### Nucleation in Hard Spheres Systems

#### Sven Dorosz

University of Luxembourg, Group of Tanja Schilling - Softmatter Theory

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#### Background and Motivation

Homogenous nucleation Heterogenous nucleation

# Softmatter



Liquids, colloids, polymers, foams, gels, granular materials, and a number of biological materials.

Illustration taken from SoftComp website

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3 Heterogenous nucleation

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## **Classical Nucleation Theory**



$$\Delta G = 4\pi\gamma R^{2} + \frac{4\pi\Delta\mu\rho}{3}R^{3} \qquad \qquad R^{*} = \frac{2\gamma}{\rho|\Delta\mu|}$$
$$\Delta G_{crit} = \frac{16\pi\gamma^{3}}{3(\rho|\Delta\mu|)^{2}} \qquad \qquad I = \kappa \exp\left[-\frac{16\pi\gamma^{3}}{3k_{B}T(\rho|\Delta\mu|)^{2}}\right]$$

source Hamed Maleki, PhD Thesis, University of Mainz, 2011

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# Hard Spheres

$$V(r) = \begin{cases} \infty & \text{if } r < R \\ 0 & \text{if } r \ge R \end{cases}$$

collisions

are elastic  $\Rightarrow$  internal energy constant

$$F = -TS$$

most simple model for a liquid

$$\eta = \frac{1}{6}\pi R^3 \rho$$

The equation of state is given by

$$\frac{\beta P}{\rho} = \frac{(1+\eta+\eta^2)}{(1-\eta)^3}$$



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# Phasediagram for Hard Spheres





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Background and Motivation

Homogenous nucleation Heterogenous nucleation

### Comparison Experiment to Theory



Stefan Auer and Daan Frenkel, Nature 409, 1020-1023 (2001)

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### Motivation Event driven molecular dynamics

time driven MD simulation vs. event driven MD simulation



#### V(r) discontinuous $\Rightarrow$ free flight between collisions NVE ensemble $\Rightarrow$ T is trivial parameter $\Rightarrow$ sets timescale

Alder, B. J., and Wainwright, T. E., 1957, J. chem. Phys., 27, 1208.

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# Algorithm Event driven molecular dynamics

Diagram

- $\Rightarrow \mathsf{Neighboring}\ \mathsf{boxes}$
- Find the first collision for each particle
- Insert into collision list don't execute yet
- Then execute earliest collision
- Find next collision of the two particles  $\Rightarrow$  update the list
- Then execute earliest collision ...

Algorithm by setup serial execution scales with  $N \log N$ . N number of particles in system

### Local crystal symmetry

Hard spheres system.  $\rho = 1.03$ 

Loading

### Local crystal symmetry



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### Definition of the order parameter

Observables for the Local Bond Ordering: *In 3d:* 

$$ar{q}_{6m}(i) := rac{1}{n(i)} \sum_{j=1}^{n(i)} Y_{6m}(ec{r}_{ij}) \quad , r_{ij} < 1.4$$

where  $Y_{6m}(\vec{r}_{ij})$  are the spherical harmonics (with l=6).

P. J. Steinhardt, D. R. Nelson, and M. Ronchetti. Phys. Rev. B, 28(2), 1983

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### Distribution of the order parameter

scalar product  $\vec{q_6}(i) \cdot \vec{q_6}^*(i)$ 



source Hamed Maleki, PhD Thesis, University of Mainz, 2011

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### Local crystal symmetry

scalar product  $\vec{q_6}(i) \cdot \vec{q_6}^*(j)$  measures relative angle orientation



 $\vec{q_6}(i) \cdot \vec{q_6}^*(j) < 0.7$ 

 $\vec{q_6}(i) \cdot \vec{q_6}^*(j) > 0.7$ 

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# Detecting emerging crystallites

If particle i and  $n_b$  neighbouring particle j satisfy  $\vec{q_6}(i) \cdot \vec{q_6}^*(j) > 0.7$ 





Crystalline particles (colorcoded "green"),  $n_b > 10$ . Low symmetry cluster (LSC)(colorcoded "light brown"),  $n_b > 5$ .

# Motivation

- How do the theoretical nucleation rates compare to the experiment? (Brute force molecular dynamics simulation)
- What are the structural properties of the emerging nuclei?
- Can we identify characteristic preconditions near nucleation sites?
- What are the properties of the growing nuclei?

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### nucleation rates



 $\Rightarrow$  MD and MC simulations produce rates match the experimental results  $\Rightarrow$  SPRES as the first full non equilibrium rare event sampling method

Schilling T.; Dorosz S.; Schöpe H. J.; et al. JPCM, 23, 19, 194120, 2011 🛛 🔬 🕞 🕨 🤄 🚍

### Precursor nucleation



 $\Rightarrow$  Effective two step process. Precursor formation

Schilling T.; Dorosz S.; Schöpe H. J.; et al. JPCM, 23, 19, 194120, 2011

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### Radius of gyration



#### $\Rightarrow$ Small crystallites are far from being spherical

Schilling T.; Dorosz S.; Schöpe H. J.; et al. JPCM, 23, 19, 194120, 2011

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# **SPRES**

#### Going to lower densities $\rho$ .



J.T. Berryman and T. Schilling. Sampling rare events in nonequilibrium and nonstationary systems. J Chem Phys, 133(24):244101, 2010.

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# Motivation

- Will the substrate induce different nucleation pathways?
- Where does the nucleation happen?
- What are the consequences of the mismatch between substrate and equilibrium crystal lattice constant?
- What is the crystal structure of the nucleus?
- How does the substrate change the nucleation rate?

### Setup of the system

Super-saturated fluid of hard spheres in contact with a triangular substrate.



A (10) > (10)

### Parameters

N = 220200 (216000 bulk + 4200 substrate) particles N/V = 1.005 ( $\eta = 0.526$ ) - 1.02 ( $\eta = 0.534$ ) Corresponding chemical potentials  $-\Delta \mu \simeq 0.50 - 0.54 \ k_B T$ 



Rintoul, Md. and Torquato, S., 1996, PRL 77, 20, 4198-4201.

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### Immediate wetting

 $a < a_{sp}$ 





$$t = 6D$$

t = 70D

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S.D. and T. Schilling, 2012, J. Chem. Phys. 136, 044702.

## Vertical density profile



S.D. and T. Schilling, 2012, J. Chem. Phys. 136, 044702.

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### The first layer

at t > 150D





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$$a = 1.01\sigma$$

$$a = 1.1\sigma$$

S.D. and T. Schilling, 2012, J. Chem. Phys. 136, 044702.

### Defect density



 $\Rightarrow$  Induced defects are compensated in the first 3 layers

# 3 layer stacking





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#### $\Rightarrow$ Domains of ABA and ABC structure

S.D. and T. Schilling, 2012, J. Chem. Phys. 136, 044702.

# 5 layer stacking



 $\Rightarrow$  Crystal grows in random hexagonal closed packing (RHCP)

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### Nucleation at the wall

 $a > a_{sp}$ 





$$t = 6D$$

t = 80D

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S.D. and T. Schilling, 2012, J. Chem. Phys. 136, 044702.

### **Droplet** characterization



 $\Rightarrow$  non-spherical droplets even up to 4000 particles.

S.D. and T. Schilling, 2012, J. Chem. Phys. 136, 044702.

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### Nucleation rates



 $\Rightarrow$  Decreasing nucleation rate with increasing mismatch to the substrate S.D. and T. Schilling, 2012, J. Chem. Phys. 136, 044702.

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# Softmatter Theory Group - UL



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M. Radu, M. Esposito, M. Mathew, Z. Heng, and G. Diana.

#### There is an open postdoc position.

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