

# Monte Carlo Simulation of Interfaces

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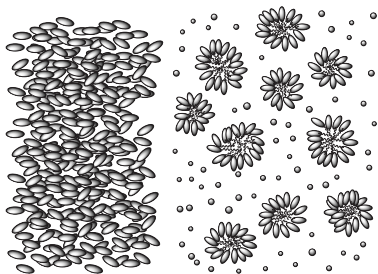


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# What is...?

## Soft matter

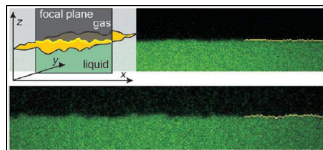
- liquids, liquid crystals, polymers, colloids, surfactants



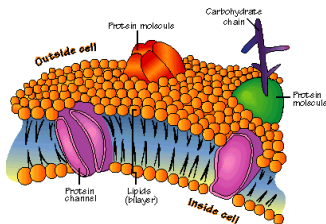
- soft (energies  $\approx k_B T$ )
- fluidity
- order
- self-organization

## Interfaces

- liquid-liquid, liquid-gas



- solid-liquid
- membranes



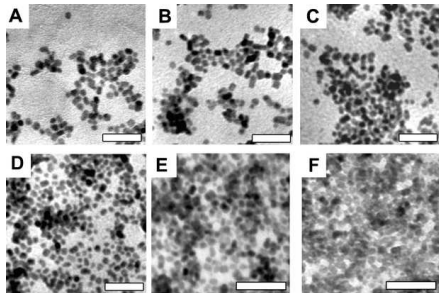
# Outline

- 1 Introduction
- 2 Nanoparticles at soft interfaces
- 3 Adsorption on polymer vesicles
- 4 Conclusions

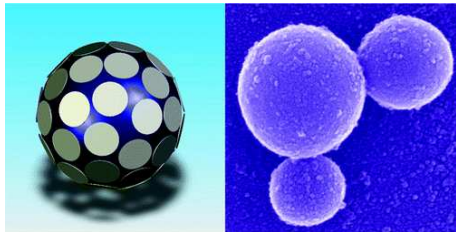
# Nanoparticles at soft interfaces

- Nanoparticles
  - ▶ quantum dots, fullerenes, macromolecules, proteins...
- Soft interfaces
  - ▶ liquid-liquid (oil-water), polymer blends, membranes....

## Nanoparticle monolayer



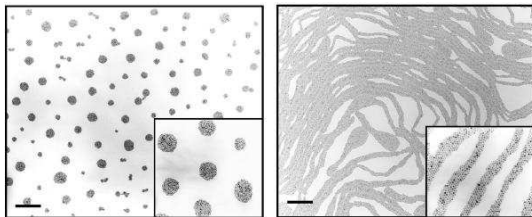
## Nanoparticle stabilised droplet



- Adhesion of nanoparticles onto soft interfaces
  - ▶ for  $\approx$ nm particles detachment energy  $10 k_B T$

# Nanoparticle-interface interaction

- Nanoparticle self-assembly
  - ▶ dynamics/kinetics
  - ▶ capillary forces between nanoparticles: structure formation



- Adhesion strength not measured experimentally
  - ▶ often estimated from continuum models
- Many contributions to interaction
  - ▶ difficult to isolate different effects experimentally

# Model

- Solvent

- ▶ non-additive hard sphere (Widom-Rowlinson) mixture  
2 components  $A$  and  $B$

$$V_{\alpha\beta}(r) = (1 - \delta_{\alpha\beta})V_{hs}(r, \sigma)$$

(diameter  $\sigma \approx 0.3$  nm)

- ▶ demixes above critical density

- Nanoparticle

- ▶ hard-sphere (diameter  $3-6 \sigma$ )

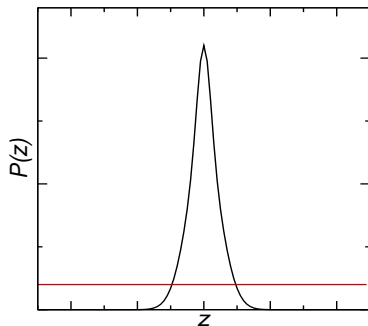
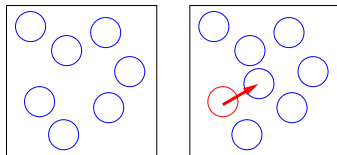
- Grand-canonical Monte Carlo simulations

- ▶ Free-energy profile (effective NP-interface interaction)

$$\beta F(\mathbf{z}) = -\log \mathcal{P}(\mathbf{z})$$

- ▶ Wang-Landau sampling

# Why do we need Wang-Landau?



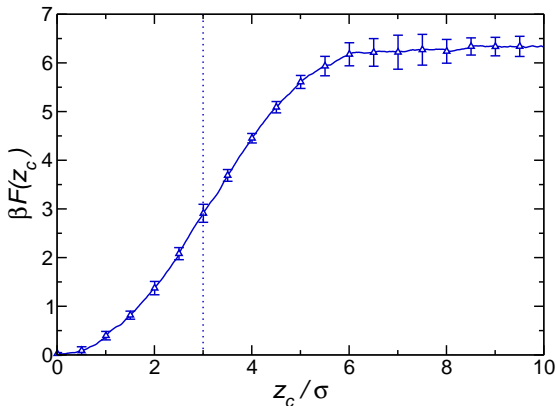
- Detachment energy  $\approx 10 k_B T$
- To accurately determine free energy profile need to sample uniformly across interface





# Nanoparticle-interface interaction

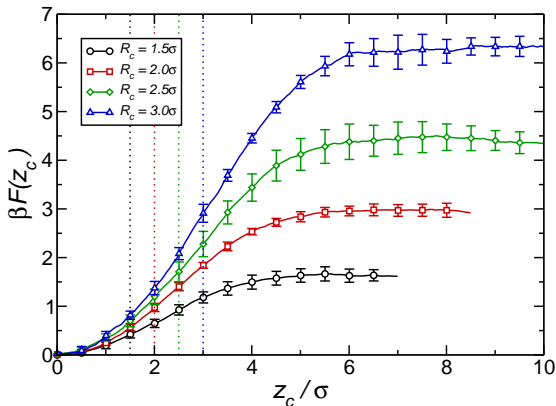
- Free energy profile



- ▶ long-range interaction ( $> R_c$ )
- ▶ detachment energy: 1-10  $k_B T$

# Nanoparticle-interface interaction

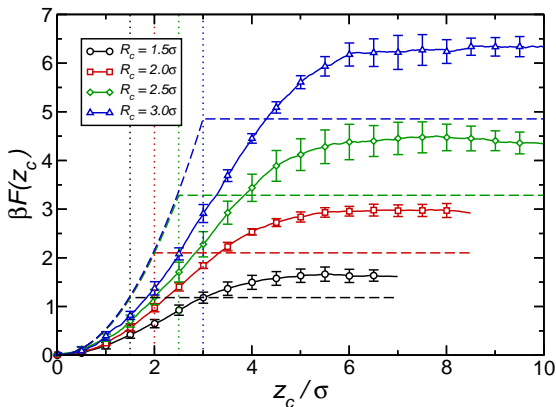
- Free energy profile



- ▶ long-range interaction ( $> R_c$ )
- ▶ detachment energy: 1-10  $k_B T$
- ▶ detachment energy:  $\propto R_c^2$

# Can we use continuum theory?

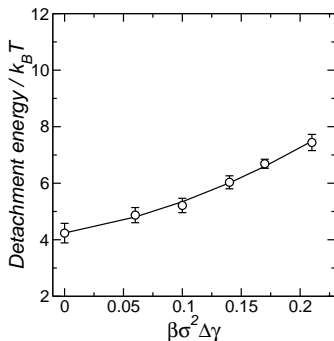
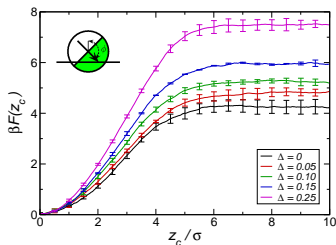
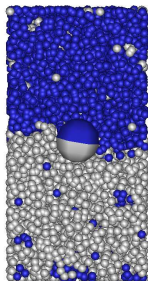
- Free energy profile:  $F(z) = \pi\gamma z^2$  ( $z \leq R_c$ )



- Continuum theory in poor agreement with simulation
  - underestimates interaction range  $\rightarrow$  flat interface approximation

# More complex particles: Janus spheres

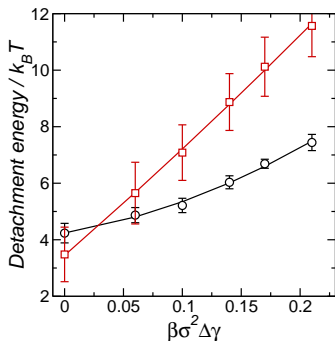
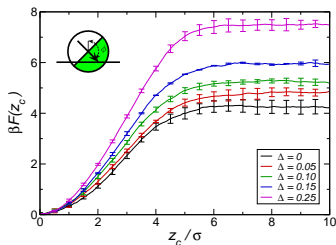
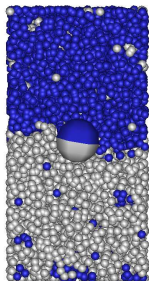
- Hemispheres of different (A-philic/B-philic) functionality



- Stability increases with  $\Delta \gamma$

# More complex particles: Janus spheres

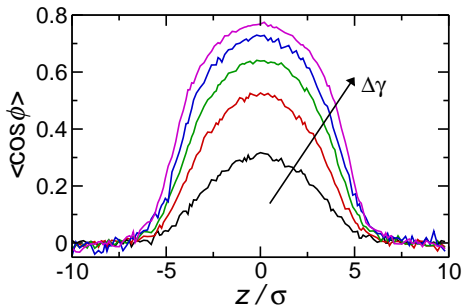
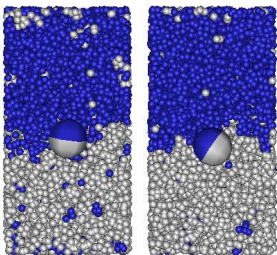
- Hemispheres of different (A-philic/B-philic) functionality



- Stability increases with  $\Delta \gamma$
- Continuum theory: overestimates detachment energy

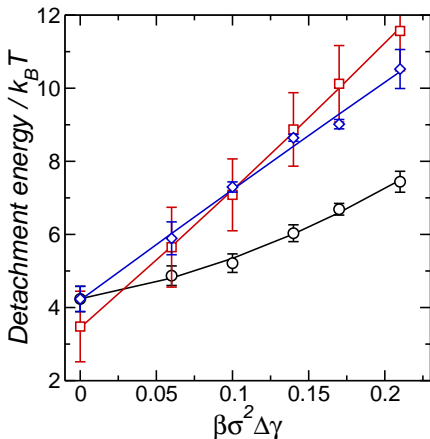
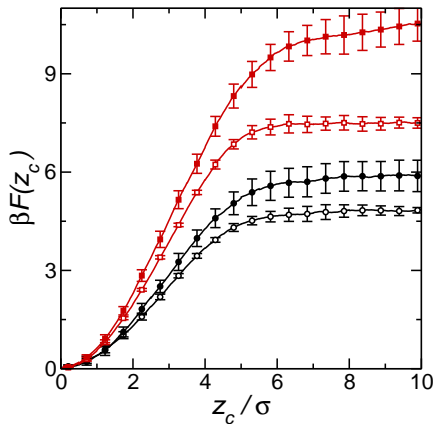
# Nanoparticles rotate

- Theory assumes fixed particle orientation
- nm-sized particles have significant orientation freedom
- Angle between particle orientation and  $z$



# Fixing the orientation

- Stability increased  $\approx 50\%$  for fixed orientation



- ▶ fix orientation experimentally ( $E$  or  $B$  field?)

# Nanoparticle-interface interactions

- Have used molecular simulation to study interaction of nanoparticle with liquid interfaces
  - ▶ interaction is longer ranged than expected - capillary waves
  - ▶ detachment energy is  $1 - 10 k_B T$
  - ▶ detachment energy  $\propto R_c^2$
- Comparison with continuum theory (Pieranski approximation)
  - ▶ underestimates detachment energy
  - ▶ underestimates range of interaction - neglect of capillary waves
- Janus particles
  - ▶ more stable on interfaces, although orientational freedom important



# Outline

## 1 Introduction

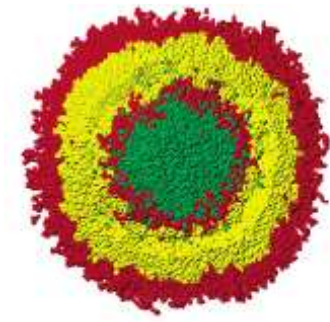
## 2 Nanoparticles at soft interfaces

- Nanoparticle-interface interactions
- Janus particles

## 3 Adsorption on polymer vesicles

## 4 Conclusions

# Polymer vesicles



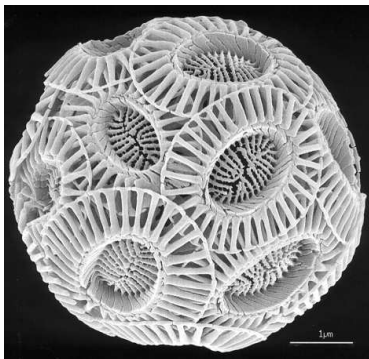
Polymer bilayers forming a fluid-filled sac

- polymersomes - analogous to liposomes
- synthetic minimal cells

Use of polymers enhances the mechanical stability compared to liposomes

- reaction vessels
- drug delivery vehicles

# Armoured vesicles



The stability of polymer vesicles may be further enhanced by a coating of nanoparticles

This occurs in many naturally occurring systems

- bacterial S-layers
- nanopatterned calcium carbonate coating on coccolithophorids

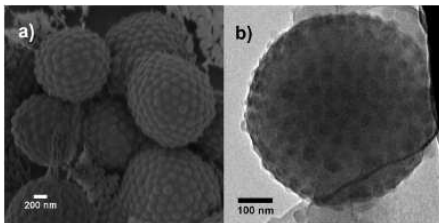
Can this be mimicked in synthetic, polymeric systems?

Y. Shiraiwa, University of Tsukuba

# Experimental system (Bon group, UoW)

Vesicle: poly(*n*-butyl methacrylate)-*b*-(*N,N*-dimethylaminoethyl methacrylate) block co-polymer (1  $\mu\text{m}$  radius)

Nanoparticles: 120 nm and 200 nm diameter anionic polystyrene latex particles



Distinct packing patterns of nanoparticles on vesicle surface

- can we reproduce/predict these packings from simulations?

# Simulations

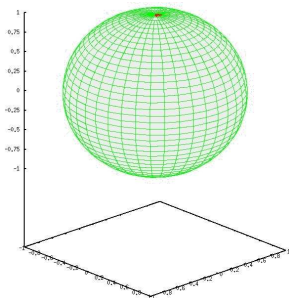
## Monte Carlo simulations

- nanoparticles interact through modified LJ+Yukawa potential

$$V(r) = \epsilon \left[ \left( \frac{r_{eq}}{r} \right)^{24} - 2 \left( \frac{r_{eq}}{r} \right)^{12} \right] + A \frac{\exp(-r/\xi)}{r/\xi}$$

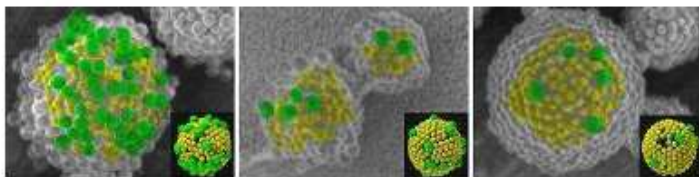
A is related to the charge density on the particle surface

- model vesicle as large sphere
  - ▶ gradually add particles onto vesicle - NPs irreversibly adsorbed
  - ▶ NPs move on the surface (modify normal move acceptance to ensure uniform sampling on spherical surface)



# Comparison

Packing patterns on polymer vesicles (after 14 hours annealing) and from simulations (insets)



- 56%, 78%, and 91% encounter probabilities (relative likelihood of smaller particle attaching to vesicle)

Good agreement between experimental and simulation packing patterns

# Controlling the pattern

Study the effect of changing the the surface charge density

56 % small particles

Increasing charge density →



79 % small particles



91 % small particles



# Adsorption on polymer vesicles

- Experimentally it has been shown that it is possible to coat polymer vesicles in 'nanoparticle-armour'
- Using simple MC simulations can reproduce experimentally observed packing patterns on polymer vesicles
- Find changes in packing patterns with increasing surface charge density
- Further work is to quantify the simulation and experimental packing patterns



# Conclusions

- Molecular simulation provides a powerful tool for the investigation of interfacial systems
- Gives molecular insight that is complementary to experimental studies
  - ▶ test/refine theories
  - ▶ study molecular details difficult/impossible to resolve experimentally
  - ▶ gives precise control over the system parameters

## References:

### Nanoparticle-interface interactions

DLC & S. Bon, *Phys. Rev. Lett.*, **102**, 066103 (2009)

DLC & S. Bon, *Soft Matter*, **5**, 3969 (2009)

### Armoured vesicles

R Chen *et al*, *J. Am. Chem. Soc.*, **133**, 2151 (2011)

# Acknowledgements

## Collaborators

- Warwick  
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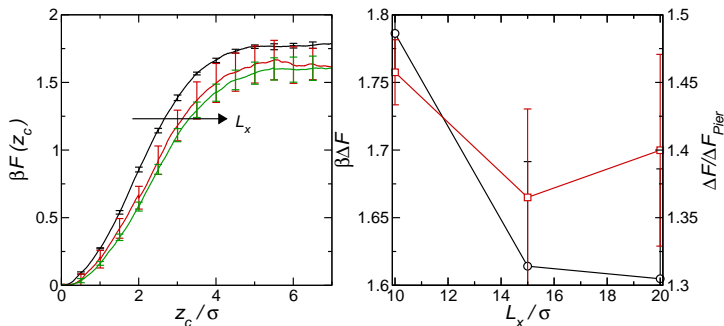


# Model & method

- Study system using grand-canonical MC simulations
  - ▶ simulations at different (solvent) chemical potentials  $\beta\mu = 0.15\dots 0.35$  ( $\beta\mu_c \approx 0.04$ )
  - ▶ confine system in z-direction: localises the interface near cell centre
- Calculate free energy profile
  - ▶  $\beta F(z_c) = -\log \mathcal{P}(z_c)$
  - ▶ find probability distribution using Wang-Landau sampling
  - ▶ divide separation into overlapping windows
- Calculate interfacial tension

# System-size dependence

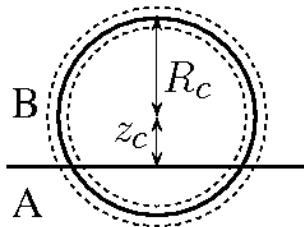
- System-size dependence (lateral box length  $L_x$ )



- Consistent with decrease in  $\gamma$ 
  - ▶ interaction range increases
  - ▶ barrier decreases

# Varying wettabilities

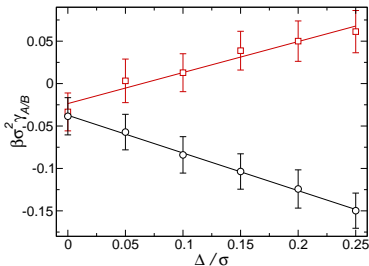
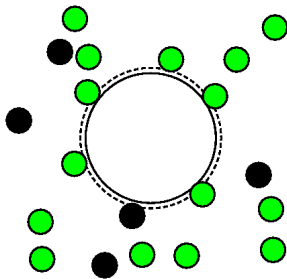
- Stability controlled by changing surface tensions
  - ▶ Experimental systems:  
different  $\gamma$  for two components
  - ▶ polystyrene-water:  
 $\gamma=32 \text{ mN m}^{-1}$
  - ▶ polystyrene-hexadecane:  $\gamma=14.6 \text{ mN m}^{-1}$
- Simulate non-symmetric case
  - ▶ use different radii for the two components
  - ▶  $R_{A/B} = R_c \mp \Delta$
  - ▶  $R_c = 2.5\sigma$  and  $\Delta \leq 0.1R_c$
  - ▶  $\beta\mu = 0.15$



# Diversion: calculating $\gamma_{iP}$

- To make contact with continuum theories need to calculate  $\gamma_{AP}$  and  $\gamma_{BP}$
- Bresme & Quirke
  - ▶ free energy change from change in nanoparticle radius

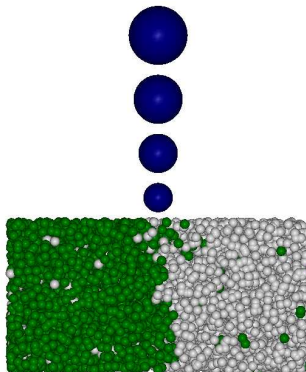
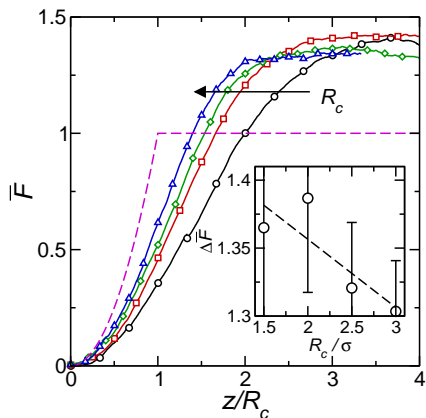
$$\Delta F = (4\pi R_c^2 \Delta R)P + (8\pi R_c \Delta R)\gamma$$



- $\Delta\gamma < 8 \text{ mN m}^{-1}$

# Towards the continuum limit

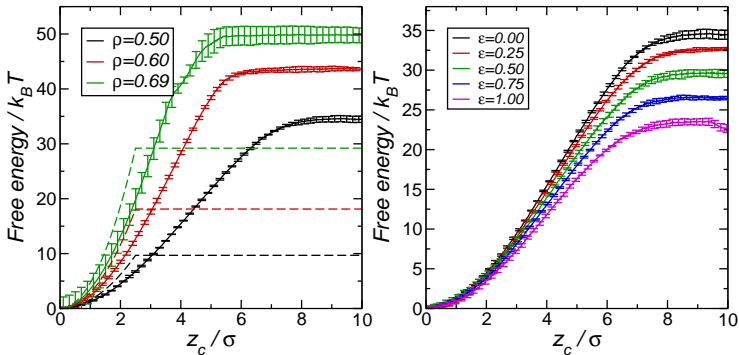
- As particle size increases continuum theory becomes more accurate





# Not just hard spheres

- Binary Lennard-Jones fluid



- Qualitative results same as for WR mixture
- Attractive NP-fluid interactions decrease NP stability