# Process Systems Engineering

## **Pressure Swing Adsorption:** Design and Optimization for Pre-Combustion Carbon Capture

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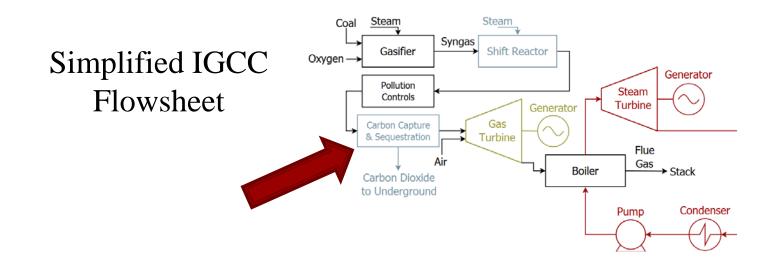
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### Research Objectives

• Demonstrate methods for optimal Pressure Swing Adsorption (PSA) process synthesis

• Design **cost effective** PSA cycle for H<sub>2</sub>-CO<sub>2</sub> separation in IGCC power plant



### Pressure Swing Adsorption (PSA)

- Gas separation utilizing differences in adsorption phenomena
- Adsorption at high pressure, desorption at low pressure

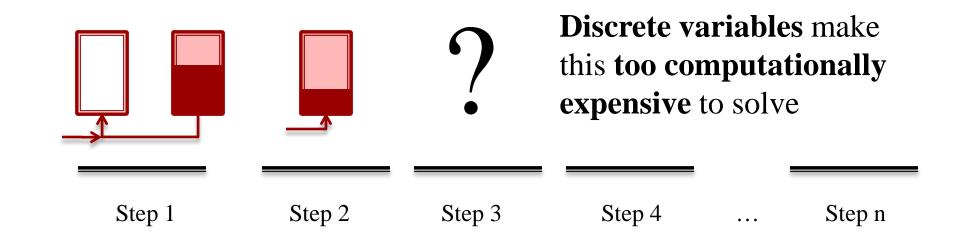
Numerous industrial examples

 H<sub>2</sub> purification in refineries
 O<sub>2</sub> concentration for medical use

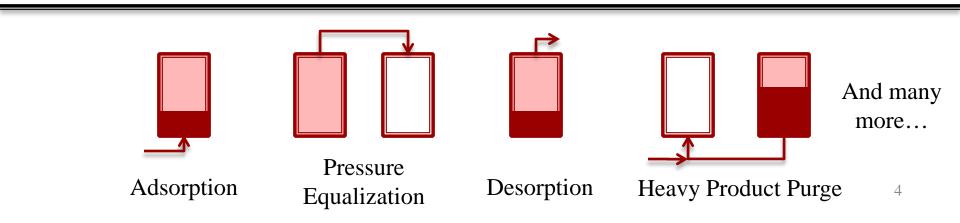




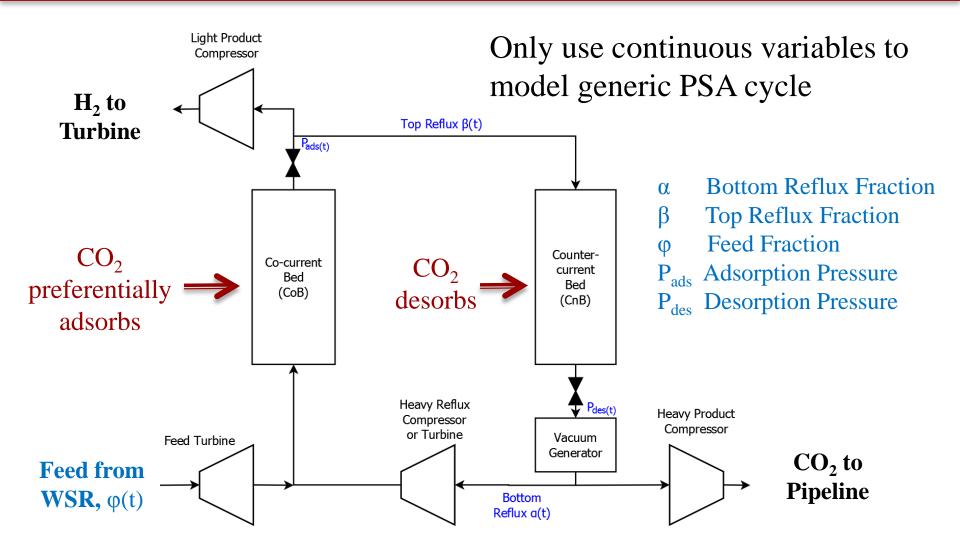
# Optimal Cycle Synthesis



#### "Parts Box" of Steps



## PSA "Superstructure"



### PSA Model: Transport Equations

Momentum (Ergun Equation)

$$-\frac{\partial P}{\partial x} = \frac{150\mu(1-\epsilon_b)^2}{d_p^2\epsilon_b^3}v + \frac{1.75}{d_p}\left(\frac{1-\epsilon_b}{\epsilon_b^3}\right)\left(\sum_i M_w^i C_i\right)v|v|$$
$$v_j(t,x) \leftarrow \begin{cases} \max(0, v_j(t,x)) & \text{if } j = 1 \ \text{(co-cur. bed)}\\ \min(0, v_j(t,x)) & \text{if } j = 2 \ \text{(counter-cur. bed)} \end{cases}$$

Energy

$$0 = \left(\epsilon_t \sum_i C_i (C_{pg}^i - R) + \rho_s C_{ps}\right) \frac{\partial T}{\partial t} - \rho_s \sum_i \Delta H_i^{ads} \frac{\partial q_i}{\partial t} + \frac{\partial (vh)}{\partial x} + UA(T - T_w)$$

Material

$$\epsilon_b \frac{\partial C_i}{\partial t} + (1 - \epsilon_b) \rho_s \frac{\partial q_i}{\partial t} + \frac{\partial (vC_i)}{\partial x} = D_L \frac{\partial^2 C_i}{\partial x^2} \qquad i = 1...N_c \qquad {}_6$$

#### PSA Model: Adsorption

Linear Driving Force

$$\frac{\partial q_i}{\partial t} = k_i (q_i^\star - q_i) \qquad i = 1...N_c$$

Dual-Site Langmuir Isotherm

$$q_i^{\star} = \frac{q_1^s b_{1i} P_i}{1 + \sum_j b_{1j} P_j} + \frac{q_2^s b_{2i} P_i}{1 + \sum_j b_{2j} P_j} \qquad i = 1...N_c$$

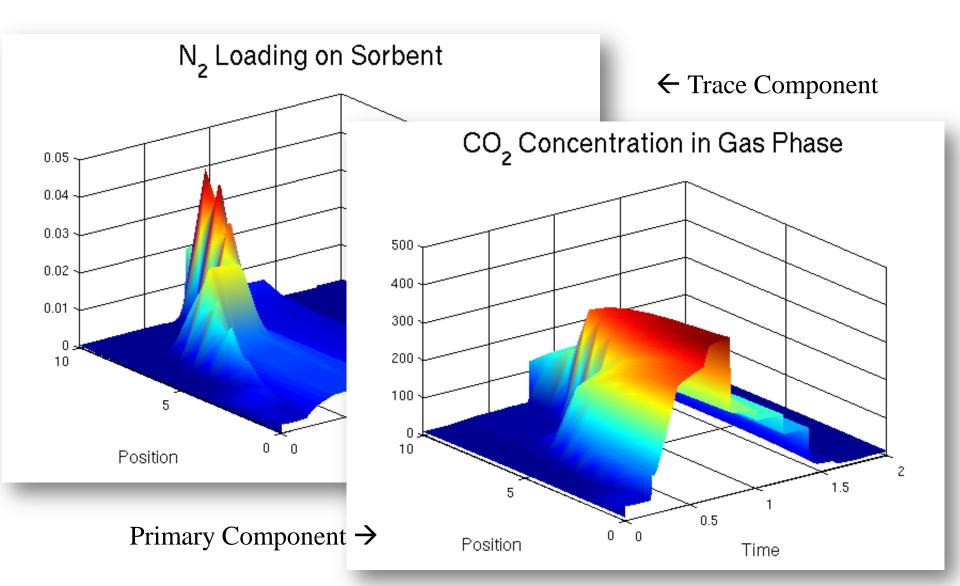
where  $q_{mi}^s = k_{mi}^1 + k_{mi}^2 T$ 

$$b_{mi} = k_{mi}^3 exp(k_{mi}^4/T)$$
  $m = 1, 2$ 

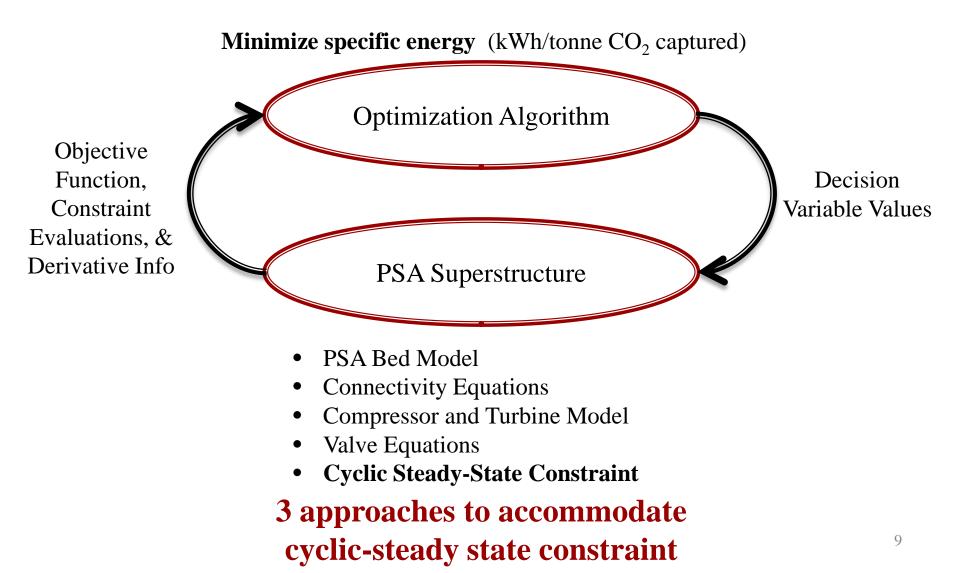
Thermodynamics: Ideal Gas Law

#### Take away: complex non-linear PDAE model

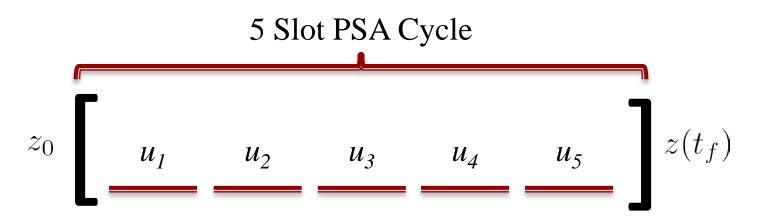
### Sample Simulation Results



# Optimization Methodology



#### 1. Periodic Boundary Conditions



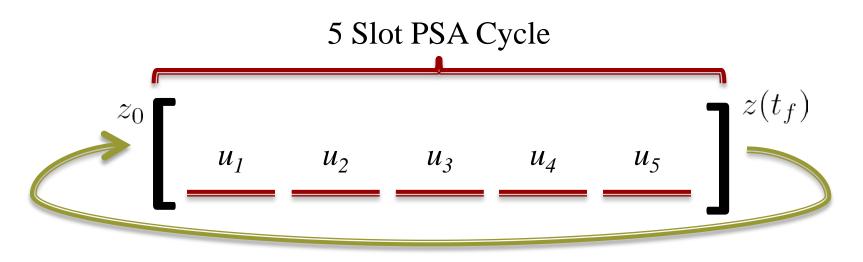
Constraint linking initial and final bed state variables

$$z_0 - z(t_f) = 0$$

+ exact and smooth  $\rightarrow$  derivative based optimization algorithms

- large problem ( $z_0$  and  $u_i$  optimization variables)
- expensive derivatives (from direct sensitivity equations)

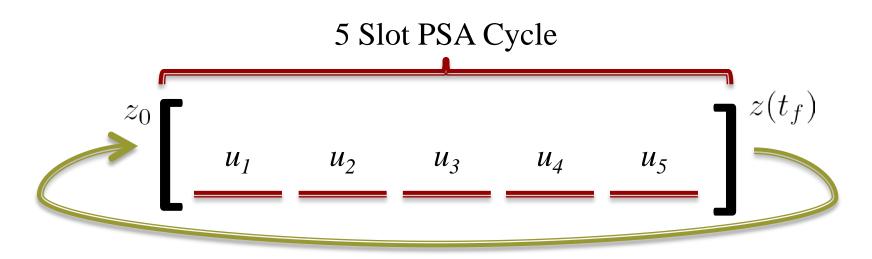
#### 2. Direct Substitution



Repeat direct substitution until  $|z_0 - z(t_f)| < \epsilon$ 

- + "natural"... mimics process start-up
- + simple implementation
- + medium size problem ( $z_0$  *not* optimization variables)
- not smooth  $\rightarrow$  derivative free optimization

### 3. Fixed Horizon



Repeat direct substitution a fixed number of times (M)

- + exact and smooth  $\rightarrow$  derivative based optimization algorithms
- + medium size problem ( $z_0$  *not* optimization variables)
- expensive objective function and constraint evaluations
- expensive derivatives (from adjoint sensitivity equations)

# Implementation Details

- IPOPT for derivative based formulations (1, 3)
  - First derivatives from sensitivity equations
  - Second derivatives approximated with LBFGS
- BOBYQA for direct substitution (2)
  - DFO code based on quadratic approximation to objective function
  - Accommodates variable bounds

Case Study 1

Approach	Obj. Func $kWh/tonne \ CO_2$	CPU Time/Iter h:mm:ss	Iter
Periodic Bnd. Cnd. (1)	89.63	0:08:49	187
Derivative Free $(2)$	146.42	0:04:46	566
Fixed Horizon $(3)$	98.46	0:20:41	397

- Common far starting point
- DFO approach terminates at a much poorer solution
   Local minima?
- Some challenges with gradient-based convergence
  - Terminate due to resource limits or integrator failure
  - Noisy first derivatives, approximate second derivatives

Case Study 2

#### **Part A: Two Components** $(CO_2, H_2)$

Approach	Obj. Func $kWh/tonne \ CO_2$	CPU Time/Iter h:mm:ss	Iter
Periodic Bnd. Cnd. (1)	83.51	0:10:37	82
Derivative Free $(2)$	114.21	0:03:28	1215
Fixed Horizon $(3)$	86.46	0:21:09	56

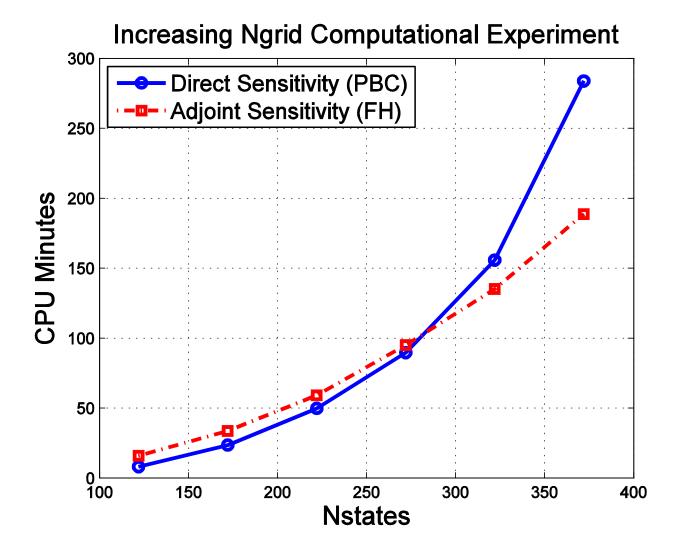
#### **Part B: Five Components** (CO<sub>2</sub>, H<sub>2</sub>, CH<sub>4</sub>, N<sub>2</sub>, CO)

Approach	Obj. Func $kWh/tonne \ CO_2$	$\begin{array}{c} \text{CPU Time/Iter} \\ h:mm:ss \end{array}$	Iter
Periodic Bnd. Cnd. (1)	89.37	1:00:15	470
Derivative Free $(2)$	109.04	0:11:29	2500 +
Fixed Horizon $(3)$	86.81	1:27:52	260

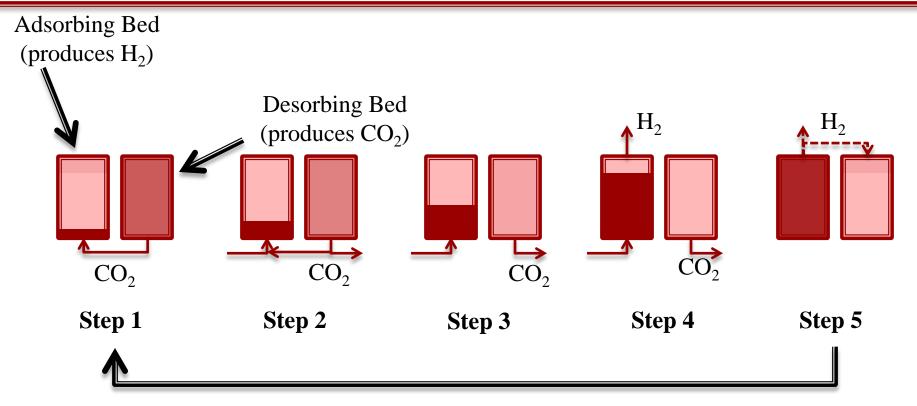
- Common near starting point
- DFO approach terminates at an infeasible solution

## Problem Complexity

Adjoint sensitivity computationally adventitious for large systems



Designed Cycle



Switch Beds and Repeat

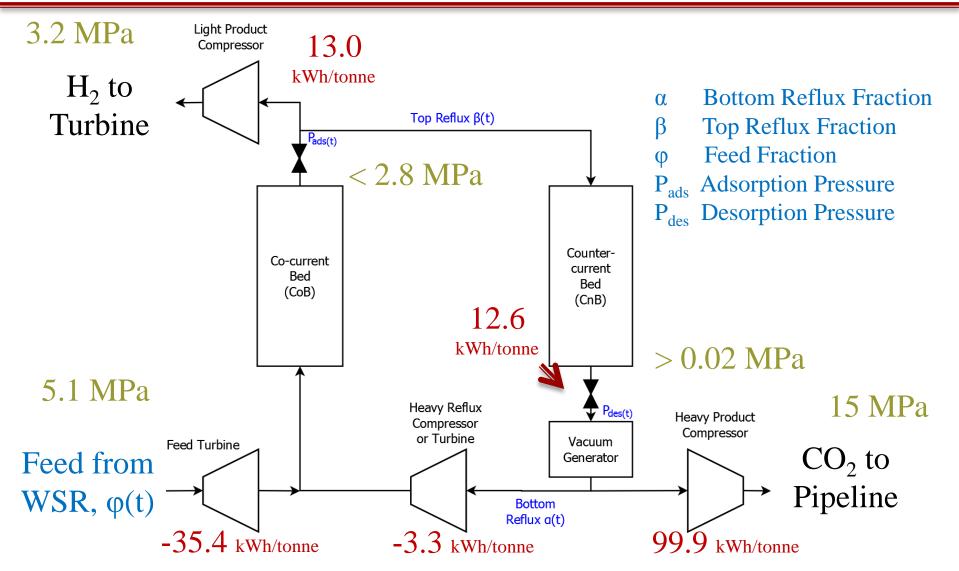
Best 5 Component **Solution** 





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# 86.8 kWh/tonne $CO_2$ captured



# Technology Comparison

#### Economic Metric: Cost of Electricity

IGCC <b>without</b>	IGCC with <b>Selexol</b>	IGCC with <b>PSA</b>
Carbon Capture*	Carbon Capture*	Carbon Capture
\$ 76 / MWh	\$ 106 / MWh	\$ 103 - 109 / MWh

#### Goal: \$ 83 / MWh

- Results are with activated carbon
- Future work: consider advanced sorbents

\*Cost and Performance Baseline for Fossil Energy Plants Vol 1: Bit. Coal and Nat. Gas to Elec., NETL (2010)

#### Conclusions

- Compared three PSA optimization formulation
- Developed novel application of adjoint sensitivity equations to PSA optimization
- Demonstrated potential cost competitiveness of PSA for H<sub>2</sub>-CO<sub>2</sub> separation in IGCC power plant with an *activated carbon sorbent*



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### Optimization Convergence

