t} + \frac{\partial F_i}{\partial V} = \frac{\partial}{\partial Z} \left( \varepsilon_b D_{ax,i} \frac{\partial C_i}{\partial Z} \right) + k_{c,i} a_v (C_{c,i}|_{R_p} - C_i)$$

$$\varepsilon_b C p_f C_T \frac{\partial T}{\partial t} + C p_f F_T \frac{\partial T}{\partial V} = \frac{\partial}{\partial Z} \left( \varepsilon_b \lambda_{ax} \frac{\partial T}{\partial Z} \right)$$

$$+ h_f a_v (T_c|_{R_p} - T) + \frac{4U}{DR} (T_w - T)$$

### Solid phase

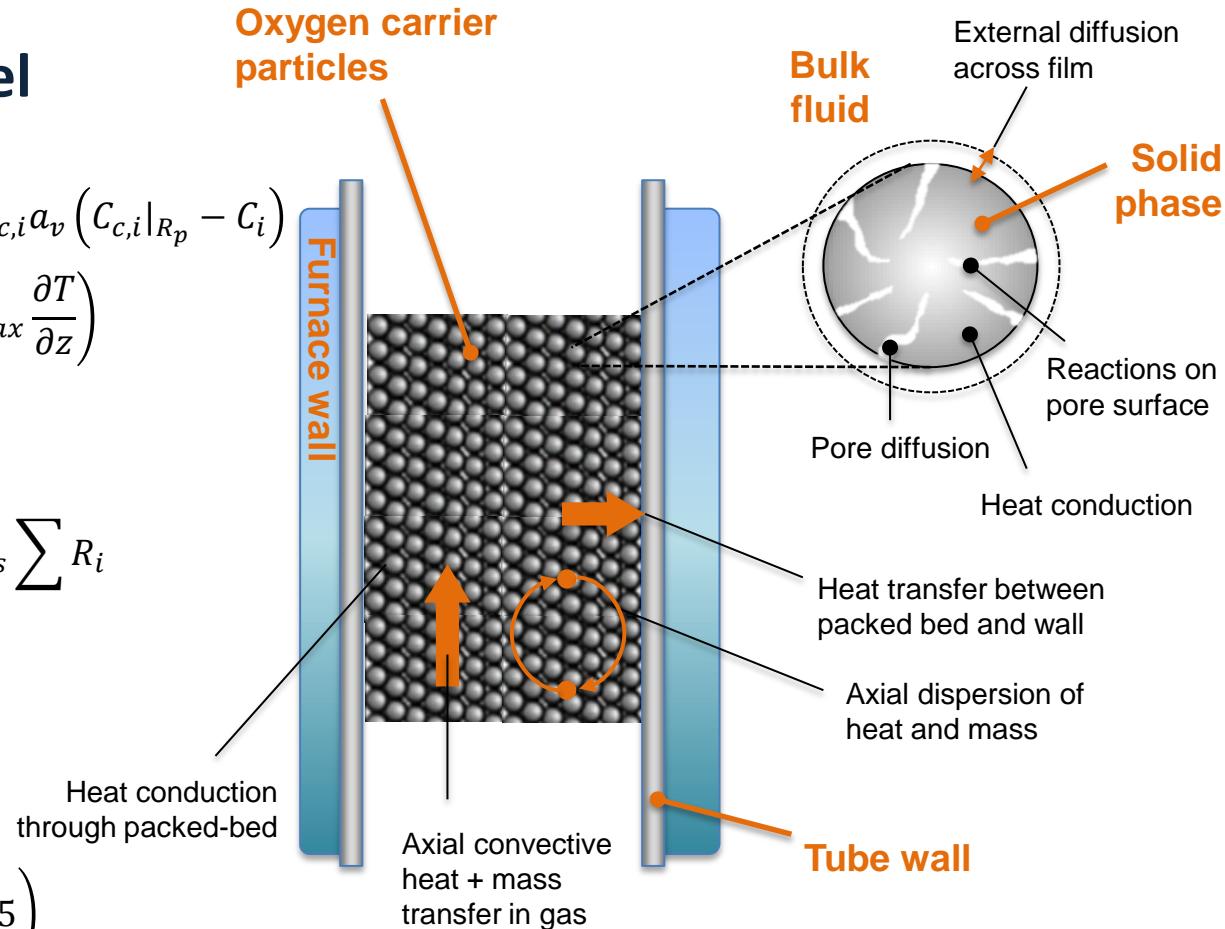
$$\varepsilon_c \frac{\partial C_{c,i}}{\partial t} = \frac{1}{r_c^2} \frac{\partial}{\partial r_c} \left( D_{e,i} r_c^2 \frac{\partial C_{c,i}}{\partial r_c} \right) + \rho_s \sum R_i$$

$$((1 - \varepsilon_c) \rho_s C p_s + \varepsilon_c C p_c C_{T,c}) \frac{\partial T_c}{\partial t} =$$

$$\frac{\lambda_s}{r_c^2} \frac{\partial}{\partial r} \left( r_c^2 \frac{\partial T_c}{\partial r_c} \right) + \rho_s \sum (-\Delta H_i) (R_i)$$

### Pressure drop

$$\frac{dP}{dz} = - \left( \frac{1 - \varepsilon_b}{\varepsilon_b^3} \right) \left( \frac{\rho u_0^2}{D_p} \right) \left( \frac{150}{Re_p} + 1.75 \right)$$



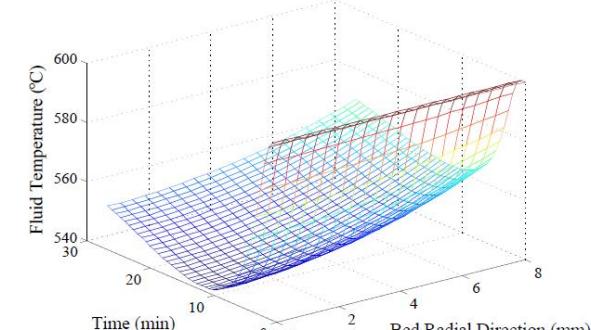
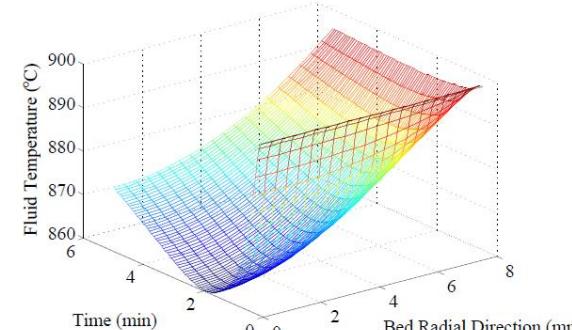
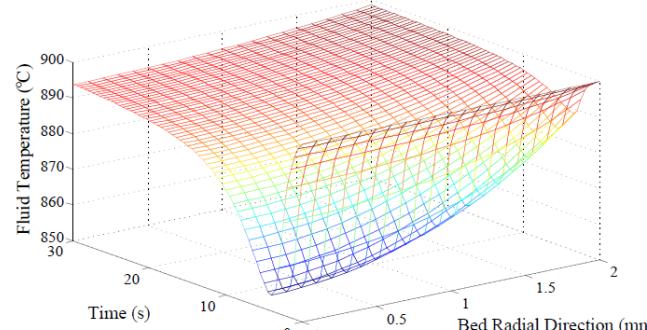
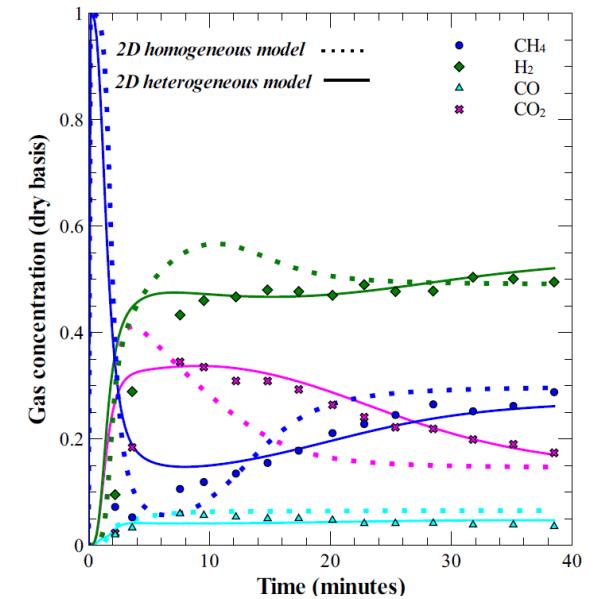
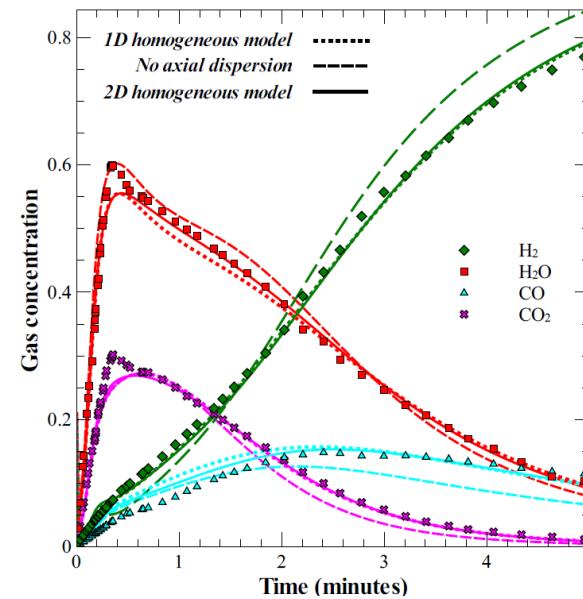
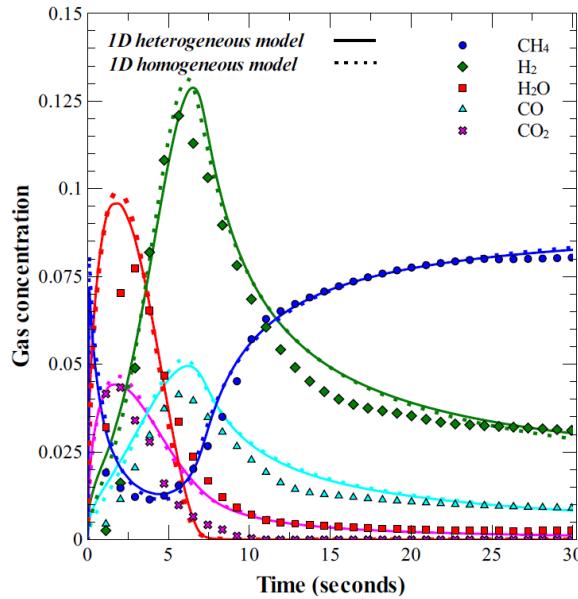
Han, L.; Zhou, Z.; Bolas, G. M. Heterogeneous Modeling of Chemical-Looping Combustion. Part 1: Reactor Model. *Chemical Engineering Science* 2013



# Fixed-bed model application

- Application to experimental data of CLC by Iliuta et al. (2010), Ryden et al. (2008) and CLR data by Jin (2002)

Han, L.; Zhou, Z.; Bollas, G. M. Heterogeneous Modeling of Chemical-Looping Combustion. Part 1: Reactor Model. *Chemical Engineering Science* 2013





# Reduction reactions with NiO

Oxygen carrier reduction reactions	CH <sub>4</sub> oxidation	$\text{CH}_4 + 2\text{NiO} \leftrightarrow 2\text{Ni} + \text{CO}_2 + 2\text{H}_2$	$\Delta H^\circ = 165 \text{ kJ/mol}$
	H <sub>2</sub> oxidation	$\text{H}_2 + \text{NiO} \leftrightarrow \text{Ni} + \text{H}_2\text{O}$	$\Delta H^\circ = -2.2 \text{ kJ/mol}$
	CO oxidation	$\text{CO} + \text{NiO} \leftrightarrow \text{Ni} + \text{CO}_2$	$\Delta H^\circ = -43.3 \text{ kJ/mol}$
	Partial CH <sub>4</sub> oxidation	$\text{CH}_4 + \text{NiO} \leftrightarrow \text{Ni} + 2\text{H}_2 + \text{CO}$	$\Delta H^\circ = 203 \text{ kJ/mol}$
Reactions catalyzed by Ni	Steam reforming	$\text{CH}_4 + \text{H}_2\text{O} \leftrightarrow 3\text{H}_2 + \text{CO}$	$\Delta H^\circ = 205 \text{ kJ/mol}$
	Water gas shift	$\text{CO} + \text{H}_2\text{O} \leftrightarrow \text{H}_2 + \text{CO}_2$	$\Delta H^\circ = -41.1 \text{ kJ/mol}$
	Dry reforming	$\text{CH}_4 + \text{CO}_2 \leftrightarrow 2\text{CO} + 2\text{H}_2$	$\Delta H^\circ = 247 \text{ kJ/mol}$
	Methane decomposition	$\text{CH}_4 \leftrightarrow 2\text{H}_2 + \text{C}$	$\Delta H^\circ = 88 \text{ kJ/mol}$
	Carbon gasification by steam	$\text{C} + \text{H}_2\text{O} \leftrightarrow \text{CO} + \text{H}_2$	$\Delta H^\circ = 131 \text{ kJ/mol}$
	Carbon gasification by CO <sub>2</sub>	$\text{C} + \text{CO}_2 \leftrightarrow 2\text{CO}$	$\Delta H^\circ = 173 \text{ kJ/mol}$

Zhou, Z.; Han, L.; Bolas, G. M. Model-based Analysis of Bench-Scale Fixed-Bed Units for Chemical-Looping Combustion. *Chemical Engineering Journal* 2013



# TGA Model

## Mass balance

$$\varepsilon_c \frac{\partial C_{c,i}}{\partial t} + \frac{1}{r_c^2} \frac{\partial}{\partial r_c} \left( r_c^2 v_c C_{c,i} \right) = \frac{1}{r_c^2} \frac{\partial}{\partial r_c} \left( D_{\text{eff},i} C_{c,i} \right) + \rho_s \sum R_j$$

## Intraparticle velocity (forced convection)

$$\frac{\partial v_c}{\partial r_c} = \frac{\sum R_j}{\sum_i C_{c,i}}$$

## Boundary Conditions

$$-\frac{\partial (D_{\text{eff},i} C_{c,i})}{\partial r_c} \Big|_{r_c=r_p} + v_c \Big|_{r_c=r_p} C_{c,i} \Big|_{r_c=r_p} = k_{c,i} (C_{c,i} \Big|_{r_c=r_p} - C_i) \quad \frac{\partial C_{c,i}}{\partial r_c} \Big|_{r_c=0} = v_c \Big|_{r_c=0} = 0$$

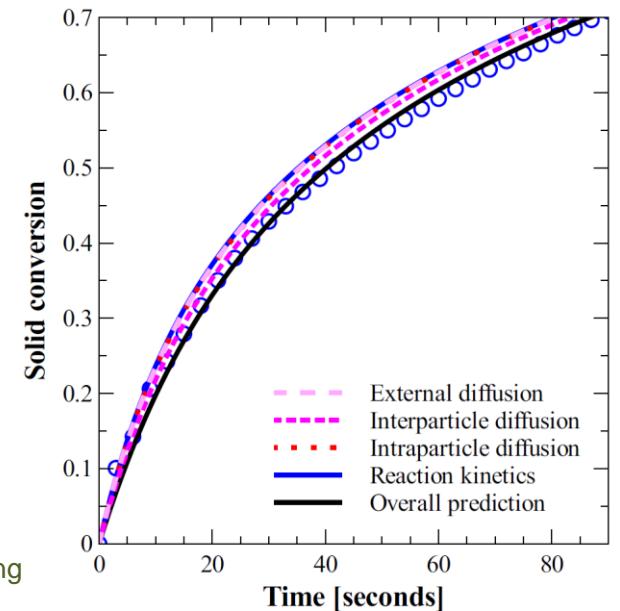
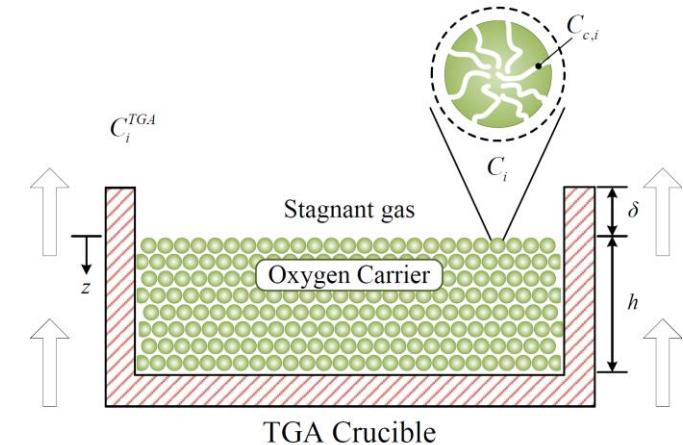
## Mass Balance around the crucible

$$\varepsilon_b \frac{\partial C_i}{\partial t} = \varepsilon_b \frac{\partial}{\partial z} \left( D_{ax,i} \frac{\partial C_i}{\partial z} \right) + k_{c,i} a_v (C_{c,i} \Big|_{r_c=r_p} - C_i)$$

## Boundary Conditions

$$\varepsilon_b D_{ax,i} \left( \frac{\partial C_i}{\partial z} \right) \Big|_{z=0} = \frac{D_{m,i}}{\delta} (C_i \Big|_{z=0} - C_i^{TGA}) \quad \left( \frac{\partial C_i}{\partial z} \right) \Big|_{z=h} = 0$$

Han, L.; Zhou, Z.; Bollas, G. M. Heterogeneous Modeling of Chemical-Looping Combustion. Part 2: Particle Model. *Chemical Engineering Science* 2013





# Non-catalytic gas-solid reactions

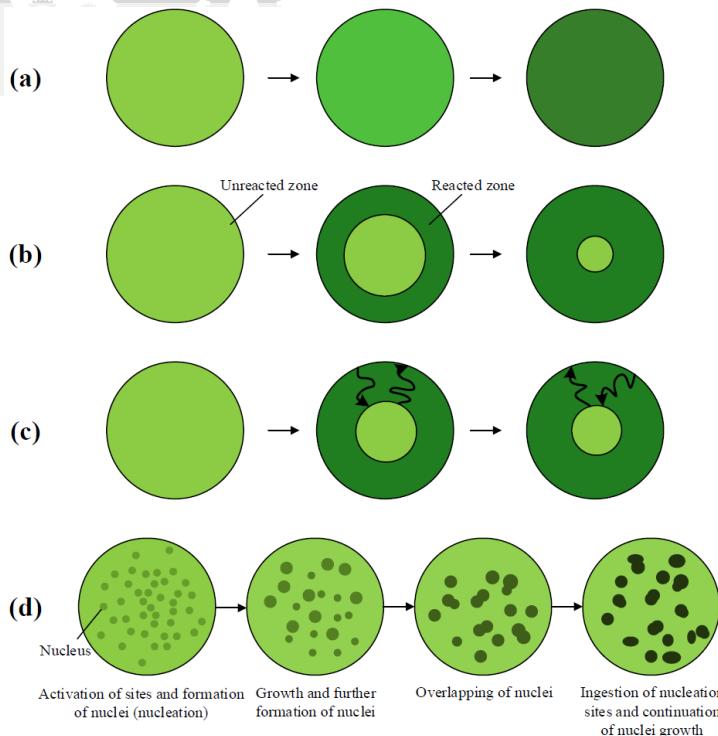
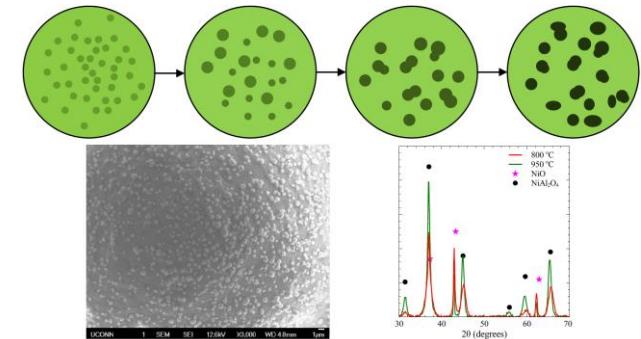


Table 1: Rate and integral expressions for different solid-state kinetic models

No.	Reaction model	$f(x) = 1/k dx/dt$	$g(x) = kt$	$n$
F1.5	Three-halves order	$(1-x)^{3/2}$	$2[(1-x)^{(-1/2)} - 1]$	0.91
F2	Second-order	$(1-x)^2$	$1/(1-x) - 1$	0.83
F3	Third-order	$(1-x)^3$	$(1/2)[(1-x)^{-2} - 1]$	0.70
R1	Zero-order (Polany-Winger equation)	1	$x$	1.24
R2	Phase-boundary controlled reaction (contracting area, i.e. bi-dimensional shape)	$2(1-x)^{1/2}$	$1-(1-x)^{(1/2)}$	1.11
R3	Phase-boundary controlled reaction (contracting volume, i.e. tridimensional shape)	$3(1-x)^{2/3}$	$1-(1-x)^{(1/3)}$	1.07
D1	One-dimensional diffusion	$1/(2x)$	$x^2$	0.62
D2	Two-dimensional diffusion Valensi equation	$1/[-\ln(1-x)]$	$(1-x)\ln(1-x) + x$	0.57
D3	Three-dimensional diffusion Jander equation	$3(1-x)^{(1/3)}/[2(1-x)^{(-1/3)} - 1]$	$[1-(1-x)^{1/3}]^2$	0.54
D4	Three-dimensional diffusion Ginstling - Brounshtein	$3/[2(1-x)^{-1/3} - 1]$	$(1-2x/3)-(1-x)^{(2/3)}$	0.57
AE1	First-order (Mampel) (F1) or Avrami-Erofe'ev ( $n=1$ )	$(1-x)$	$-\ln(1-x)$	1
AE0.5	Avrami-Erofe'ev ( $n=0.5$ )	$(1/2)(1-x)(-\ln(1-x))^{-1}$	$(-\ln(1-x))^2$	0.50
AE1.5	Avrami-Erofe'ev ( $n=1.5$ )	$(3/2)(1-x)[- \ln(1-x)]^{1/3}$	$(-\ln(1-x))^{2/3}$	1.5
AE2	Avrami-Erofe'ev ( $n=2$ )	$2(1-x)[- \ln(1-x)]^{1/2}$	$(-\ln(1-x))^{1/2}$	2
AE3	Avrami-Erofe'ev ( $n=3$ )	$3(1-x)[- \ln(1-x)]^{2/3}$	$(-\ln(1-x))^{1/3}$	3
AE4	Avrami-Erofe'ev ( $n=4$ )	$4(1-x)[- \ln(1-x)]^{3/4}$	$(-\ln(1-x))^{1/4}$	4
AEn	Avrami-Erofe'ev	$n(1-x)[- \ln(1-x)]^{(n-1)/n}$	$(-\ln(1-x))^{1/n}$	$n$
RPM	Random pore model	$(1-x)(1-\phi \ln(1-x))^{1/2}$	$x = 1 - \exp[-g(x)(1+\phi g(x))]$	-
SB	Šesták - Berggren function	$x^n(1-x)^n$	$\ln(x/(1-x))$	-
PT	Prout-Tompkins	$x(1-x)$		-



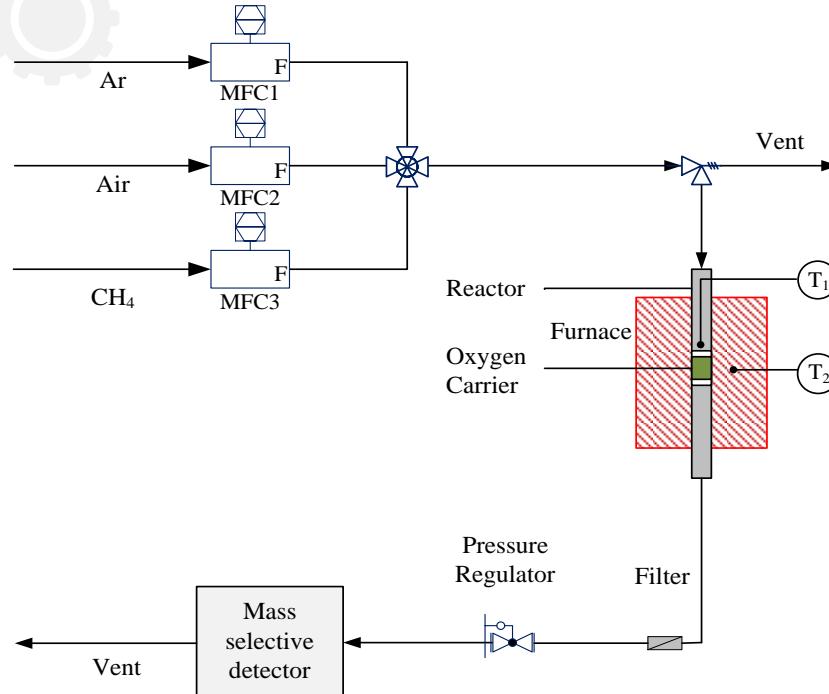
## Analysis of available literature on reduction of supported and unsupported NiO by H<sub>2</sub>

- Models of varying degree of fidelity (number of parameters)
- F-test
- Akaike Information Criterion

Zhou, Z.; Han, L.; Bollas, G. M. Kinetics of NiO reduction by H<sub>2</sub> and Ni oxidation at conditions relevant to chemical-looping combustion and reforming. Int. Journal of Hydrogen Energy, 2014

# Current experimental setup

## Fixed-bed apparatus

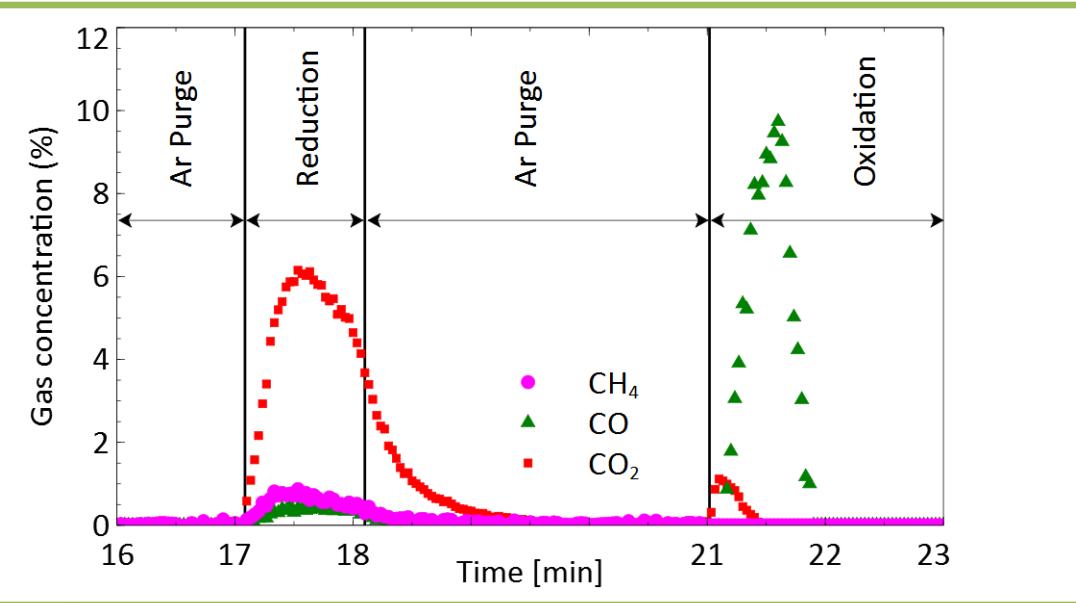
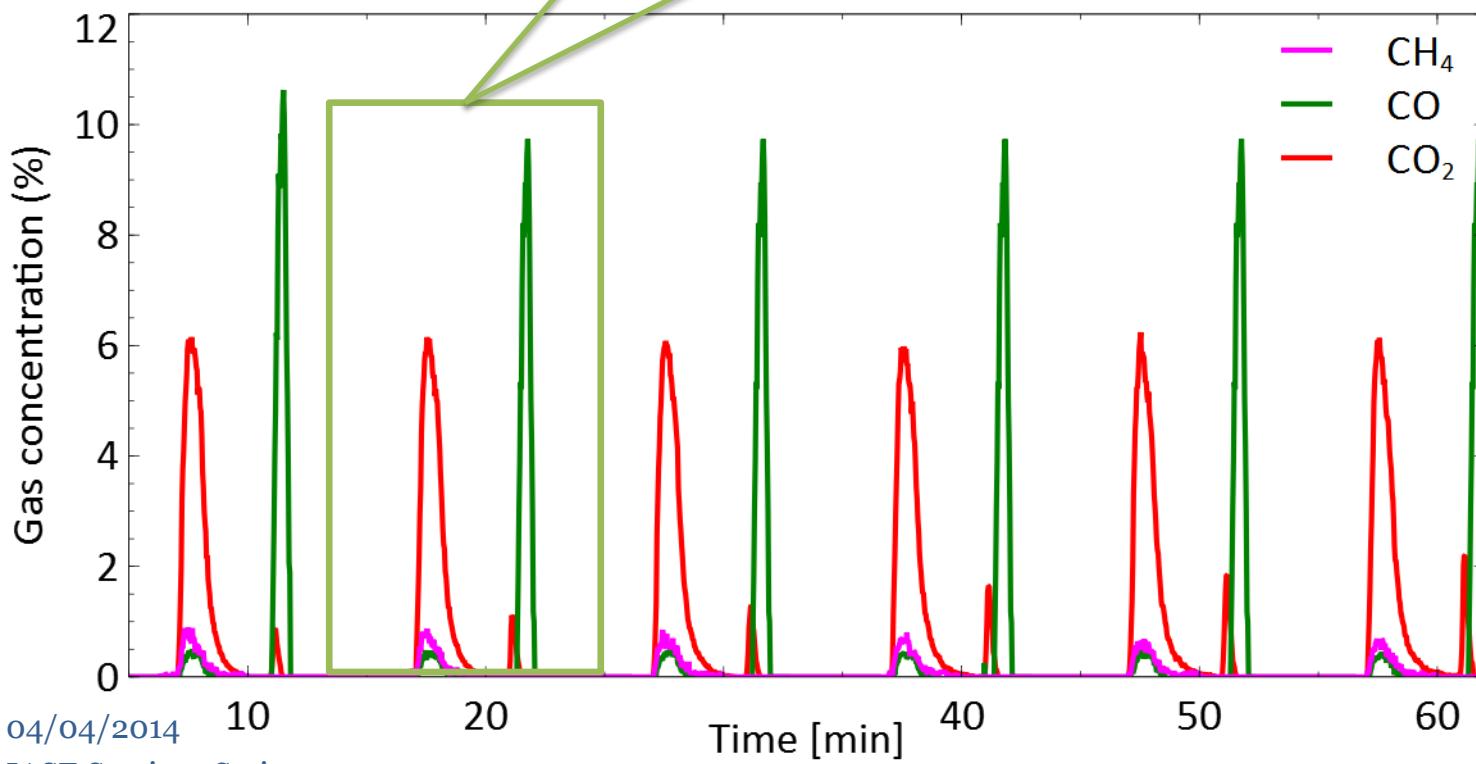


## NiO/Al<sub>2</sub>O<sub>3</sub> oxygen carrier preparation

- Dry impregnation with loading of 20 wt% Ni
- Particle size: 50-150 µm
- Surface area: 90 m<sup>2</sup>/g

### Experimental conditions

Reduction temperature	800°C
Reduction time	1 min
Reducing gas flow	20 CH <sub>4</sub> + 80 Ar ml/min
Solid loading	2 g
Purge time	3 min
Oxidizing gas	100 air ml/min
Oxidation time	3 min
Tube ID	0.99 cm
Tube length	30 cm





# Dynamic Sensitivity Analysis

## Model, system of DAE's

$$\begin{aligned} \mathbf{f}(\dot{\mathbf{x}}(t), \mathbf{x}(t), \mathbf{u}(t), \bar{\mathbf{w}}, \boldsymbol{\theta}, t) &= 0 \\ \hat{\mathbf{y}}(t) &= \mathbf{h}(\mathbf{x}(t)) \end{aligned}$$

$\mathbf{f}$  : continuous function

$\dot{\mathbf{x}}(t)$  : differential state variables

$\mathbf{u}(t)$  : time-varying controls

$\bar{\mathbf{w}}$  : time-constant controls

$\boldsymbol{\theta}$  : parameter vector

$\mathbf{h}(\mathbf{x}(t))$ : measured state variables

$\hat{\mathbf{y}}(t)$  : measured responses

## Sensitivity matrix

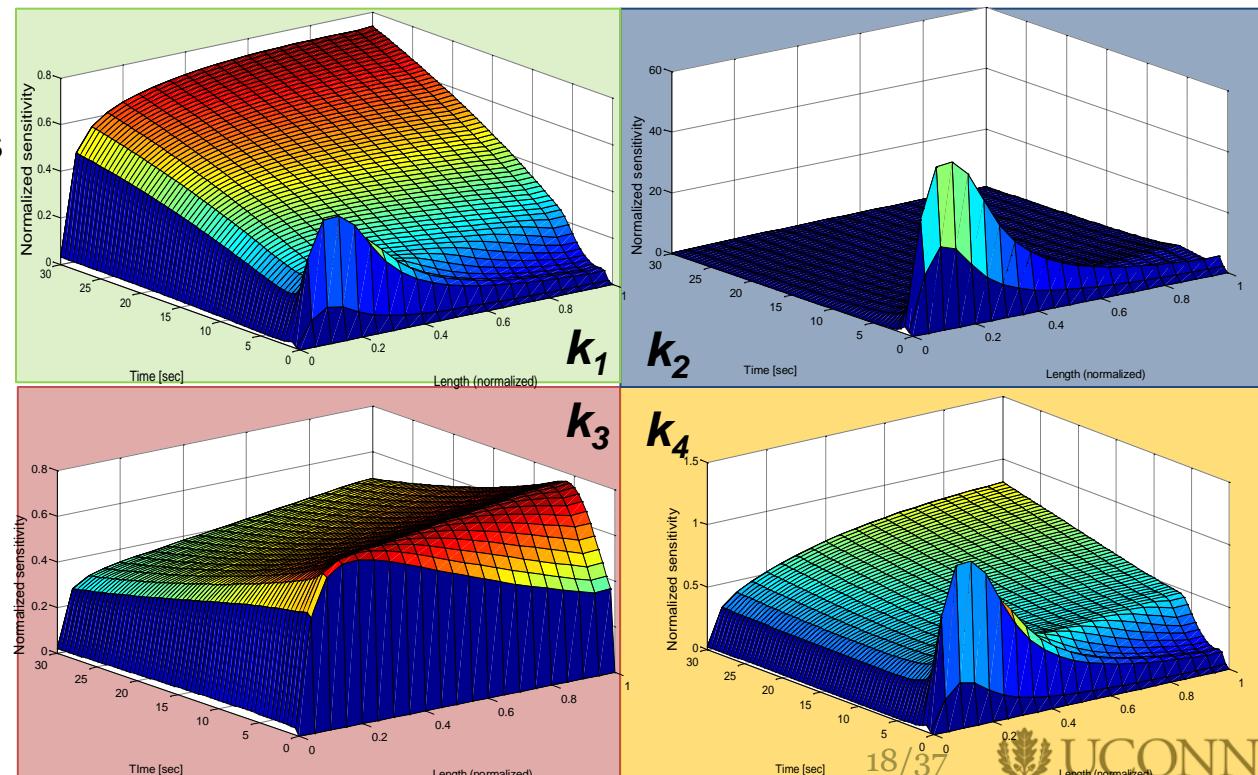
$$Q = \begin{bmatrix} \frac{\partial \hat{y}_1}{\partial \theta_i} & \dots & \frac{\partial \hat{y}_1}{\partial \theta_p} \\ \vdots & \ddots & \vdots \\ \frac{\partial \hat{y}_n}{\partial \theta_i} & \dots & \frac{\partial \hat{y}_n}{\partial \theta_p} \end{bmatrix}$$

## Local methods

Differentiation of model equations

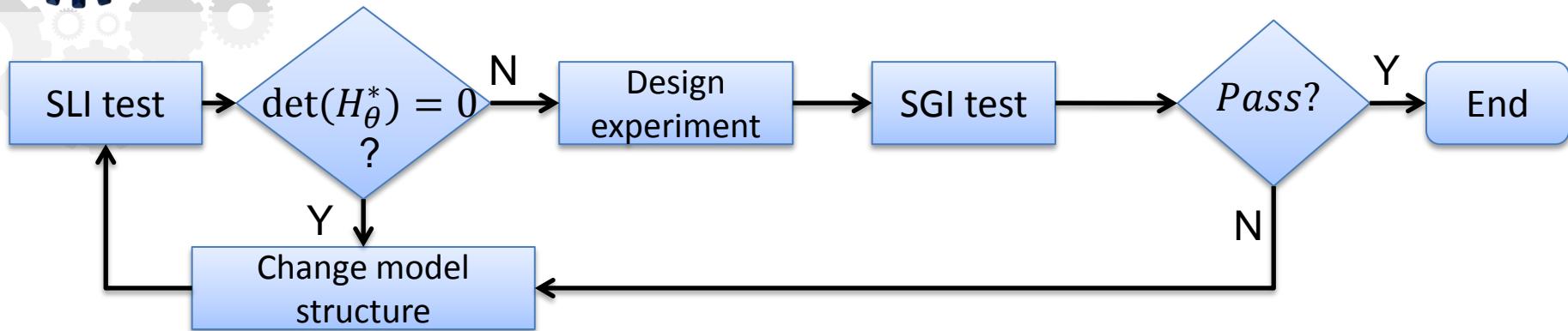
$$\frac{d}{dt} \frac{\partial \hat{\mathbf{y}}}{\partial \boldsymbol{\theta}} = \frac{\partial \mathbf{f}}{\partial \hat{\mathbf{y}}} \cdot \frac{\partial \hat{\mathbf{y}}}{\partial \boldsymbol{\theta}} + \frac{\partial \mathbf{f}}{\partial \boldsymbol{\theta}}$$

**Results for CLC fixed-bed reactor:**





# Identifiability Analysis



## Structural local identifiability test (SLI)

- (1) Correlation of sensitivity matrix is different from  $\pm 1$
- (2) Fisher information matrix is non-singular

$$\mathbf{H}_\theta^* = \sum_{i=1}^{N_{ts}} \sum_{j=1}^{N_y} \sigma_{ij} \mathbf{Q}_i^T \mathbf{Q}_j$$

## Structural global identifiability test (SGI)

- Verifies if parameter sets do not provide the same model responses

$$\Phi^I = \max_{\theta, \theta^*} (\theta - \theta^*)^T \mathbf{W}_\theta (\theta - \theta^*) \leq \varepsilon_\theta$$

Subject to:

$$\int_0^{\tau} (\mathbf{y}(\mathbf{u}_0, \theta) - \mathbf{y}(\mathbf{u}_0, \theta^*))^T \mathbf{W}_y (\mathbf{y}(\mathbf{u}_0, \theta) - \mathbf{y}(\mathbf{u}_0, \theta^*)) dt < \varepsilon_y$$

$\theta, \theta^*$ : parameter sets  
 $\mathbf{y}$ : model trajectory  
 $\mathbf{u}_0$ : initial controls  
 $\mathbf{W}$ : weights  
 $\varepsilon_\theta, \varepsilon_y$ : small numbers



# Identifiability Analysis: Arrhenius Expression

## Arrhenius Expression:

$$k = k_{\text{ref}} \exp \left[ -\frac{E}{R} \left( \frac{1}{T} - \frac{1}{T_{\text{ref}}} \right) \right]$$

## SLI results:

- 1 experiment
  - *High correlation*
  - *Unidentifiable*
- 2 experiments
  - *Identifiable*

Optimal experiments		
T [°C]	600	800
Q <sub>CH4</sub> [sccm]	30	30
Solids [g]	1.2	2.2

## SGI results:

- $\Phi^I = 4E-10 < \varepsilon_0 = 1E-6$
- $\varepsilon_y = 1E-3$

## Correlation matrix of Arrhenius parameters

	Ea <sub>1</sub>	Ea <sub>2</sub>	Ea <sub>3</sub>	Ea <sub>4</sub>	k <sub>1</sub>	k <sub>2</sub>	k <sub>3</sub>	k <sub>4</sub>
Ea <sub>1</sub>	1.000							
Ea <sub>2</sub>	-0.394	1.000						
Ea <sub>3</sub>	-0.247	-0.022	1.000					
Ea <sub>4</sub>	-0.140	-0.143	-0.589	1.000				
k <sub>1</sub>	-0.817	0.287	0.644	-0.271	1.000			
k <sub>2</sub>	-0.396	1.000	-0.025	-0.140	0.289	1.000		
k <sub>3</sub>	-0.290	-0.017	0.999	-0.575	0.666	-0.019	1.000	
k <sub>4</sub>	-0.052	0.316	-0.165	-0.573	0.045	0.317	-0.158	1.000

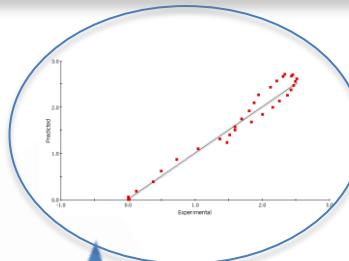
## Correlation matrix of Arrhenius parameters

	Ea <sub>1</sub>	Ea <sub>2</sub>	Ea <sub>3</sub>	Ea <sub>4</sub>	k <sub>1</sub>	k <sub>2</sub>	k <sub>3</sub>	k <sub>4</sub>
Ea <sub>1</sub>	1.000							
Ea <sub>2</sub>	-0.108	1.000						
Ea <sub>3</sub>	-0.917	0.199	1.000					
Ea <sub>4</sub>	-0.726	0.164	0.810	1.000				
k <sub>1</sub>	-0.385	0.035	0.213	-0.002	1.000			
k <sub>2</sub>	-0.134	-0.044	0.317	0.339	-0.048	1.000		
k <sub>3</sub>	-0.758	0.193	0.886	0.818	-0.214	0.333	1.000	
k <sub>4</sub>	0.027	0.166	0.047	-0.050	-0.291	-0.053	0.145	1.000

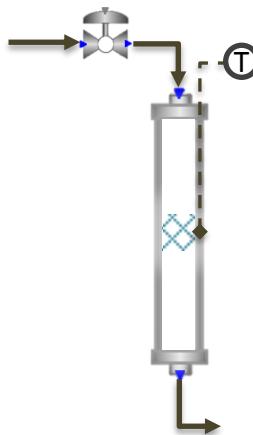
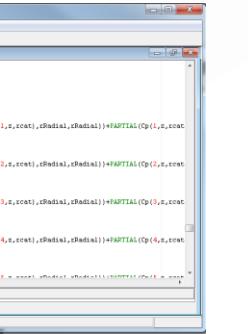


# Model-guided experiment

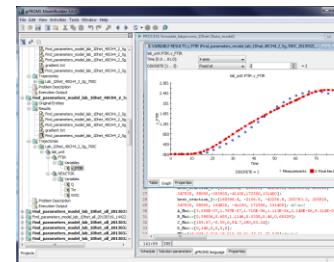
## Build first principles process model



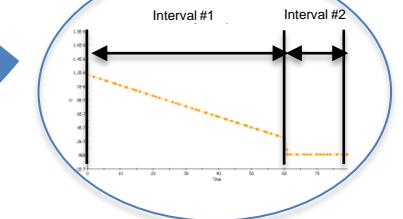
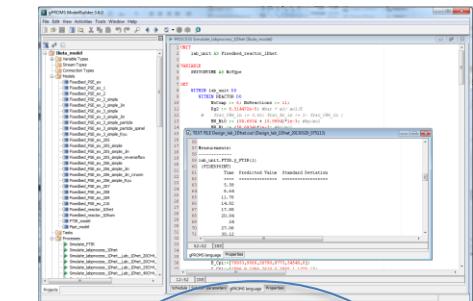
## Estimate parameters & confidence intervals



Conduct experiment at specified conditions



# Design optimal experiment





# Optimal experimental design (OED)

- Motivation: maximize information content for parameter estimation

$$\boldsymbol{\varphi}^{opt} = \arg \min_{\boldsymbol{\varphi}} \left[ \det \left( H_{\boldsymbol{\theta}}^{-1}(\boldsymbol{\theta}, \boldsymbol{\varphi}) \right) \right]$$

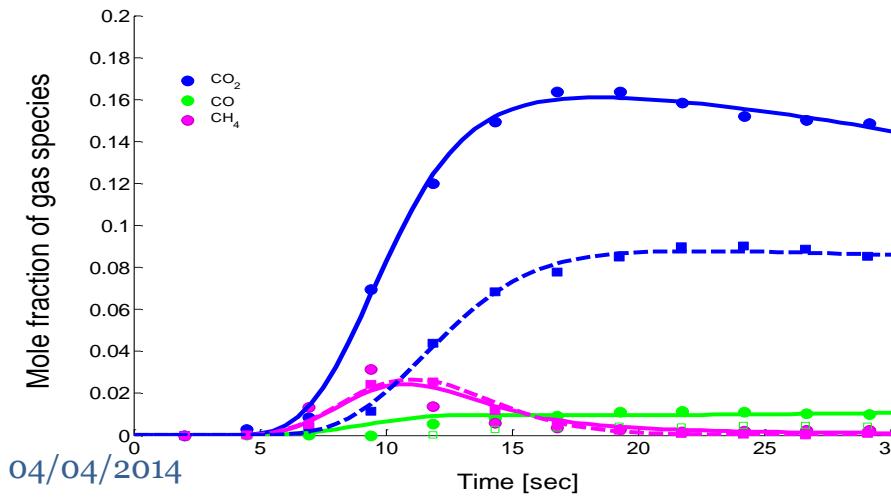
subject to:

$$\mathbf{f}(\dot{\mathbf{x}}(t), \mathbf{x}(t), \mathbf{u}(t), \bar{\mathbf{w}}, \boldsymbol{\theta}, t) = 0$$

$$\varphi_i^L \leq \varphi_i \leq \varphi_i^U$$

- Model + experimental results

Comparison of optimal (-) and baseline (--) experiments



Design criterion:  
**D-OPTIMALITY**

Experiments		
	Standard	Optimal
T [°C]	700	700
Q <sub>CH4</sub> [sccm]	10	20
Solids [g]	2	2

**Norm 95% confidence interval**

Kinetics	Nominal exp.	Optimal exp.
k <sub>1</sub>	0.3880	0.1654
k <sub>2</sub>	1.4416	0.8379
k <sub>3</sub>	0.6005	0.1461
k <sub>4</sub>	3.2706	0.3118

**Improves parameter estimation  
for all uncertain kinetic  
parameters**



# Fluidized bed model

## Kunii & Levenspiel 3-phase model

### Mass balance

#### Gas (bubble)

$$(\delta + \alpha\delta\varepsilon_{mf})\frac{\partial C_{j,b}}{\partial t} + \frac{\partial(u_b(\delta + \alpha\delta\varepsilon_{mf})C_{j,b})}{\partial z} = K_{j,be}(C_{j,e} - C_{j,b})(\delta + \alpha\delta\varepsilon_{mf}) + (\lambda_1 C_{j,b} + \lambda_2 C_{j,e})\frac{\partial(u_b(\delta + \alpha\delta\varepsilon_{mf}))}{\partial z} + R_{j,b}(C_{j,b})\rho_p\alpha\delta(1 - \varepsilon_{mf})$$

#### Gas (emulsion)

$$(1 - \delta - \alpha\delta)\varepsilon_{mf}\frac{\partial C_{j,e}}{\partial t} + \frac{\partial(u_e(1 - \delta - \alpha\delta)\varepsilon_{mf}C_{j,e})}{\partial z} = K_{j,eb}(C_{j,b} - C_{j,e})(1 - \delta - \alpha\delta)\varepsilon_{mf} - (\lambda_1 C_{j,b} + \lambda_2 C_{j,e})\frac{\partial(u_b(\delta + \alpha\delta\varepsilon_{mf}))}{\partial z} + R_{j,e}(C_{j,e})\rho_p(1 - \delta - \alpha\delta)(1 - \varepsilon_{mf})$$

#### Solid (wake)

$$\alpha\delta(1 - \varepsilon_{mf})\rho_p\frac{\partial C_{i,w}}{\partial t} + \frac{\partial(u_b\alpha\delta(1 - \varepsilon_{mf})\rho_p C_{i,w})}{\partial z} = K_{j,we}(C_{i,e} - C_{i,w})\rho_p\alpha\delta(1 - \varepsilon_{mf}) + (\lambda_1 C_{i,w} + \lambda_2 C_{i,e})\frac{\partial(u_b\alpha\delta(1 - \varepsilon_{mf})\rho_p)}{\partial z} + R_{i,w}M_i\rho_p\alpha\delta(1 - \varepsilon_{mf})$$

#### Solid (emulsion)

$$(1 - \delta - \alpha\delta)(1 - \varepsilon_{mf})\rho_p\frac{\partial C_{i,e}}{\partial t} + \frac{\partial(u_s(1 - \delta - \alpha\delta)(1 - \varepsilon_{mf})\rho_p C_{i,e})}{\partial z} = K_{j,ew}(C_{i,w} - C_{i,e})(1 - \delta - \alpha\delta)(1 - \varepsilon_{mf}) - (\lambda_1 C_{i,w} + \lambda_2 C_{i,e})\frac{\partial(u_b\alpha\delta(1 - \varepsilon_{mf})\rho_p)}{\partial z} + R_{i,w}M_i\rho_p(1 - \delta - \alpha\delta)(1 - \varepsilon_{mf})$$

#### Gas (freeboard)

$$\varepsilon_f\frac{\partial C_{j,f}}{\partial t} + u_{g,f}\frac{\partial C_{j,f}}{\partial z} = (1 - \varepsilon_f)R_{j,f}\rho_p$$

#### Solid (freeboard)

$$(1 - \varepsilon_f)\frac{\partial C_{i,f}}{\partial t} + u_{s,f}\frac{\partial C_{i,f}}{\partial z} = (1 - \varepsilon_f)R_{i,f}M_i$$

### Energy balance

#### Bubble

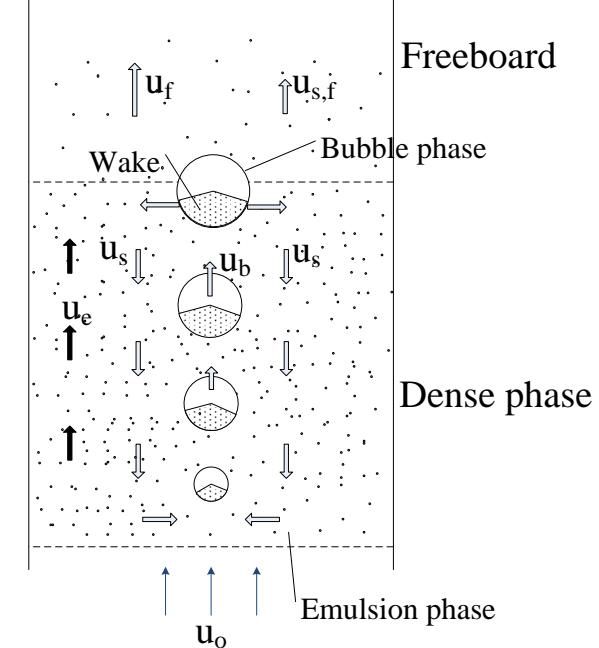
$$\begin{aligned} & \left( (\delta + \alpha\delta\varepsilon_{mf})Cp_b C_{g,b} + \alpha\delta(1 - \varepsilon_{mf})\rho_p \sum C p_{w,s,i} C_{w,s,i}/M_i \right) \frac{\partial T_b}{\partial t} + \\ & \left( (\delta + \alpha\delta\varepsilon_{mf})C_{g,b}Cp_b u_b + \alpha\delta(1 - \varepsilon_{mf})u_b\rho_p \sum C p_{e,s,i} C_{e,s,i}/M_i \right) \frac{\partial T_b}{\partial z} = (\delta + \alpha\delta\varepsilon_{mf})H_{be}(T_e - T_b) + \\ & \alpha\delta(1 - \varepsilon_{mf})\sum(-\Delta H_{i,b})(-R_{i,b})\rho_p + \\ & (\lambda_1 T_b C p_b C_{g,b} + \lambda_2 T_e C p_e C_{g,e} + \sum(\lambda_1 T_b C p_{w,s,i} C_{w,s,i}/M_i + \lambda_2 T_e C p_{e,s,i} C_{e,s,i}/M_i)) \frac{\partial}{\partial z} (u_b(\delta + \alpha\delta\varepsilon_{mf})) \end{aligned}$$

#### Emulsion

$$\begin{aligned} & \left( (1 - \delta - \alpha\delta)\varepsilon_{mf}C p_e C_{g,e} + \rho_p(1 - \delta - \alpha\delta)(1 - \varepsilon_{mf})\sum C_{e,s,i} C p_{e,s,i}/M_i \right) \frac{\partial T_e}{\partial t} + \\ & \left( (1 - \delta - \alpha\delta)\varepsilon_{mf}C_{g,e}C p_e u_e + \rho_p(1 - \delta - \alpha\delta)(1 - \varepsilon_{mf})u_s \sum C_{e,s,i} C p_{e,s,i}/M_i \right) \frac{\partial T_e}{\partial z} = \\ & (1 - \delta - \alpha\delta)\varepsilon_{mf}H_{eb}(T_b - T_e) + (1 - \delta - \alpha\delta)(1 - \varepsilon_{mf})\sum(-\Delta H_{i,e})(-R_{i,e})\rho_p - \\ & (\lambda_1 T_b C p_b C_{g,b} + \lambda_2 T_e C p_e C_{g,e} + \sum(\lambda_1 T_b C p_{w,s,i} \frac{C_{w,s,i}}{M_i} + \lambda_2 T_e C p_{e,s,i} \frac{C_{e,s,i}}{M_i})) \frac{\partial}{\partial z} (u_b(\delta + \alpha\delta\varepsilon_{mf})) + \\ & U(T_a - T_e)/H_d \end{aligned}$$

#### Freeboard

$$\varepsilon_f C p_f C_{g,f} \frac{\partial T_f}{\partial t} + C p_f C_{g,f} u_f \frac{\partial T_f}{\partial z} = \sum(-\Delta H_{i,f})(-R_{i,f})\rho_p + U(T_a - T_f)/H_f$$

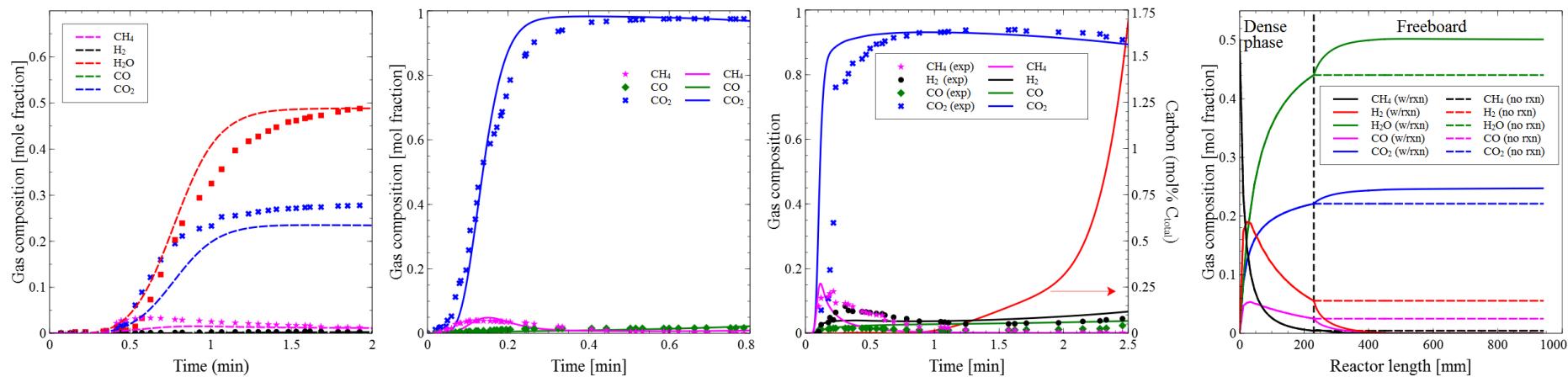


Zhou, Z.; Han, L.; Bolas, G. M. Modeling Chemical-Looping Combustion in Bubbling Fluidized Bed Reactors. *AIChE J.* 2014



# Fluidized bed operation

- Fluidized Bed chemical-looping – prediction and analysis***



- Model is predictive (kinetic mechanism and constants of the fixed bed models used)
- Freeboard contributes significantly to  $\text{CH}_4$  conversion and completion of oxidation
- Consistent with all relevant experimental observations from various laboratories

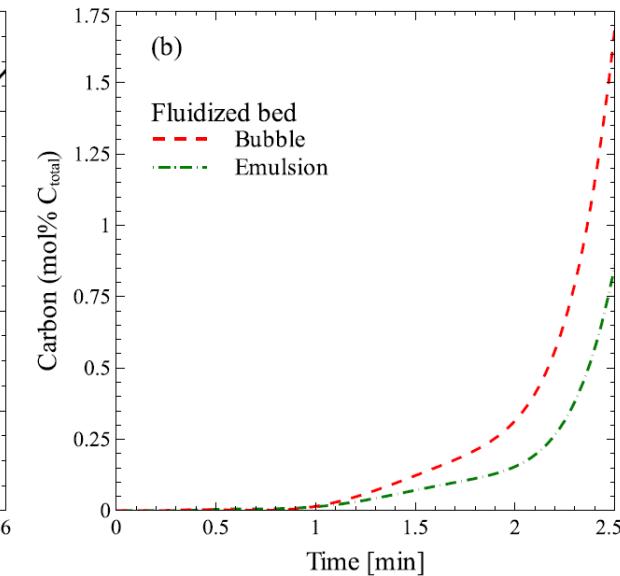
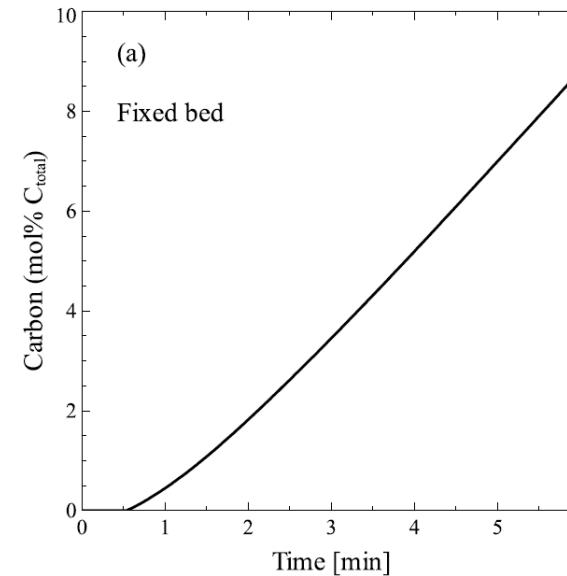
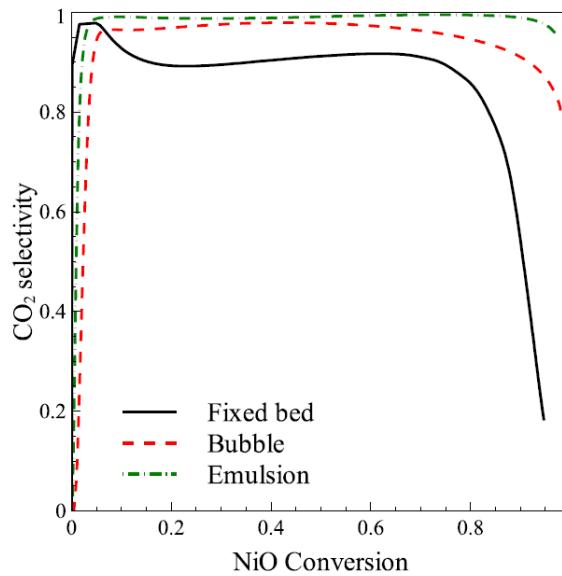
- Zhou, Z.; Han, L.; Bollas, G. M. Modeling Chemical-Looping Combustion in Bubbling Fluidized Bed Reactors. *AIChE J.* **2014**  
 - Zhou, Z.; Han, L.; Bollas, G. M. Overview of chemical-looping reduction in fixed-bed and fluidized-bed reactors focused on oxygen carrier utilization and reactor efficiency. *Aerosol & Air Quality Research*. **2014**



# Fixed/Fluidized beds comparison

- Comprehensive comparison of two reactor designs (fixed and fluidized bed) of the same oxygen carrier loading
- The fixed bed reactor is inferior in all aspects including
  - CO<sub>2</sub> selectivity
  - Carbon formation
  - Bed isothermality

Zhou Z, Han L, Bollas GM, Overview of Chemical-Looping Reduction in Fixed Bed and Fluidized Bed Reactors Focused on Oxygen Carrier Utilization and Reactor Efficiency. *Aerosol Air Qual Res* 2014;14:559–71



# Summary of background

## Chemical-Looping

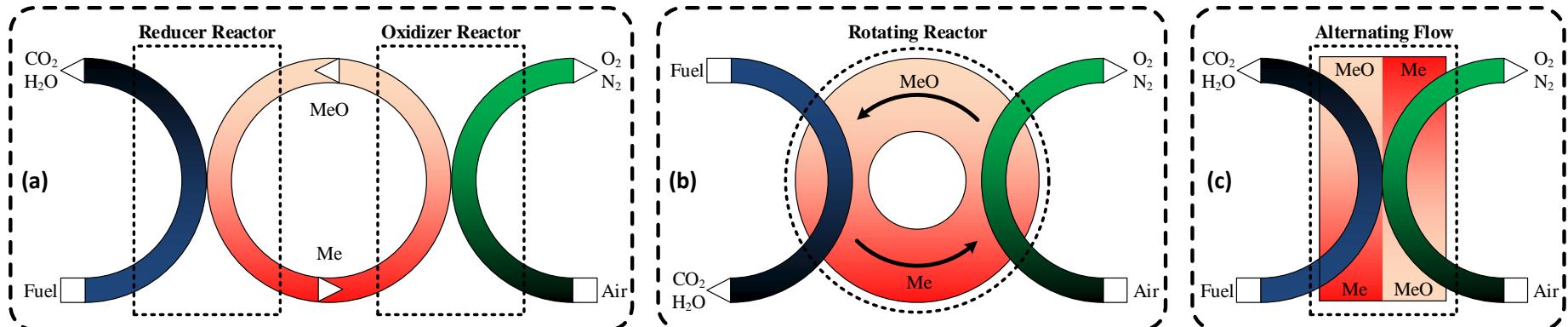
- Most efficient method for CO<sub>2</sub> capture
- Very high research effort
- Tremendous research expenditure
- Combustion or reforming are feasible
- Mature process

## Process Options

- Fluidized beds
- Fixed beds
- Rotary beds
- Rotating beds
- Moving beds

## Our work

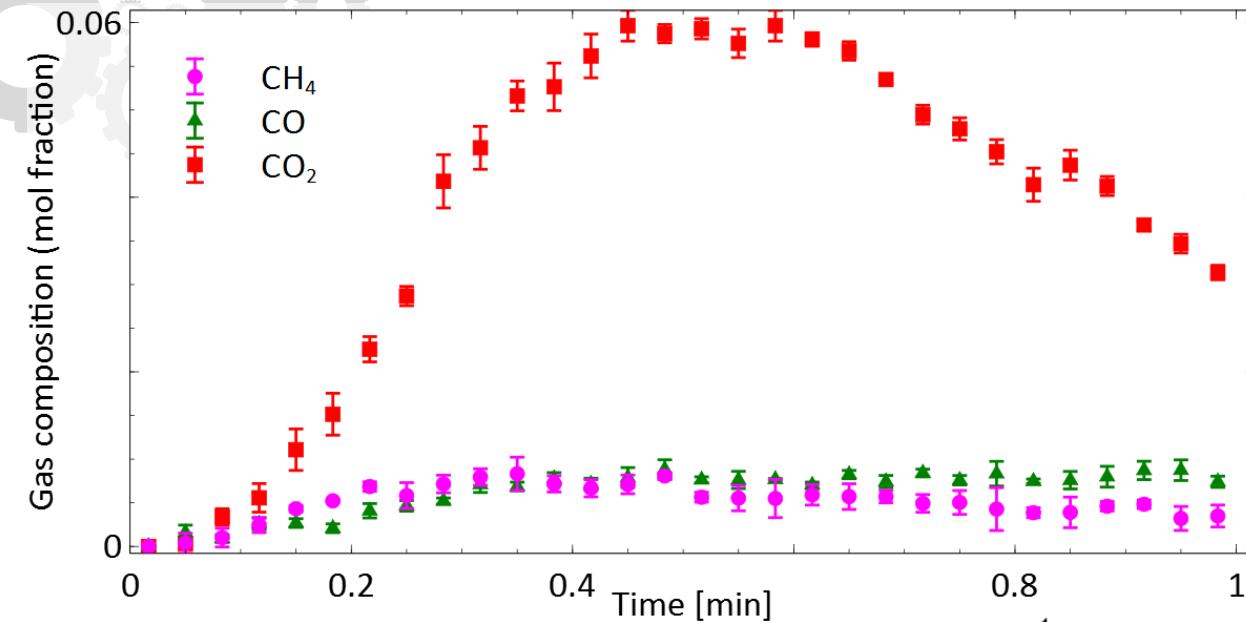
- Modeled all fixed bed reactors with CH<sub>4</sub> and NiO
- Predicted all fluidized beds with CH<sub>4</sub> & NiO
- Compared fixed and fluidized bed CLC and CLR
- Setup a bench-scale fixed bed reactor



Reactor options for Chemical-looping Combustion (CLC): (a) circulating fluidized-bed; (b) rotating reactor; and (c) alternating flow over a fixed-bed.



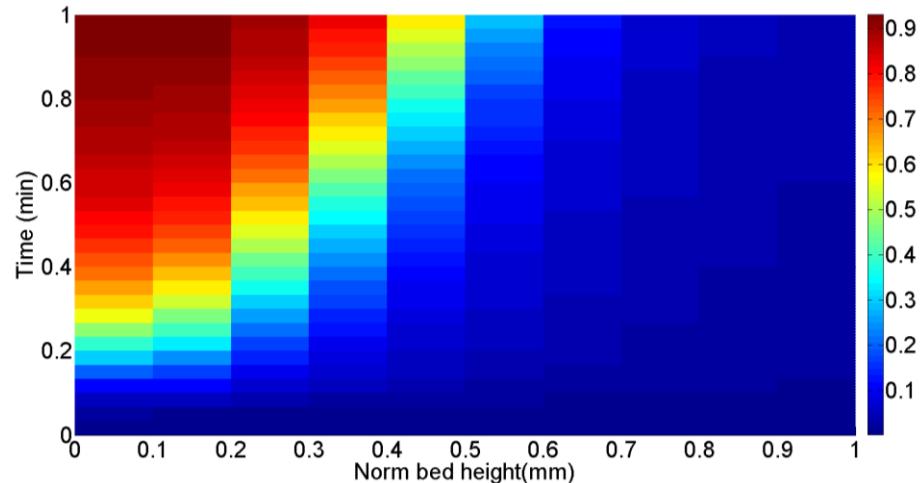
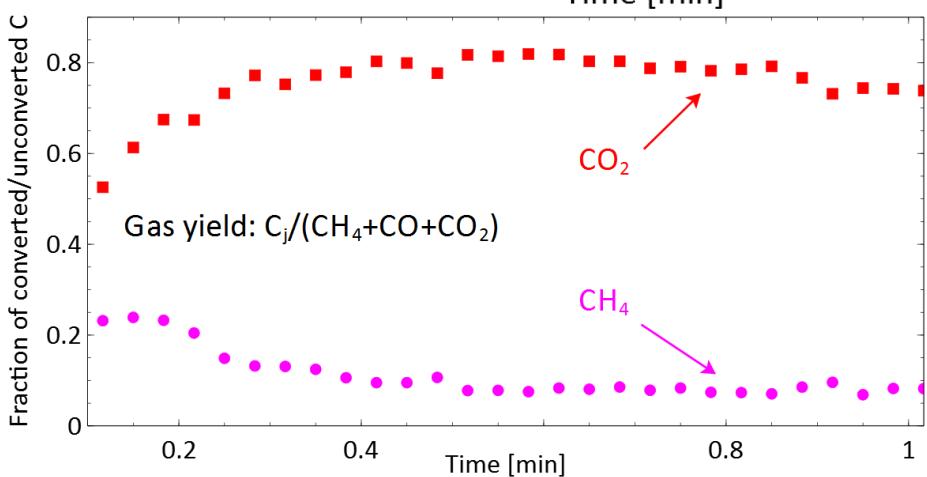
# Typical fixed-bed experiment



## Experimental settings

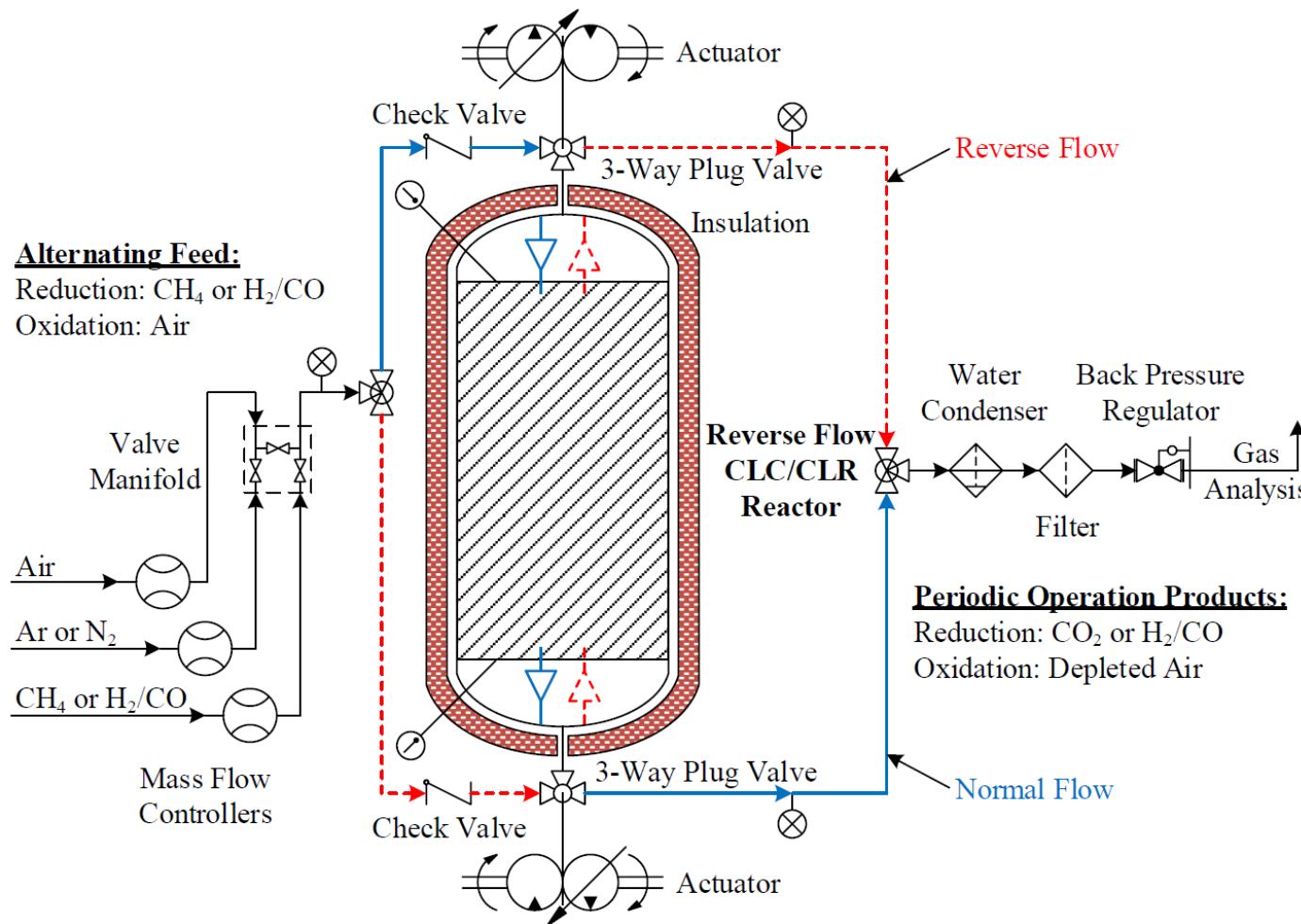
Reduction temperature	800°C
Reduction time	1 min
Reducing gas flow	10 CH <sub>4</sub> in 100 ml/min
Solid loading	2 g

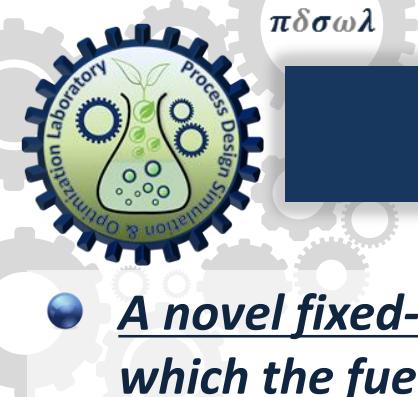
## Oxygen carrier conversion



# Reverse-Flow Fixed-bed CLC Reactor

## Design of the novel reactor setup





# Patent Claims (Bollas, Han 2014)

- A novel fixed-bed chemical-looping reactor configuration was invented, in which the fuel flow direction is periodically switched during each cycle.
- The new design significantly improves the performance of fixed-bed chemical-looping reactors, making them competitive to their fluidized-bed equivalents, while overcoming their operating bottlenecks.
- The novel system enables:
  - (1) improved oxygen carrier utilization,
  - (2) higher CO<sub>2</sub> capture efficiency (by up to 50%),
  - (3) mitigation of hot and cold zones,
  - (4) elimination of gas-solids separation steps,
  - (5) resistance to carbon deposition.
- Advantages relevant to the oxygen carrier used (as compared to current process configurations) relate to the elimination of:
  - (6) need for oxygen carrier fluidizability,
  - (7) attrition,
  - (8) toxic solid fines effluents,
  - (9) need for oxygen carrier addition.



# Reverse-Flow Fixed-bed Reactor Model

## Model Description

- 1D heterogeneous model
- Dusty-gas model (concentrated transport)
- Time varying boundary conditions for the fluid phase

## Full heterogeneous design equations

Solid phase

$$-\frac{\partial C_{c,i}}{\partial r_c} = \sum_{j=1}^N \frac{1}{D_{ij}^e} (y_k J_i - y_j J_k) + \frac{J_i}{D_{ik}^e}$$

$$\frac{\partial(\varepsilon_c C_{c,i})}{\partial t} + \frac{1}{r_c^2} \frac{\partial}{\partial r_c} (r_c^2 J_i) = \rho_s \sum R_i$$

$$\left( (1-\varepsilon_c) \rho_s C_{p,s} + \varepsilon_c C_{p,c} C_{T,c} \right) \frac{\partial T_c}{\partial t} = \frac{1}{r_c^2} \frac{\partial}{\partial r_c} \left( r_c^2 \lambda_s \frac{\partial T_c}{\partial r_c} \right) + \rho_s \sum (-\Delta H_i) (R_i)$$

$$J_i \Big|_{r_c=0} = \frac{\partial T_c}{\partial r_c} \Bigg|_{r_c=0} = 0 \quad J_i \Big|_{r_c=r_p} = k_{c,i} \left( C_{c,i} \Big|_{r_c=r_p} - C_i \right) \\ - \lambda_s \left( \frac{\partial T_c}{\partial r_c} \right) \Bigg|_{r_c=r_p} = h_f \left( T_c \Big|_{r_c=r_p} - T \right)$$

Fluid phase

$$\frac{\partial(\varepsilon_b C_i)}{\partial t} + \frac{\partial(u C_i)}{\partial z} = \varepsilon_b \frac{\partial}{\partial z} \left( D_{ax,i} \frac{\partial C_i}{\partial z} \right) + k_{c,i} a_v \left( C_{c,i} \Big|_{r_c=r_p} - C_i \right)$$

$$\frac{\partial(\varepsilon_b C_{p,f} C_T)}{\partial t} + \frac{\partial(C_T C_{p,f} u T)}{\partial z} = \varepsilon_b \frac{\partial}{\partial z} \left( \lambda_{ax} \frac{\partial T}{\partial z} \right) + h_f a_v \left( T_c \Big|_{r_c=r_p} - T \right)$$

$$\frac{dP}{dz} = - \left( \frac{1-\varepsilon_b}{\varepsilon_b^3} \right) \left( \frac{\rho u_0^2}{d_p} \right) \left( \frac{150}{Re_p} + 1.75 \right)$$

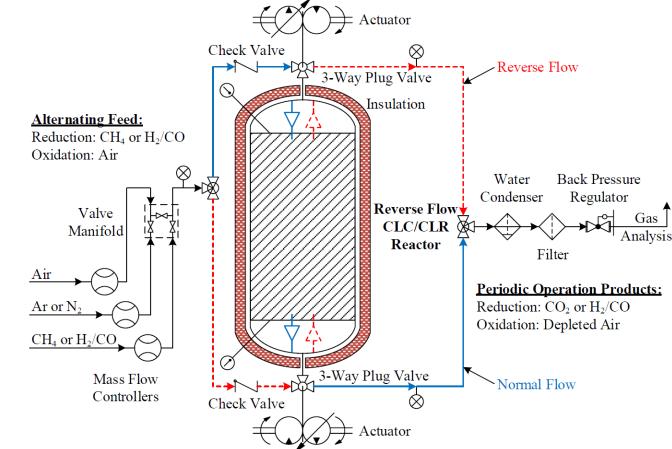
$$U(t) = \kappa(t) u$$

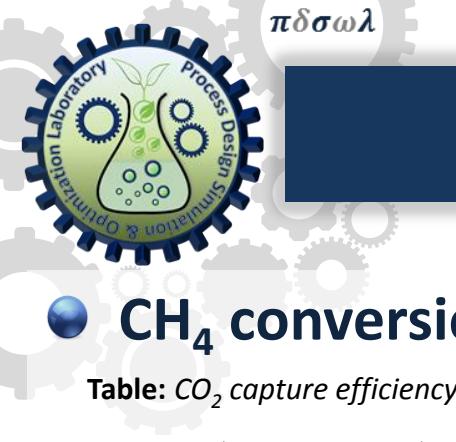
$$\kappa(t) = \begin{cases} 1, & t \in [(n-1)t_s, (n-1/2)t_s] \\ -1, & t \in [(n-1/2)t_s, nt_s] \end{cases}$$

$$\varepsilon_b D_{ax,i} \frac{\partial C_i}{\partial z} = \begin{cases} \frac{1+\kappa(t)}{2} u (C_i - C_{i,in}), & z=0 \\ -\frac{1-\kappa(t)}{2} u (C_i - C_{i,in}), & z=L \end{cases}$$

$$\varepsilon_b \lambda_{ax} \frac{\partial T}{\partial z} = \begin{cases} \frac{1+\kappa(t)}{2} u (T - T_{in}) C_T C_{p,f}, & z=0 \\ -\frac{1-\kappa(t)}{2} u (T - T_{in}) C_T C_{p,f}, & z=L \end{cases}$$

$$P|_{z=L} = P_{out}$$





# Performance metrics I

## CH<sub>4</sub> conversion and CO<sub>2</sub> selectivity

**Table:** CO<sub>2</sub> capture efficiency for varying oxygen carrier conversion

Solid conversion	One-directional	Reverse-flow
0.3	0.9238	0.9559
0.4	0.8975	0.9513
0.5	0.8692	0.9347
0.6	0.8389	0.9105
0.7	0.8055	0.8854
0.8	0.7652	0.8508

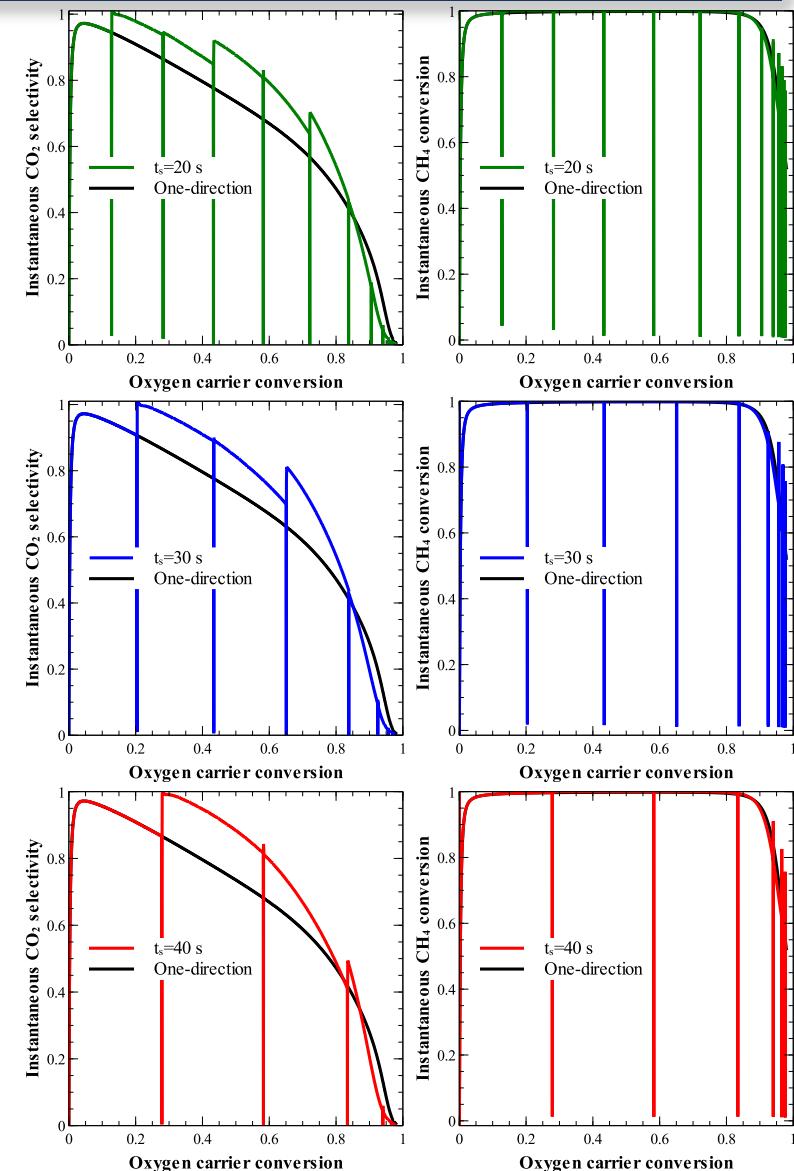
Solid conversion	One-directional	Reverse-flow
0.3	0.9102	0.9387
0.4	0.8759	0.9239
0.5	0.8399	0.9012
0.6	0.8020	0.8810
0.7	0.7619	0.8525
0.8	0.7146	0.8144

Industrial-scale reactor →

- Reactor in this study is suboptimal for fair comparison with existing fixed bed reactors

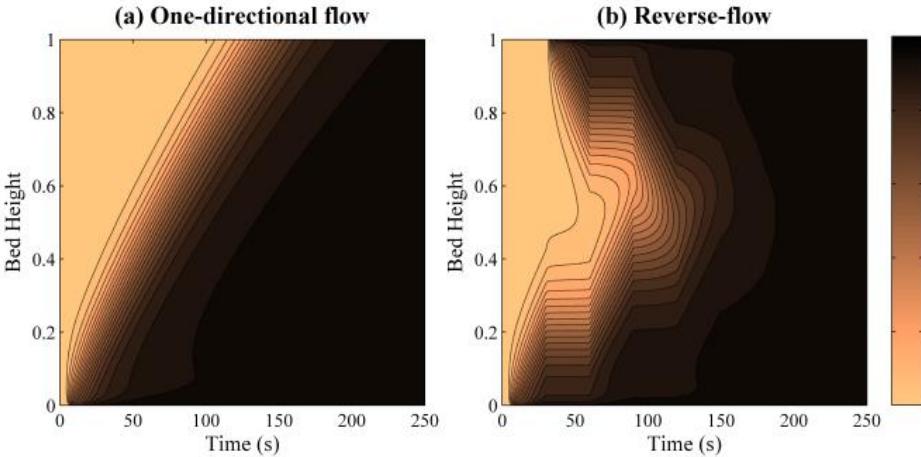
Han L, Zhou Z, Bollas GM. Chemical-looping combustion in a reverse-flow fixed-bed reactor. Applied Energy 2014

Bollas GM, Han L. Reverse-Flow Reactor for Chemical-Looping Combustion and Reforming of Gaseous Fuels; US Provisional Patent - University of Connecticut, 2014.

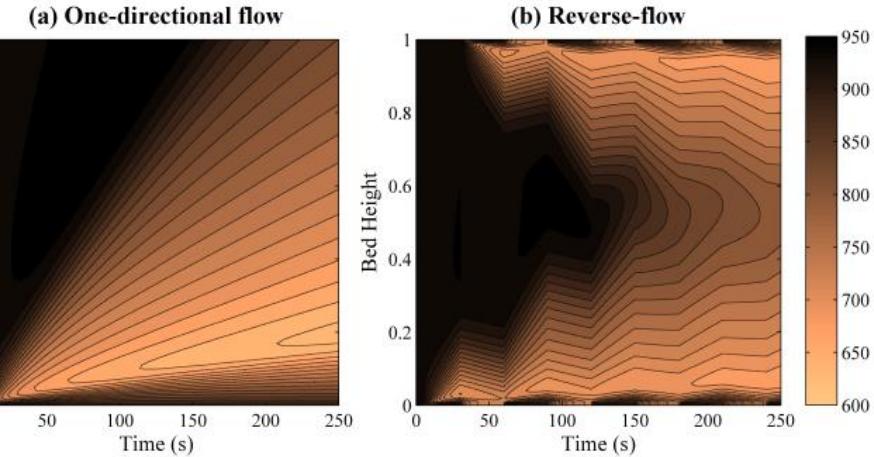


# Performance metrics II

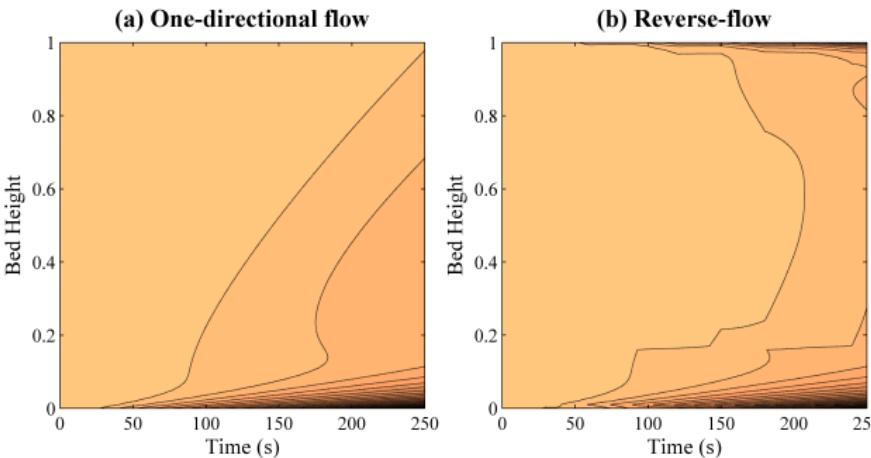
## Oxygen carrier conversion



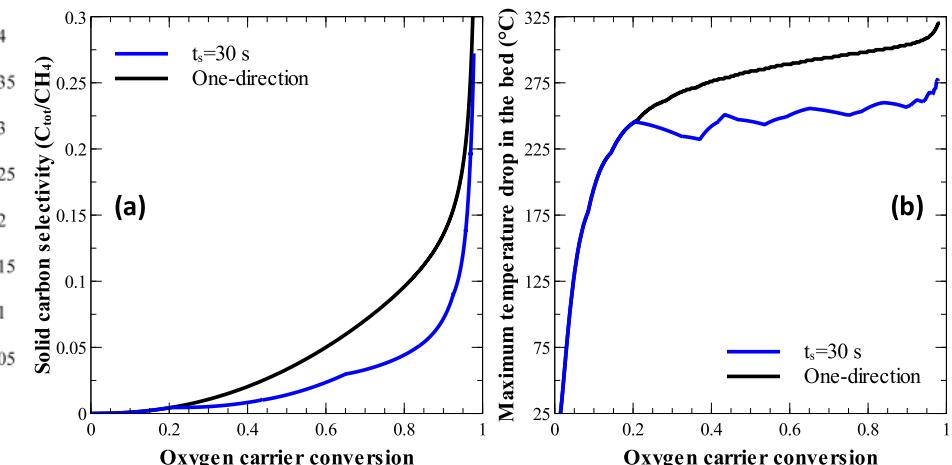
## Bed Temperature Profile



## Carbon Formation



## Solid Carbon selectivity and Max Bed T drop





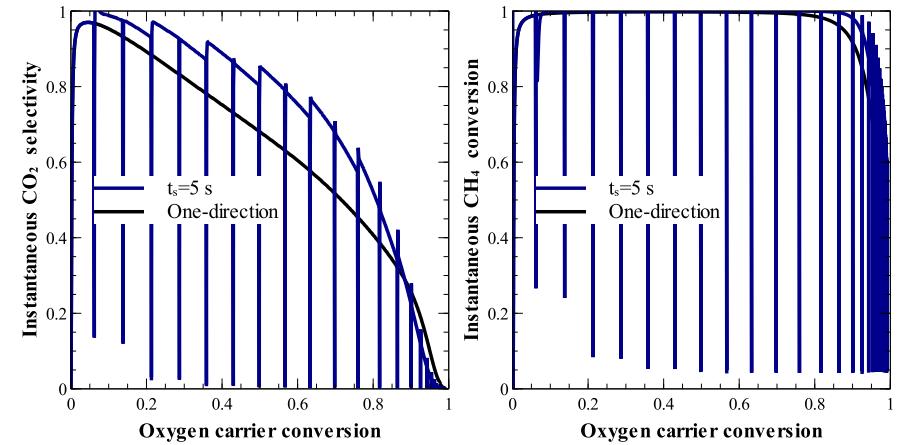
# Scaled-up Performance metrics I

## Scale-up procedure

- Commercially realistic industrial-scale fixed-bed reactor
- Small particle size ( $300 \mu\text{m}$ ) to minimize diffusion effects
- Significant pressure drop in the system =>
  - Constraint: bed height should not exceed 1 m*
- Scaling factors:
  - L/D ratio and Froude number*

	Bench-scale reactor	Industrial-scale reactor
$L [\text{m}]$	0.22	1.0
$D [\text{m}]$	0.055	0.25
$Q (\text{L/min})$	16.68 (100% $\text{CH}_4$ )	3000 (100% $\text{CH}_4$ )
$Fr$	0.34	0.39
$L/D$	4	4
$Re_p$	0.80	6.9
$\Delta P [\text{bar}]$	0.3	4

- Reactor still suboptimal
- Performance enhancement improved*



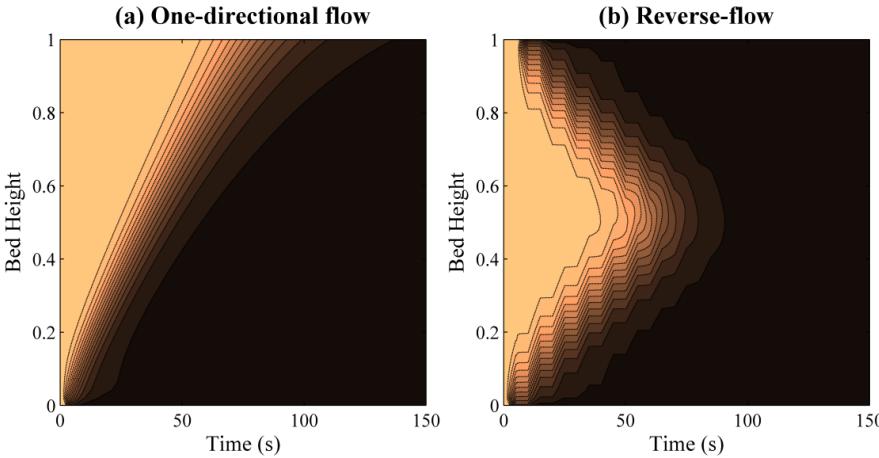
Han L, Zhou Z, Bollas GM. Chemical-looping combustion in a reverse-flow fixed-bed reactor. Appl Energy 2014

Bollas GM, Han L. Reverse-Flow Reactor for Chemical-Looping Combustion and Reforming of Gaseous Fuels; US Provisional Patent - University of Connecticut, 2014.

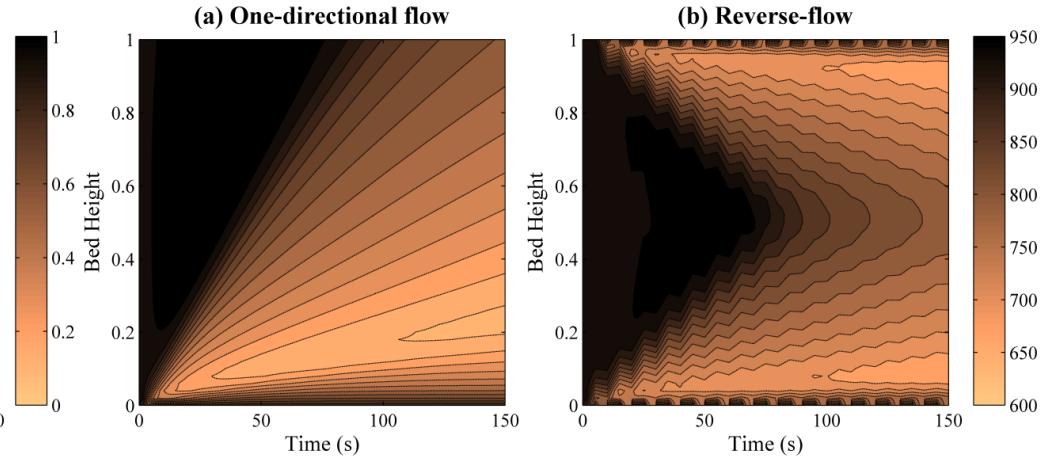


# Scaled-up Performance metrics II

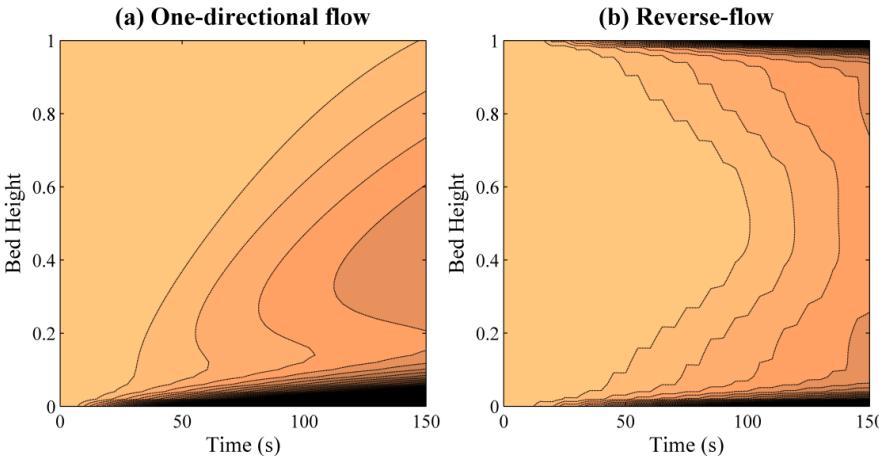
## Oxygen carrier conversion



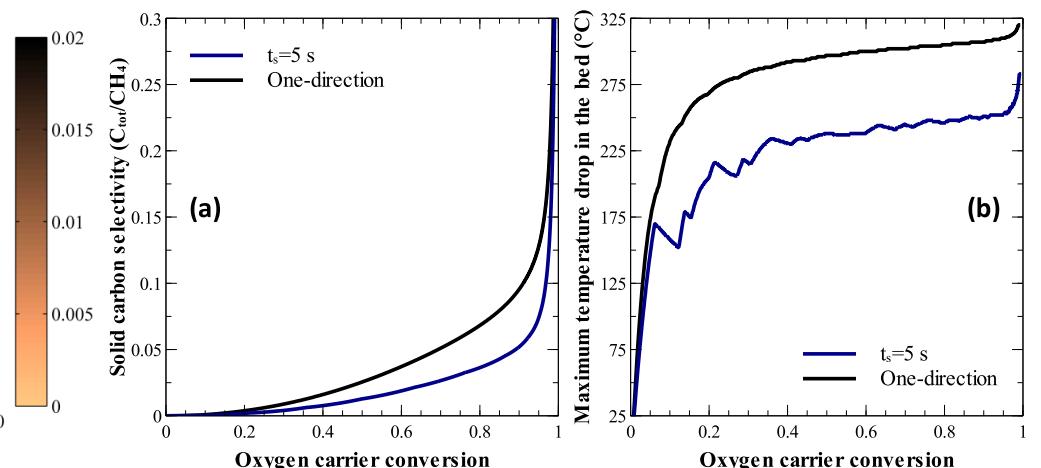
## Bed Temperature Profile



## Carbon Formation



## Solid Carbon selectivity and Max Bed T drop





# Conclusions

- What we should have done (Model-Based Development)
  - Statistical Analysis of Existing Data and Kinetics Models (F-test, AICc)
  - Fixed-bed model utilizing statistically significant kinetics
  - Optimal Experimental Design for derivation/validation of unknown kinetics
  - Fluidized-bed model prediction and validation
  - Fixed-bed / Fluidized-bed comparison
  - Reverse-flow fixed-bed reactor invention
- What we accomplished so far:
  - A novel reactor concept was invented that addresses the roadblocks to commercialization of existing chemical-looping processes
- Our Aim
  - *to put chemical-looping research and technology on a fundamentally new learning curve; one that relaxes the requirement for fluidized-bed reactor systems and is capable of making chemical-looping a disruptive new technology*



# Acknowledgments



**UCONN**

**NSF CAREER Award**

**No. 1054718**

**Process and Reaction Engineering Program, CBET**

**UCONN Prototype Fund**

**Office of the Vice President for Research**

## ● **Zhiquan Zhou**

*4<sup>th</sup> year PhD Student, CBE UConn*

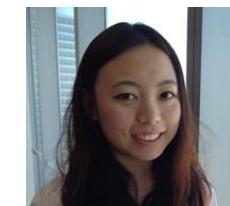
*Fluidized bed modeling, dynamic parameter estimation, statistical analysis*



## ● **Lu Han**

*3<sup>rd</sup> year PhD Student, CBE UConn*

*gPROMS, sensitivity analysis, optimal experimental design*



- Ari Fischer
- Oscar Nordness
- Catherine Cheu

- Kyle Such
- Clarke Palmer



# *Thank you!*

**George M. Bollas**

**Department of Chemical & Biomolecular Engineering  
University of Connecticut**

<http://pdsol.engr.uconn.edu>