

# Reliable Density-Functional-Theory Calculations of Adsorption in Nanoporous Materials

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AIChE Annual Meeting, Los Angeles, CA, Nov. 12–17, 2000  
Session 92 (Molecular Thermodynamics of Adsorption I):  
Paper 92g

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# Density Functional Theory

- Popular tool for modeling adsorption phenomena
- Basic idea: Model system free energy and entropy as functionals of density distribution  $\rho(r)$
- Lattice (discrete density distribution) or nonlattice models can be used
- Determine equilibrium density profile by solving appropriate minimization problem, generally by numerical solution of a nonlinear equation system for stationary points in the optimization problem
- This equation system may have multiple roots, especially in regions of phase transitions and hysteresis
- For reliable study of phase behavior using DFT, a solution technique is needed that can reliably find all roots of a nonlinear equation system

# Solution Methods

- Local methods with multiple initial guesses
  - Broyden (e.g., Neimark and Ravikovitch, 1998)
  - Successive substitution (e.g., Lastoskie *et al.*, 1993)
  - No guarantee that all solutions are found
- Path tracking approach (Aranovich and Donohue, 1998, 1999)
  - No guarantee that all solutions are found
- We propose here using an interval-Newton/generalized-bisection (IN/GB) approach
  - **Mathematical and computational guarantee that all solutions are found**

## IN/GB Approach

Problem: Solve  $f(\mathbf{x}) = 0$  for all roots in initial interval  $\mathbf{X}^{(0)}$

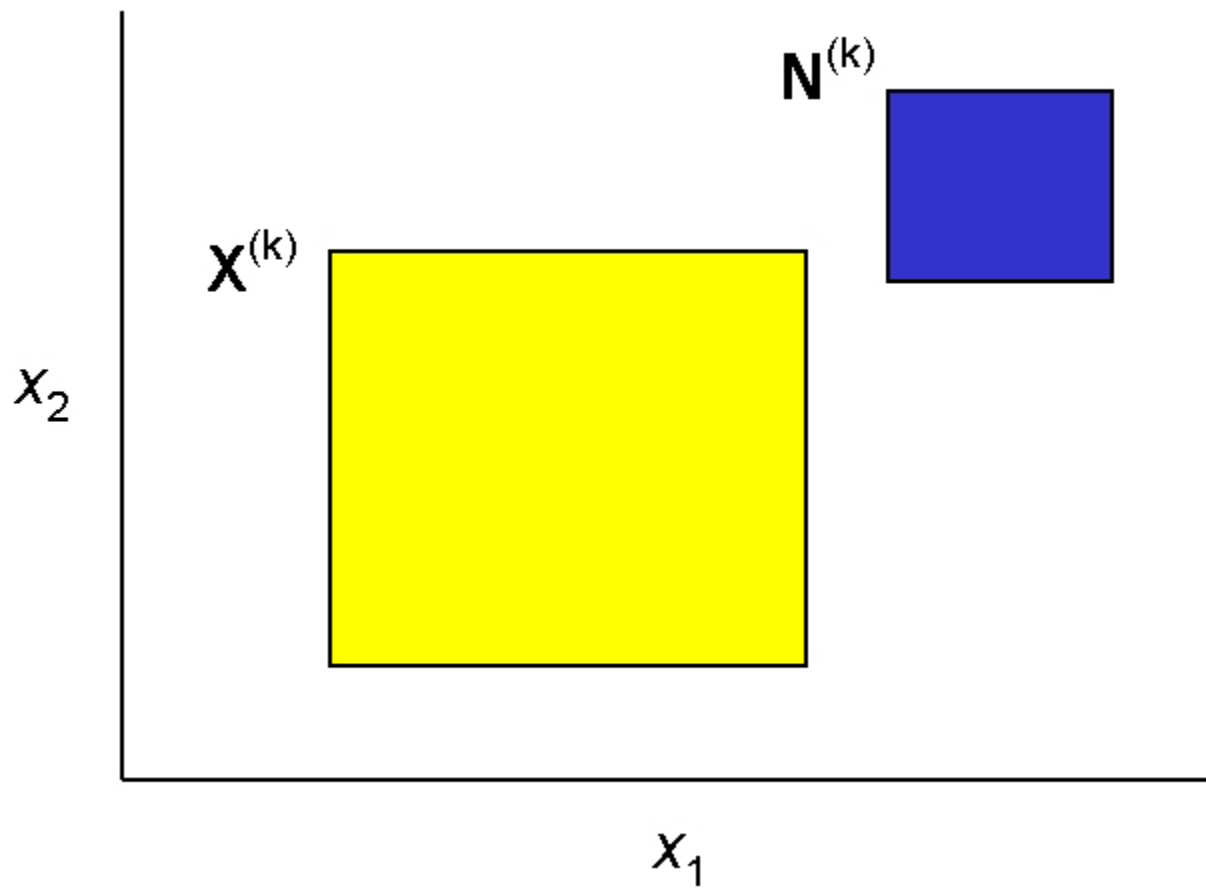
Basic iteration scheme: For a particular subinterval (box),  $\mathbf{X}^{(k)}$ , arising from some branching (bisection) scheme, perform root inclusion test:

- Compute the interval extension (bounds on range) of each function in the system
- If there is any range for which 0 is not an element, delete (prune) the box
- If 0 is an element of every range, then compute the *image*,  $\mathbf{N}^{(k)}$ , of the box by solving the interval Newton equation

$$F'(\mathbf{X}^{(k)})(\mathbf{N}^{(k)} - \mathbf{x}^{(k)}) = -\mathbf{f}(\mathbf{x}^{(k)})$$

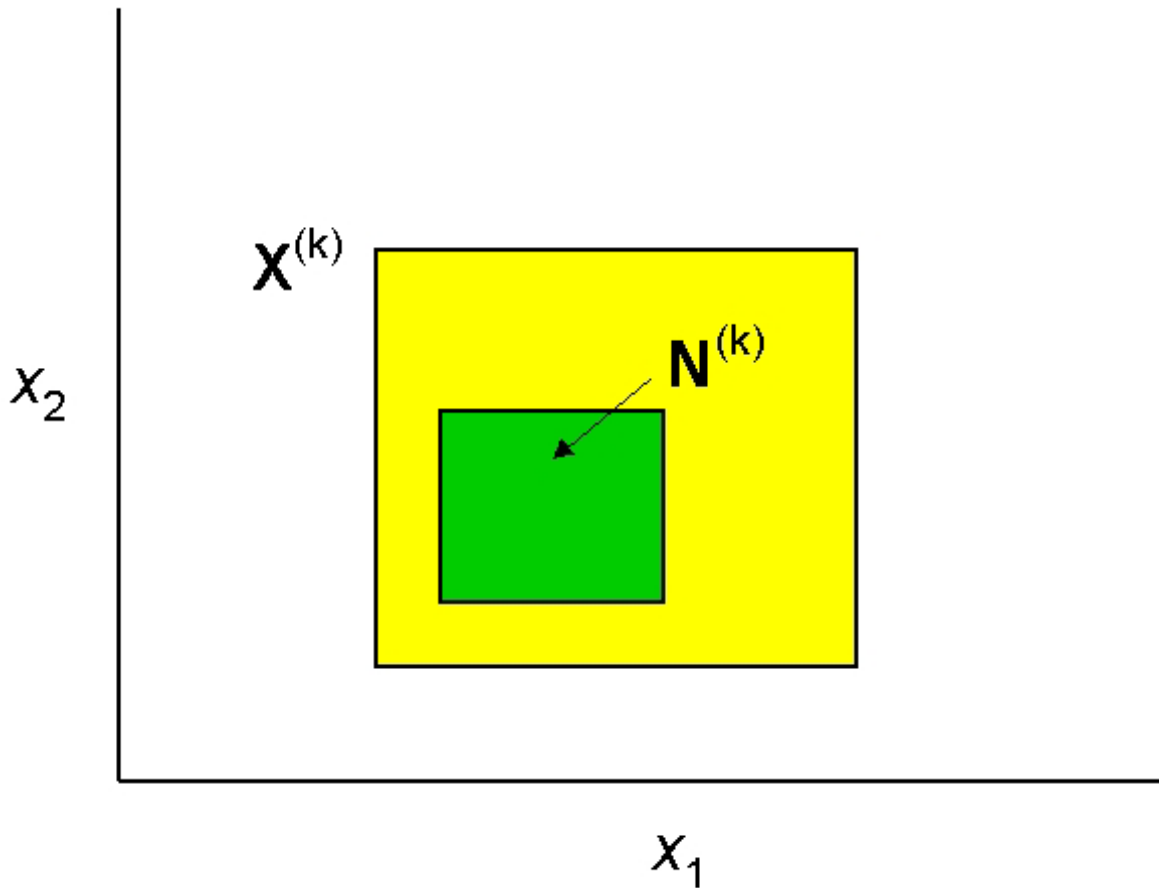
- $\mathbf{x}^{(k)}$  is some point in the interior of  $\mathbf{X}^{(k)}$
- $F'(\mathbf{X}^{(k)})$  is an interval extension of the Jacobian of  $\mathbf{f}(\mathbf{x})$  over the box  $\mathbf{X}^{(k)}$

# Interval Newton Method



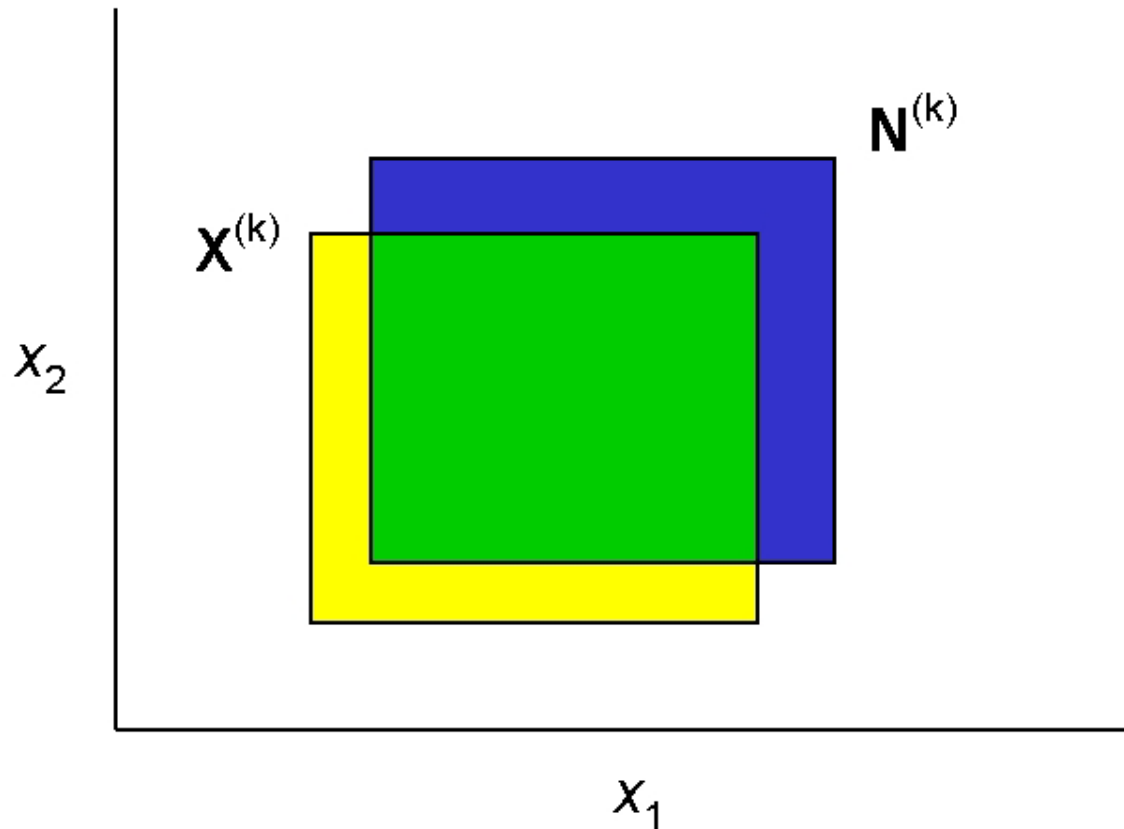
- There is no solution in  $\mathbf{X}^{(k)}$

# Interval Newton Method



- There is a *unique* solution in  $\mathbf{X}^{(k)}$
- This solution is in  $\mathbf{N}^{(k)}$
- Point Newton method will converge to solution

# Interval Newton Method



- Any solutions in  $\mathbf{X}^{(k)}$  are in intersection of  $\mathbf{X}^{(k)}$  and  $\mathbf{N}^{(k)}$
- If intersection is sufficiently small, repeat root inclusion test
- Otherwise, bisect the intersection and apply root inclusion test to each resulting subinterval

## Example Problems

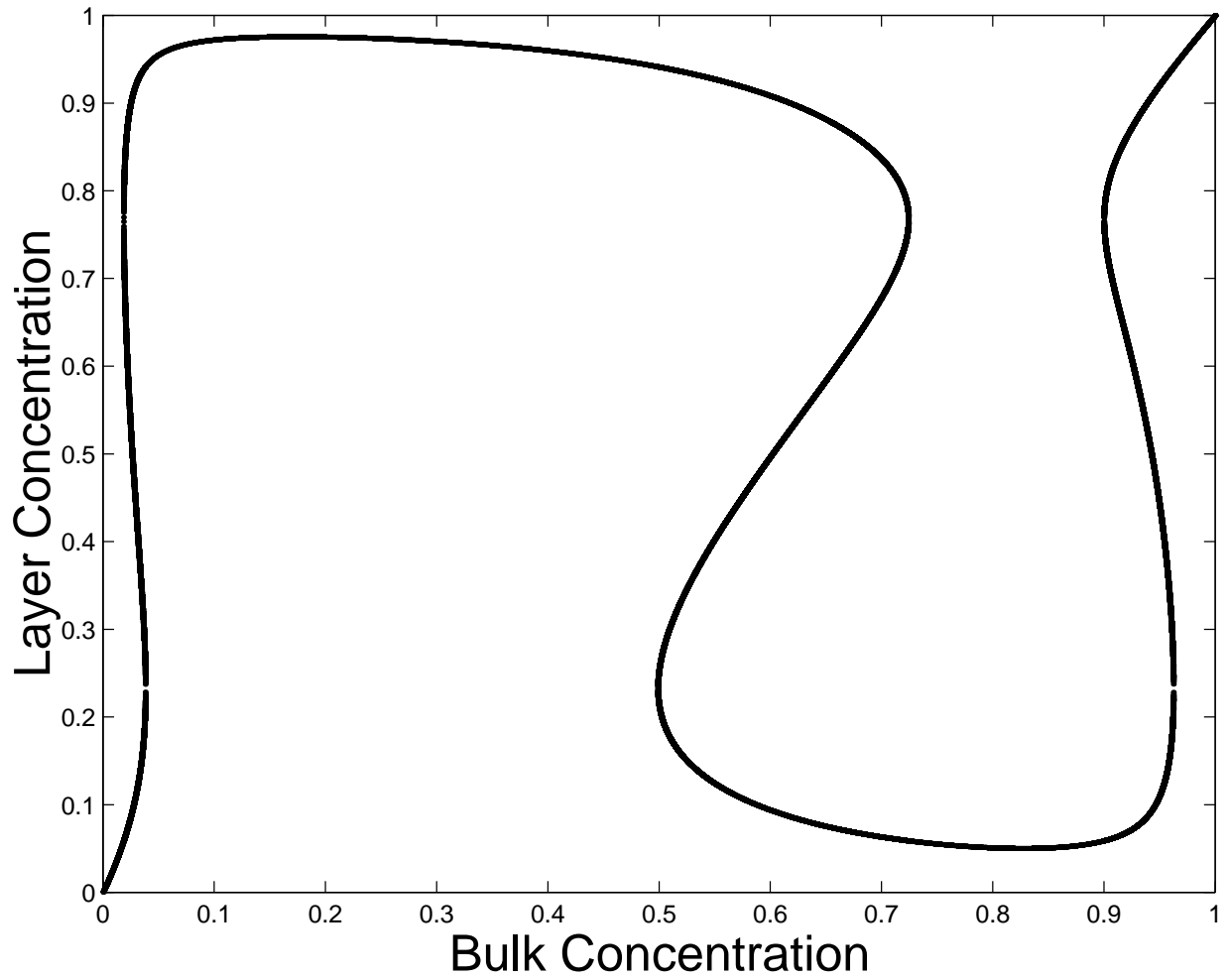
- Solve the lattice-DFT model of Aranovich and Donohue (1999) for phase behavior in nanoscale pores
- Single component systems containing from  $N = 2$  to  $N = 20$  layers (1 to 10 independent variables) were considered (same problems solved by Aranovich and Donohue)
- For each system, the equation system was solved for the density profile (layer concentrations)  $\rho_A(i)$ ,  $i = 1, \dots, N$  for many values of the bulk concentration  $\rho_A$
- An initial interval of  $[0,1]$  was used for each variable  $\rho_A(i)$
- All computations were done using a Sun Ultra 10/440 workstation



# Example 1

$$N = 2$$

$$z_1 = 1, z_2 = 3, \epsilon_{AA}/kT = -1.4, \epsilon_{AS}/kT = -1.0$$

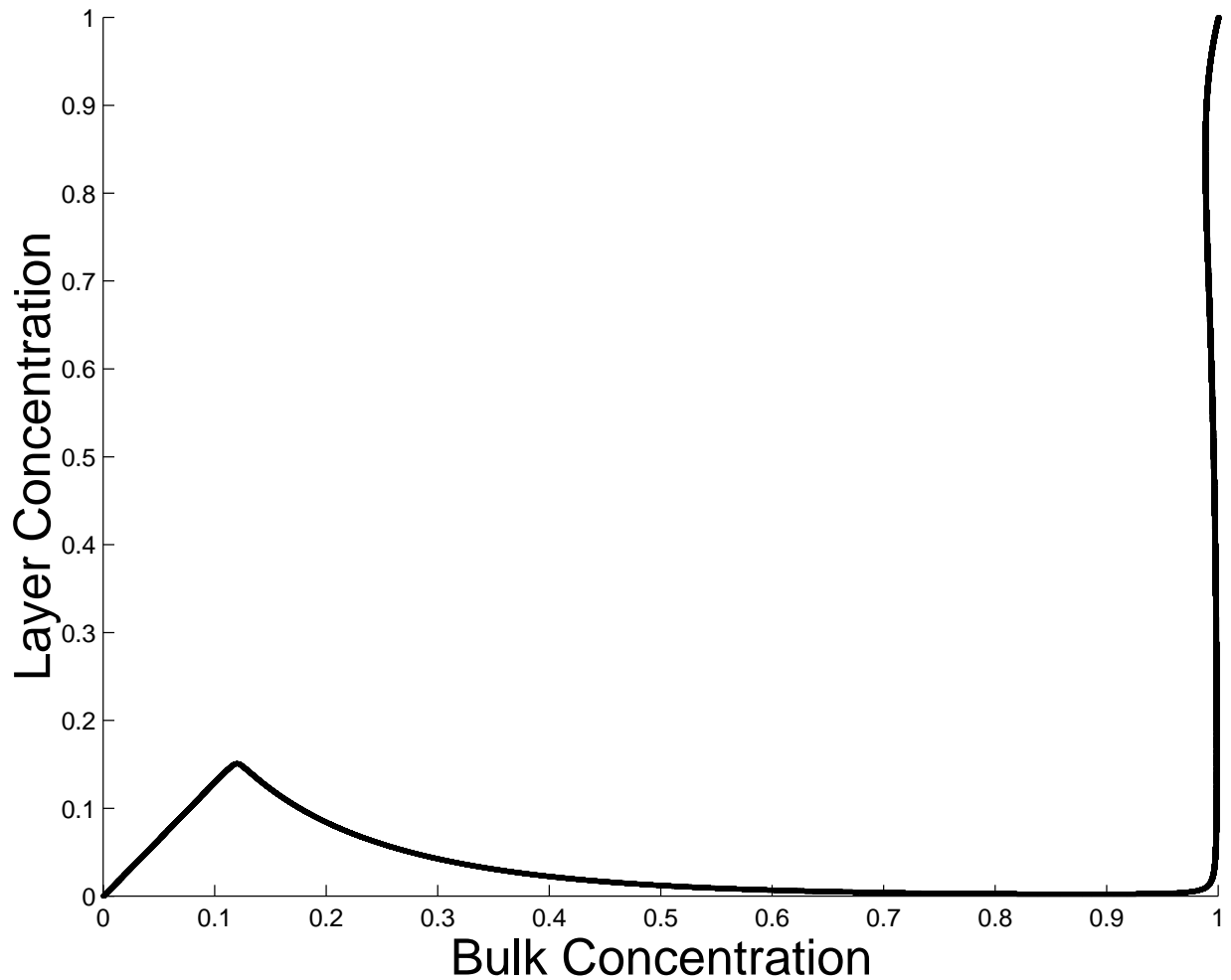


## Example 2

$$N = 2$$

$$z_1 = 1, z_2 = 3, \epsilon_{AA}/kT = -1.9, \epsilon_{AS}/kT = -.258$$

Result using path tracking method of Aranovich and Donohue (1998).

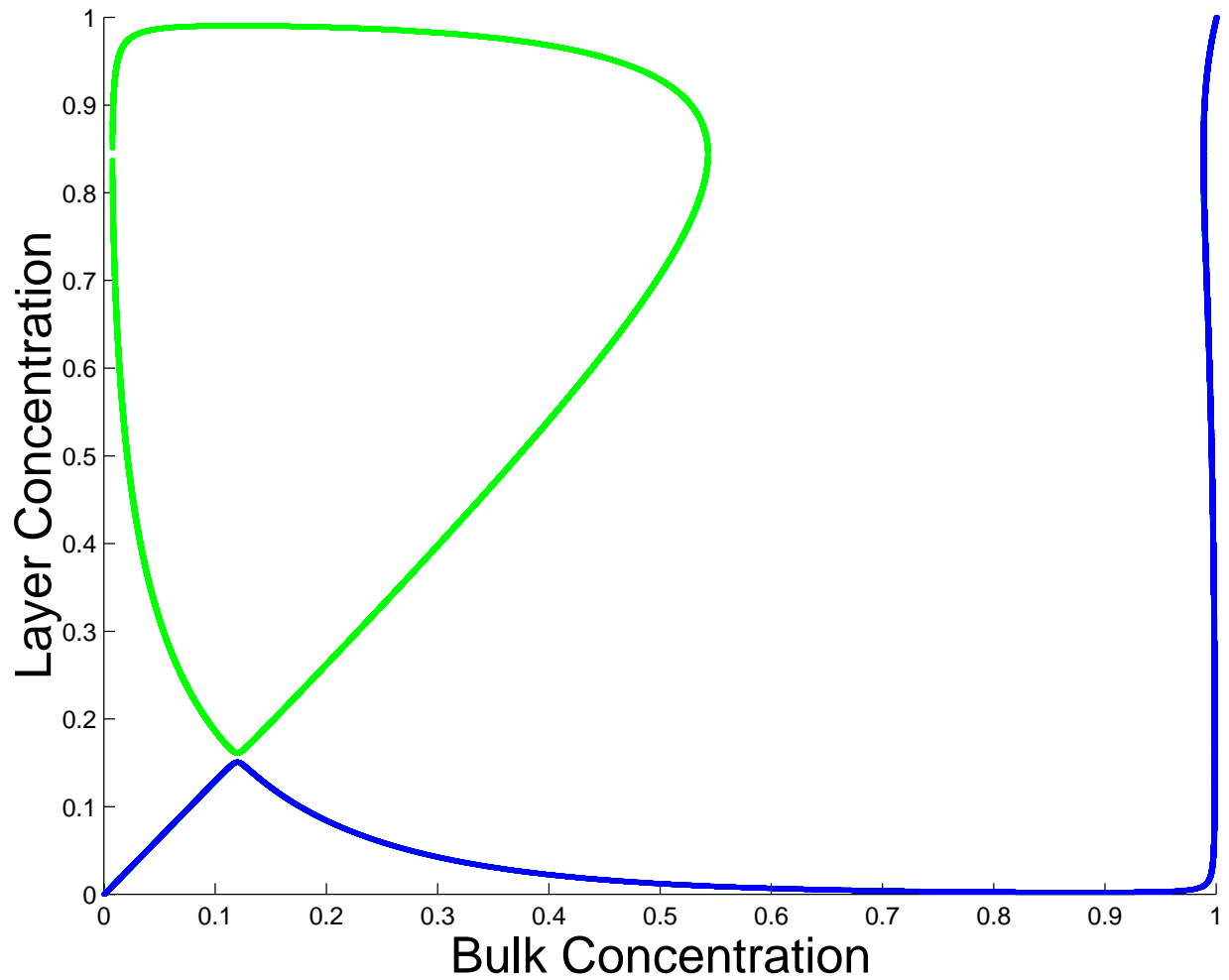


## Example 2 (cont'd)

$$N = 2$$

$$z_1 = 1, z_2 = 3, \epsilon_{AA}/kT = -1.9, \epsilon_{AS}/kT = -.258$$

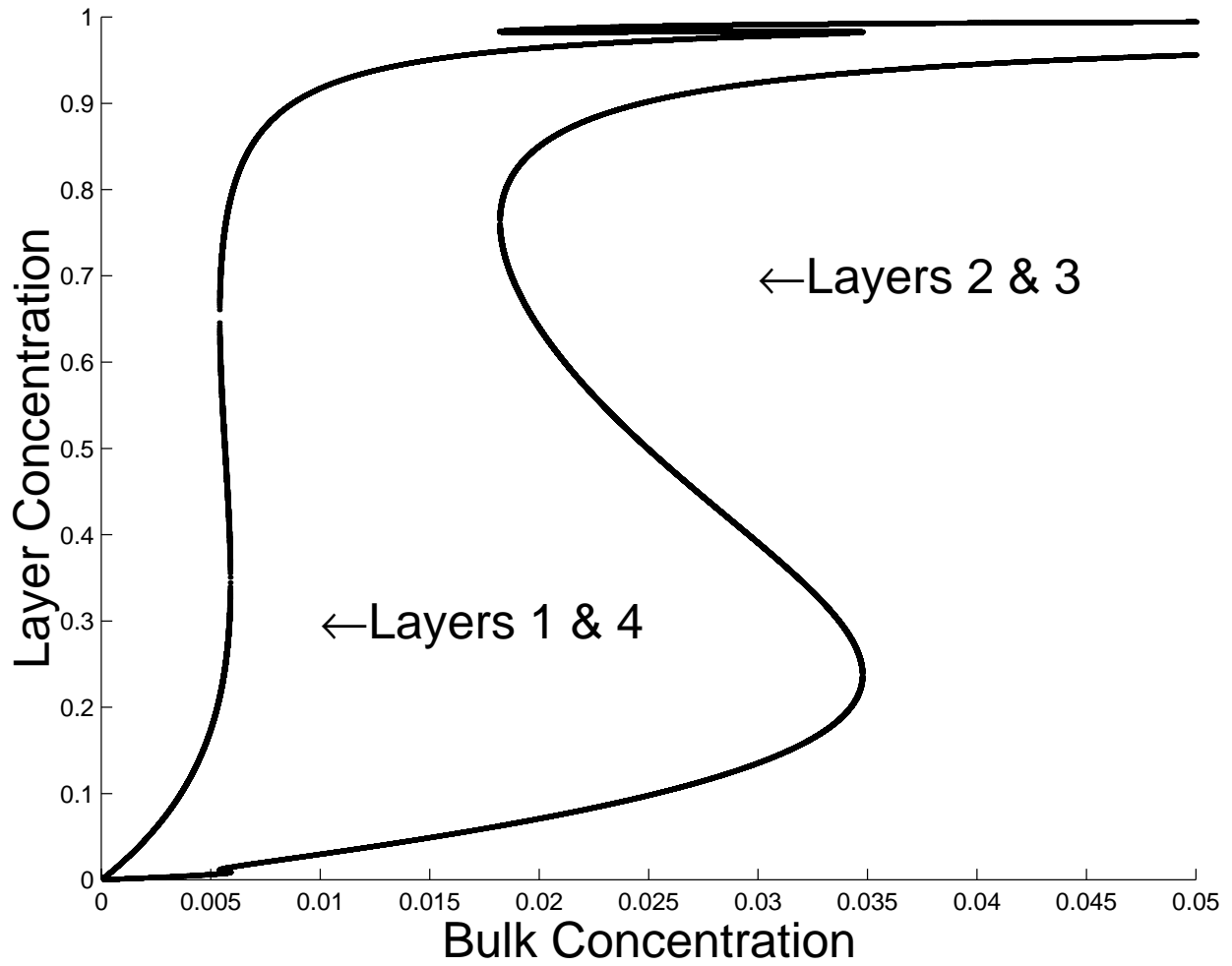
Result using IN/GB approach.



# Example 3

$$N = 4$$

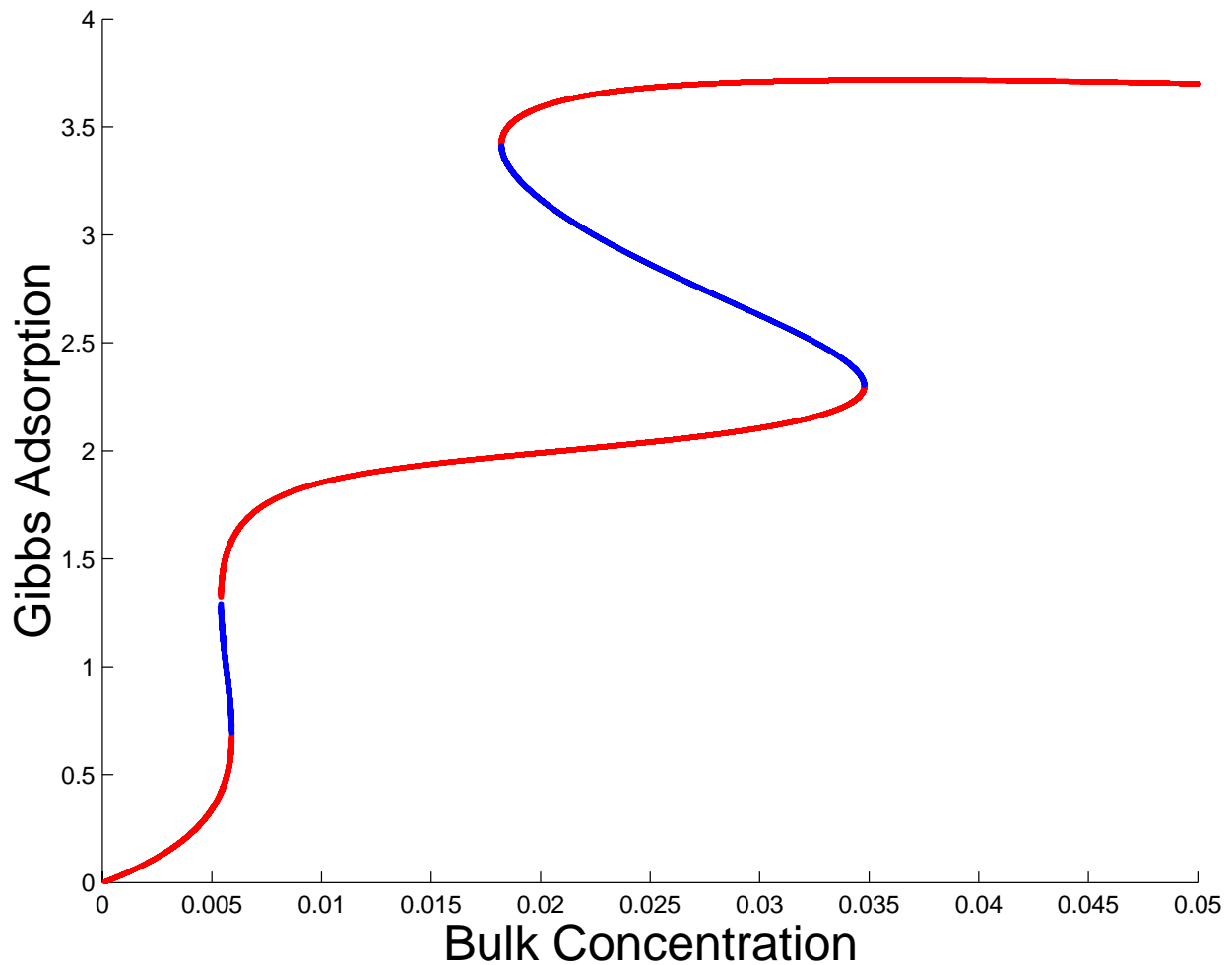
$$z_1 = 1, z_2 = 4, \epsilon_{AA}/kT = -1.1, \epsilon_{AS}/kT = -3.0$$



## Example 3 (cont'd)

Plot of Gibbs adsorption  $\Gamma = \sum_{i=1}^N [\rho_A(i) - \rho_A]$

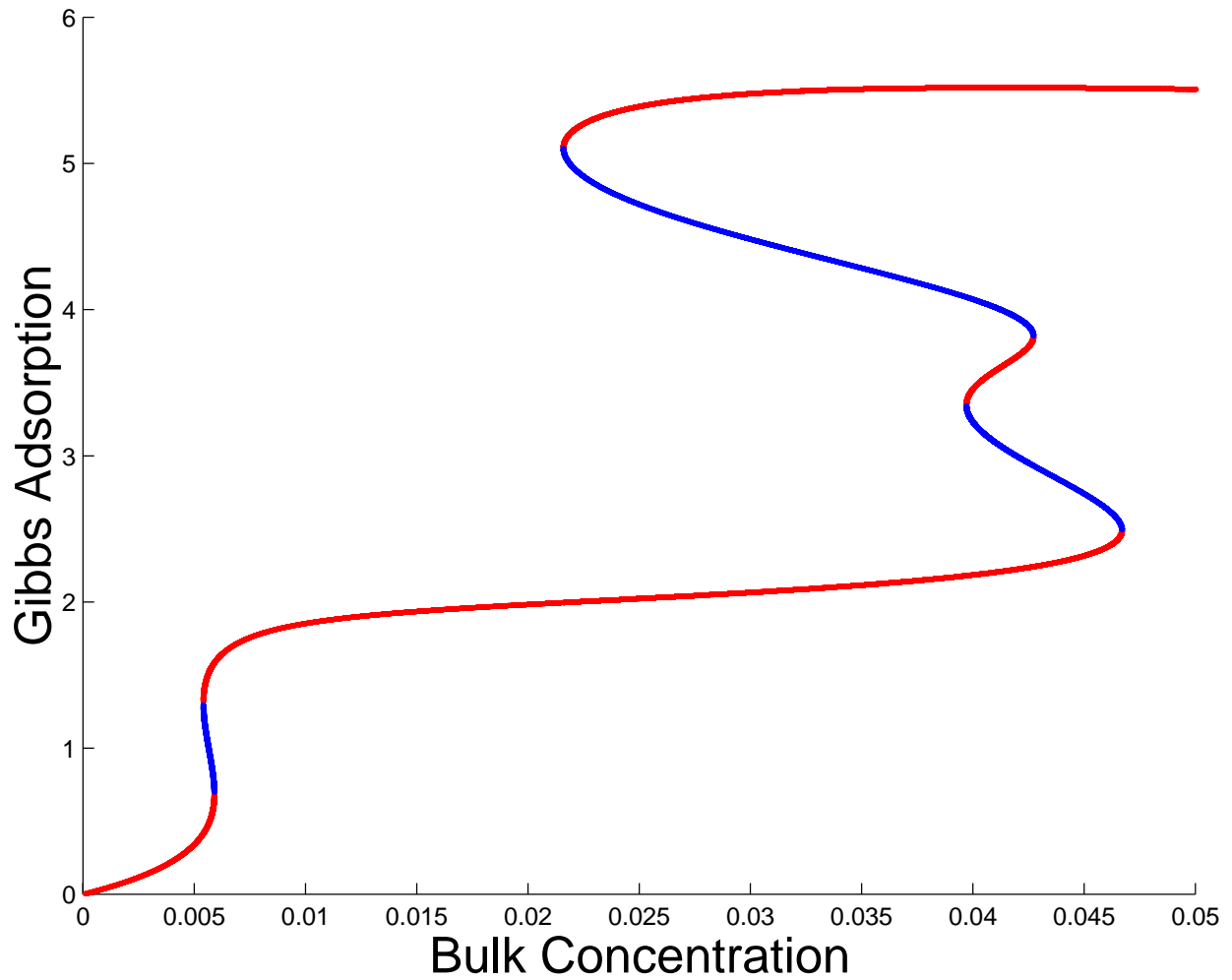
**Red**  $\rightarrow$  local (or global) minimum in optimization problem (stable or metastable state)



## Example 4

$$N = 6$$

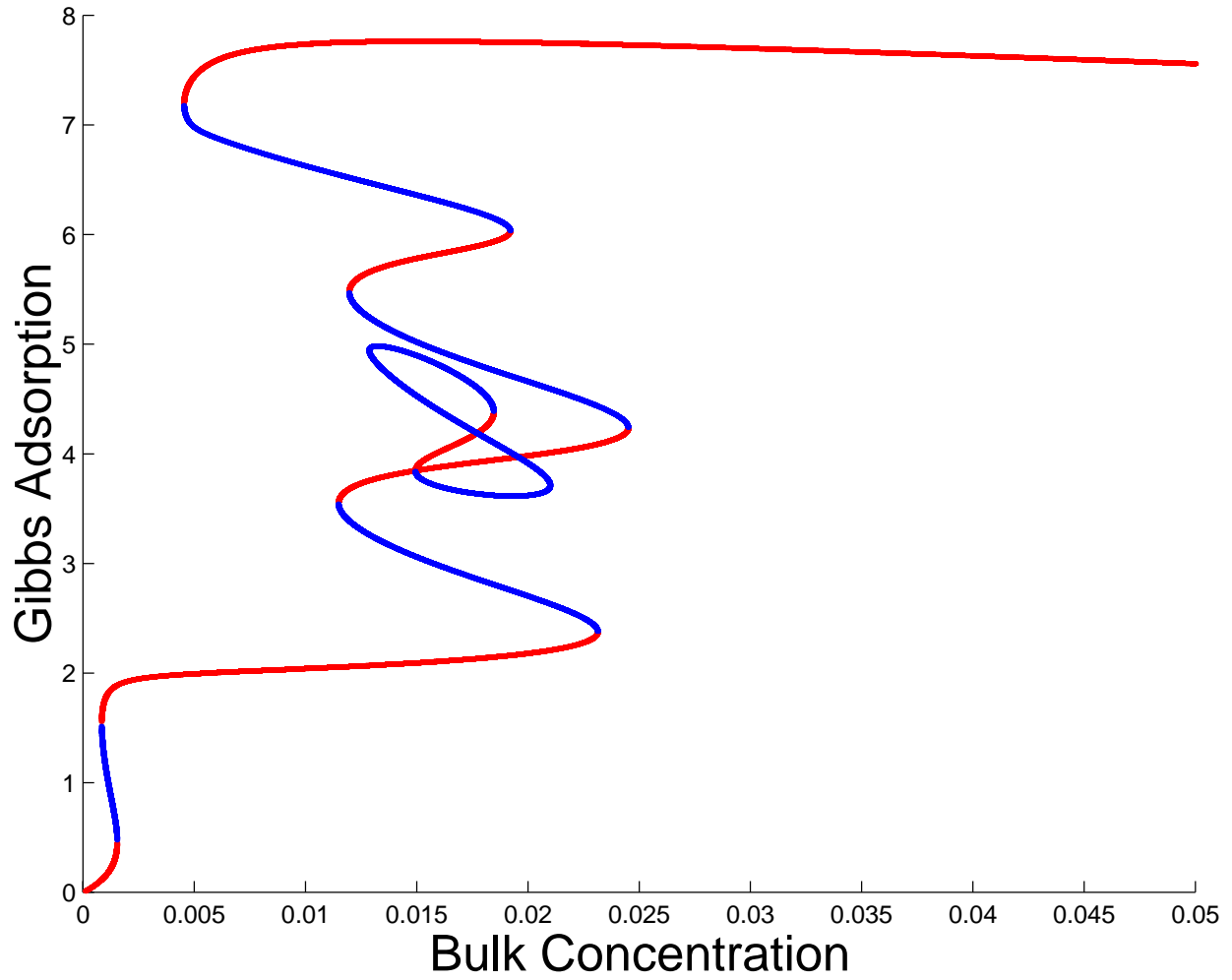
$$z_1 = 1, z_2 = 4, \epsilon_{AA}/kT = -1.1, \epsilon_{AS}/kT = -3.0$$



# Example 5

$$N = 8$$

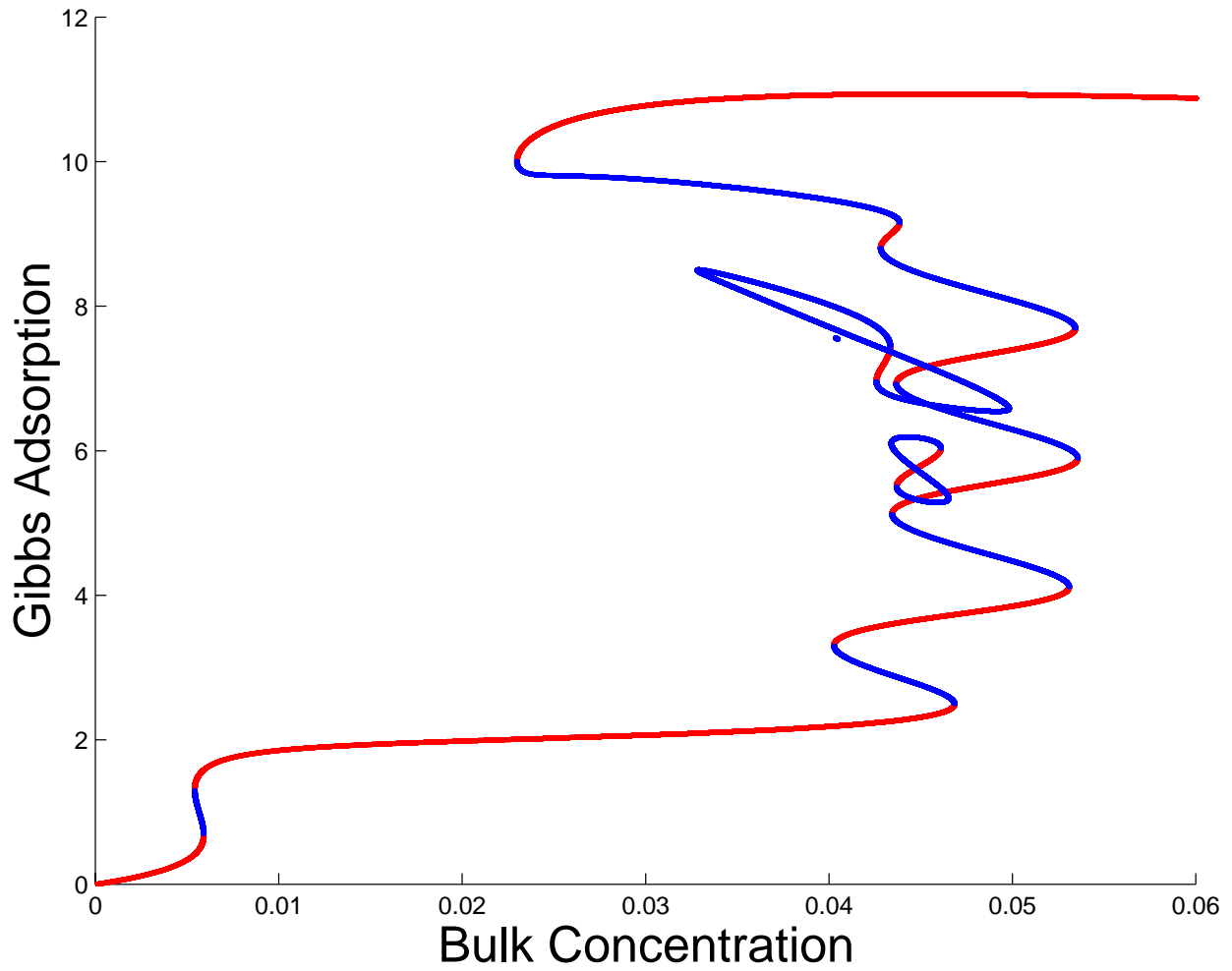
$$z_1 = 1, z_2 = 4, \epsilon_{AA}/kT = -1.4, \epsilon_{AS}/kT = -4.0$$



## Example 6

$$N = 12$$

$$z_1 = 1, z_2 = 4, \epsilon_{AA}/kT = -1.1, \epsilon_{AS}/kT = -3.0$$

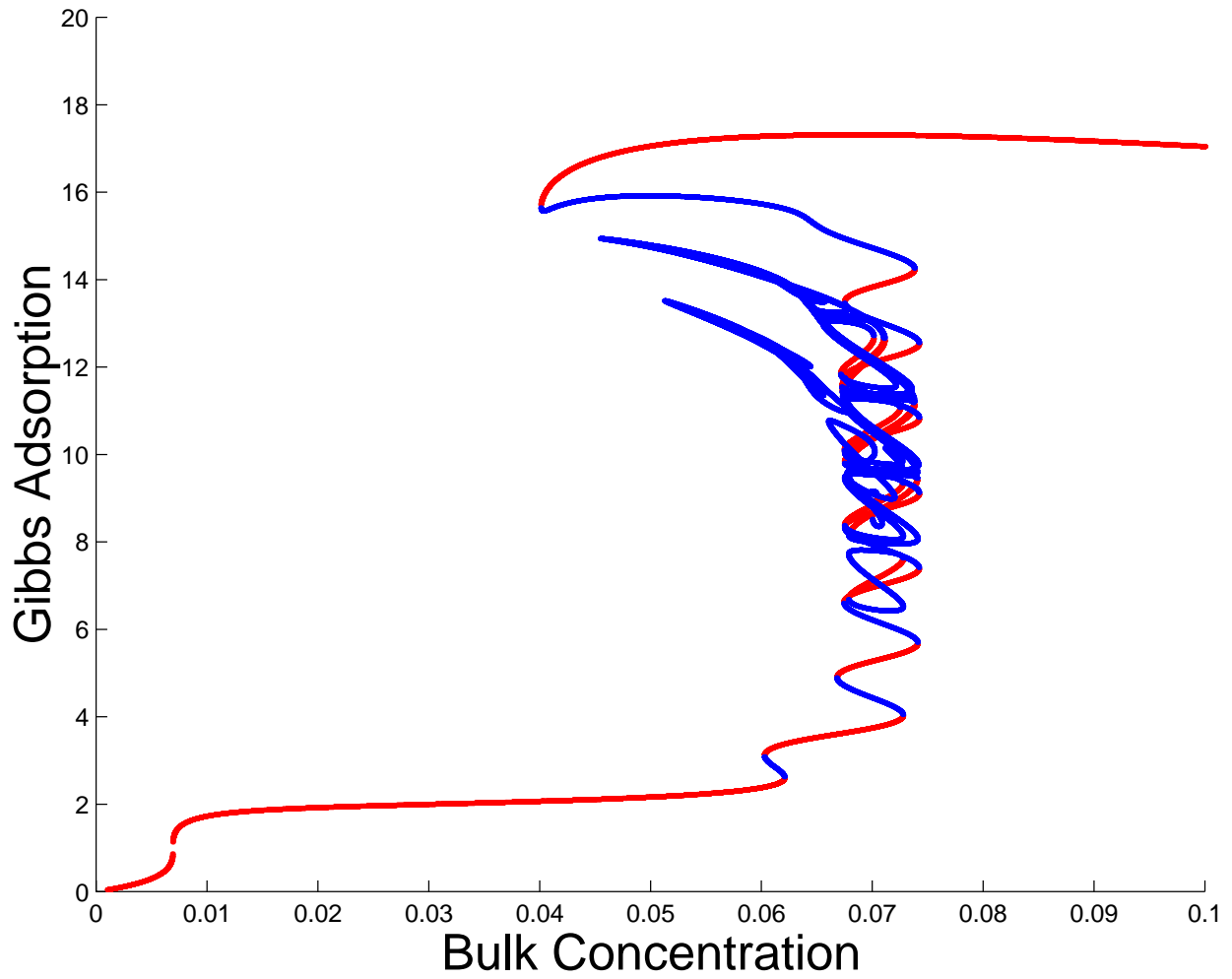




# Example 7

$$N = 20$$

$$z_1 = 1, z_2 = 4, \epsilon_{AA}/kT = -1.0, \epsilon_{AS}/kT = -3.0$$



# Computational Performance

Layers ( $N$ )	Variables ( $N/2$ )	Average Solution Time (ms)
2	1	1
4	2	2
6	3	3
8	4	6
12	6	19
20	10	316

- Average solution time is the average CPU time required to obtain all solutions of the nonlinear equation system for a particular given value of the bulk concentration
- Times are on a Sun Ultra 10/440 workstation

## Concluding Remarks

- Interval Newton approach provides an efficient and completely reliable method for solving DFT models of adsorption in nanoscale pores
- Other types of problems solved using IN/GB
  - Fluid phase stability and equilibrium (e.g. Hua *et al.*, 1998)
  - Location of azeotropes (Maier *et al.*, 1998, 1999, 2000)
  - Location of mixture critical points (Stradi *et al.*, 2000)
  - Solid-fluid equilibrium (Xu *et al.*, 2000)
  - Parameter estimation (Gau and Stadtherr, 1999, 2000)
  - General process modeling problems—up to 163 equations (Schnepper and Stadtherr, 1996)
- Continuing advances in hardware and software (e.g., compiler support for interval arithmetic from Sun Microsystems) will make this approach even more attractive

## Acknowledgments

- ACS PRF 30421-AC9 and 35979-AC9
- NSF EEC97-00537-CRCD
- EPA R826-734-01-0

For more information:

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- See also  
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