

# MONTE CARLO METHODS FOR ESTIMATING INTERFACIAL FREE ENERGIES AND LINE TENSIONS

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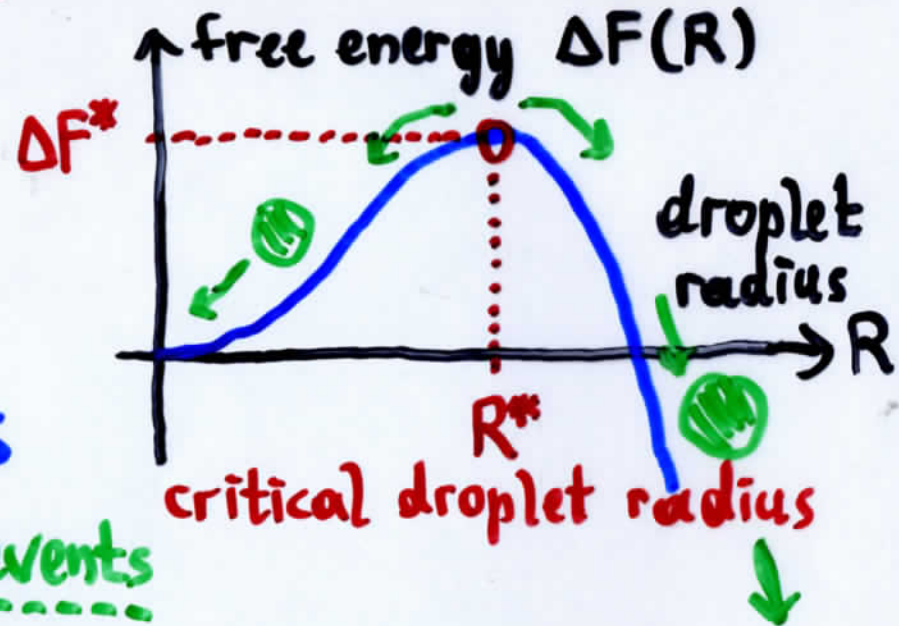


# HOMOGENEOUS VERSUS HETEROGENEOUS NUCLEATION

## homogeneous nucleation:

a "droplet" of the new (stable) phase forms from the old (metastable) phase by SPONTANEOUS THERMAL FLUCTUATIONS

- high free energy barrier  $\Delta F^* \Rightarrow$  rare events
- $R^*$  nanoscopic: direct observation DIFFICULT



## heterogeneous nucleation

e.g. condensation of a liquid at a wall under INCOMPLETE WETTING conditions

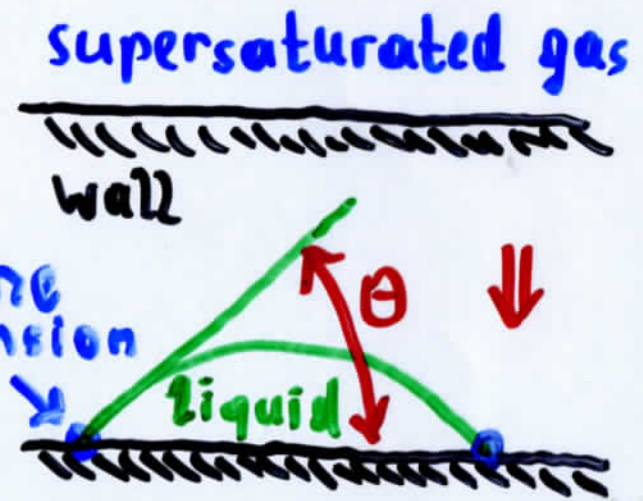
$$\gamma_{wg} - \gamma_{wl} = \gamma_{gl} \cos \theta$$

- 3 interface tensions
- lower free energy barrier

$$\Delta F_{het}^* = \Delta F_{hom}^* f(\theta)$$

$\theta =$  contact angle  
YOUNG (1805)

? line tension



$$f(\theta) = (2 + \cos \theta)(1 - \cos \theta)^2 / 4$$



# CLASSICAL NUCLEATION THEORY

- estimate free energy barrier  $\Delta F^*$  to form CRITICAL DROPLET (radius  $R^*$ )

- spherical droplets

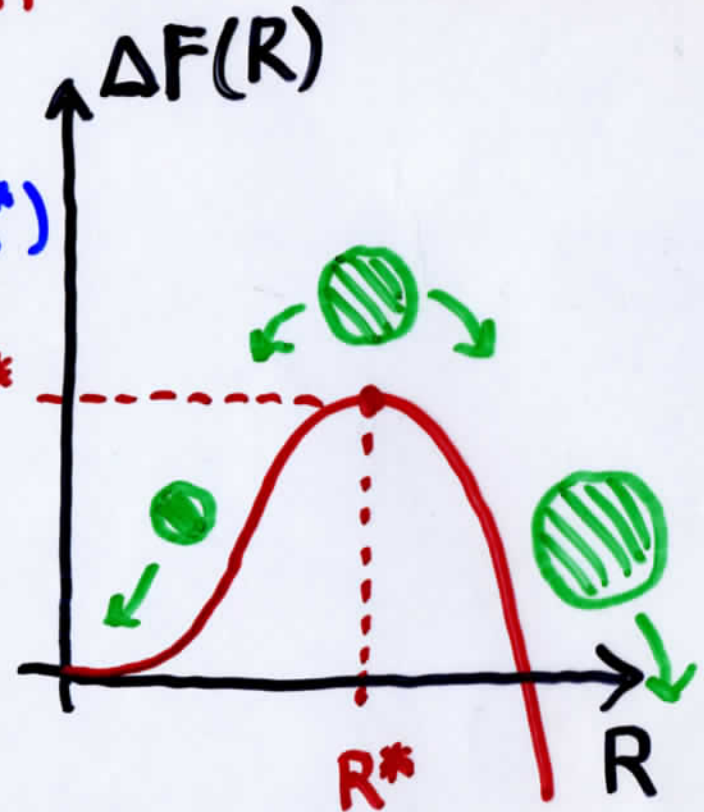
- macroscopic description: split  $\Delta F(R)$  in BULK and SURFACE terms

$$\Delta F(R) = \Delta g \cdot 4\pi R^3/3 + \gamma_{v2} \cdot 4\pi R^2$$

$$\Delta g = -(\rho_l - \rho_v) \delta\mu$$

SAME interfacial free energy as for a FLAT PLANAR INTERFACE

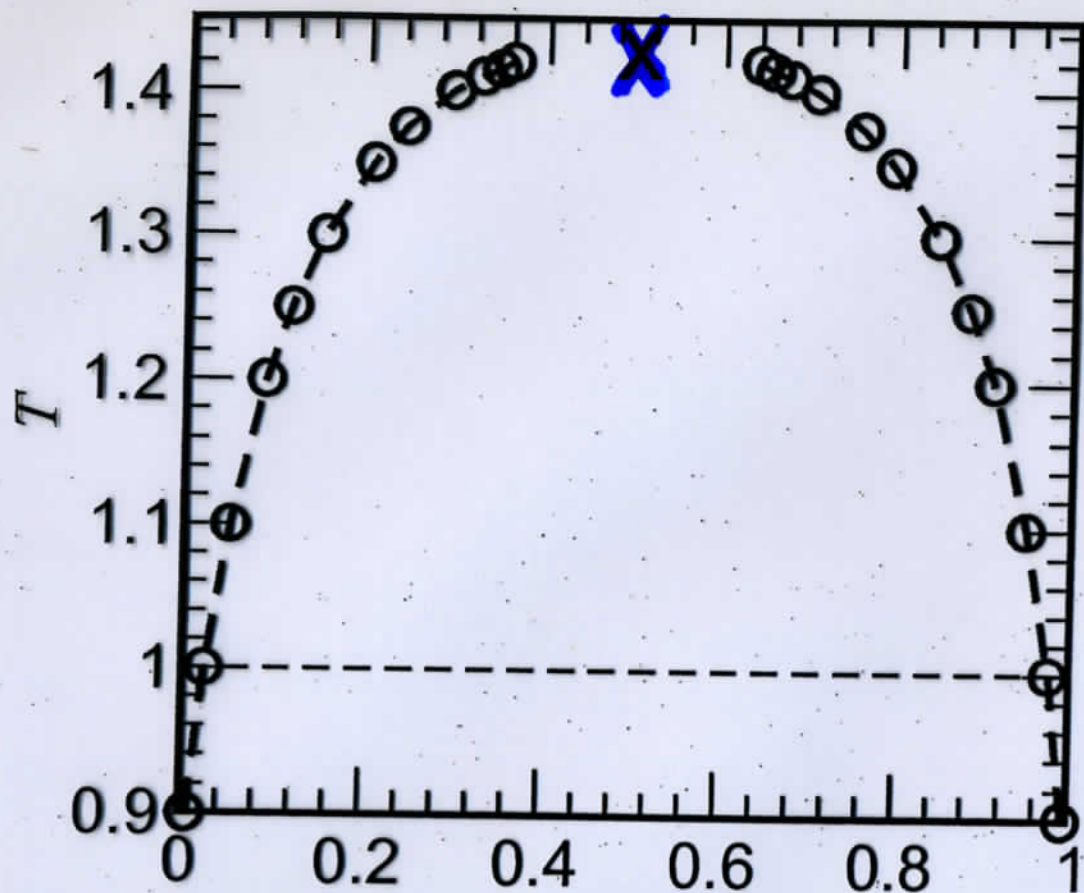
? Tolman correction



(near coexistence curve)  $\delta\mu = \mu - \mu_{\text{coex}}$   
chemical potential difference

$$\left. \frac{\partial(\Delta F(R))}{\partial R} \right|_{R^*} = 0 \Rightarrow R^* = \frac{2\gamma_{v2}}{(\rho_l - \rho_v)\delta\mu}, \quad \Delta F^* = \frac{16\pi}{3} \frac{\gamma_{v2}^3}{[(\rho_l - \rho_v)\delta\mu]^2}$$

nucleation rate  $J^*$ : # of crit. nuclei/cm<sup>3</sup>s :  $J = \omega^* \exp[-\Delta F^*/k_B T]$



concentration  $x_A = N_A / (N_A + N_B)$

energy parameters:  $\epsilon_{AA} = \epsilon_{BB} = \epsilon = 1$ ,  $\epsilon_{AB} = \frac{1}{2}$

$T_c = 1.4230 \pm 0.0005$   
(finite size scaling)

$\phi_{LJ}(r) = 4 \epsilon_{\alpha\beta} \left[ \left( \frac{\sigma_{\alpha\beta}}{r} \right)^{12} - \left( \frac{\sigma_{\alpha\beta}}{r} \right)^6 \right]$   
truncated + shifted at  $r_c = 2.5\sigma$

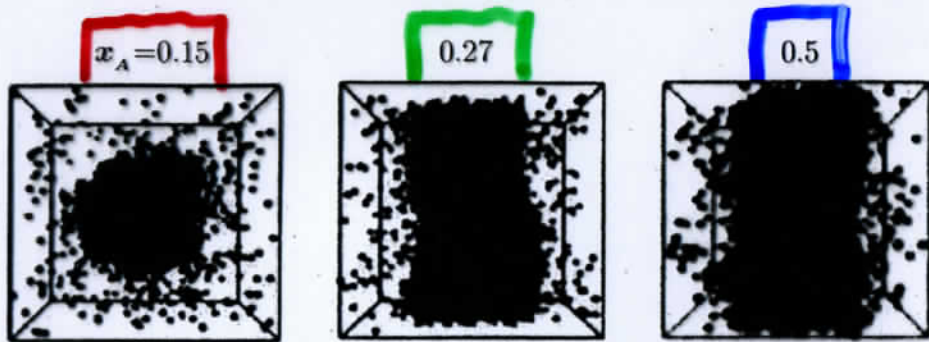
symmetrical binary  
Lennard-Jones  
mixture

symmetric around  $x_A^c = \frac{1}{2}$

density  $\rho^* = \rho \sigma^3 = 1$

LJ diameter  $\sigma_{AA} = \sigma_{BB} = \sigma_{AB} = \sigma = 1$





$L \times L \times L$  cubic simulation box + periodic boundary conditions

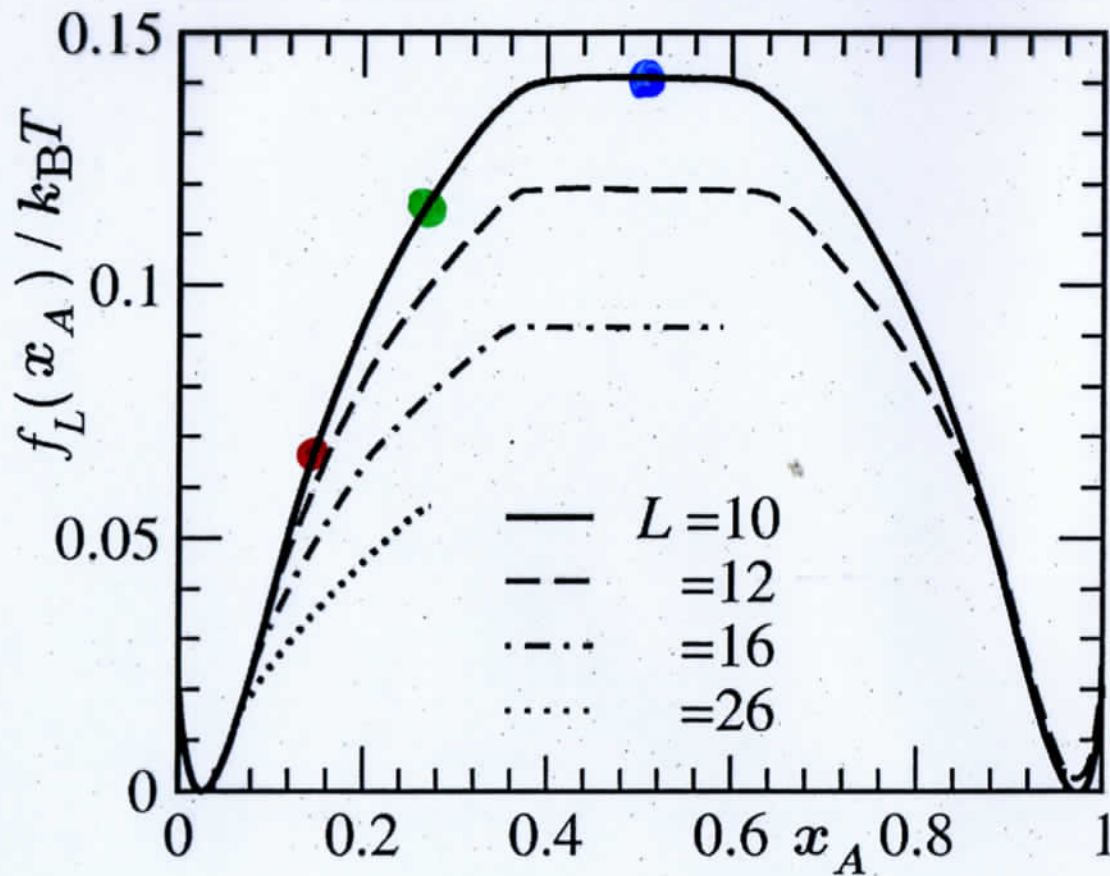
effective free energy

$$f_L(x_A, T) = -\frac{k_B T}{V} \ln \frac{P(x_A)}{P(x_A^{cl})}$$

$$V = L^3$$

$P(x_A)$  = probability to observe  $x_A$  in the semi-grandcanonical  $\Delta\mu NVT$ -ensemble

successive UMBRELLA SAMPLING



THIRD EDITION

Landau & Binder

A Guide to Monte-Carlo Simulations in Statistical Physics

# A Guide to Monte-Carlo Simulations in Statistical Physics

David P. Landau & Kurt Binder

Dealing with all aspects of Monte-Carlo simulation of complex physical systems encountered in condensed-matter physics and statistical mechanics, this book provides an introduction to computer simulations in physics.

This third edition contains extensive new material describing numerous powerful new algorithms that have appeared since the previous edition. It highlights recent technical advances and key applications that these algorithms now make possible. With several new sections and a new chapter on the use of Monte-Carlo simulations of biological molecules, this edition expands the discussion of Monte-Carlo at the periphery of physics and beyond.

Throughout the book there are many applications, examples, recipes, case studies, and exercises to help the reader understand the material. It is ideal for graduate students and researchers, both in academia and industry, who want to learn techniques that have become a third tool of physical science, complementing experiment and analytical theory.

David P. Landau is the Distinguished Research Professor of Physics and founding Director of the Center for Simulational Physics at the University of Georgia.

Kurt Binder is Professor of Theoretical Physics at the Institute für Physik, Johannes-Gutenberg-Universität Mainz, Germany.

From the first edition:

"This book will serve as a useful introduction to those entering the field, while for those already versed in the subject it provides a timely survey of what has been achieved."

D. C. Rapaport, *Journal of Statistical Physics*

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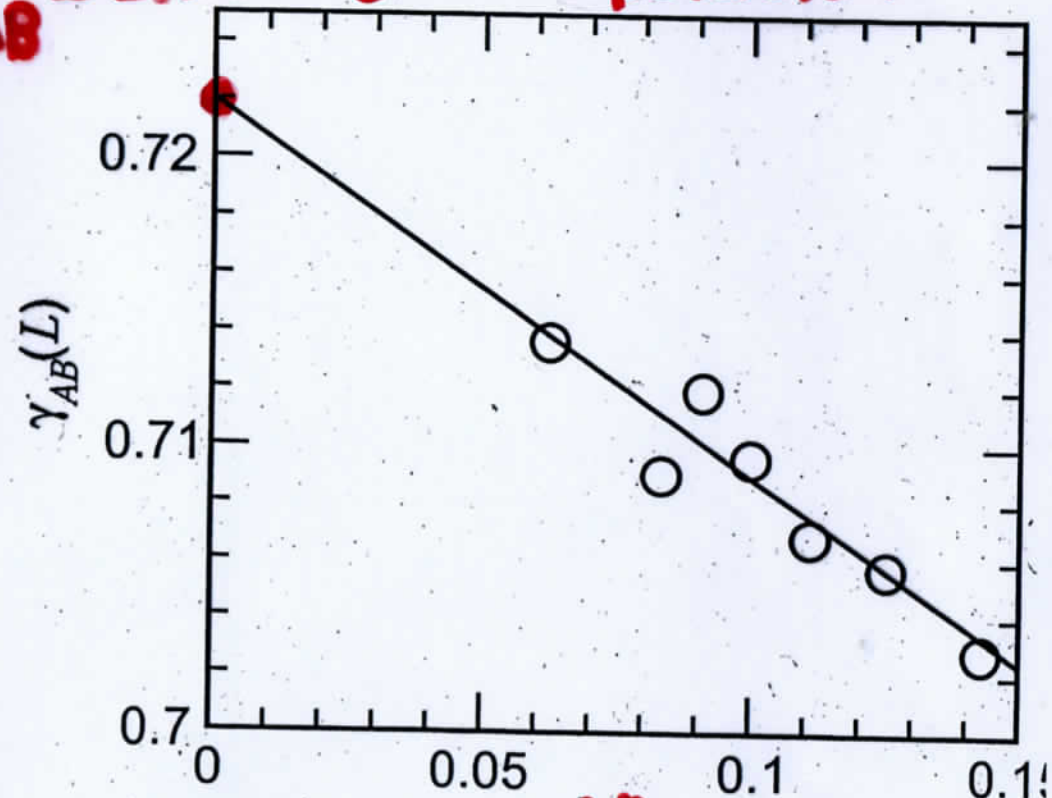
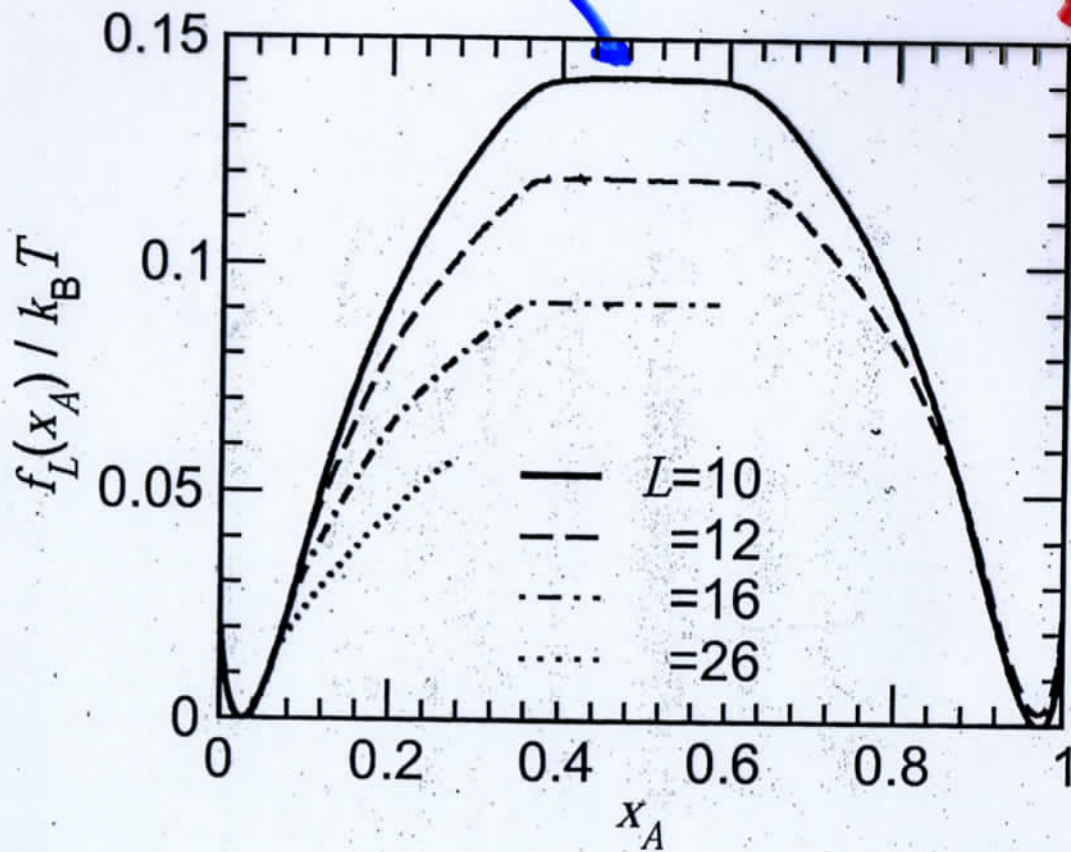
CAMBRIDGE



# Estimation of the interfacial tension of flat INTERFACES (K.B., PR A 25, 1699 (1982))

"hump": SLAB configuration: 2 interfaces of area  $L^2$

$\gamma_{AB} = 0.722$  (extrapolation)



$\Rightarrow$  free energy density  $f_L(x_A \approx 0.5) = 2 \gamma_{AB}(L) / L$

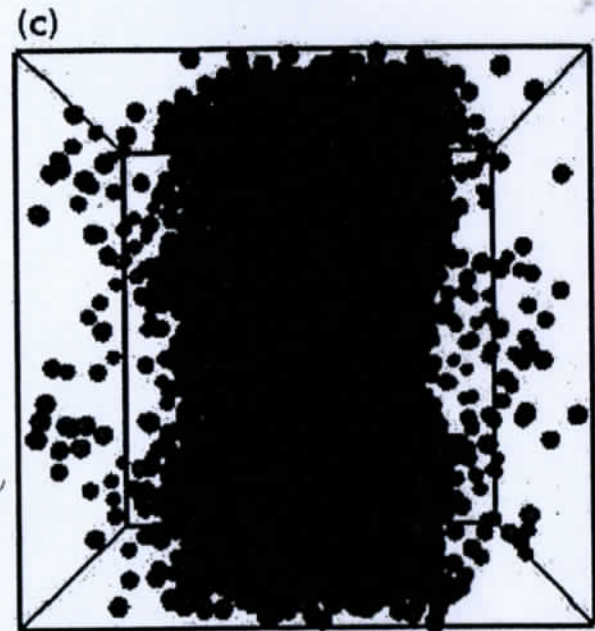
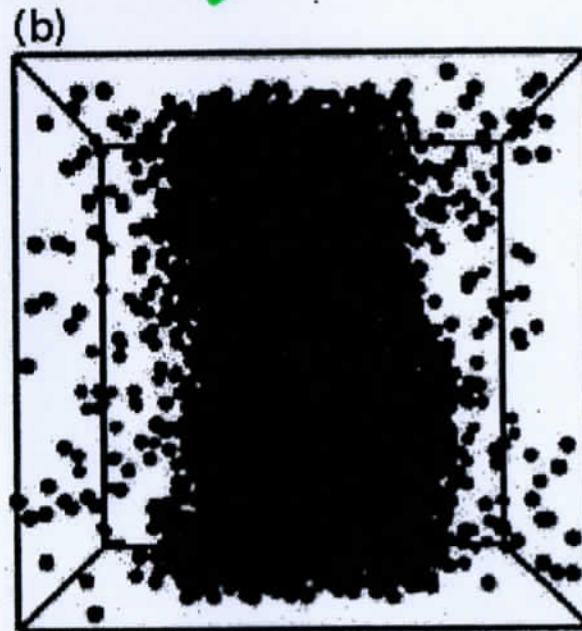
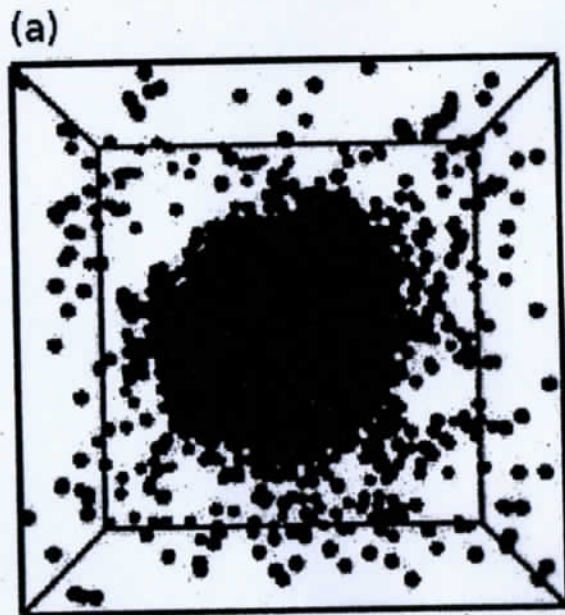
$\gamma_{AB}(L)$  size-dependent (capillary waves constrained, etc.)

also the ascending/descending parts of the "free energy hump" are useful  $\Rightarrow$  information on CURVATURE DEPENDENCE of SURFACE TENSION !

droplet

cylinder

slab

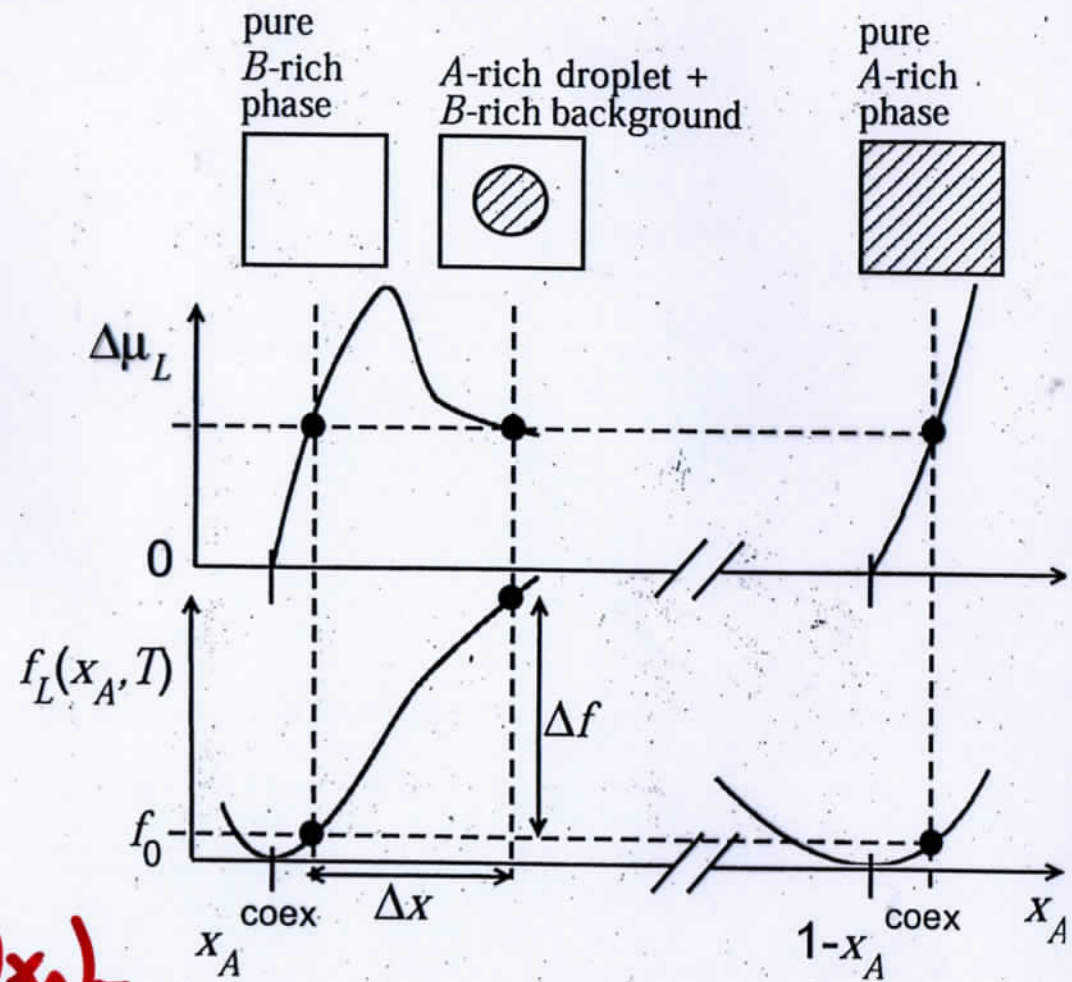
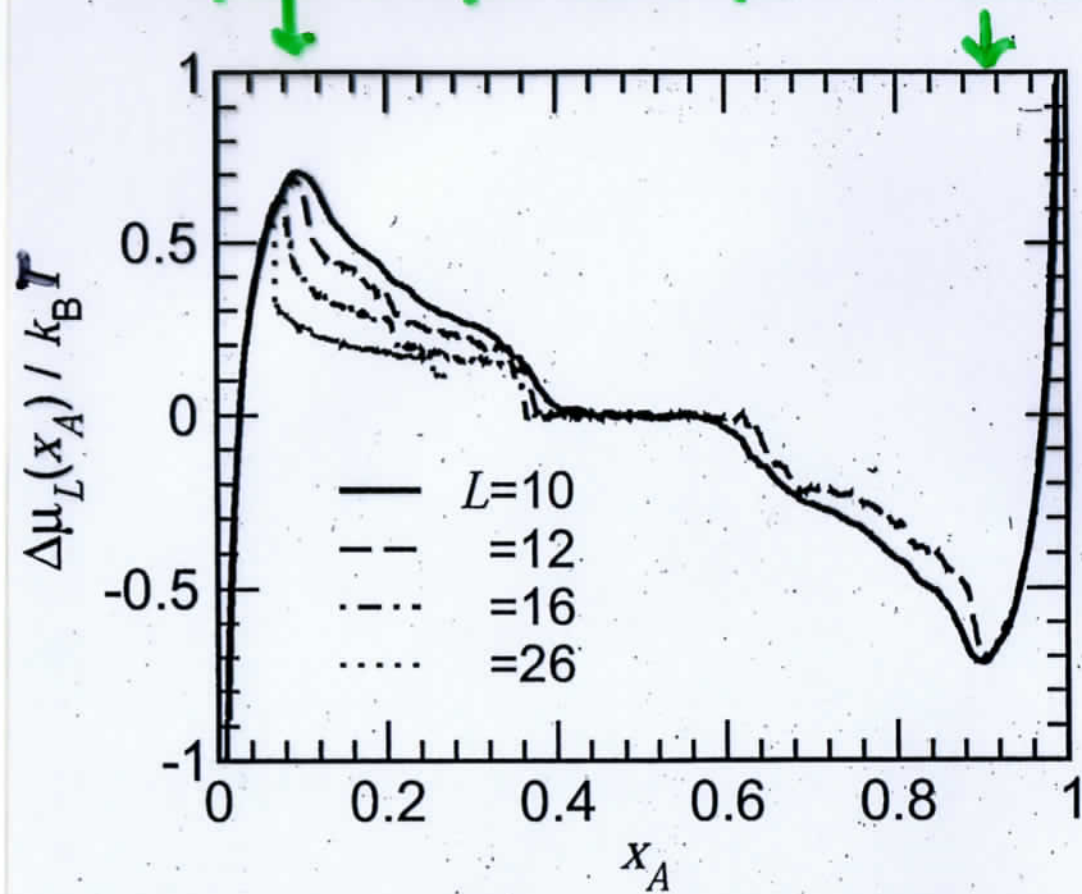


$\uparrow$  now accurate sampling of  $f_L(x_{A1}^T)$  is possible

M.H.Kalos + K.B. (1980) : DROPLET evaporation/condensation transition  
 H.Furukawa + K.B. (1982)



# droplet evaporation/condensation transition



effective chemical potential

difference  $\Delta\mu_L(x_A) \equiv (\partial f_L(x_A) / \partial x_A)_T$

NO metastable or unstable STATES: FULL EQUILIBRIUM OF A FINITE SYSTEM: states with the same  $\Delta\mu_L$  can COEXIST

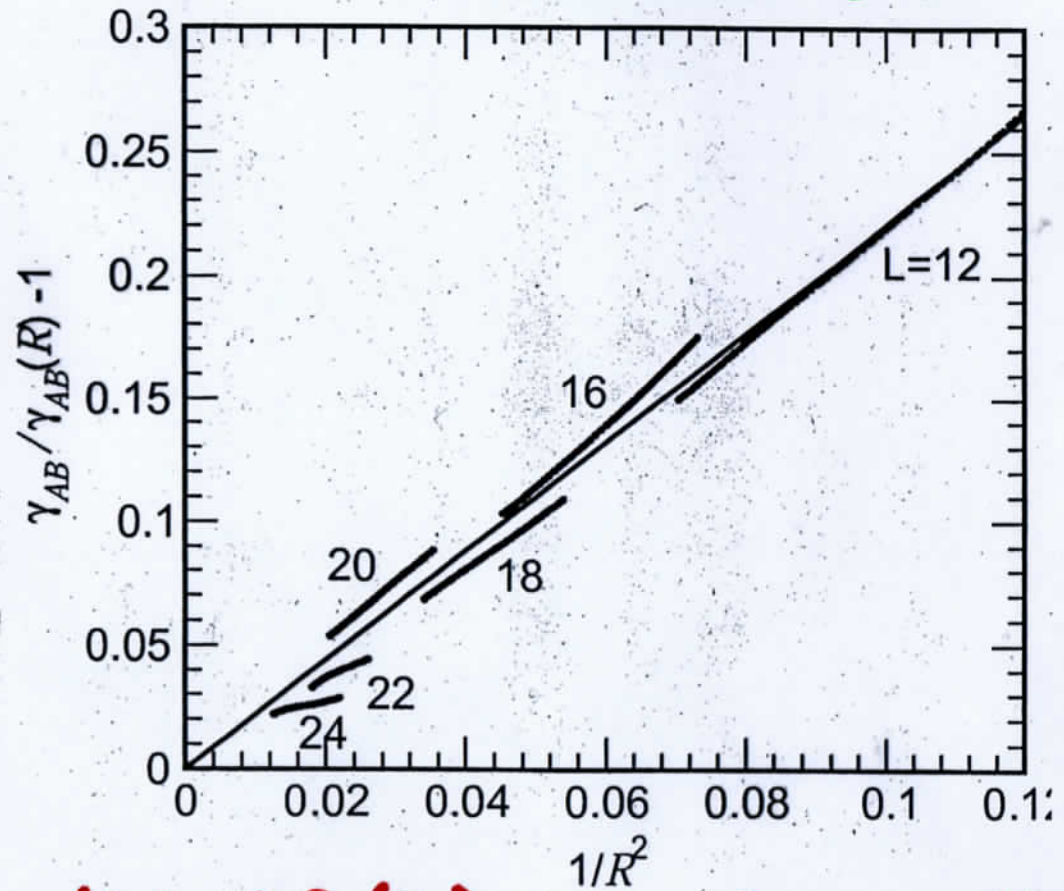
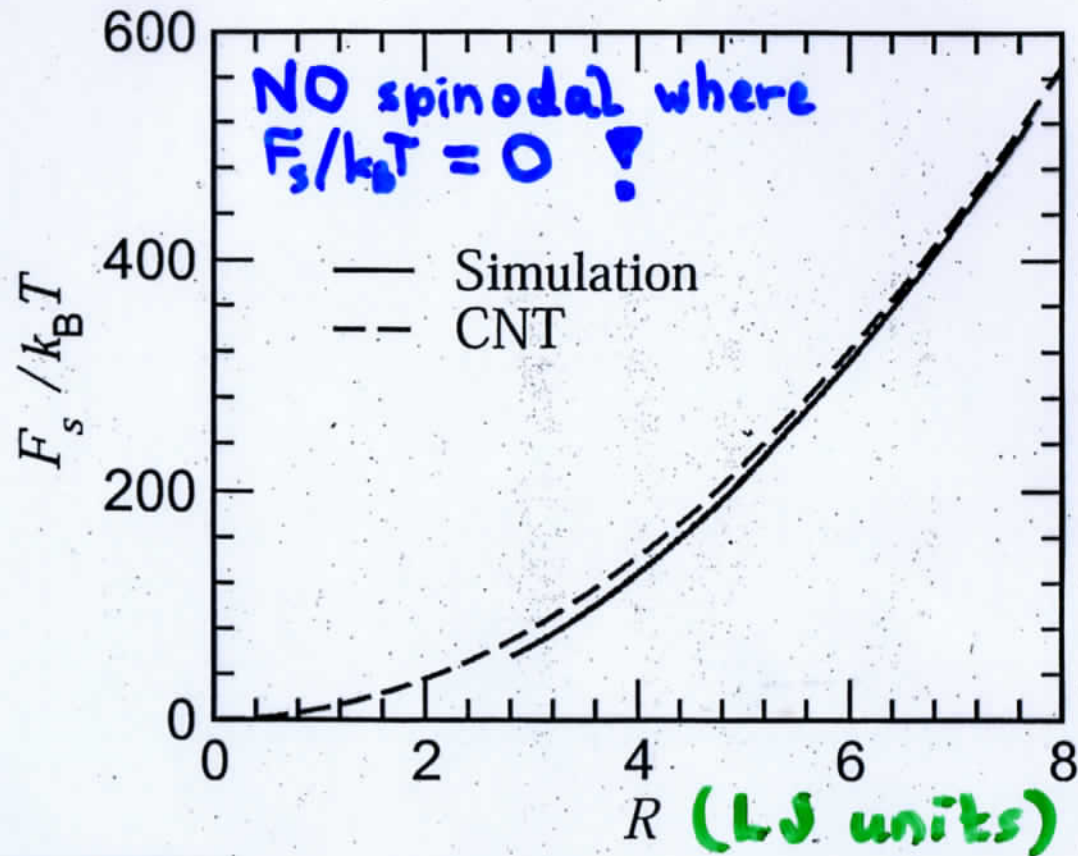
$\Delta f = 4\pi R^2 \gamma_{AB}(R)$

$\Delta x = (1 - 2x_A^{\text{coex}}) (4\pi R^3 / 9L^3)$



Droplet free energy  $F_s(R)/k_B T$  of binary LJ mixture at  $T=1$

classical nucleation theory (CNT):  $F_s(R)/k_B T = 4\pi R^2 \delta_{AB}$   
 nucleation barrier  $\Delta F^* = F_s(R^*)/3$  flat interface



TOLMAN (1949):  $\gamma(R) = \gamma(\infty) / (1 + 2\delta/R)$   $\delta = \text{Tolman length}$   
 (Tolman assumed  $\delta$  is positive, constant, and of order  $\sigma$ )

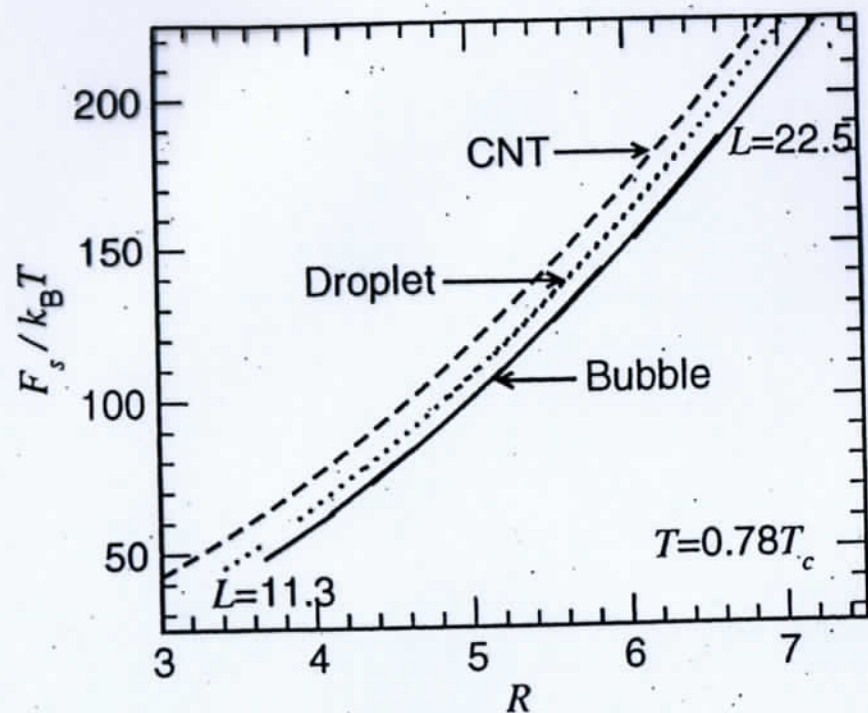
M.P.A. Fisher + Wortis (1984):  $\delta \equiv 0$  in symmetric systems (droplet  $\leftrightarrow$  bubble)

$$\gamma_{AB}(R) = \gamma_{AB}(\infty) / [1 + 2(l_s/R)^2] \quad l_s \approx 1.05$$



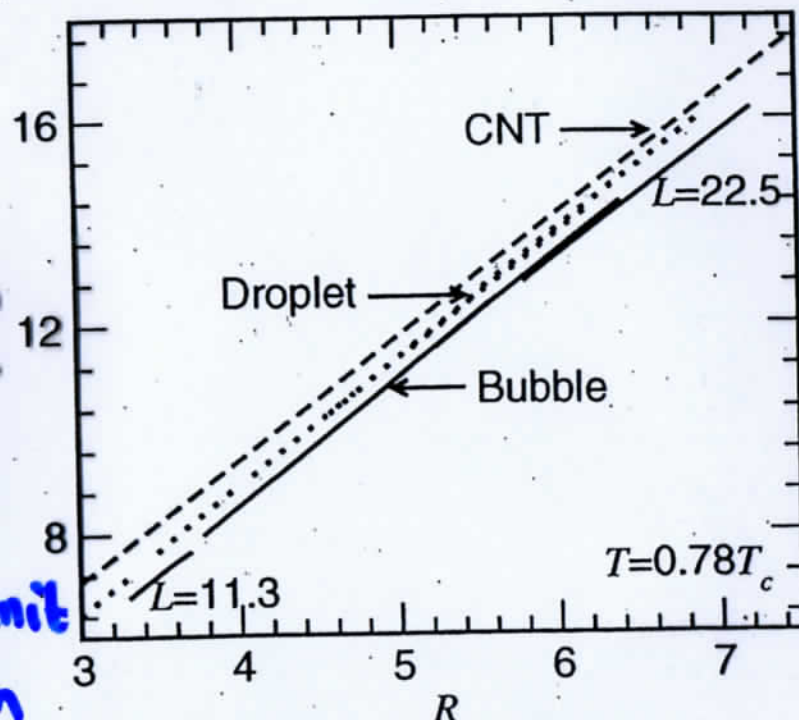
# VAPOR-LIQUID TRANSITION OF SIMPLE LENNARD-JONES FLUID

## NO SYMMETRY BETWEEN DROPLETS and BUBBLES!



SPHERES

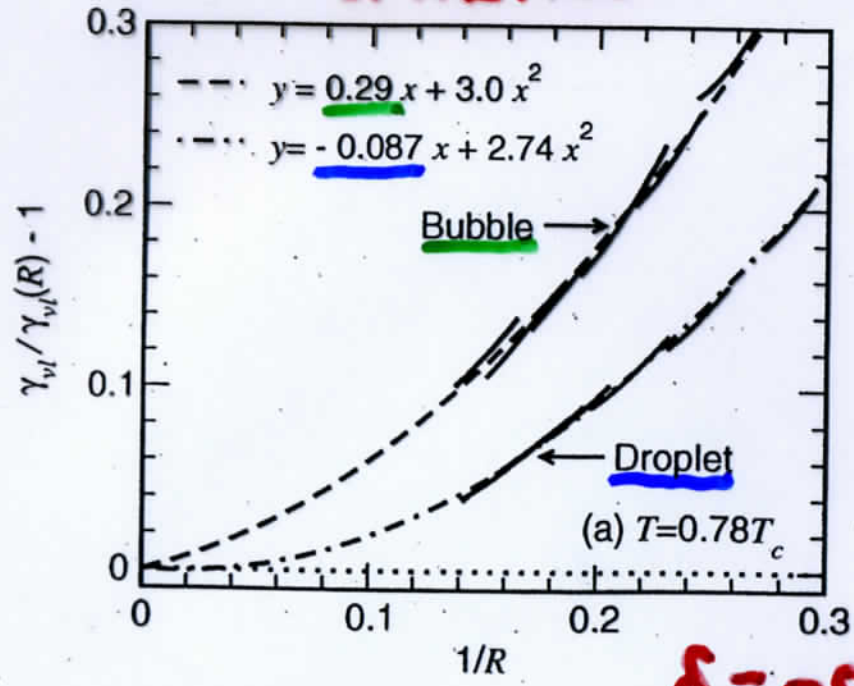
per unit  
length  
of the  
cylinder



CYLINDERS

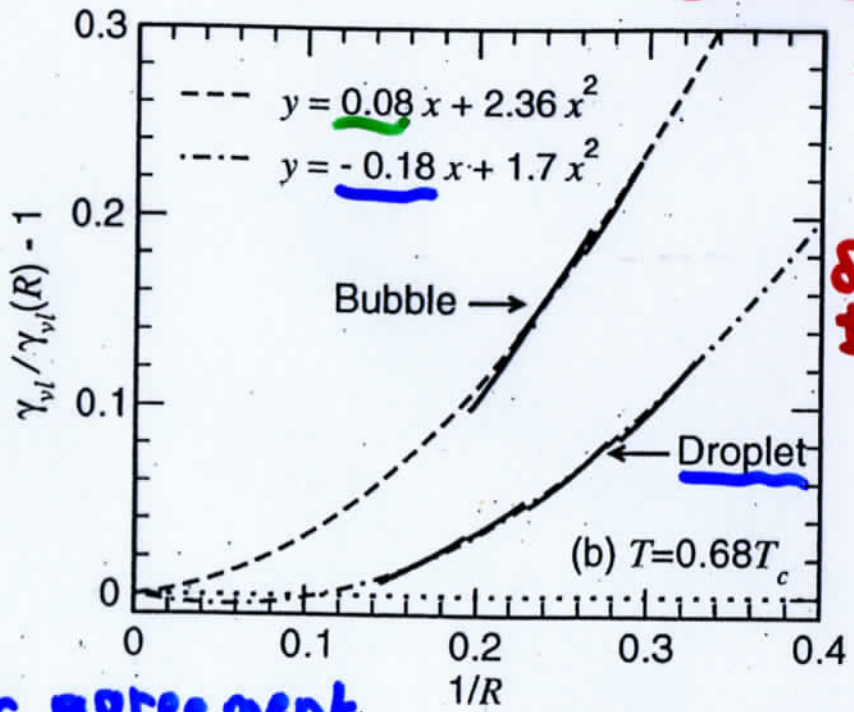
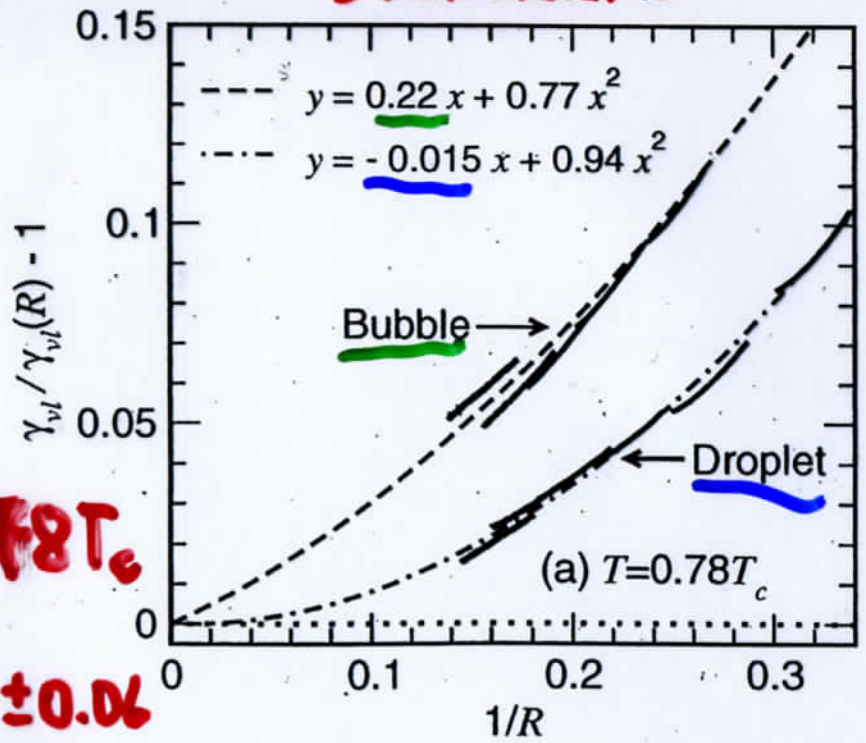
- hypothesis:
- $\gamma_{vl}(\infty)/\gamma_{vl}(R) = 1 + 2\delta/R + 2(l_s/R)^2$  spherical droplet
  - $\gamma_{vl}(\infty)/\gamma_{vl}(R) = 1 - 2\delta/R + 2(l_s/R)^2$  spherical bubble
  - $\gamma_{vl}(\infty)/\gamma_{vl}(R) = 1 + \delta/R + 2(l_s/R)^2$  cylindrical drop
  - $\gamma_{vl}(\infty)/\gamma_{vl}(R) = 1 - \delta/R + 2(l_s/R)^2$  cylindrical bubble

# SPHERES

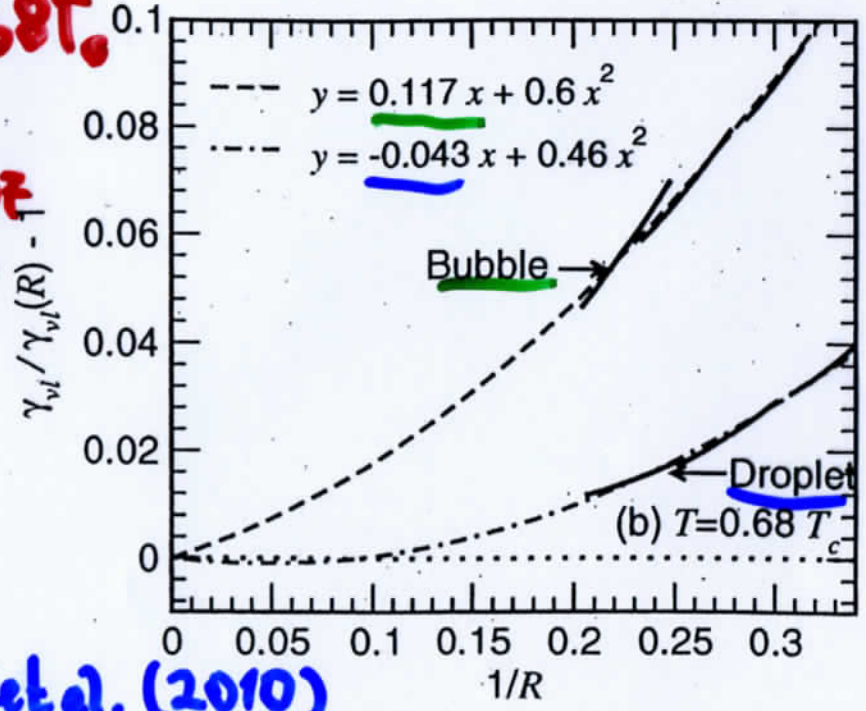


$T = .78T_c$   
 $\downarrow$   
 $\delta = -0.11 \pm 0.06$

# CYLINDERS

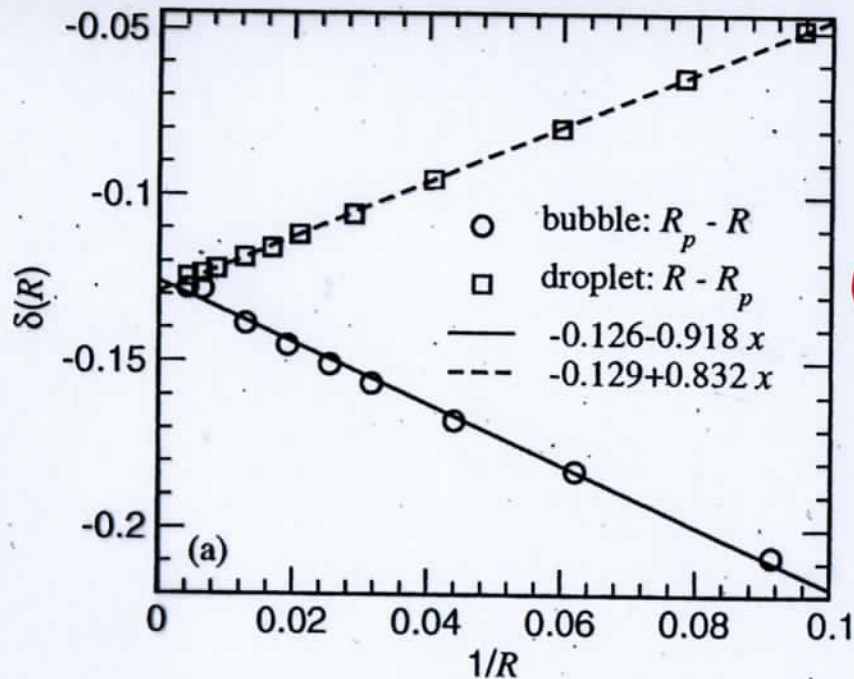
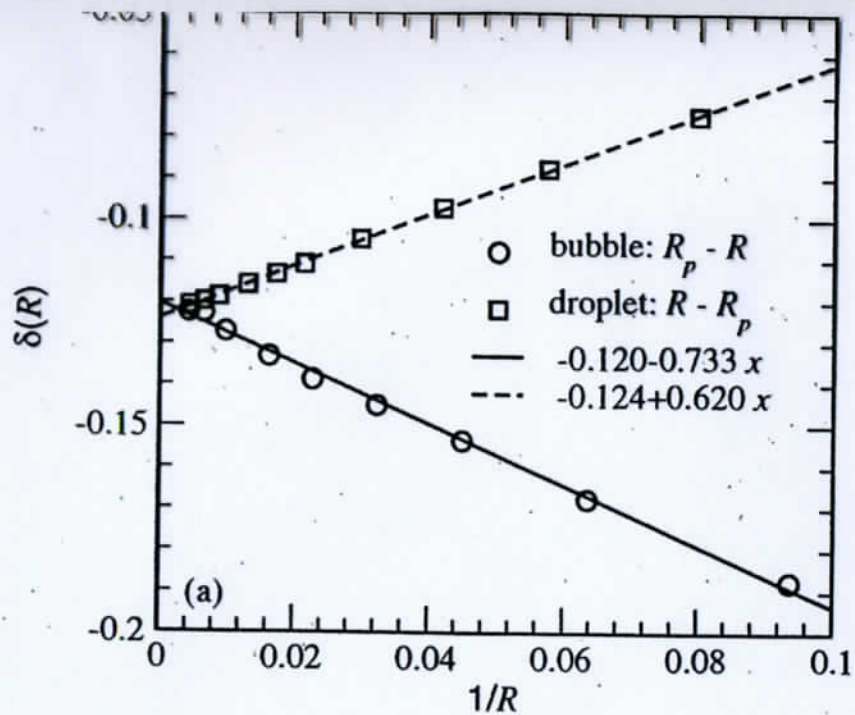


$T = .68T_c$   
 $\downarrow$   
 $\delta = -0.07 \pm 0.04$



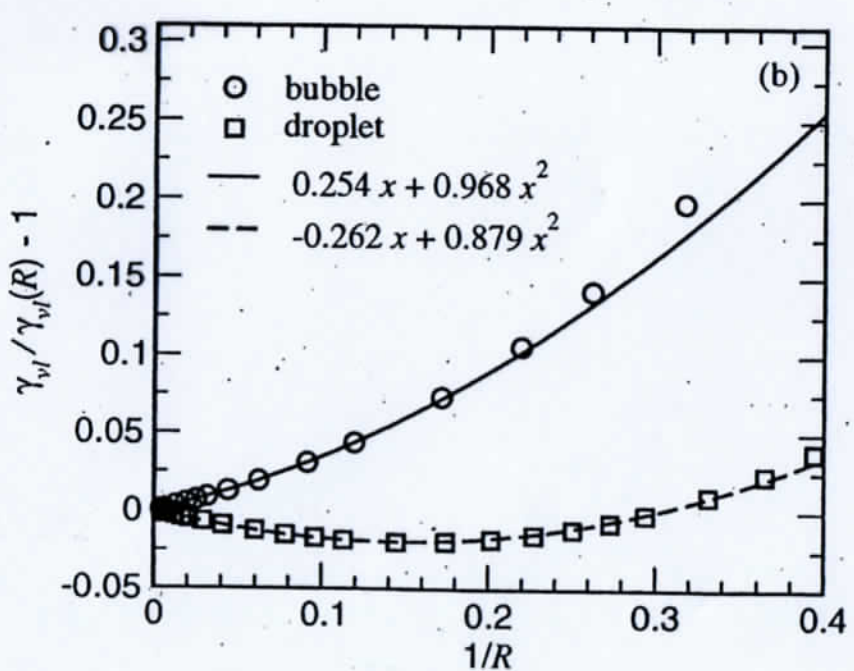
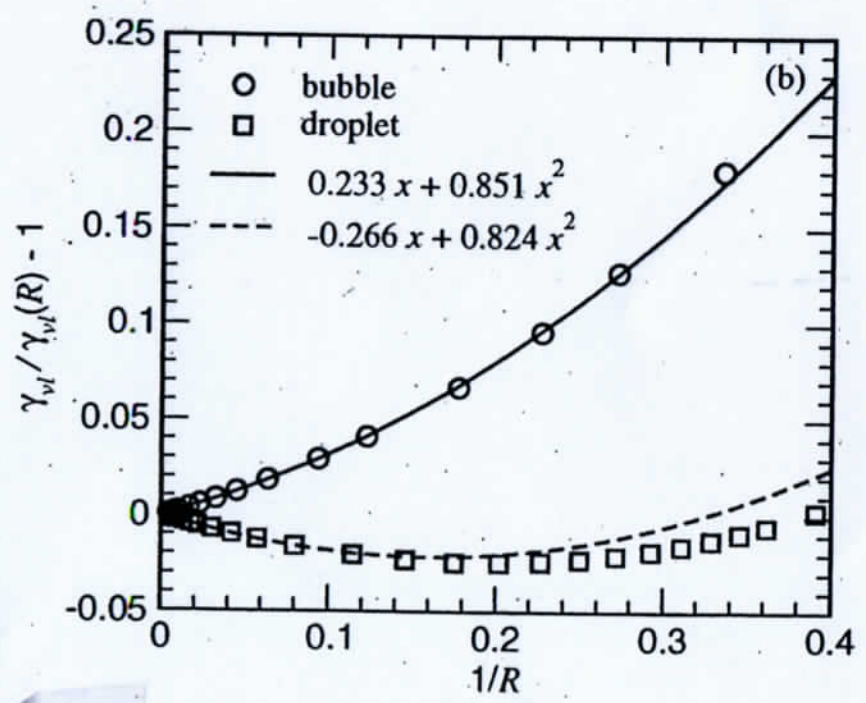
fair agreement with BLOKHUIS et al. (2009) + JACKSON et al. (2010)





density functional theory (M. Dettler 2010)

R-dependent Tolman length



$\frac{\delta_{vl}}{\gamma_{vl}(R)} - 1$

$T = 0.68 T_c$

$T = 0.78 T_c$



# BINARY LJ MIXTURE between ANTISYMMETRIC WALLS = phase

coexistence at  $x_A = 0.5$  (FIXED!)

allows "measurement" of CONTACT ANGLE  $\Theta$   $L \times L \times D$  geometry

wall potentials:

$$u_A(z) = \frac{2\pi\rho}{3} \left\{ \epsilon_r \left[ \left( \frac{6}{z+6/2} \right)^9 + \left( \frac{6}{D+6/2-z} \right)^9 \right] - \epsilon_a \left( \frac{6}{z+6/2} \right)^3 \right\}$$

$$u_B(z) = \frac{2\pi\rho}{3} \left\{ \epsilon_r \left[ \left( \frac{6}{z+6/2} \right)^9 + \left( \frac{6}{D+6/2-z} \right)^9 \right] - \epsilon_a \left( \frac{6}{D+6/2-z} \right)^3 \right\}$$

one wall attracts only A, the other wall only B, with the same strength

← complete wetting (resp. interface "unbinding from walls") has occurred

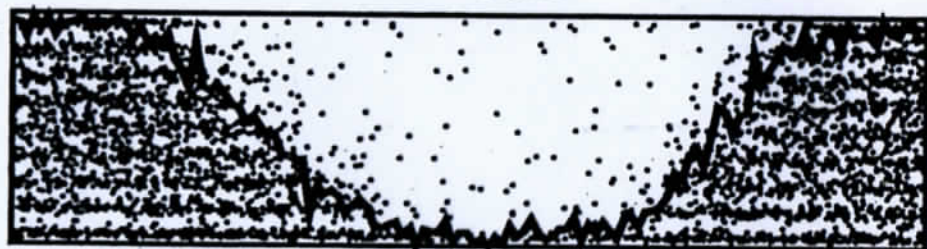
$\epsilon_a = 0.05$



$\epsilon_a = 0.1$



$\epsilon_a = 0.15$



$\epsilon_a = 0.25$



$L=32, D=8$

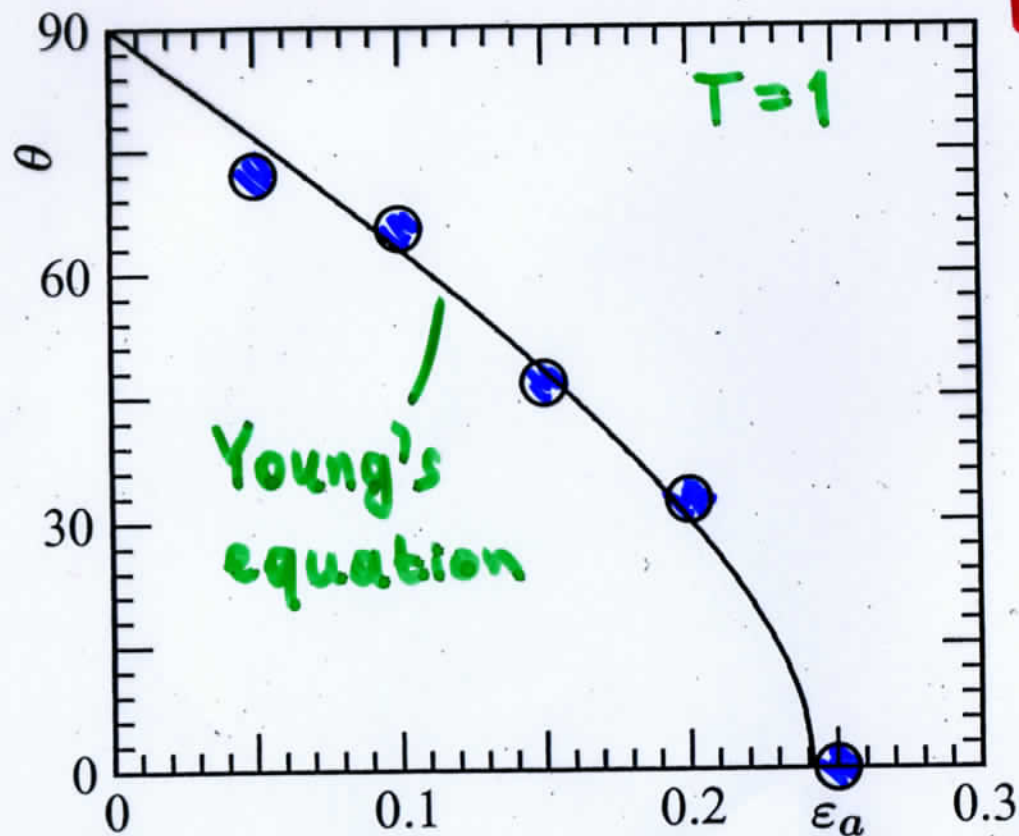
$x \rightarrow$

$D \left\{ \begin{array}{l} \uparrow \\ \uparrow \\ \uparrow \end{array} \right.$

$z \uparrow$



# CONTACT ANGLE vs. STRENGTH of attractive part of wall potential for the binary LJ mixture



● observations from flat but inclined interfaces in nano-films

—  $\cos \theta = (\gamma_{WA} - \gamma_{WB}) / \gamma_{AB}$

obtained from thermodynamic integration of systems with walls (NO PHASE COEXISTENCE) in the semi-grandcanonical ensemble (incomplete wetting conditions)

$$\gamma_{WA} - \gamma_{WB} = f_s^{(z=0)}(\epsilon_a) \Big|_{\text{A-rich phase}} - f_s^{(z=0)}(\epsilon_a) \Big|_{\text{B-rich phase}} =$$

$$= \frac{2\pi\rho}{3} \int_0^{\epsilon_a} d\epsilon'_a \int_0^D dz \left[ \langle p_A(\epsilon'_a, z) \rangle_{\text{A-rich}} \left( \frac{\sigma}{z + \frac{D}{2}} \right)^3 - \langle p_B(\epsilon'_a, z) \rangle_{\text{A-rich}} \left( \frac{\sigma}{D + \frac{\sigma}{2} - z} \right)^3 \right]$$

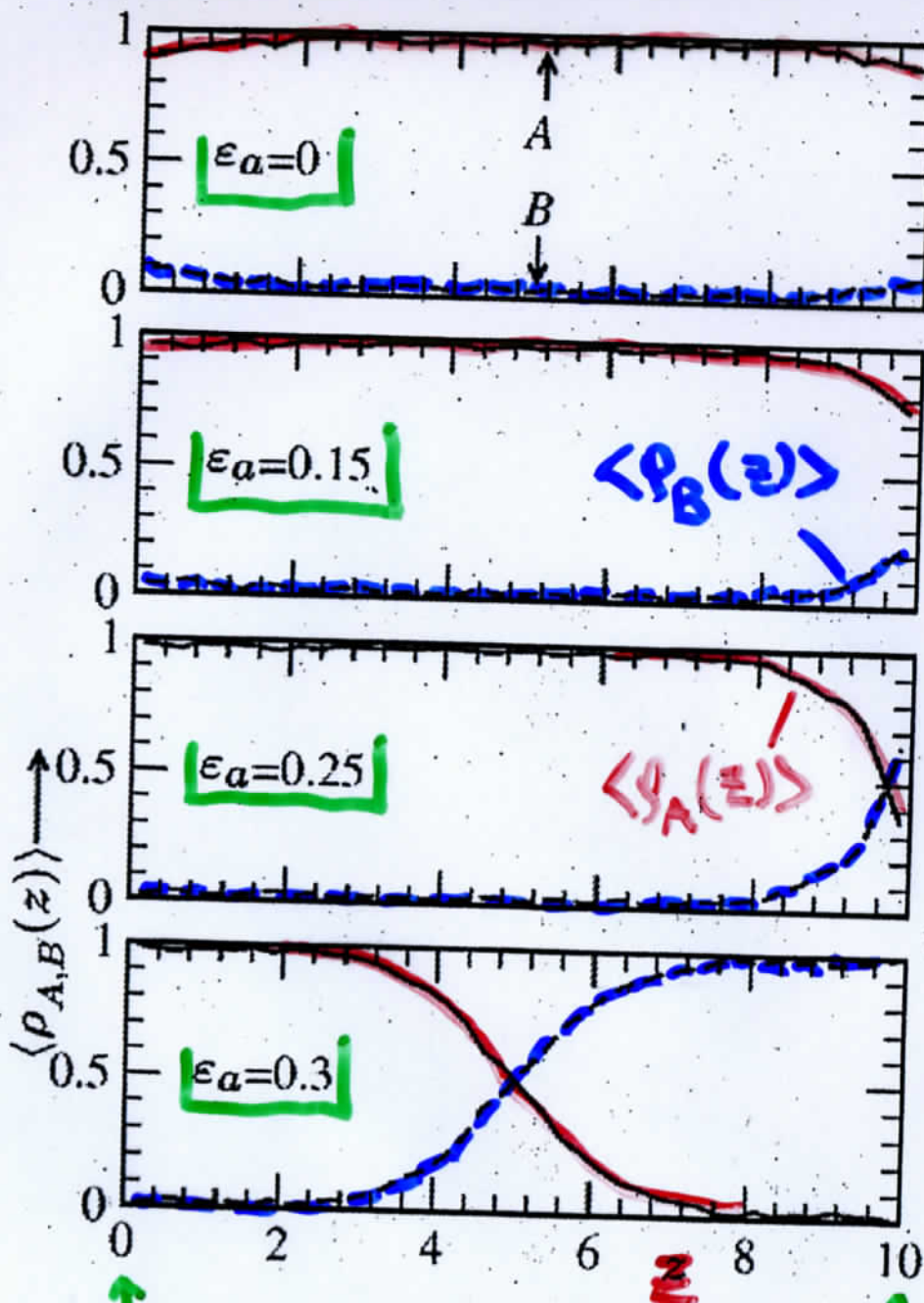
# Density profiles across the film ( $D=10$ )

(semi-grandcanonical ensemble)

$$F = -k_B T \ln \int d\vec{X} \exp \left\{ -\beta \mathcal{H}(\vec{X}) - \beta \mathcal{H}_w^{\epsilon_a}(\vec{X}) + \beta \epsilon_a L^2 \frac{2\pi\rho}{3} \times \left[ \int_0^D \rho_A(z) \left( \frac{\sigma}{z + \frac{\sigma}{2}} \right)^3 dz + \int_0^D \rho_B(z) \left( \frac{\sigma}{D + \frac{\sigma}{2} - z} \right)^3 dz \right] \right\}$$

$$\Rightarrow \left( \frac{\partial f_s^{(z=0)}}{\partial \epsilon_a} \right)_T = \frac{2\pi\rho}{3} \int_0^D \langle \rho_A(z) \rangle \left( \frac{\sigma}{z + \frac{\sigma}{2}} \right)^3 dz$$

$$\left( \frac{\partial f_s^{(z=D)}}{\partial \epsilon_a} \right)_T = \frac{2\pi\rho}{3} \int_0^D \langle \rho_B(z) \rangle \left( \frac{\sigma}{D + \frac{\sigma}{2} - z} \right)^3 dz$$



wall attracts A      wall attracts B



# LATTICE GAS (ISING MODEL)

$$\mathcal{H} = -J \sum_{\langle i,j \rangle} S_i S_j - H \sum_i S_i - H_1 \sum_{i \in n=1} S_i - H_D \sum_{i \in n=D} S_i, \quad S_i = \pm 1$$

Local density:  $\rho_i = (1 + S_i)/2 = \begin{cases} 1 \\ 0 \end{cases}$

magnetic field  $H \leftrightarrow$

chemical potential difference

$$2H = \mu - \mu_{\text{coex}}$$

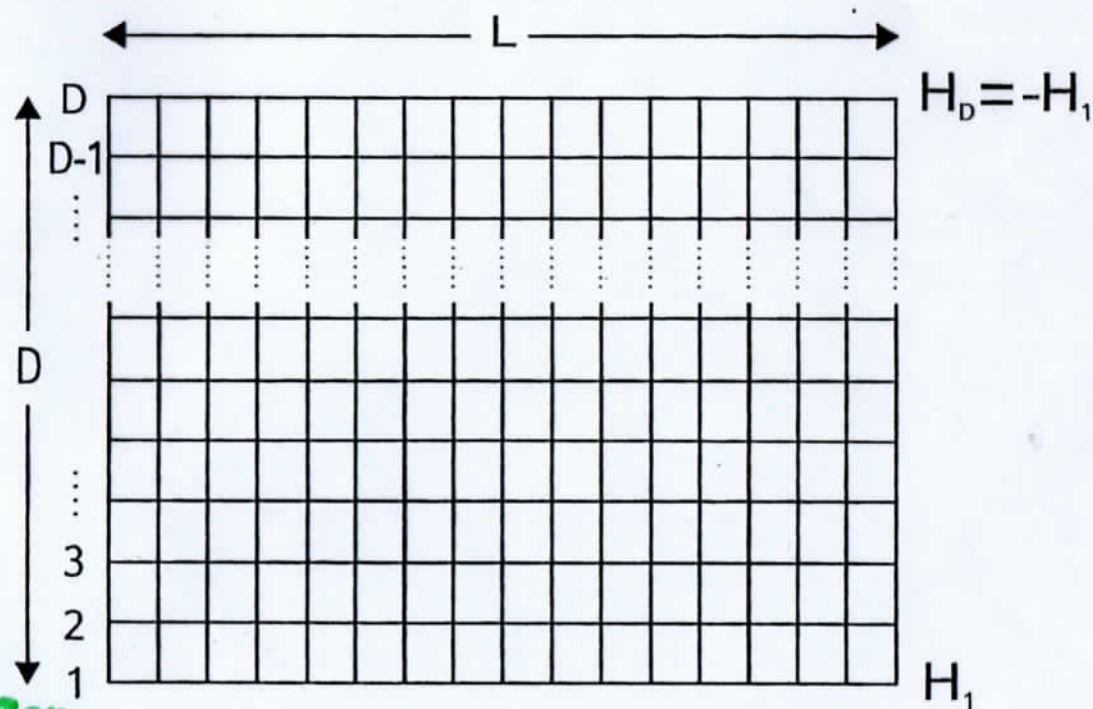
$$\rho = (1 + \langle S_i \rangle_T) / 2$$

$$\rho_v = (1 - m_{\text{coex}}) / 2$$

$$\rho_e = (1 + m_{\text{coex}}) / 2$$

$m_{\text{coex}}$  = spontaneous magnetization

units:  $J \equiv 1$ , lattice spacing = 1



no planes  $n = 0, n = D + 1$ :  
"missing neighbors"

# ESTIMATION OF THE CONTACT ANGLE: ISING MODEL

use YOUNG's equation!

$L \rightarrow \infty$ , large  $D$ :

$$f(T, H, H_1, H_D, D) = f_b(T, H)$$

$$+ \frac{1}{D} f_s(T, H, H_1) + \frac{1}{D} f_s(T, H, H_D)$$

Young (1805):

$$\gamma_{ve} \cos \theta = f_s^{(+)}(T, 0, H_1) - f_s^{(-)}(T, 0, H_1)$$

(+), (-): sign of spont. magn.

Ising symmetry:

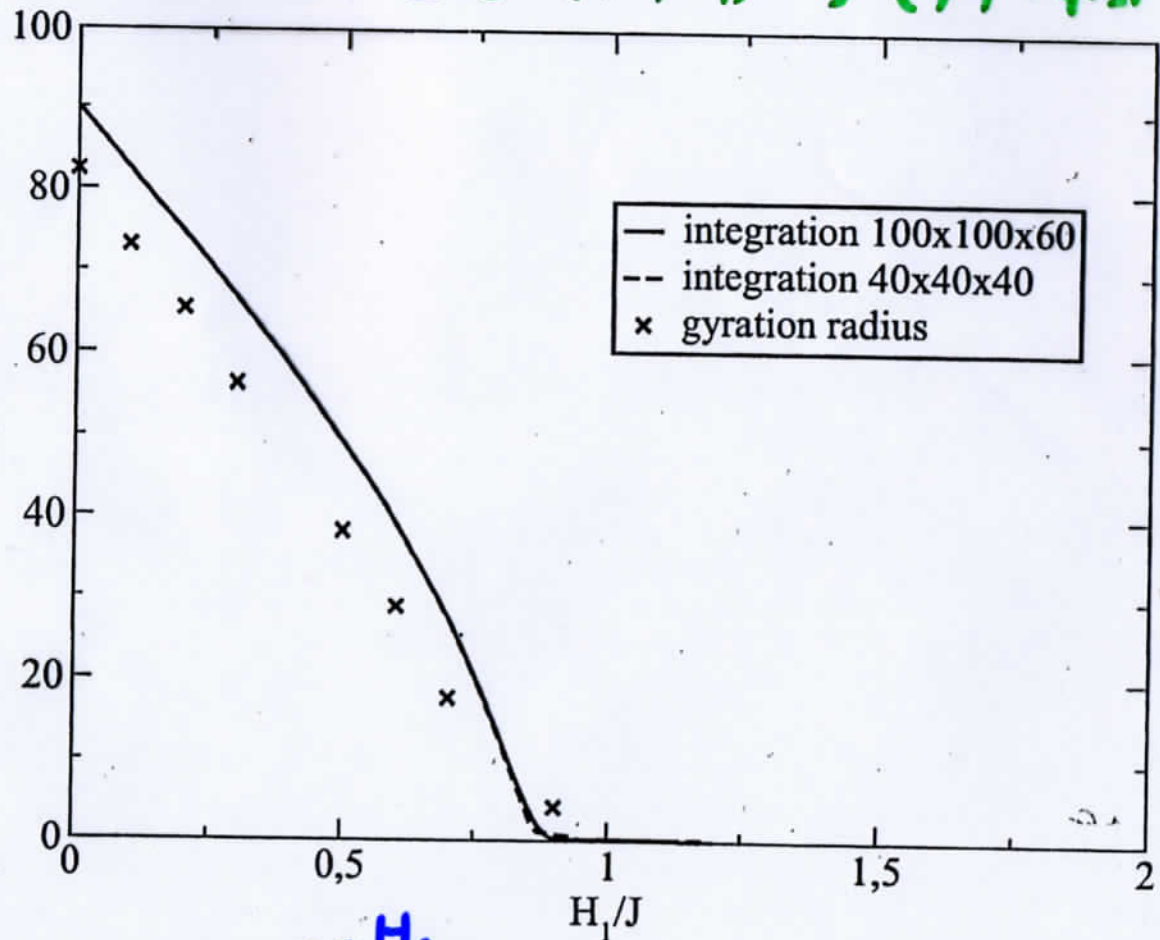
$$f_s^{(-)}(T, 0, H_1) = f_s^{(+)}(T, 0, -H_1)$$

$$\{s_i\}, H_1, H_1 \leftrightarrow \{-s_i\}, -H_1, -H_1$$

$$m_1 = -(\partial f_s(T, H, H_1) / \partial H_1)_T \Rightarrow \cos \theta = \left\{ \int_0^{H_1} [m_D(H'_1) - m_1(H'_1)] dH'_1 \right\} / \gamma_{ve}$$

Hasenbusch + Pinn (1993)

$$\cos \theta = [f_s^{(+)}(T, 0, H_1) - f_s^{(+)}(T, 0, -H_1)] / \gamma_{ve}(T)$$



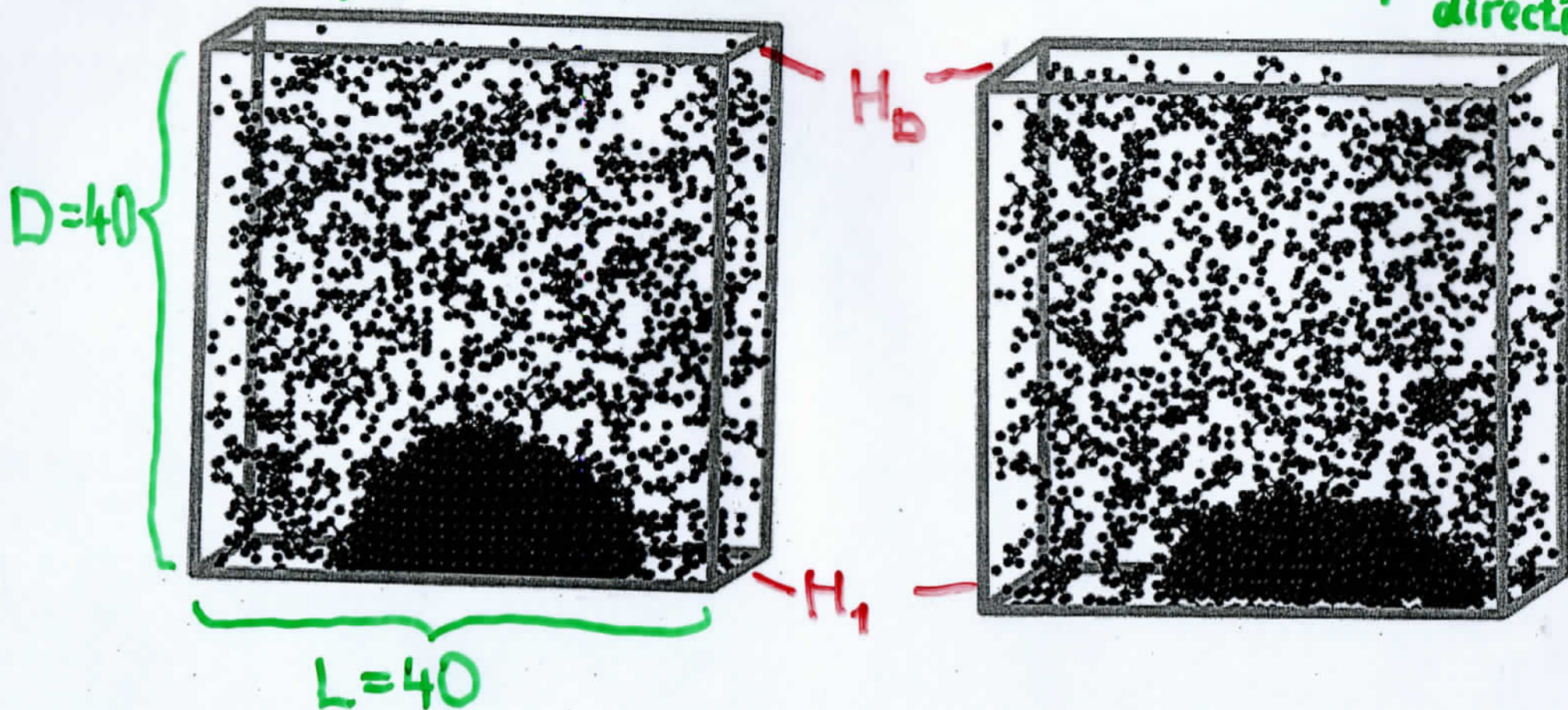


Lattice gas model

$$k_B T/J = 3.0$$

$$(k_B T_c/J \approx 4.51)$$

$L \times L \times D$  geometry, two free  $L \times L$  surfaces; pbc in  $x, y$  directions



surface fields:  $H_D = -H_1$

$$H_1 = 0.4J$$

$H_1 = 0$ : contact angle  $\Theta = 90^\circ$

$$\Rightarrow \Theta \approx 56^\circ$$



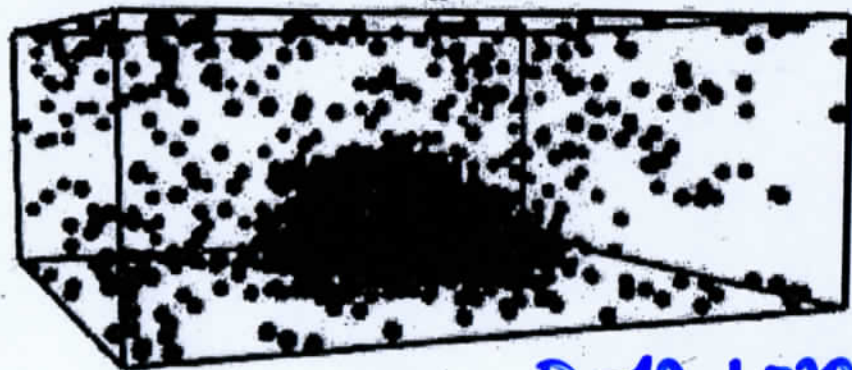
# Wall-attached droplets in the binary Lennard-Jones mixture

$$\epsilon_a = 0: \theta = 90^\circ$$

$$\epsilon_a = 0 \quad D=12, L=24$$

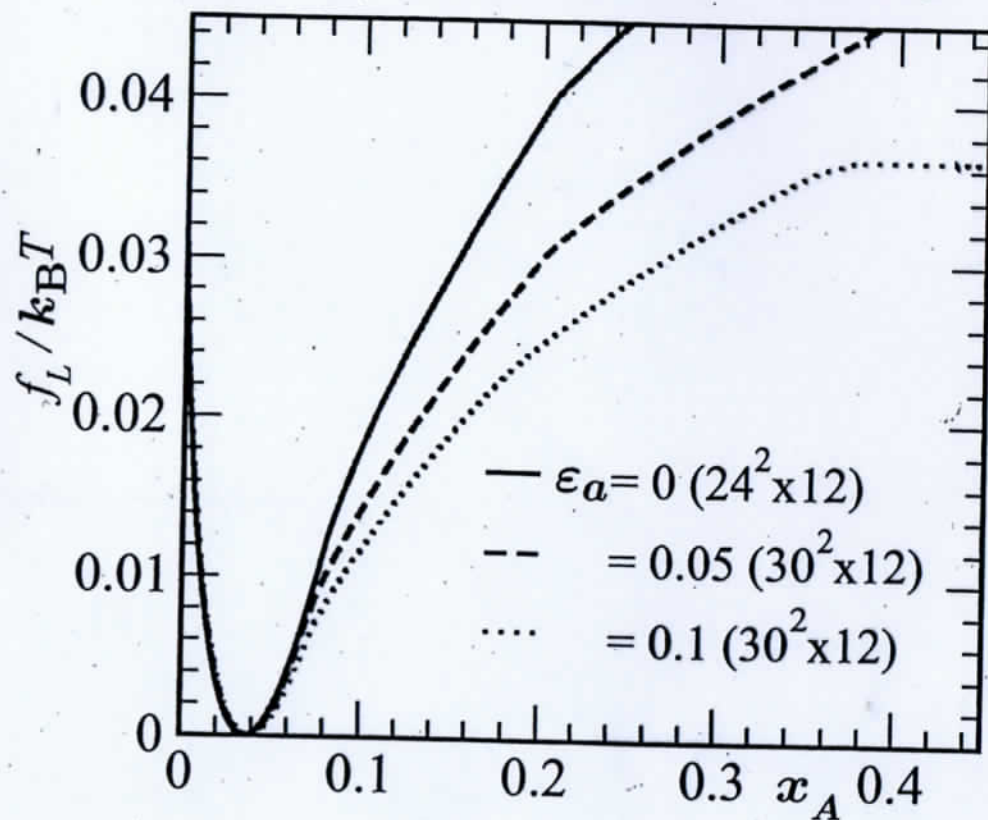


$$\epsilon_a = 0.05 \quad \theta \approx 77^\circ$$



$$D=12, L=30$$

effective free energy  
in the presence of walls





# PHASE COEXISTENCE IN FINITE $L=L \times D$ ISING SYSTEMS: GENERAL CONSIDERATIONS

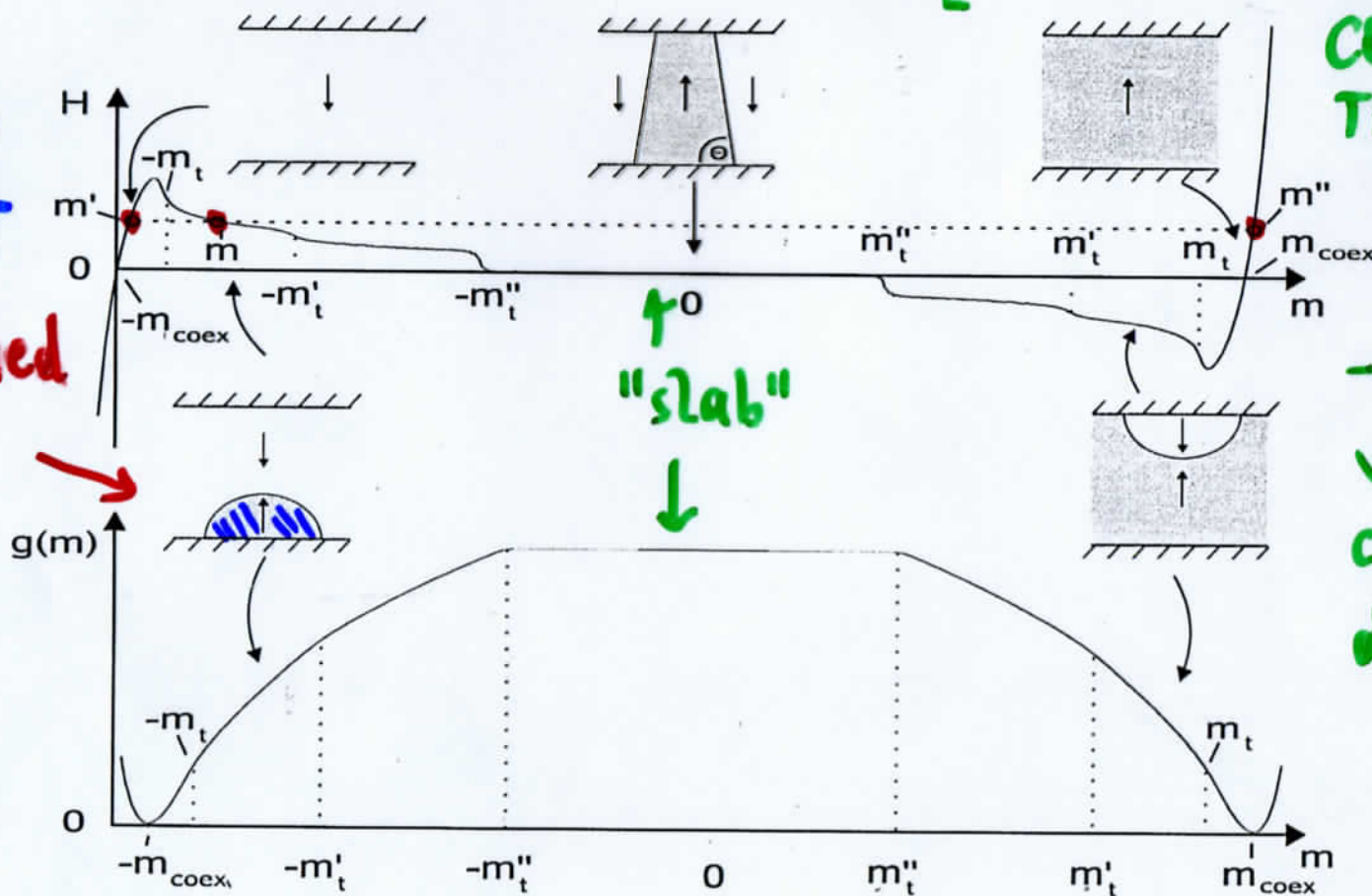
$-m < m < -m_{coex}$ : vapor;  $-m_t < m < -m'_t$ : vapor + sphere-cap droplet

$m = -m_t$ : DROPLET EVAPORATION-CONDENSATION TRANSITION

CONDENSATION TRANSITION

$$H(m) = \left( \frac{\partial g(m)}{\partial m} \right)_T$$

Wall-attached droplet



density  $g(m)$  of the thermodynamic potential

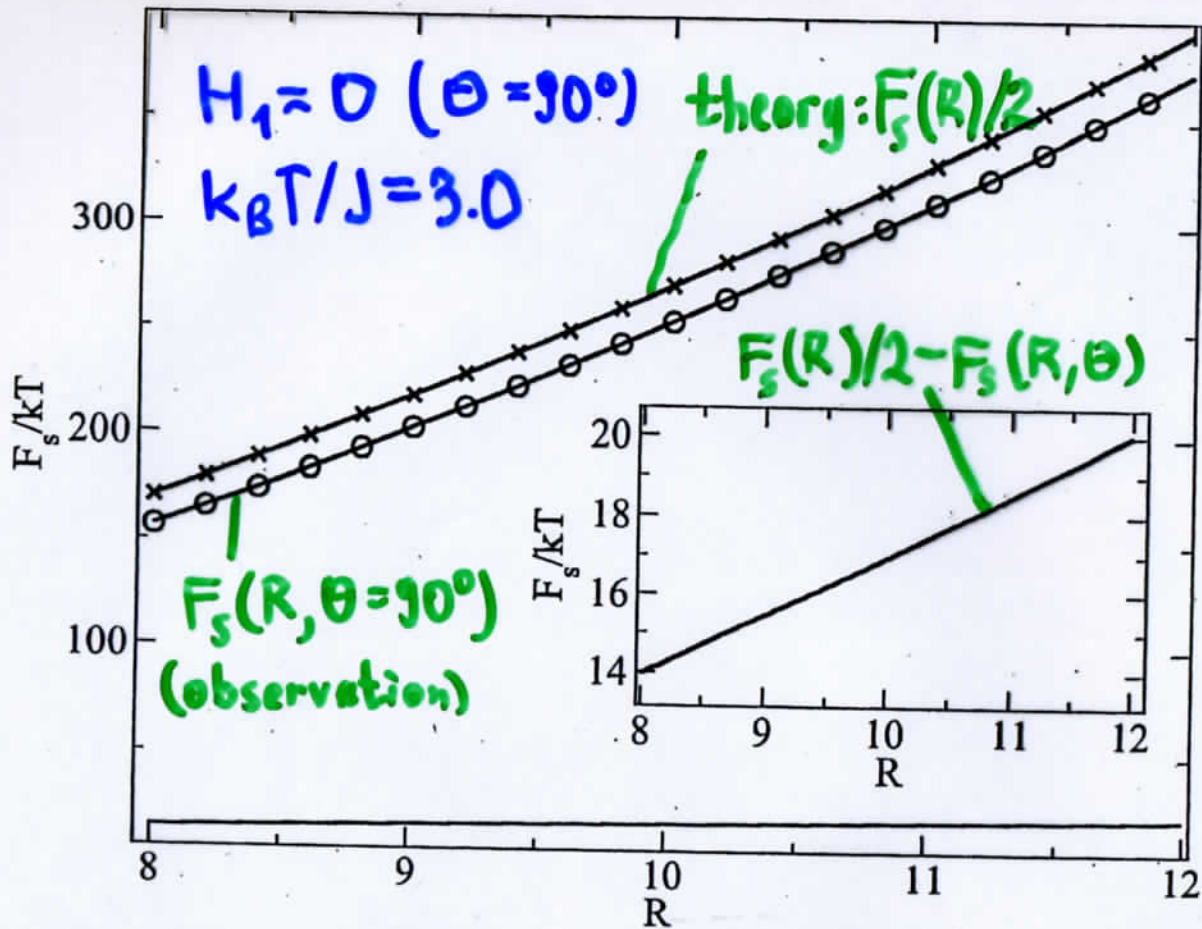
$$g(m > m_{coex}) = g(m = -m_{coex}) = 0$$

$-m'_t < m < -m''_t$ : vapor + cylinder-cap droplet

transitions at  $\pm m_t, \pm m'_t, \pm m''_t$  sharp only for  $L \rightarrow \infty$

# SURFACE FREE ENERGY versus DROPLET RADIUS

(wall-attached droplets)



Linear variation with  $R$ :  
**EVIDENCE** for  
**LINE TENSION** contribution

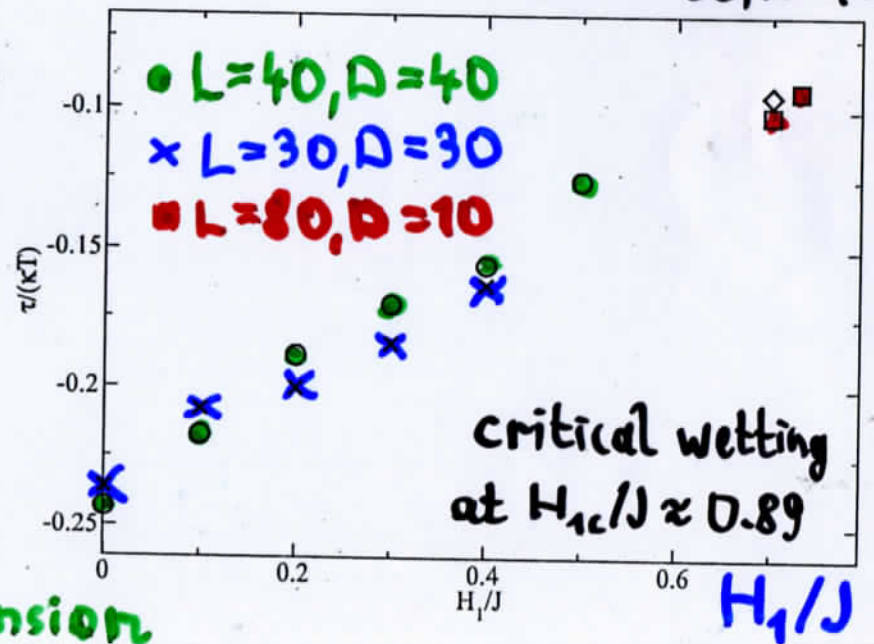
Classical theory including line tension (GRETZ 1966, NAVASCUEZ + TARANZONA 1981):

$$F_s(R, \theta) = 4\pi R^2 \gamma_{ve} f(\theta) + 2\pi R \sin \theta \tau$$

$$f(\theta) = (2 + \cos \theta)(1 - \cos \theta)^2 / 4$$

line tension

$\diamond L=60, D=10$

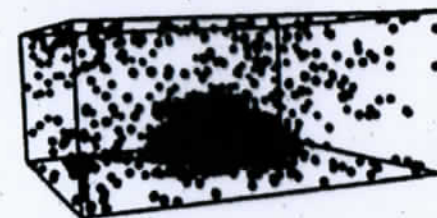




# surface free energy of wall-attached droplets for the binary Lennard-Jones mixture

$(\theta, R) = (90^\circ, 6.3)$

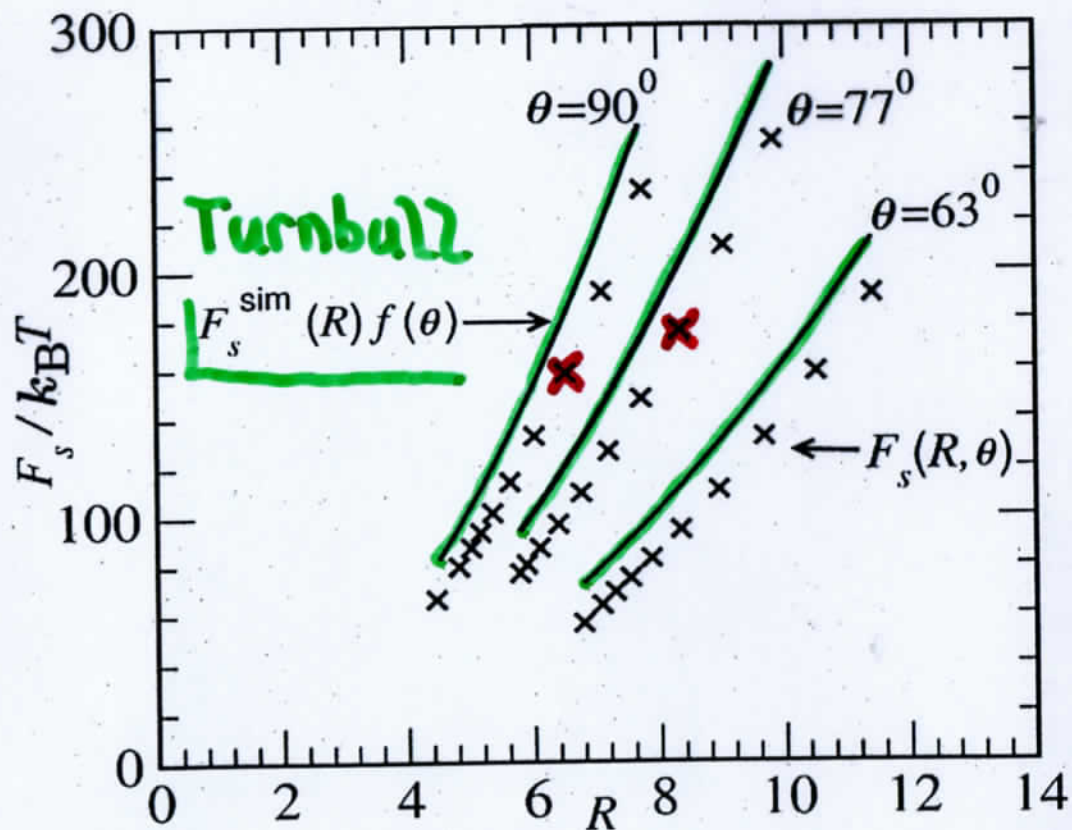
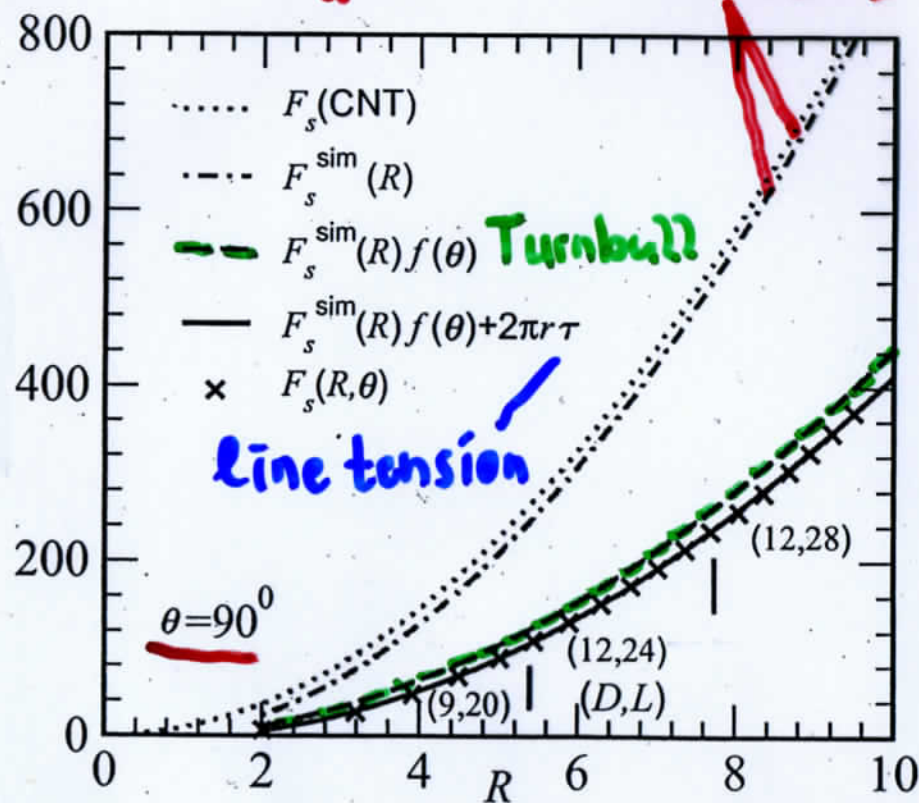
$(77^\circ, 8.4)$



$\epsilon_w = 0$

no walls

$F_s / k_B T$

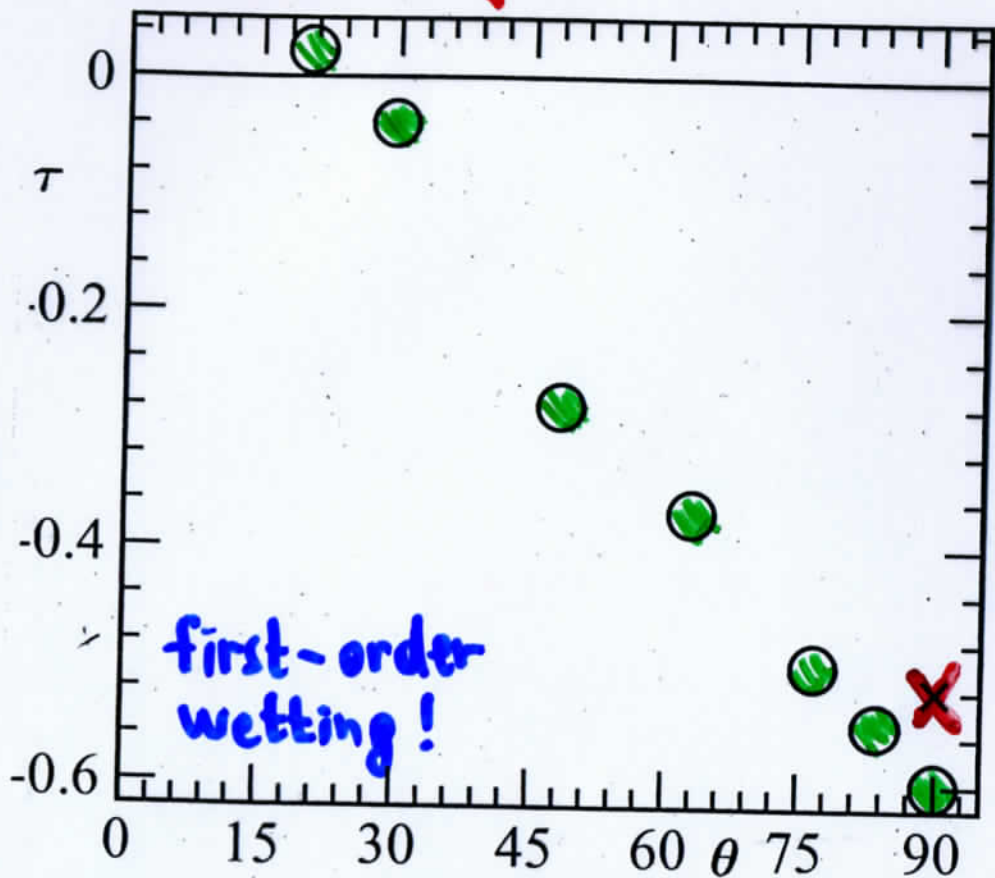


droplet radius

NEGATIVE LINE TENSION  $\Rightarrow$

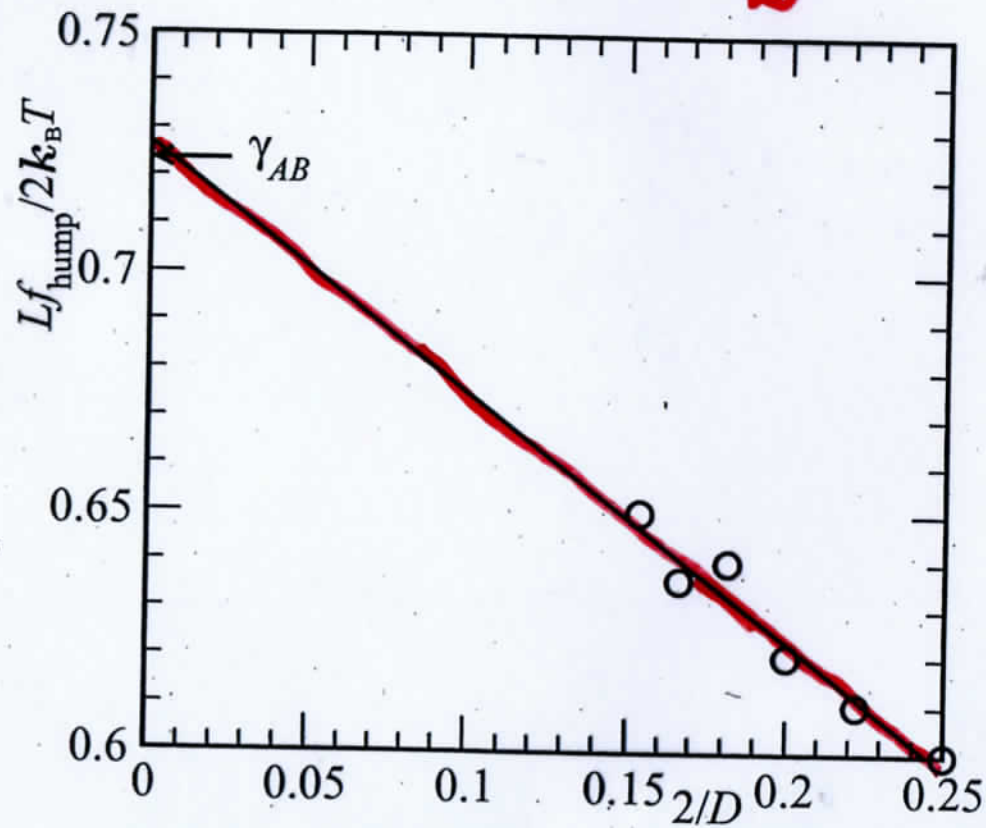
Turnbull's formula  $F_s(R)f(\theta)$  overestimates actual surface free energy cost even if the (KNOWN) curvature correction is included

# Line tension of the binary Lennard-Jones mixture versus contact angle

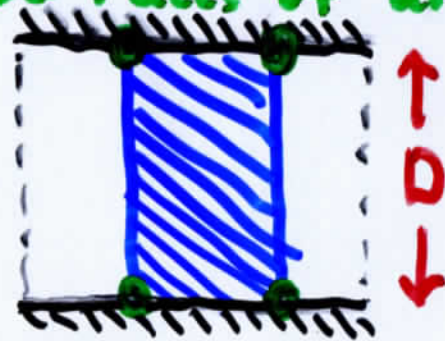


- extracted from the free energy of wall-attached droplets
- X finite-size analysis of slab configurations

$$Lf_{\text{hump}}/2k_B T = \gamma_{AB} + \tau \frac{2}{D}$$



2 interfaces of area  $LD$



↑  $D$   
↓  $D$   
volume  $L^2 D$

4 3-phase contact lines



# CONCLUSIONS

- method developed for the study of sessile wall-attached droplets in full equilibrium
- no "cluster criterion" needed to identify droplets → also bubbles accessible
- no "bias potential" needed to stabilize droplets
- chemical potential of gas coexisting with droplet and droplet volume and droplet surface (+line) energy "measured"
- Tolman length  $\approx -0.1\sigma$ ; quadratic correction more important
- applications: 3-dim lattice gas model, binary LJ mixture
  - contact angle  $\Theta(H_1)$  easy to determine
  - classical prediction  $F_s(R, \Theta) = F_s(R)(2 + \cos\Theta)(1 - \cos\Theta)^2/4$  is accurate, if line tension correction is applied
  - still difficult:  $T$  near  $T_c$ ;  $H_1$  near wetting transition