

# Jammed Packings of Hard Particles

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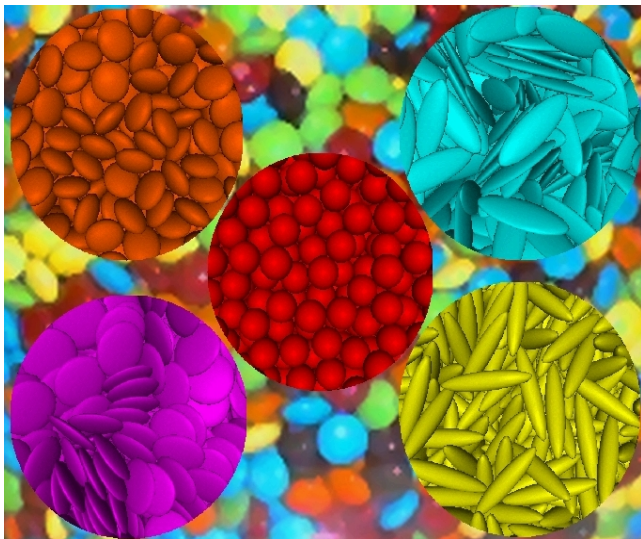
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9th June 2006

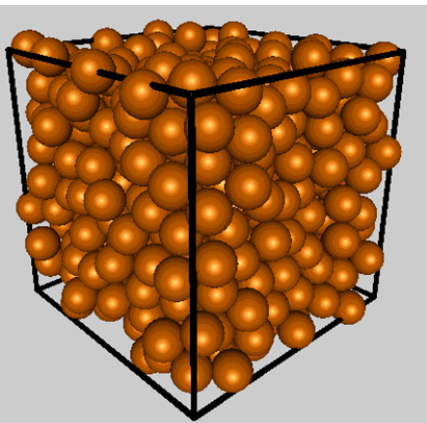
FPO Presentation



# What my dissertation is about?



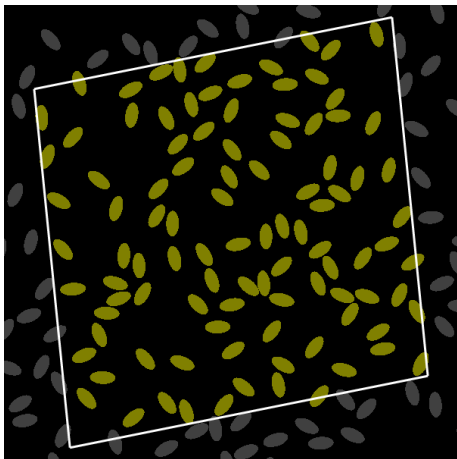
# Why Study Packings?



- Good starting **models** for the structure of diverse **materials**: *granular media, colloids, liquids, glasses, crystals...*
- Packing problems are **ancient** in mathematics and in real-life: *Densest packing of a shape in  $\mathcal{R}^d$*
- Hard-particle problems are **hard!**
- **Multidisciplinary** field: *physical sciences, mathematics, engineering, computer science, biology.*



# Jamming

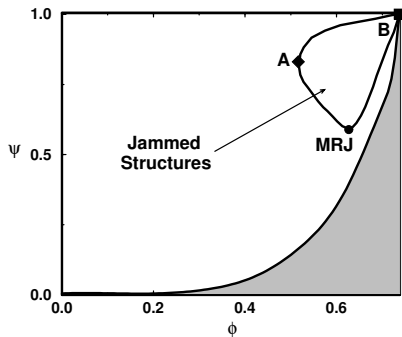


(MNG)(MPEG)

- **Jammed (rigid) packing:**  
Particles are locked in their positions despite thermal agitation/shaking and/or boundary deformations/loading.
- **Boundary conditions** determine different **jamming categories** (*local, collective, strict*):
  - frozen particles, hard walls, or periodic
  - fixed or flexible



# Randomness

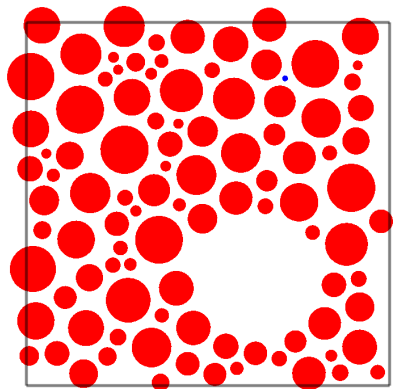


Distinguish configurations based on **how disordered** they are

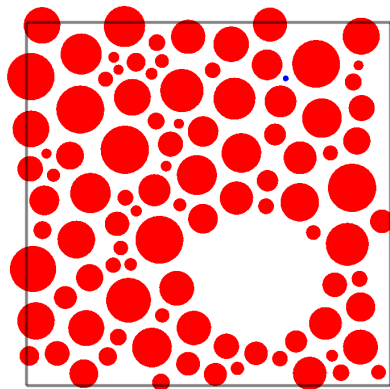
- A **scalar order metric**  
 $0 \leq \psi \leq 1$  (translational, orientational, bond-orientational, etc.)
- Special **dynamics-independent** point: **Maximally Random Jammed (MRJ)** state
- *Is there a “universal” order metric: **Entropy** (information-content)?*



# Configurational-Space View



(MNG) (MPEG)



(MNG)

Faster (fastest?) compression leads to MRJ (MNG).



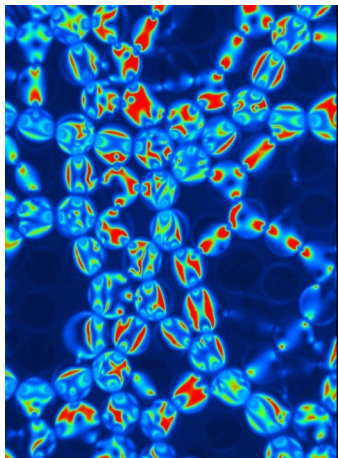
# Summary of Main Results

In this dissertation, we *develop* and *discover that*:

- Event-driven MD algorithms for nonspherical particles.
- Algorithms based on rigidity theory and mathematical programming to test for jamming.
- Asphericity dramatically affects the density and contact number.
- Experimentally verify the simulation predictions.
- The densest-known crystal packing of ellipsoids.
- Unexpected short-range and long-range correlations in disordered hard sphere packings for  $d \geq 3$ .
- Orientationally-disordered tetratic solid phase for hard dominos.
- There is no ideal glass transition for binary hard-disk mixtures.



# Molecular Dynamics (MD) Algorithm



(MNG) (MPEG)

*Behringer et al.*

- Event-driven MD (**EDMD**) packing algorithm *a la* **Lubachevsky-Stillinger**
- Sophisticated optimized algorithm (**NNLs**, bounding complexes, etc.) tailored for hard particles.
- The workhorse of this research program!
- "*Neighbor List Collision-Driven Molecular Dynamics Simulation for Nonspherical Particles.*"

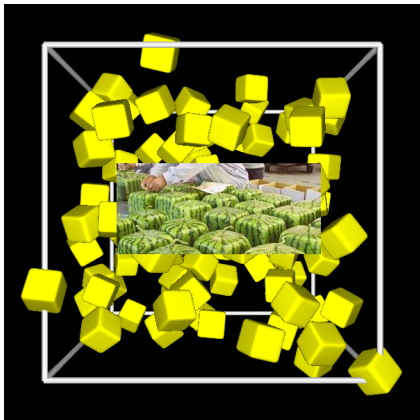
**A. Donev**, F. H. Stillinger, and S. Torquato

**J. Comp. Phys.**, 2005

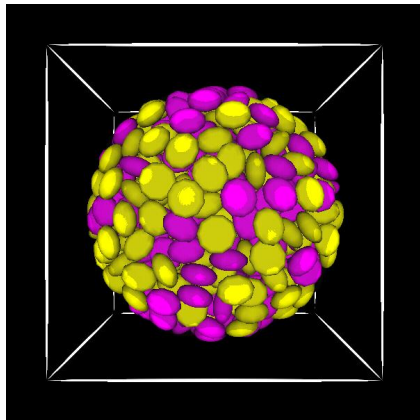




# Packing for Different Shapes/Containers



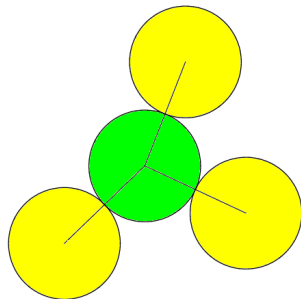
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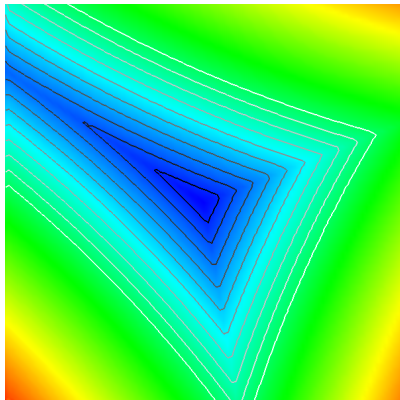
(MNG)(MPEG)



# Jamming as Configurational Entraping



(MNG) (MPEG)



# Jamming Polytope $\mathcal{P}_{\Delta R}$

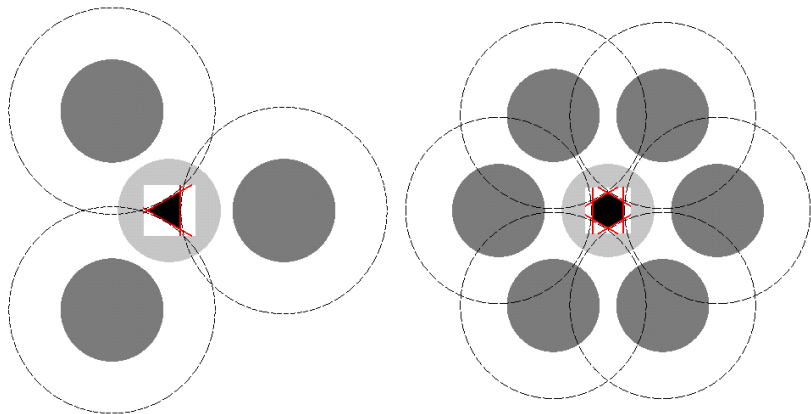
- We have a **jamming polytope**  $\mathcal{P}_{\Delta R}$  :  $\mathbf{A}^T \Delta \mathbf{R} \leq \Delta \mathbf{I}$ , as given by the **rigidity matrix  $\mathbf{A}$** .
- Jamming *implies* existence of **contact forces**:

$$\mathbf{A}\mathbf{f} = 0 \text{ and } \mathbf{f} \geq 0$$

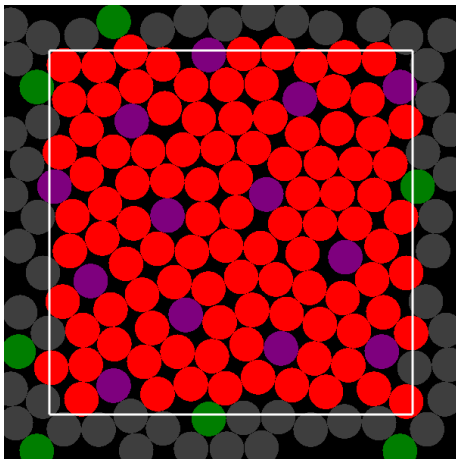
- Theorem: If the packing is jammed than  $\mathcal{P}_{\Delta R}$  is closed for  $\phi > \phi_J [1 - \delta_{\max}(N)]$ .
- If the number of contacts  $M = N_f \approx Nd$ , i.e.,  $\bar{Z} = 2d$ , the jamming polytope is a **simplex**, corresponding to an **isostatic** packing.



# Simplices and Isostatic Packings



# Collective Unjamming Motions



(MNG) (GIF)

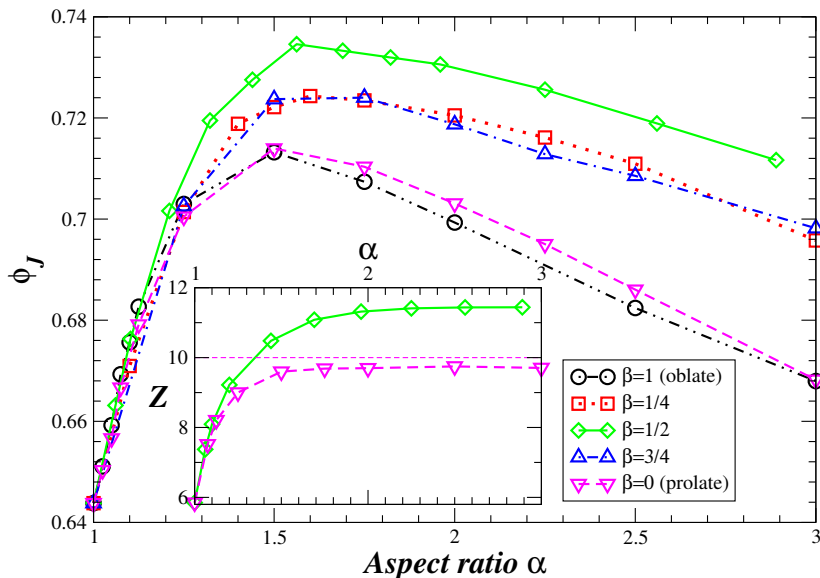
- Using *randomized sequential linear programming* to find collective unjamming motions.
- "A Linear Programming Algorithm to Test for Jamming in Hard-Sphere Packings"  
**A. Donev**, S. Torquato, F. H. Stillinger, and R. Connelly, **J. Comp. Phys**, 2004



# Random Packing of Ellipsoids

- If the EDMD algorithm is applied to spheres with **random initial conditions** and a growth rate  $\gamma$  that is on the order of  $10^{-2} - 10^{-5}$  times smaller than the velocity, the terminal **disordered (random) packings** have a (**jamming**) density  $\phi \approx 0.64 - 0.65$ .
- *Extrapolation*: Apply the same procedure to ellipsoids with axes  $a : b : c = 1 : \alpha^\beta : \alpha$ .
- Here  $\alpha > 1$  is the **aspect ratio** (ratio of subscribed and circumscribed sphere diameters).
- And  $0 \leq \beta \leq 1$  is the “oblateness”, or **skewness** ( $\beta = 0$  is **prolate**,  $\beta = 1$  is **oblate**).



Density  $\phi$  and Contact Number  $\bar{Z}$ 

# Isostaticity Breaks Down for NonSpheres

- The maximum  $\phi$  (and  $\bar{Z}$ !) is for axes  $0.8 : 1 : 1.25$  ( $\beta = 0.5$ ,  $\alpha \approx 1.6$ ) and it approaches that of **crystallized spheres**,  $\phi \approx 0.735$ . These are **ollipsoids**.
- **Isostatic conjecture:** Large random jammed packings have

$$Z \rightarrow 2d_f$$

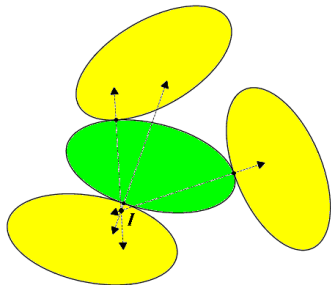
where  $d_f$  is the number of degrees of freedom *per particle*.

- For spheres,  $Z_{\text{isostatic}} = 6$ , for spheroids  $Z_{\text{isostatic}} = 10$ , and for asymmetric shapes  $Z_{\text{isostatic}} = 12$
- For ellipsoids with large  $\alpha \gtrsim 2$  the isostatic conjecture holds *approximately*, but generally  $Z < Z_{\text{isostatic}}$ .





# When Curvature Matters

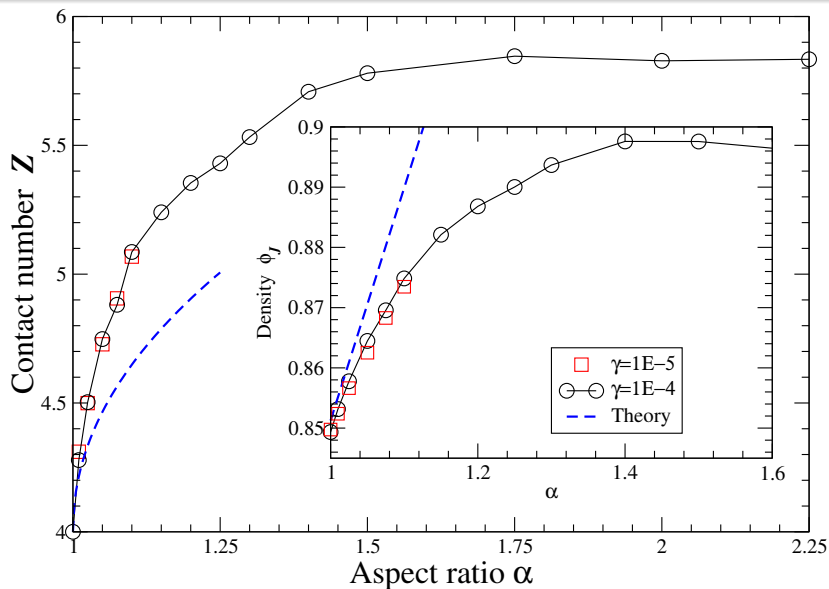


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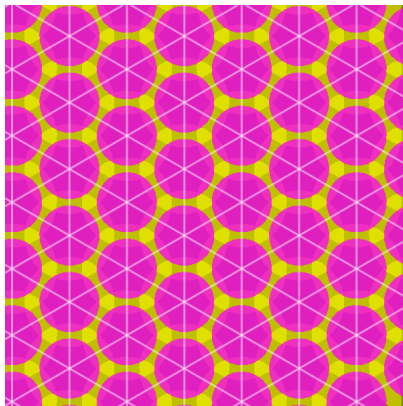
- Forces are balanced, and the torque is identically zero!
- Application of torque will cause a **finite deformation** decreasing with the elastic moduli.
- “*Hypostatic Jammed Packings of Hard Ellipsoids*”  
**A. Donev**, R. Connelly, F. H. Stillinger and S. Torquato, **Phys. Rev. E**



## Near-Sphere Expansion



# The BCMD Algorithm: Disks



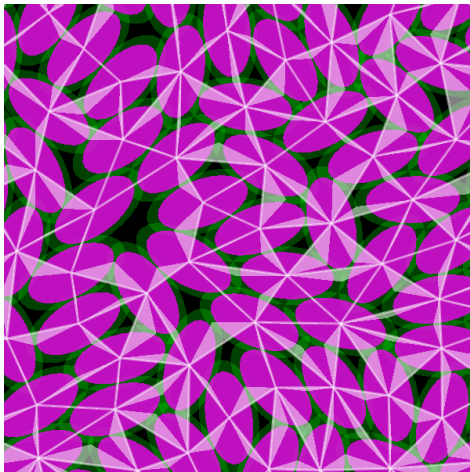
Link: [Graphics/LSD.HS.2D.BCMD.mpg](#)

*“Calculating the Free Energy of Nearly Jammed Hard-Particle Packings Using Molecular Dynamics”,*

**A. Donev**, F. H. Stillinger and S. Torquato, **J. Comp. Phys.**



# The BCMD Algorithm: Ellipses



Link: [Graphics/LSD.HE.2D.BCMD.mpg](#)

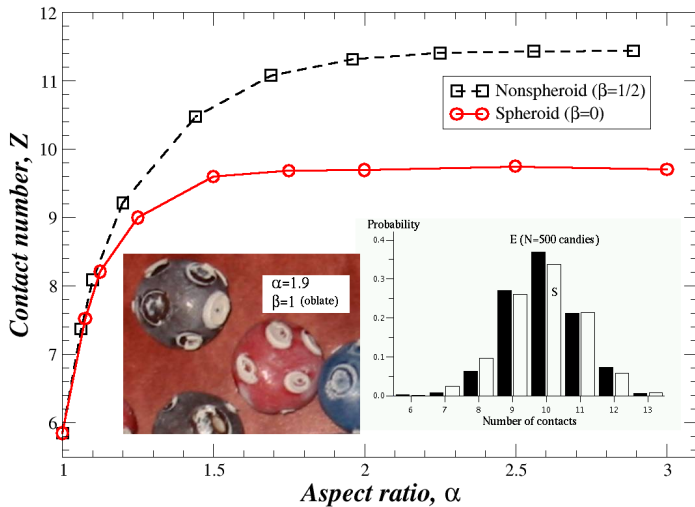


# Packing MMs



- Compare computer-generated packings to experiments with M&Ms!
- *"Improving the Density of Jammed Disordered Packings using Ellipsoids"*  
**A. Donev**, I. Cisse, D. Sachs, E. A. Variano, F. H. Stillinger, R. Connelly, S. Torquato and P. M. Chaikin  
**Science, 2004**



Contact Number  $Z$ 

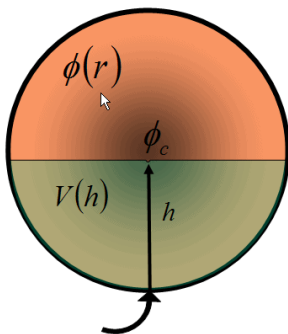
# Comparing Simulation to Experiment



- Manufacture 1000 ellipsoids using **stereolithography**.
- We need to correct for the strong **finite-size** and **boundary** effects!
- "*Experiments on Random Packings of Ellipsoids*"  
W. Man, **A. Donev**, F. H. Stillinger, M. T. Sullivan, W. B. Russel, D. Heeger, S. Inati, S. Torquato and P. M. Chaikin  
**Phys. Rev. Lett., 2005**



# High-School Approach



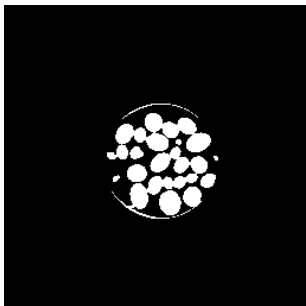
- Formally  $1 - \phi(r) = \frac{1}{2\pi r} \frac{\partial^2 V(h=r)}{\partial h^2}$ .
- Fitting  
 $V(h) = \frac{\pi}{3}(1 - \phi_c)h^3 - AR^2 + B$  with a **cubic fit** works well!
- It is confirmed that  $\phi_c \approx 0.74$  but it cannot really determine  $\phi(r)$ .
- Use MRI to really determine the structure!

$$V(h) = \int_h^R 2\pi r^2 \left(1 - \frac{h}{r}\right) [1 - \phi(r)] dr$$





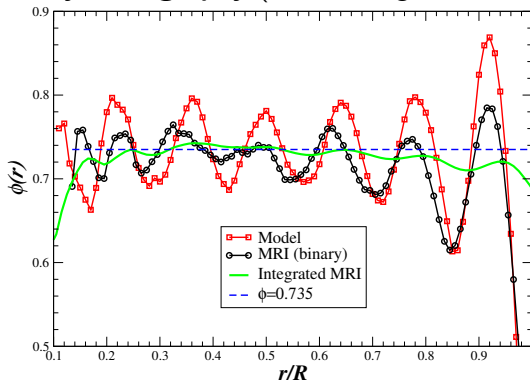
# High-Tech Approach



(MNG) (MPEG)

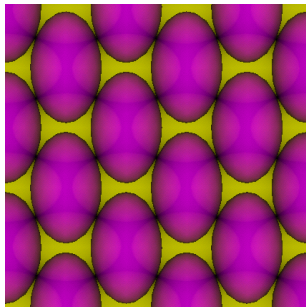
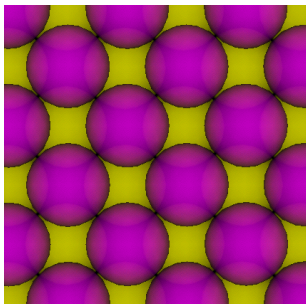
Compare **MRI** with  
previous techniques

**Confocal microscopy** (colloids, Makse, 2004)  
**X-ray tomography** (ball bearings, Aste, 2004)



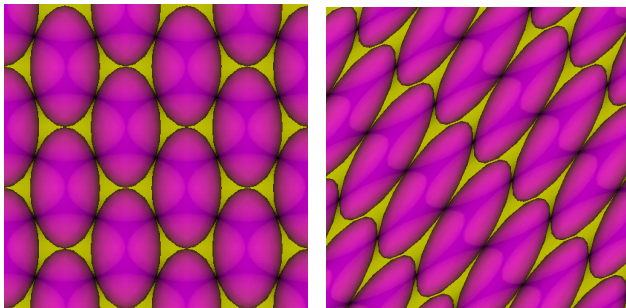
# Layered Ellipsoid Crystal

- "*Unusually Dense Crystal Packings of Ellipsoids*"  
**A. Donev**, F. H. Stillinger, P. M. Chaikin and S. Torquato, **Phys. Rev. Lett.**, 2004
- *MD recipe*: **Slow growth, small systems, deforming unit cell**



# The Densest Ellipsoid Packing

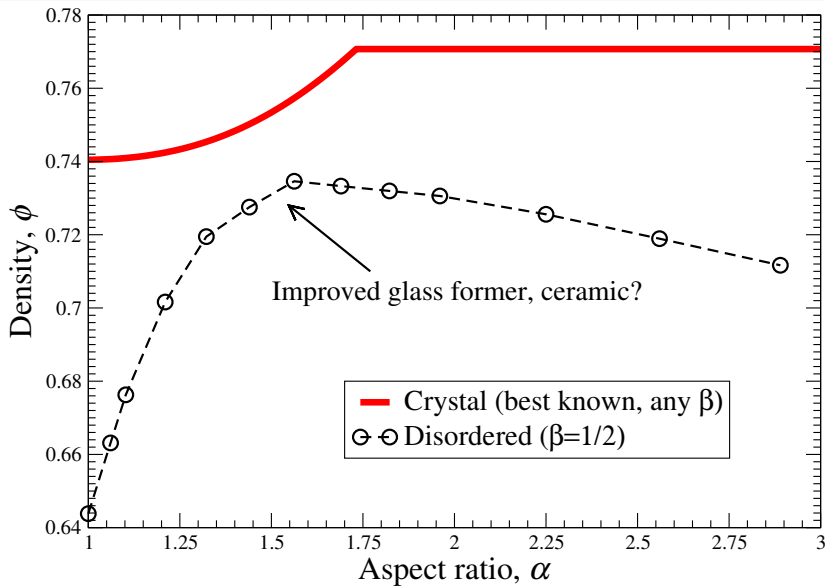
- Higher symmetry leads to higher densities:  $\phi \approx 0.77$ ,  $Z = 14$
- Works for  $\alpha = 1 + \sqrt{3}$  or higher: Just apply an **affine** stretch!



- We do **not** know if there are denser packings of ellipsoids...some equilibrium thermodynamics indications!



## Disordered vs. Ordered Packing Density



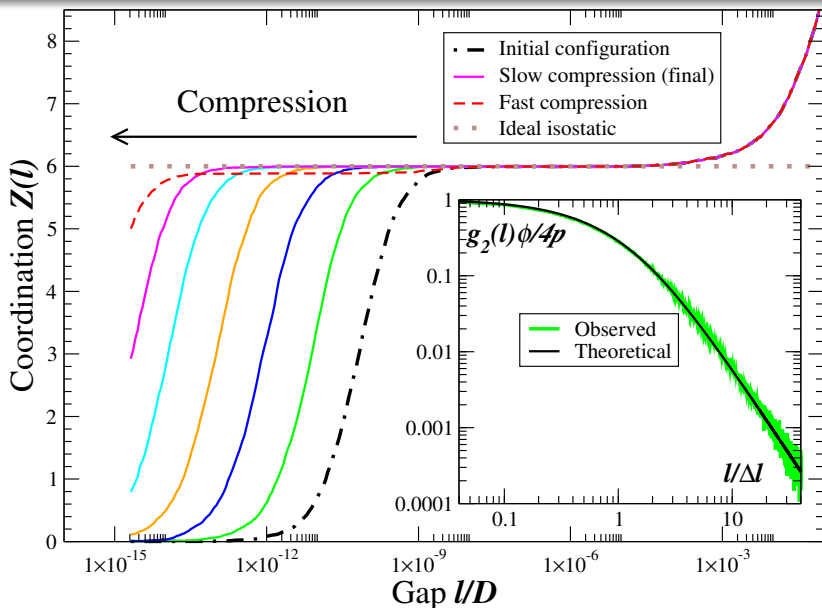
# Pair-Correlation Function

- $g_2(r) = \frac{\langle P(r) \rangle}{\rho s_1(r)} = \frac{\bar{Z} \delta(r-D)}{\rho s_1(D)} + g_2^{(b)}(r) + g_2^{(rest)}(r)$
- Use the *cumulative coordination number*  $Z(l) = \frac{N}{V} \int_{r=D}^{D+l} 4\pi r^2 g_2(r) dr$
- **Delta-function region**  $g_2^{(\delta)}(x)$ , gap  $x = (r - D)/D$
- **Near-contact region** (background)  $g_2^{(b)}(x)$
- **Split second-peak** and remaining oscillations

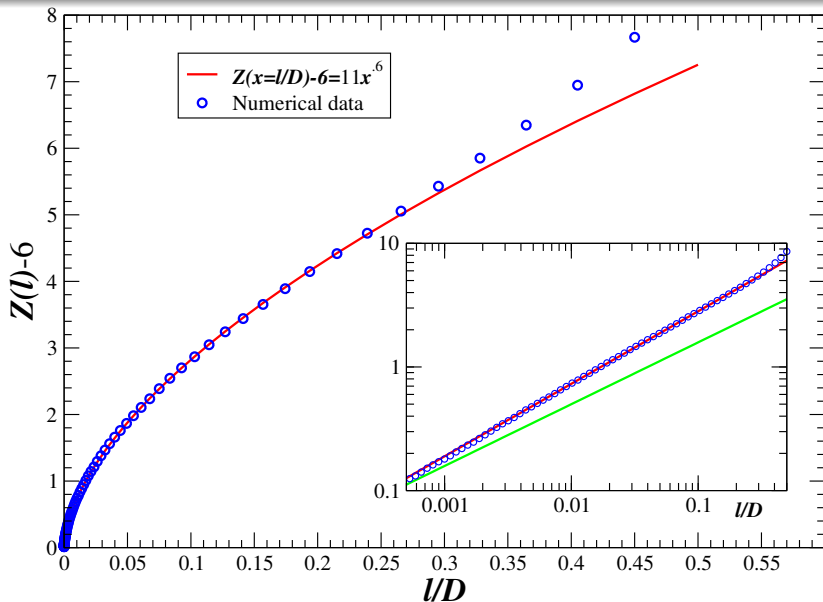
"Pair Correlation Function Characteristics of Nearly Jammed Disordered and Ordered Hard-Sphere Packings", **A. Donev**, S. Torquato and F. H. Stillinger, **Phys. Rev. E**, 2005



## Delta-Function Region



## Near-Contact Region



# Structure Factor

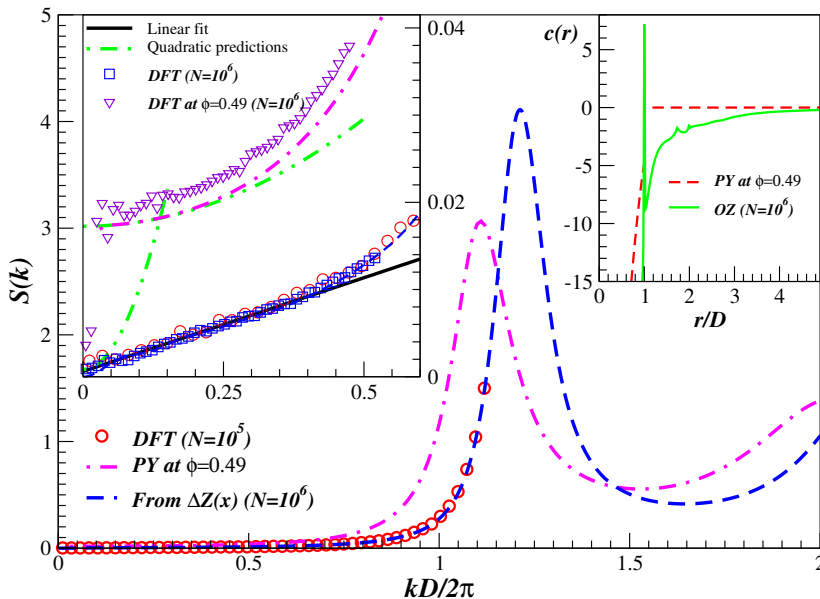
- Fourier transform of the total correlation function  $h(r) = g_2(r) - 1$ ,

$$S(k) = 1 + \rho \hat{h}(k).$$

- For disordered hard sphere packings  $S(k)$  shows a large peak at  $kD = 2\pi$  due to short-range ordering.
- The width of the first peak is inverse correlation length.
- **Hyperuniform** systems: Infinite wavelength density fluctuations vanish,  $S(k = 0)$ .
- “*Unexpected Density Fluctuations in Jammed Disordered Sphere Packings*”, **A. Donev**, S. Torquato and F. H. Stillinger, **Phys. Rev. Lett.**, 2005





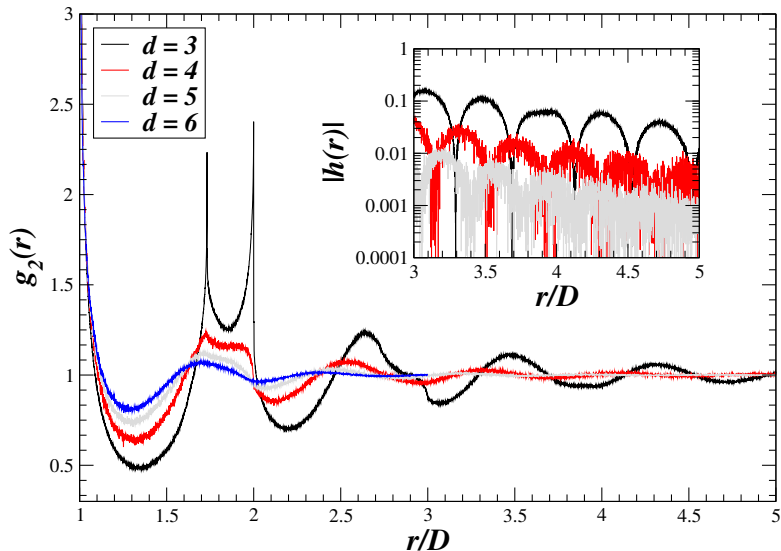
Non-analytic  $S(k) \sim |k|$ 

# Packing Densities

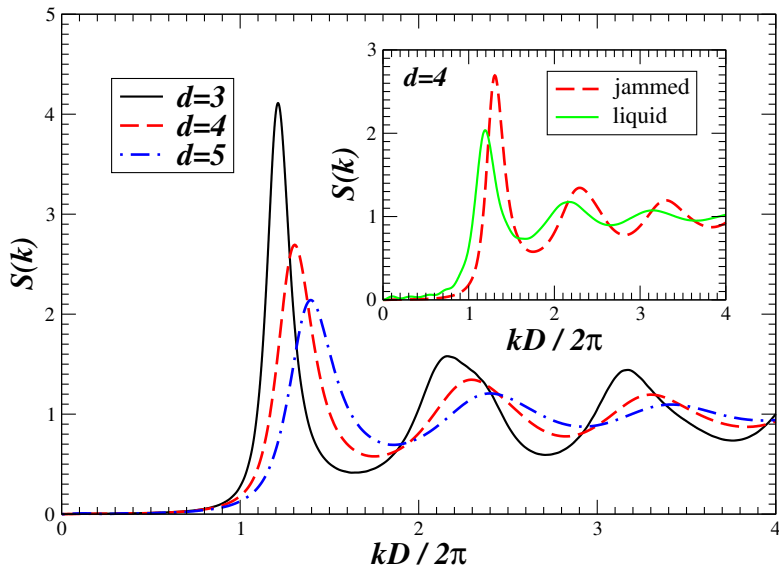
Packing fraction	$d = 3$	$d = 4$	$d = 5$	$d = 6$
$\phi_F$	0.494	$0.32 \pm 0.01^*$	$0.19 \pm 0.01^*$	-
$\phi_M$	0.545	$0.39 \pm 0.01^*$	$0.24 \pm 0.01^*$	-
$\phi_{MRJ}$	$0.645 \pm 0.005$	$0.46 \pm 0.005^*$	$0.31 \pm 0.005^*$	$0.20 \pm 0.01^*$
$\phi_{max}$	0.7405...	0.6169...	0.4652...	0.3729...
Lattice	FCC/HCP	Checker $D_4$	$D_5$	Root $E_6$
$Z_{max}$	12	24	<b>40-46</b>	<b>72-82</b>

*"Packing Hyperspheres in High-Dimensional Euclidean Spaces"*, M. Skoge, A. Donev, F. H. Stillinger and S. Torquato, **Phys. Rev. E**

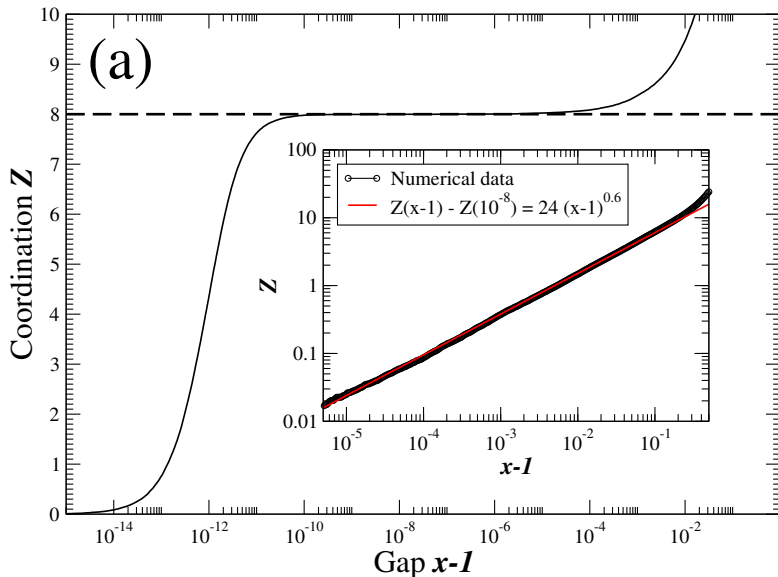


$g_2(r)$  Decorrelation

# $S(k)$ Decorrelation



## Near-Contact Region

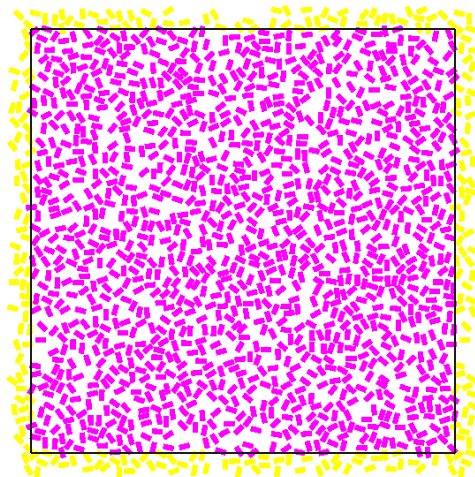


# Near-Contact Divergence

- We numerically observe  $Z(x) = \bar{Z} + Z_0 x^{0.6}$ , where  $\bar{Z} = 2d$
- We measure  $Z_0^{3D} = 11$ ,  $Z_0^{4D} = 24$ , and  $Z_0^{5D} = 40$ .
- Compare to **kissing numbers**  $Z_{max}^{3D} = 12$ ,  $Z_{max}^{4D} = 24$ ,  
 $Z_{max}^{5D} = 40 - 46$ ,  $Z_{max}^{6D} = 72 - 80$ .
- Disordered packings might be **deformed crystal packings**, in which the true contacts are deformed into near contacts, and only the minimal number of contacts necessary for jamming is preserved.



# Hard-Domino Systems

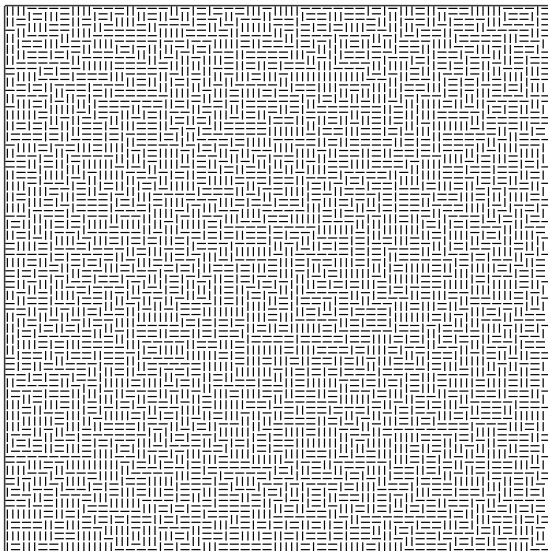


(MNG) (GIF)

- **Tetratic** liquid phase is observed (quasi-KTHNY?).
- Can a “disordered” **domino tiling** be the stable solid phase?
- *“Tetratic Order in the Phase Behavior of a Hard-Rectangle System”*  
**A. Donev**, J. Burton, F. H. Stillinger and S. Torquato,  
Phys. Rev. B., 2006



# Random Domino Tilings





# Analogies: Soft versus Hard

Soft	Hard	Notes
$T \downarrow$	$p \uparrow$	State control variable
$T \downarrow$	$\phi \uparrow$	Alternative state
<b>inherent structure</b>	<b>jammed packing</b>	Exact in certain limit
$U_{IS}$	$\phi_J$	Basin depth
<b>saddle point</b>	<b>hypostatic packing</b>	$x \equiv (M - N_f)/N$
$f_{vib}^{IS}$	$\ln  \mathcal{P}_{\Delta R}  / N$	Exact for isostatic
<b>Cooling rate</b>	<b>Expansion rate</b>	Quenching
<b>Barrier height</b>	?	No energy, only entropy!

“Do Binary Hard Disks Exhibit an Ideal Glass Transition?”, **A. Donev**, F. H. Stillinger and S. Torquato, **Phys. Rev. Lett.**, 2006  
 “Configurational Entropy of Binary Hard-Disk Glasses”, **J. Chem. Phys.**



# Inherent-Structure Formalism

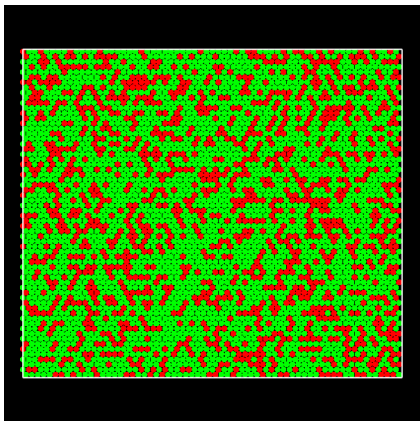
- Let the number of jammed packings be  $N_g(\phi_J) = \exp[S_c(\phi_J)] = \exp[N \cdot s_c(\phi_J)]$ , where the **configurational entropy**  $s_c(\phi_J)$  must vanish at some density  $\phi_J^{\max} < \phi_{CP}$ .
- Liquid free energy embodies competition between **free-volume** and **degeneracy**:

$$f_L(\phi) = f_{FV} \left[ \phi, \hat{\phi}_J(\phi) \right] - s_c \left[ \hat{\phi}_J(\phi) \right] = - \left[ d \ln \left( 1 - \frac{\phi}{\hat{\phi}_J} \right) - f_J \right] - s_c(\hat{\phi}_J)$$

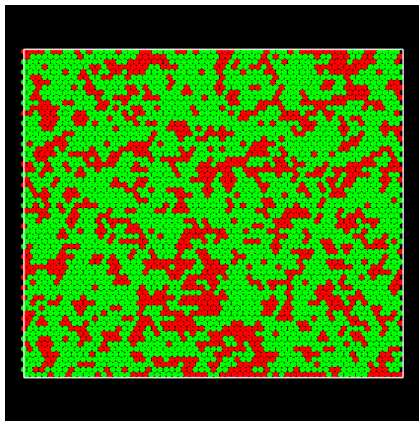
- At an **ideal glass transition density**  $\phi_g$ ,  $\hat{\phi}_J(\phi_g) = \phi_J^{\max}$ , and  $s_c = 0$ .
- The configurational entropy is very close to the **mixing entropy** near the kinetic glass transition!*



# Most Disordered Binary Disk Packings



(MNG) (MPEG)



(MNG) (MPEG)

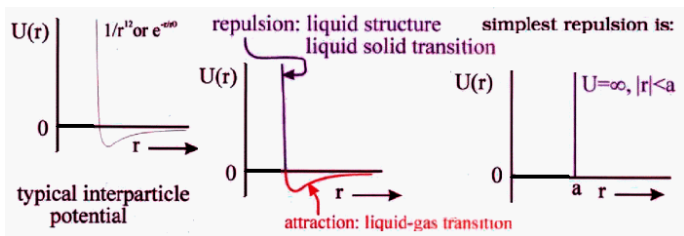


# Is There a Most Dense Amorphous Packing?

- Using specific statistical models for micro-clustering (we use **Leveled Random Gaussian Fields**) we can calculate **entropy** (degeneracy)  
 $s = \ln(N_P)/N$  .
- Starting with more clustered initial configurations generates denser final packings: tradeoff between **density** and **disorder!**
- Ideal glass transition is **naively extrapolated** to  $s_c = 0$ , which requires overcoming the entropy of mixing, i.e., **demixing**
- The presumed “ideal glass” is nothing but a fully demixed, i.e., **phase-separated crystal**
- An **exponential majority** of packings are *most disordered* (MRJ)?



# Why *Frictionless Hard Particles*?



Hard-particle systems:

- Extract the **essence** of the problem: **Geometry**
- Are **simple**: *No potential energy, temperature, or dissipation*
- Exhibit behavior almost as **rich** as more realistic models
- Can often be **simulated** more efficiently/easily



# What is a Packing?

- A packing  $\mathcal{Q}$  is a collection of (static) convex objects (particles) in Euclidean space  $\mathcal{R}^d$  such that no two objects overlap (no compactness). Focus on **congruent** objects (monodisperse systems) with a specified particle **shape**.
- We usually consider **periodic packings** obtained by replicating a **unit cell** containing  $N$  particles, giving  $N_f \sim N$  **degrees of freedom**.
- A packing  $\mathcal{Q} = (\mathbf{Q}, \phi)$  is characterized by
  - The **configuration**  $\mathbf{Q} = (\mathbf{q}_1, \dots, \mathbf{q}_N; \mathbf{\Lambda}) \in \mathcal{R}^{N_f}$ , determining the positions and orientations of each particle
  - The **covering fraction (density)**,  $\phi$ , determining the size of the particles.

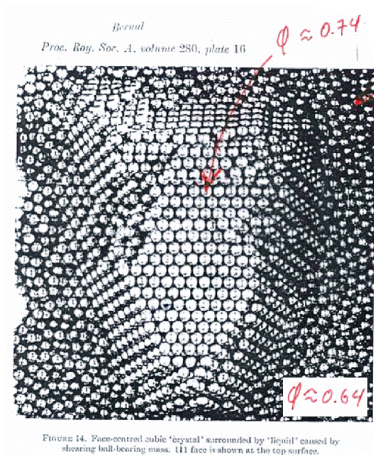


# Large Random Jammed Packings

- We are particularly interested in the **thermodynamic limit**,  $N \rightarrow \infty$ .
- The collection of all packings at a given density  $\phi$  specifies the **set of allowed configurations**  $\mathcal{Q}(\phi) \subset \mathcal{R}^{N_f}$ . Understanding the **topology** and **geometry** of this set is the holy grail!
- Focus on **jammed packings** (compactly packed, mechanically stable). *Intuition*: Particles are locked in their positions despite thermal agitation/shaking and/or boundary deformations/loading.
- *Intuition* for **randomness (disorder)**: Lack of correlations/predictability between different particles and different parts of the packing.



# Old-School: Packing of Hard Spheres





- We need definitions for:
  - **Jammed packing** (coming up)
  - **Random (disordered, amorphous) packing**
- Prevailing 50-year old view (Bernal): *Random close packing (RCP) is the maximum density that a large random collection of spheres can attain.*
- The problem: **What is random?** (Torquato *et al.*, 2000)  
Randomness can be measured by using **order metrics**: Something can be **more random** than something else.
- Contradiction: *Higher density implies less random, so there is no “most dense random packing”!*



# Basic Notation

- Thermal system of hard particles with covering fraction (or **density**)  $\phi$  at temperature  $kT = 1$ .
- Particle displacements  $\Delta\mathbf{Q} = (\Delta\mathbf{q}_1, \dots, \Delta\mathbf{q}_N)$  from an ideal *jammed* configuration  $\mathbf{Q}_J$  with jamming density  $\phi_J$ 
  - For spheres  $\Delta\mathbf{q} \equiv \Delta\mathbf{r}$
  - For nonspherical particles  $\Delta\mathbf{q} = (\Delta\mathbf{r}, \Delta\varphi)$
  - We mostly focus on spheres for simplicity
- Think about **configuration space**  $\Delta\mathbf{Q} \in \mathcal{R}^{N_f}$ , where  $N_f = Nd_f$ , and  $d_f$  is number of *degrees of freedom* per particle.
- There can be additional degrees of freedom due to, for example, the boundary.



# Jamming: Kinematic View

- Definition **A**, discarded  
(S. Alexander, 1998): “A packing is “**geometrically rigid**” if it cannot be “deformed continuously by rotating and translating the constituent grains without deforming any of them and without *breaking* the contacts between any two grains”.
- Definition **B (kinematically rigid)**  
(R. Connelly, 1996): There is no non-trivial continuous path (motion) starting at  $\mathbf{Q}_J$  (**immobility**).  
(S. Torquato & F. Stillinger, 2001): No global boundary-shape change accompanied by collective particle motions can exist that respects the nonoverlap conditions.



# Jamming: Static View

- Definition **C (statically rigid)**

(T. Witten, 1999): “We will consider a packing to be **mechanically stable** if there is a nonzero measure set of external forces which can be balanced by interbead ones.” Replace “nonzero measure set” with “all”.

- Definition **D (jammed)**

(Z. Salsburg, 1962): “**A configuration is stable if for some range of densities slightly smaller than  $\phi_J$ , the configuration states accessible from  $\mathbf{Q}_J$  lie in the neighborhood of  $\mathbf{Q}_J$ .** More formally, if for any small  $\epsilon > 0$  there exists a  $\delta(\epsilon, N) > 0$  such that all points  $\mathbf{Q}$  accessible from  $\mathbf{Q}_J$  satisfy  $\|\mathbf{Q} - \mathbf{Q}_J\| < \epsilon$  provided  $\phi \geq \phi_J - \delta$ .”

- Theorem (R. Connelly): **For spheres, definitions B, C and D are equivalent.**



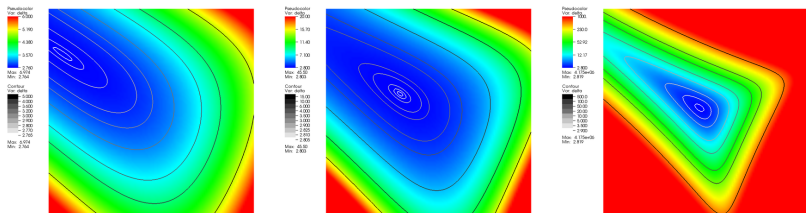
# The Accessible Region $\mathcal{J}_{\Delta\mathbf{R}}$

- Shrink the particles from the terminal jamming point  $(\mathbf{R}_J, \phi_J)$  by a scaling factor

$$\mu = (1 - \delta) = (1 + \Delta\mu)^{-1}$$

- $\phi = \phi_J (1 - \delta)^d \approx \phi_J (1 - d\delta)$ , where  $\delta \approx \Delta\mu$  is a small **jamming gap**.
- $\mathbf{R} = \mathbf{R}_J + \Delta\mathbf{R}$  remains trapped in a small **jamming neighborhood**  $\mathcal{J}_{\Delta\mathbf{R}}(\delta)$  around  $\mathbf{R}_J$ .
- Jamming assumption: There is a small  $\delta_{\max}(N) > 0$  such that  $\mathcal{J}_{\Delta\mathbf{R}}(\delta_{\max})$  is “small” and **bounded**.
- Note: Even for  $\delta > \delta_{\max}$  the configuration is often **dynamically localized** around  $\mathbf{R}_J$  (**glassiness**)!



Soft Potentials:  $U \sim \chi^{-p}$ 

Energy surface for  $p = 12, 25, 100$ , hard-limit:  $p \rightarrow \infty$ ,  $U \sim \delta$



# Jamming Polytope $\mathcal{P}_{\Delta R}$

We have a **jamming polytope**  $\mathcal{P}_{\Delta R} \subset \mathcal{J}_{\Delta R}$ , as given by the **rigidity matrix  $\mathbf{A}$** :

$$\mathcal{P}_{\mathbf{x}} : \mathbf{A}^T \mathbf{x} \leq \mathbf{e} \text{ with columns } \begin{array}{l} i \rightarrow \\ j \rightarrow \end{array} \begin{array}{c} \{i, j\} \\ \downarrow \\ \vdots \\ \mathbf{u}_{ij} \\ \vdots \\ -\mathbf{u}_{ij} \\ \vdots \end{array}$$

- $\mathcal{P}_{\Delta R}$  is just a **scaled** version of  $\mathcal{P}_{\mathbf{x}}$ .
- $\mathcal{P}_{\mathbf{x}}$  (**geometry**) **determines everything** at the jamming point!



# Contact Forces

- Jamming (for spheres) *implies* existence of **contact forces**:

$$\mathbf{A}\mathbf{f} = 0 \text{ and } \mathbf{f} \geq 0$$

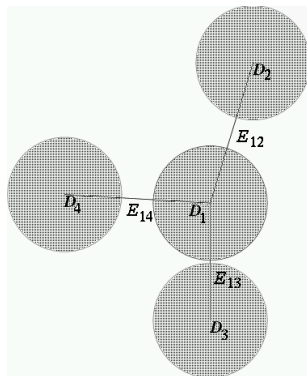
- Each force proportional to the **surface area** of the polytope face,  $f_{ij} \sim S_{ij}$ .
- Theorem: If  $\mathcal{P}_x$  is closed then the packing is jammed for  $0 \leq \delta \leq \delta_{\max}(N)$ !
- "*A Linear Programming Algorithm to Test for Jamming in Hard-Sphere Packings*"

**A. Donev**, S. Torquato, F. H. Stillinger, and R. Connelly, **J. Comp. Phys**, 2004





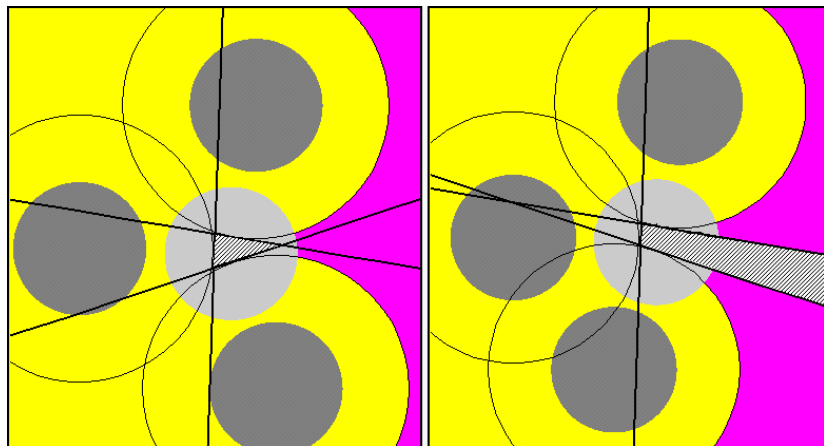
# Example



$$\mathbf{A} = \begin{matrix} D_1 \\ D_2 \\ D_3 \\ D_4 \end{matrix} \begin{bmatrix} E_{12} & E_{13} & E_{14} \\ \mathbf{u}_{12} & \mathbf{u}_{13} & \mathbf{u}_{14} \\ -\mathbf{u}_{12} & & \\ & -\mathbf{u}_{13} & \\ & & -\mathbf{u}_{14} \end{bmatrix}$$



# How Good is First-Order



# Surprisingly High Density!

- The maximum density is for axes  $0.8 : 1 : 1.25$  ( $\beta = 0.5$ ,  $\alpha \approx 1.6$ ) and it approaches that of **crystalized spheres**,  $\phi \approx 0.735$ . These are **ollipsoids**.
- Denser packing is important in different fields:
  - Rocket **fuel powders** (but also polydispersity)
  - Improved sintered materials (**ceramics**)
  - **Fish eggs**
- Is the high density robust to shape and size dispersity?
- Is there an even better particle shape?



# Packing Ollipsoids in Flasks



- **Finite-size** effects are strong
- One can try to extrapolate to infinite container,  $R \rightarrow \infty$ ,

$$\phi(R) = \phi_b - \frac{a}{R}.$$

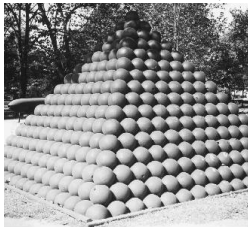
But we only have 1000 particles!

- Find the **radial density profile**  $\phi(r)$  and estimate the **core density**  $\phi_c \approx \phi_b$  instead.



# Packing Cannon Balls & Oranges

- The answer: FCC/HCP lattice,  $\phi_{\max} = \pi/\sqrt{18} = 0.7405!$



- Computer-assisted proof by Hales *et al.* (2000)
- For ellipsoids it was thought the answer is the same: **Affinely stretch** the FCC lattice?
- Our simulations led to **exact** results showing the contrary!



# Nonspherical Particles

- For spheres all constraints are **concave**, and one can prove that the jamming polytope picture describes the jamming limit
- For nonspherical particles (ellipsoids) we can still linearize

$$\mathbf{A}^T \Delta \mathbf{Q} \leq \Delta \mathbf{I}$$

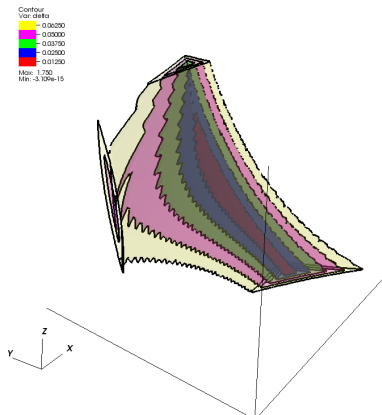
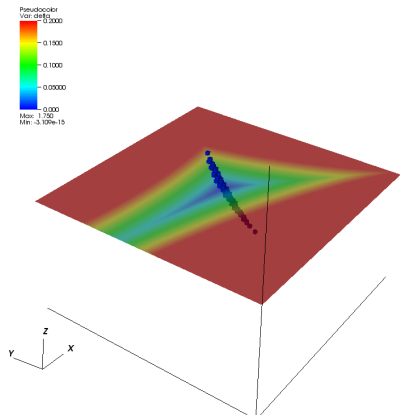
- $\mathbf{A}$  is a **generalized rigidity matrix**, containing blocks of the form

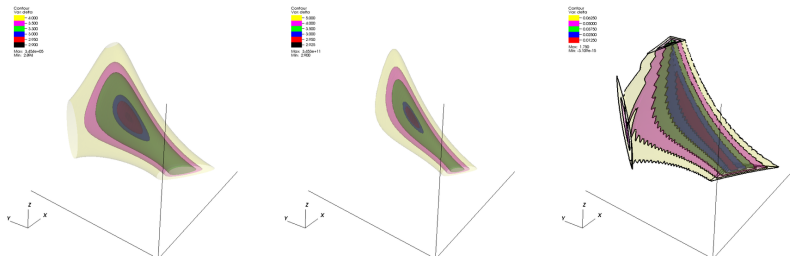
$$\begin{bmatrix} \mathbf{n} \\ \mathbf{r}_C \times \mathbf{n} \end{bmatrix}$$

- But some constraints can be **convex** and the linearization can break down!
- There exist some packings for which the polytope picture applies, and we focus on those for now.



# When Polytopes are Not Enough



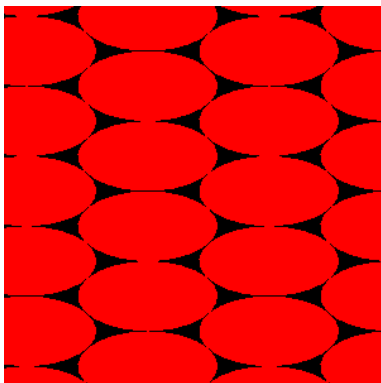
Soft Potentials:  $U \sim \chi^{-p}$ 

Energy contours for  $p = 12, 25, \infty$





# Rotation vs. Translation



(MNG) (MPEG)

- Translational jamming can happen without rotational jamming: Spheres are the ultimate (**singular**) example!
- Jammed sphere packing  $\implies$  translationally-jammed ellipsoid packing with  $\alpha = 1 + \delta_{\max}$ .
- Achieving the isostatic  $Z = 12$  requires **translational ordering**.
- Understanding ellipsoid packings is a challenge for the **future**!



# Energy, Hessians, and Jamming

- **Overlap potential:** A smooth continuous pairwise interaction  $U(\Delta\mathbf{q}_A, \Delta\mathbf{q}_B)$  which strictly increases *iff* touching particles overlap.
- *Theorem* (R. Connelly): If there exists an overlap potential such that the configuration  $\mathbf{Q}_J$  is a **stable energy minimum**, then the packing is jammed.
- *First-order condition:* Gradient vanishes  $\equiv$  **force/torque balance**

$$\mathbf{A}\mathbf{f} = 0 \text{ and } \mathbf{f} \geq 0$$

- *Second-order condition:* Hessian is **positive definite**:

$$\mathbf{H} = \mathbf{A}\mathbf{C}\mathbf{A}^T + \mathbf{f} \otimes (\nabla_{\mathbf{q}}\mathbf{A}) \succ \mathbf{0}, \text{ and for spheres } \nabla_{\mathbf{q}}\mathbf{A} \prec \mathbf{0}$$

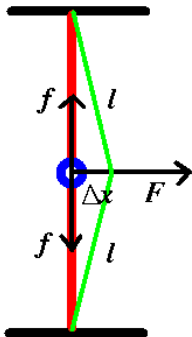


# Eigenvalues, Soft-Modes, and Sphericity

- *Theorem:*  $\mathbf{ACA}^T \succ \mathbf{0}$  if  $\mathbf{A}$  is full-rank, which requires **iso-** or **hyper-staticity**,  $Z \geq 2f$ . For small  $\mathbf{f}$ ,  $\mathbf{H} \succ \mathbf{0}$ , but for large enough  $\mathbf{f}$ , **buckling** instability modes may appear (M. Wyart *et al*, 2005).
- *Theorem:*  $\mathbf{ACA}^T$  has zero eigenvalues (**floppy modes**) if  $\mathbf{A}$  is not full-rank, for example, for hypostatic packings,  $Z < 2f$ . These modes may be rigidified by the stress term  $\mathbf{f} \otimes (\nabla_{\mathbf{q}}\mathbf{A})$  for **non-spheres only** (R. Connelly)!
- (S. Alexander, 1998): *“The basic claim...is that one cannot understand the mechanical properties of amorphous materials if one does not explicitly take into account the direct effect of stresses.”*



# Prestress Stability



- Let  $l = 1$ . Then  $f\Delta x = F$  and  $\Delta l = \Delta x^2$ .
- If **not pre-stressed**,  $f = 0$ , then  $\Delta U = \frac{1}{2}k\Delta l^2 = \frac{1}{2}k\Delta x^4$  and  $\Delta x = (F/k)^{1/3}$
- If **pre-stressed**,  $f > 0$ , then  $\Delta U = f\Delta l = f\Delta x^2$  and  $\Delta x = F/f$
- *Pre-stressing can make otherwise rigid/floppy structures un/stable.*  
Is this what happens to ellipsoids near the sphere point?



# Free Energy

- **Free energy** determines the whole thermodynamics of the system

$$F = -\ln |\mathcal{J}_{\Delta\mathbf{R}}| = Nf$$

- In the jamming limit  $|\mathcal{J}_{\Delta\mathbf{R}}| \rightarrow |\mathcal{P}_{\Delta\mathbf{R}}| = \delta^{N_f} |\mathcal{P}_{\mathbf{x}}|$ , where we recall  $\mathcal{P}_{\mathbf{x}}: \mathbf{A}^T \mathbf{x} \leq \mathbf{e}$
- Pressure  $P = -\partial F / \partial V$  giving

$$p = \frac{PV}{NkT} = \frac{1}{\delta} = \frac{d_f}{(1 - \phi/\phi_J)}$$

- The crux is in the constant  $f_J$

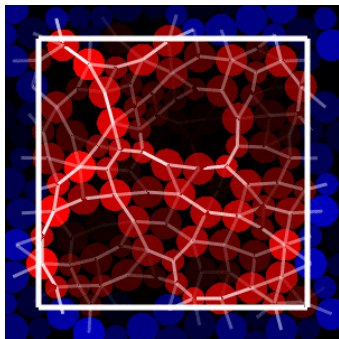
$$f = -d_f \ln \delta - \frac{\ln |\mathcal{P}_{\mathbf{x}}|}{N} = -d_f \ln \delta - f_J$$



# For Any Polytope

- Free energy  $F/NkT = -\ln |\mathcal{P}_{\Delta R}|/N$ , and  $p = -\partial F/\partial V$
- $|\mathcal{P}_{\Delta R}| = (\delta D)^{Nd} |\mathcal{P}_x|$ , giving:

$$p = \frac{PV}{NkT} = \frac{1}{\delta} = \frac{d}{(1 - \phi/\phi_J)}$$



Link: [Graphics/LSD\\_stress.mpg](#)



# Isostatic Packings

- **Isostatic** packings, for *collective* jamming

$$M = \begin{cases} 2N - 1 & \text{for } d = 2 \\ 3N - 2 & \text{for } d = 3 \end{cases}$$

where  $\bar{Z} = 2M/N \approx 2d = 6$  is the *mean coordination number*

- The forces are *unique* for a simplex:

$$\mathbf{f} = \begin{bmatrix} \mathbf{A} \\ \mathbf{e}^T \end{bmatrix}^{-1} \begin{bmatrix} \mathbf{0} \\ 1 \end{bmatrix}$$



# The Volume of a Simplex

- Computing  $|\mathcal{P}_x|$  is a well-known #P-hard problem (as a function of  $N_f$ )
- Optimal are **randomized** polynomial algorithms [at present  $O^*(N_f^4)$ ]
- But for a **simplex** (hyperplane)  $\mathcal{H}$ -representation,  $\mathbf{Ax} \leq \mathbf{b}$ , and  $\mathbf{x} \in \mathcal{R}^n$ , we can do it easily

$$V^{-1} = n! \left| \tilde{\mathbf{A}} \right| \prod_{i=1}^{n+1} a_i$$

where  $\tilde{\mathbf{A}}^T \mathbf{a} = \begin{bmatrix} \mathbf{0} \\ 1 \end{bmatrix}$  and  $\tilde{\mathbf{A}} = [ \mathbf{A} \quad \mathbf{b} ]$

- The calculation can be done fully in sparse matrix mode
- We have a *physical interpretation*, for example,  $\mathbf{a} \equiv \mathbf{f}$





# Calculating Free Energies

- The free energy is usually computed relative to a **reference state**, for example, for liquids:

$$f(\phi) = f_{\text{ideal}} + \int_0^\phi \frac{p(\phi)}{\phi} d\phi \quad \text{where} \quad f_{\text{ideal}} = -\frac{1}{N} \ln \frac{V^N}{N!} \approx -\ln \frac{V}{N} - 1$$

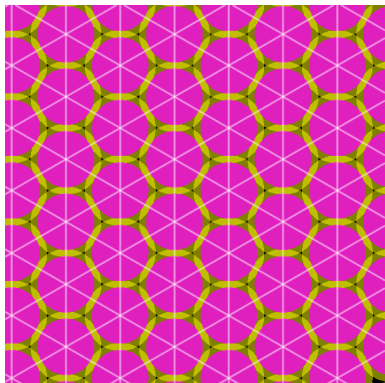
- Problem is posed for solids because of **first-order phase transitions**
- Usual solid reference state used in Monte Carlo: the **Einstein solid** (collection of independent harmonic oscillators)

$$\Delta U = \frac{k}{2} \sum_{i=1}^N \|\mathbf{r}_i - \mathbf{r}_i^J\|^2$$

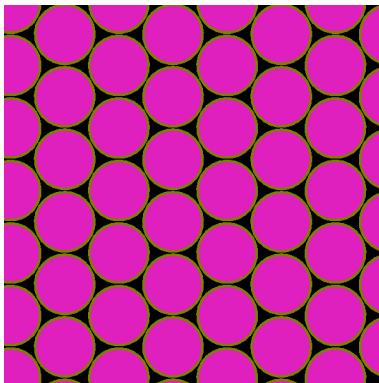
- We want an event-driven molecular-dynamics algorithm: **Only hard interactions allowed!**



# Example



Links: Graphics/LSD.HS.2D.NNL.mpg



Graphics/LSD.HS.2D.cells.disjoint.mpg



# BCMD Theory

This Bounding Cell MD algorithm uses a **single-occupancy-cell** (SOC) model with the cell scaling  $\mu$  as a parameter

- Add time-dependence  $\mu = 1 + \Delta\mu = \mu_{\max} - \gamma_{\mu} t$  with a constant *cell reduction rate*  $\gamma_{\mu}$ .
- The pressure on the walls of a cell  $p_c = P_c V_c / kT$  gives

$$f = f_c(\Delta\mu_{\min}) - \int_{V_c^{\max}}^{V_c^{\max}} p_c \frac{dV_c}{V_c}$$

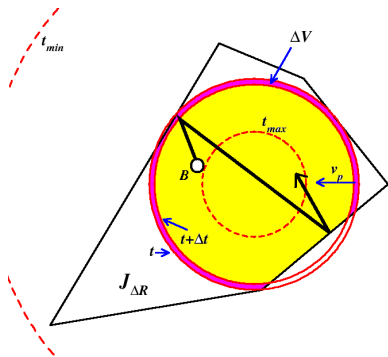
- For the disjoint-cell model we know  $f_c(\Delta\mu)$  theoretically

$$f_c(\Delta\mu) = -d_f \ln \Delta\mu - f_c^J \text{ where } f_c^J = \ln(\pi/6) \text{ for spheres}$$

- Use adaptive reduction rate  $\gamma_{\mu}(\mu) = \gamma_{\mu}(\mu_{\max}) \left( \frac{\Delta\mu}{\Delta\mu_{\max}} \right)^{\vartheta}$



## In High Dimensions



An **ergodic billiard ball**  $B \in \mathcal{R}^{N_f}$  elastically bounces inside  $\mathcal{J}_{\Delta R}$ . Add constraints  $\hat{\mathcal{J}} = \tilde{\mathcal{J}}_{\Delta R} \cap \mathcal{J}_{\Delta R}$  where  $\tilde{\mathcal{J}}_{\Delta R}(\xi \rightarrow 0) = \{\mathbf{R}_J\}$  and  $\tilde{\mathcal{J}}_{\Delta R}(\xi \rightarrow \infty) = \mathcal{R}^n$  and the volume  $|\tilde{\mathcal{J}}_{\Delta R}(\xi)|$  is known. Assume  $\tilde{\mathcal{J}}_{\Delta R}(\xi_{\max}) = \mathcal{J}_{\Delta R}$  and  $\tilde{\mathcal{J}}_{\Delta R}(\xi_{\min}) = \tilde{\mathcal{J}}_{\Delta R}(\xi)$



# The Mathematics

- Pressure on the walls of  $\hat{\mathcal{J}}$  is  $P = kT/V$ , where  $kT = 2K/N_f$
- Collisions with the moving walls of  $\tilde{\mathcal{J}}_{\Delta R}$  are **elastic**

$$v_{\perp}^{\text{after}} - v_{\perp} = - \left( v_{\perp}^{\text{before}} + v_{\perp} \right)$$

- The billiard heats up due to the shrinking of  $\hat{\mathcal{J}}$

$$\Delta K_c = \frac{m}{2} \left( v_{\perp}^{\text{after}} - v_{\perp}^{\text{before}} \right) \left( v_{\perp}^{\text{after}} + v_{\perp}^{\text{before}} \right) = v_{\perp} \Delta \pi_c$$

- During a short time interval from  $t$  to  $t + \Delta t$  the volume  $V = |\hat{\mathcal{J}}(\xi)|$  decreases by  $\Delta V = S v_{\perp} \Delta t$ , and

$$\Delta K = v_{\perp} \Delta \pi = \frac{\Delta \pi}{S \Delta t} \Delta V = P \Delta V = kT \frac{\Delta V}{V(\xi)} = \frac{2K}{N_f} \frac{\Delta V}{V}$$



## Contd.

- Continuum limit gives ODE  $dV/V = (N_f/2)dK/K$  with solution

$$\ln \frac{|\mathcal{J}_{\Delta\mathbf{R}}|}{|\tilde{\mathcal{J}}_{\Delta\mathbf{R}}(\xi_{\min})|} = \frac{N_f}{2} \ln \frac{K}{K_0}$$

- For the particle system this translates to  $\Delta f = \frac{d_f}{2} \ln \frac{K}{K_0}$
- Instead of integrating pressures, simply measure the *relative increase in the kinetic energy*! This can be used in **nonequilibrium** situations as well.

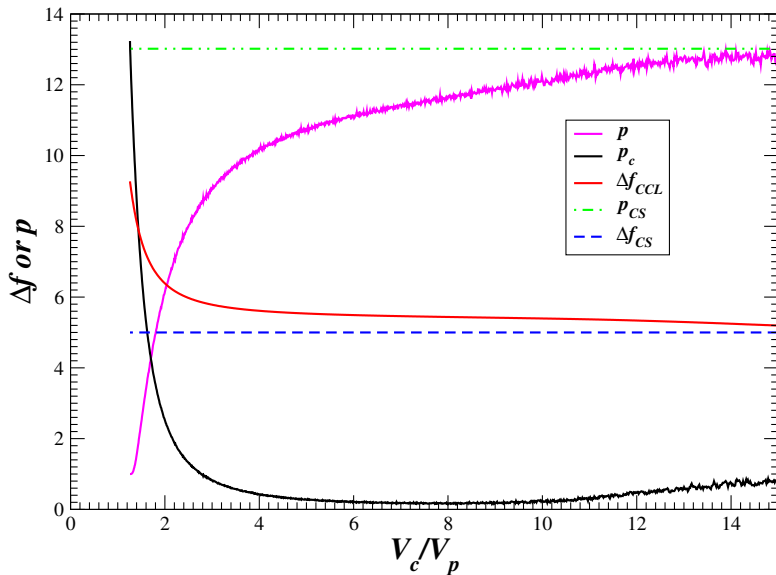


# Comparison to MC

Compare to randomized MC algorithms for volume of convex bodies in high dimensions:

- MC algorithms use a **random walk** instead of **billiards motion** (but how about Hit-and-Run random walks?)
- MC algorithms use a **sandwiching** step: What does it correspond to?
- The optimal MC algorithm is  $O^*(n^4/\epsilon^2 \ln \frac{1}{\eta})$  oracle calls, and uses simulated annealing (Lovacz and Vempala, 2004)
- Can we use the existing mathematical tools to analyze the BCMD algorithm rigorously and find the  $\gamma_\mu(\Delta\mu)$  to use to get a desired absolute error in  $f$ ?



Example: Hard Sphere Liquid at  $\phi = 0.50$ 



# Methodology

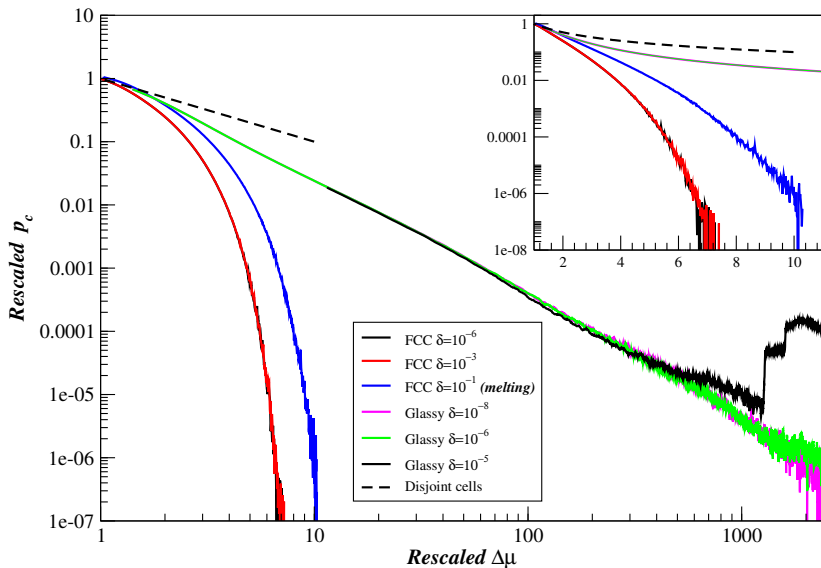
- Initial test: **FCC** hard-sphere crystal near melting:
  - Best MC result  $\Delta f_{FCC}(\phi = 0.545) = 5.91916(1)$  [is it really that accurate?]
  - BCMD algorithm with  $\Delta\mu_{\max} = 1$ ,  $\gamma_{\mu}(\mu_{\max}) = 0.001$  and  $\vartheta = 1$  produces 5.919(0)
- Start at exactly the jammed configuration  $\mathbf{R}_J$ , the cells will become disjoint when  $\Delta\mu_{\min} = \delta$ ,

$$\Delta f = \frac{d_f}{2} \ln \frac{K}{K_0} = (-f_c^J - d_f \ln \delta) - (-d_f \ln \delta - f_J) = f_J - f_c^J$$

- Notice the independence on  $\delta$ : The scaled  $\tilde{p}_c(\Delta\tilde{\mu} = \Delta\mu/\delta) = \delta p_c$  should be a universal function
- We **freeze one particle** to eliminate trivial translations



# Nearly Jammed Packings

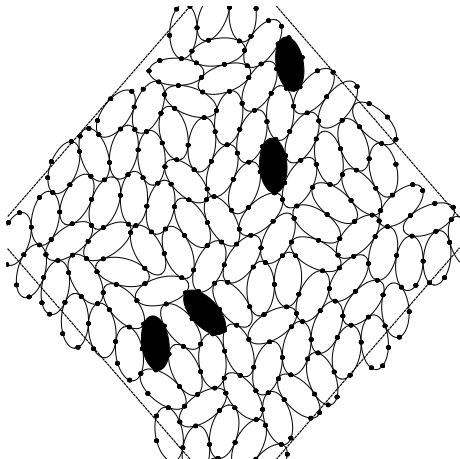


# Numbers: Spheres

- FCC crystals:
  - For FCC the literature says  $[f_J - f_c^J]_{FCC} = 2.160 \pm 0.001$
  - BCMD runs with  $N = 10,000$ ,  $\delta = 10^{-6}$ ,  $\Delta\mu_{\max} = 10^{-5}$  with  $\gamma_\mu(\mu_{\max}) = 0.001$  and  $\vartheta = 0.5$   
Results:  $[f_J - f_c^J]_{FCC} = 2.1599 \pm 0.0005$  and  $[f_J - f_c^J]_{HCP} = 2.1593 \pm 0.0005$
- But we cannot give **rigorous error estimates** until a theory is developed!
- For an isostatic disordered (random) packing of spheres ( $N = 1,000$ )
  - From the volume of the simplex  $f_J = (N - 1)^{-1} [\ln |\mathcal{P}_x|]$ , we get  $f_J - f_c^J \approx 4.9479$
  - Sample result  $\delta = 10^{-8}$ ,  $\Delta\mu_{\max} = 2.5 \cdot 10^{-5}$ ,  $\gamma_\mu(\mu_{\max}) = 0.01$  and  $\vartheta = 0.5$  gives  $f_J - f_c^J = 4.9485 \pm 0.001$



# Numbers: Ellipses



Simplex volume gives  
 $f_J - f_c^J = 3.6693$ , BCMD  
algorithm at  $\delta = 10^{-4}$  with  
 $\Delta\mu_{\max} = 1.5 \cdot 10^{-2}$  with  
 $\gamma_\mu(\mu_{\max}) = 0.001$  and  $\vartheta = 0.5$   
gave  $f_J - f_c^J = 3.61 \pm 0.01$   
There are numerical difficulties  
with the implementation which  
need to be resolved...



# Isostatic Packings

Using the simplex nature of the polytope, we get:

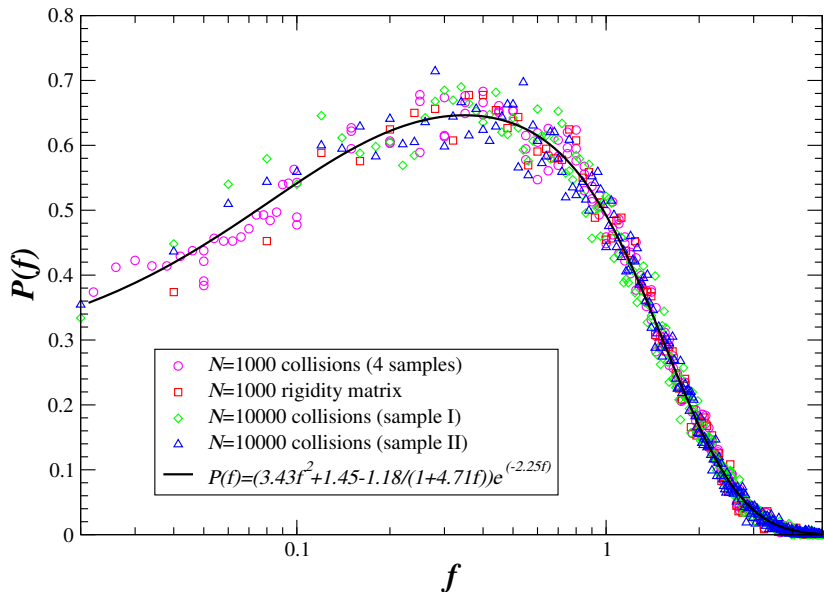
$$g_2^{(\delta)}(l) = \frac{p}{4\phi} \mathcal{L}_{l/\Delta D} [fP_f(f)]$$

- Using empirical  $P_f(f) = (Af^2 + B)e^{-Cf}$  to get

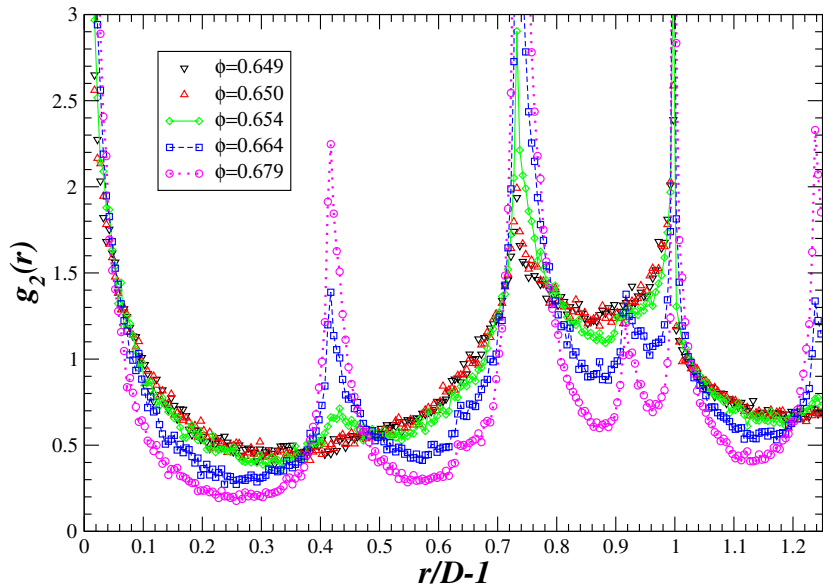
$$\mathcal{L}_x [fP_f(f)] = \frac{6A}{(x + C)^4} + \frac{B}{(x + C)^2}.$$



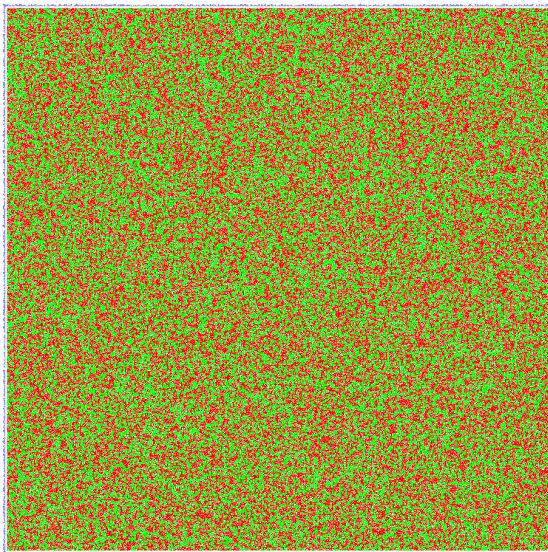
## Force Distribution



## Ordered Packings



# Hyperuniformity in 2D





# Near Contacts in High Dimensions

- Gap  $x$  at which the cumulative coordination  $Z(x)$  equals the kissing number,  $x \simeq 0.35, 0.34, 0.31 - 0.36$  and  $0.33 - 0.36$  in  $d = 3, 4, 5$  and  $6$ , respectively.
- Gap  $x$  at the **first minimum** in  $g_2$ ,  $x \simeq 0.35, 0.32, 0.30$  and  $0.28$ .
- Disordered packings might be **deformed crystal packings**, in which the true contacts are deformed into near contacts, and only the minimal number of contacts necessary for jamming is preserved.
- Contrast with the usual interpretation of disordered packing in  $d = 3$  in terms of **tetrahedral** or **icosahedral** packings, without relation to the crystal (FCC) packing.



# Infinite Dimension

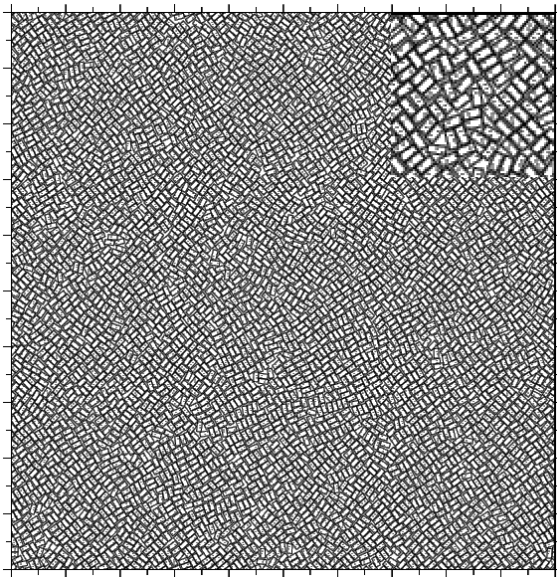
- Suggested scaling is

$$\phi_{MRJ} = \frac{(c_1 + c_2 d)}{2^d}$$

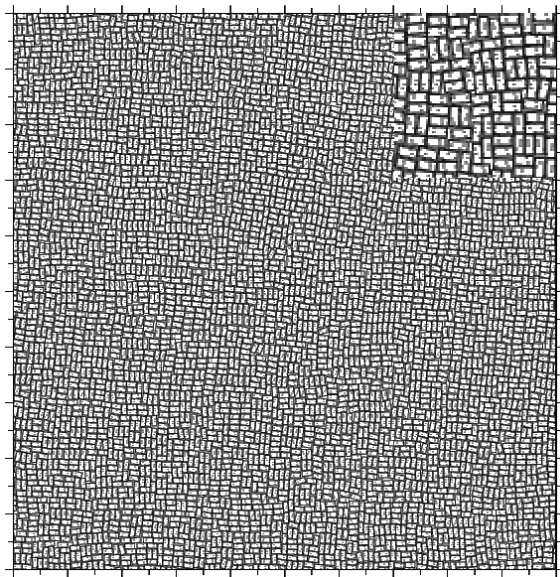
- For jammed packings  $c_1 = -2.72$  and  $c_2 = 2.56$ .
- Similar scaling is observed for Random Sequential Addition as well!
- *Will disordered packings be densest as  $d \rightarrow \infty$ ?*



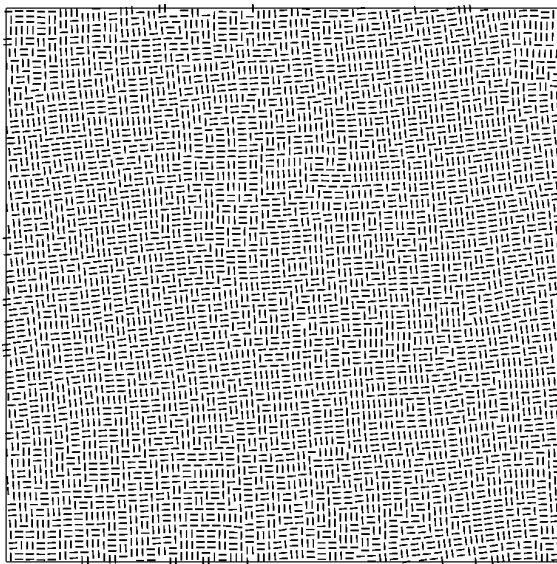
# Tetratic Liquid Phase



# Tetratic Liquid Phase



# MRJ Domino Packings?



# Thermodynamics of Hard Spheres

- Hard-particle systems are athermal, so set  $T = 1$ : Corresponds to fixed density for soft particles
- The only state variable is  $\phi$ : High density corresponds to low temperature for soft particles
- **Free energy** is simply the available volume in configuration space

$$F = -S = -\ln |V_{\text{conf}}| = Nf$$

- True thermodynamic equilibrium state: The majority of the configurational volume is in the state of *minimum free energy*
- For many systems it is firmly established that there is a first-order phase transition from **liquid** (isotropic and homogeneous, diffusive, low-density) to **crystal** (periodic, frozen, high-density)



# Hard-Sphere Glasses

- Very dense liquids have negligible diffusivity (on experimental scales) above some **glass-transition density**  $\phi_g$
- Dense liquids have very slow diffusion, i.e., infrequent particle rearrangements
- The particles in a liquid spend a long time vibrating around glassy configurations. **Glasses correspond to jammed packings!**
- Partition configuration space among all the different jammed packings and assume that most of configurational volume is accounted for

$$V_{\text{conf}} = \sum_{i \in \text{Jammed}} |\mathcal{J}_{\Delta \mathbf{R}_i}| \approx \sum_{i \in \text{Jammed}} |\mathcal{P}_{\Delta \mathbf{R}_i}|$$

- Group the jammed packings into statistically equivalent sets based on  $\phi_J$



# Inherent-Structure Formalism

- Let the number of jammed packings (glasses) with jamming density  $\phi_J$  be  $N_g(\phi_J) = \exp[S_c(\phi_J)] = \exp[s_c(\phi_J)N]$ , where **configurational entropy**  $s_c(\phi_J)$  must vanish at some density  $\phi_J^{\max} < \phi_{CP}$
- Decompose

$$V_{\text{conf}}(\phi) = \int N_g(\phi_J) \exp[-Nf_{\text{vib}}(\phi, \phi_J)] d\phi_J = \int \exp[-Nf_L] d\phi_J$$

- The integral is dominated by the maximum of the exponential

$$f_L(\phi) = f_{\text{vib}}(\phi, \phi_J) - s_c(\phi_J) = -d \ln \left( 1 - \frac{\phi}{\phi_J} \right) - f_J(\phi_J) - s_c(\phi_J)$$

where  $\phi_J(\phi)$  is the jamming density which minimizes  $f_L(\phi)$

- Assume that  $f_J(\phi_J) = \text{const}$





# The Ideal Glass Transition

- The term  $-d \ln \left(1 - \frac{\phi}{\phi_J}\right)$  prefers larger  $\phi_J$  (**more free volume**), while the term  $-s_c(\phi_J)$  prefers more disordered packings (**more degeneracy**)
- It is reasonable to assume that  $s_c(\phi_J)$  is monotonically decreasing at high densities, and goes through zero at  $\phi_J^{\max}$
- As  $\phi$  increases the system will sample packings with higher  $\phi_J$
- At an **ideal glass transition density**  $\phi_g$ ,  $\phi_J(\phi_g) = \phi_J^{\max} = \phi_{IG}$ , and there is no higher-density glasses left so the densest glass starts dominating the thermodynamics from then on.
- The assumption everyone makes, implicitly or explicitly:  
**The ideal glass corresponds to an amorphous structure with**  
 $\phi_{IG} < \phi_{\text{crystal}}$



# Measuring $s_c(\phi_J)$

- The liquid free energy can be calculated by integrating EOS from liquid state

$$f_L = f_{\text{ideal}} + \int_0^\phi \frac{p-1}{\phi} d\phi$$

- The vibrational or glass free energy can be obtained from the BCMD algorithm, i.e., via the **single-occupancy-cell** (SOC) model with cells of the “right” size

$$f_{\text{vib}} \approx f_{\text{SOC}}(\Delta\mu \approx 1)$$

- Estimate:  $s_c = f_{\text{SOC}} - f_L$  and calculate  $\phi_J$  by jamming the system. It has been done before in various studies for a variety of glass formers, most notably, Lennard-Jones and hard sphere bidisperse disk or sphere packings.



## contd...

- Problems:
  - True equilibrium EOS is very difficult to measure close to glass transition due to **sluggish dynamics**
  - Far from jamming  $f_{SOC}$  is not well-defined: It depends on **cell-size!**
  - The underlying model itself is approximate, especially at low densities, where at the very least partially jammed packings (**saddle points**) need to be considered
  - The **crystal** has been ignored: Instead of true thermodynamically stable structure look for **metastable liquid structure**. Is it well-defined?
- But let's try it anyway for a bidisperse hard disk packing with size ratio  $\kappa = 1.4$  with 1/3 large disks and 2/3 small disks!



# Basics

- Use **event-driven molecular dynamics** for maximal efficiency
- Use nonequilibrium MD in which particles grow or shrink in size with **expansion rate**  $\gamma = dD/dt$
- In the limit  $\gamma \rightarrow 0$  we obtain true equilibrium, for small  $\gamma$  we have **quasi-equilibrium** transformation
- **Validation** strategy: If significant reduction in  $\gamma$  does not change the thermodynamic properties, we can be confident the results are in “equilibrium”, local (metastable) or global (stable).
- If changes in  $\gamma$  change results we should **not** be talking about equilibrium of any sort nor invoke **thermodynamics**: It is **kinetics**!



## EOS

- Instead of  $p(\phi)$ , assume free-volume EOS holds and estimate the jamming density

$$\tilde{\phi}_J = \frac{\phi}{1 - d/p(\phi)}$$

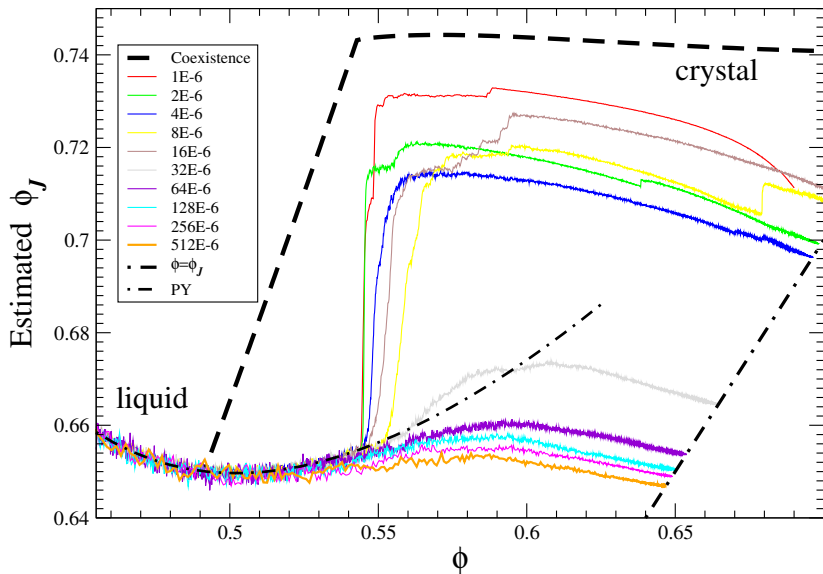
- In jamming limit or for crystals we have  $\tilde{\phi}_J \approx \phi_J = \text{const}$ , which makes plots nicer
- For (isostatic) disordered (MRJ) packings **very** close to jamming  $\tilde{\phi}_J \approx \phi_J = \text{const}$  rigorously. However, **empirically**, it seems that over a much wider range of densities of interest nearly jammed packings follow

$$\tilde{\phi}_J \approx (1 - \alpha)\phi_J + \alpha\phi \text{ where } \alpha \sim 0.1$$

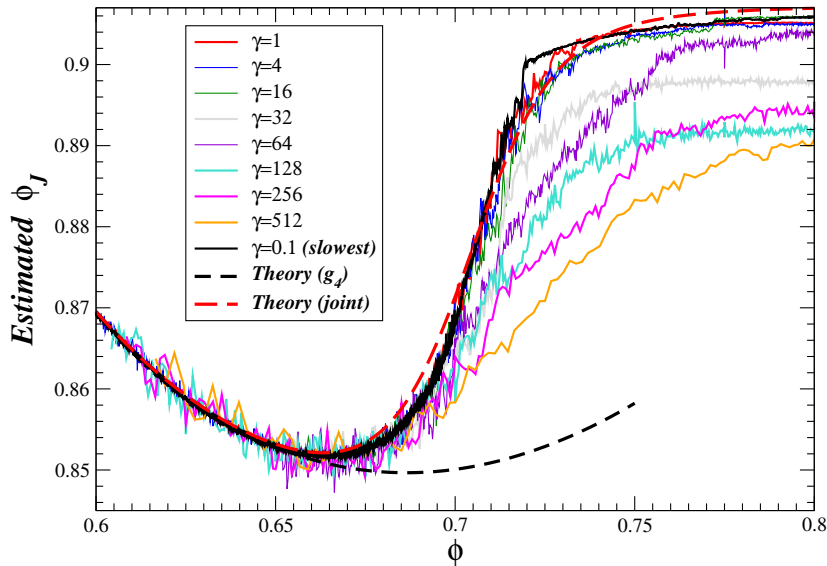
- We will see that plots of  $\tilde{\phi}_J$  highlight the kinetic glass transition very well



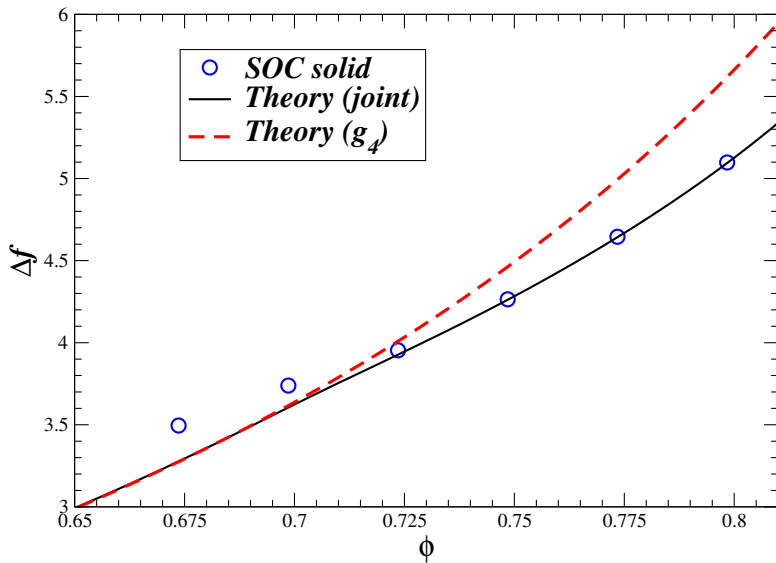
## Why Binary and not 3D Mono?



## Preliminary: Monodisperse Disks



# Configurational Entropy



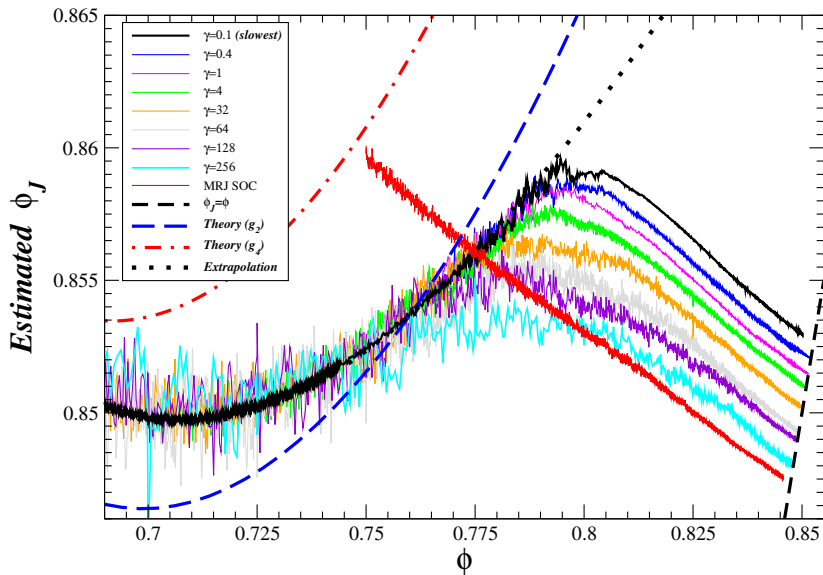


# Bidisperse Disks

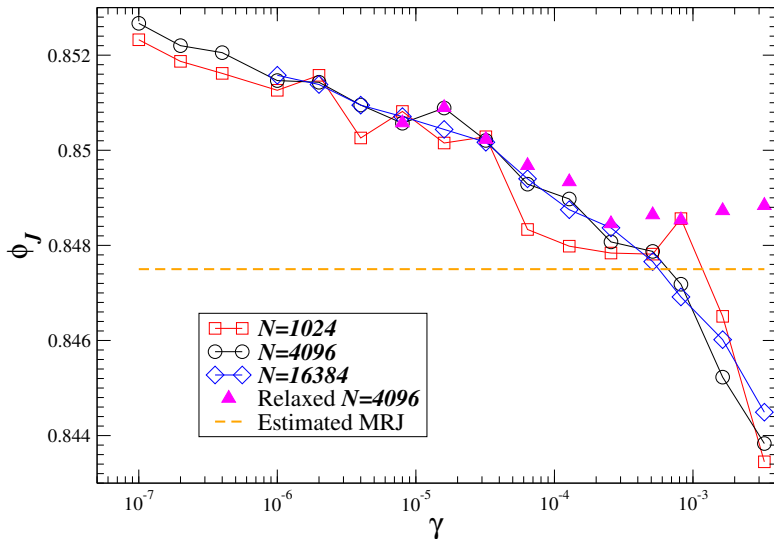
- $x_A = 2/3$  and  $x_B = 1/3$  binary mixture,  $\kappa = D_B/D_A = 1.4$
- This system is a well-studied **model glass former**, with strongly suppressed crystallization. We have never observed direct crystallization of a liquid (in large systems), even in very lengthy runs.
- We use  $N = 4096 = 64^2$  particles for most runs, which is much larger than typical studies ( $\sim 256$  particles in 3D!)
- It is widely believed that the crystal structure here is a **phase-separated** (hexagonal) crystal
- The phase diagram is believed to be of a **eutectic** type, with the liquid first precipitating a **crystal of large disks**



## Liquid/Glass EOS



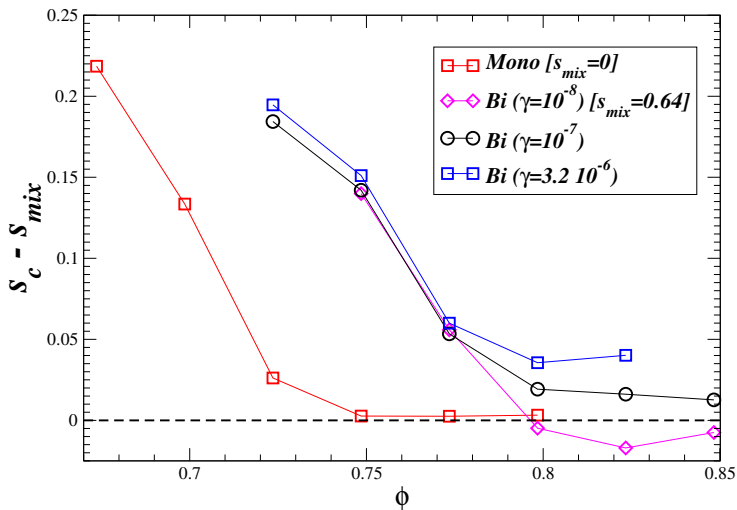
## Effect of Expansion (Cooling) Rate



# Observations

- We do not really have the liquid EOS beyond the kinetic glass transition density  $\phi_g^{\text{kinetic}} \approx 0.8$ . The best known theories do not work well!
- A free energy calculation *assuming* a first-order transition, shows that the **freezing density** is  $\phi_L^{\text{max}} \approx 0.775$ , with mixed isotropic liquid coexisting with a crystal of large particles at  $\phi_S^{\text{min}} \approx 0.842$ . The full phase diagram is difficult to calculate.
- To estimate of  $s_c(\phi)$  we can use the actual EOS for slower compressions:
  - We won't attempt to use the true liquid EOS: use measured EOS instead
  - We use the BCMD algorithm on SOC models of actual snapshots saved during the compression
  - Note that for fast compressions it is not possible to measure/define EOS exactly!



Numerical  $s_c$ 

$$s_{mix} = x_A \ln x_A + x_B \ln x_B = \text{const}$$



# Observations/Conclusions

- **The configurational entropy is very close to the mixing entropy near the glass transition**
- All numerical studies reported in the literature have  $s_c \approx s_{\text{mix}}$  for the lowest temperature or highest density reported!
- Ideal glass transition is **naively extrapolated** to  $s_c = 0$ , which requires overcoming the entropy of mixing, i.e., **demixing**
- *Proposition:* The presumed “ideal glass” is nothing but a fully demixed, i.e., **phase-separated crystal**
- Upon increasing  $\phi$  it seems **partial demixing**, i.e., clustering of large particles, should occur. We see this in the simulation results!

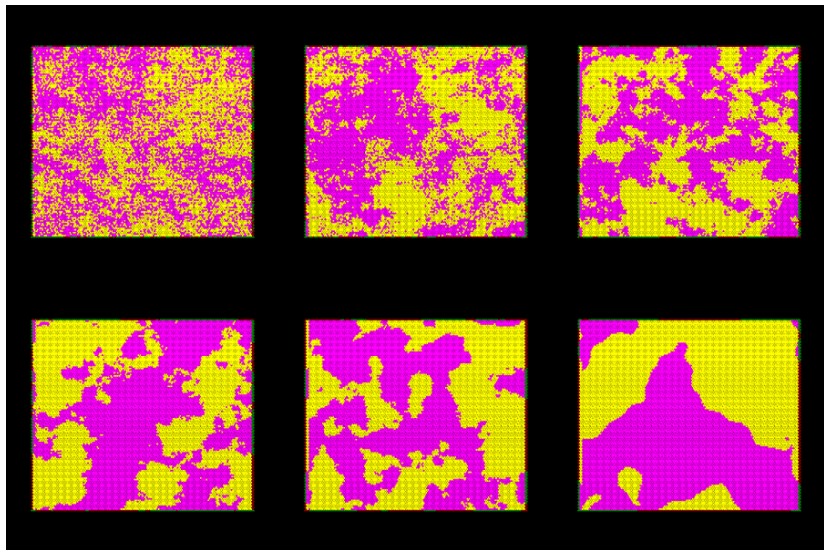


# Is There a Most Dense Amorphous Packing?

- The observation  $s_c \approx s_{\text{mix}}$  suggests that there is an almost one-to-one correspondence between random partitionings of the triangular lattice and disordered jammed packings
- Idea: Start with a monodisperse disk crystal and choose which particles will be large, and which small—grow the first and shrink the latter till the aspect ratio is 1.4
- Starting with more clustered initial configurations will generate denser final packings!
- Ultimate tradeoff between **free volume** and **degeneracy!**
- Using specific statistical models for clustering we can calculate the degeneracy exactly or numerically (we use **Leveled Random Gaussian Fields**)

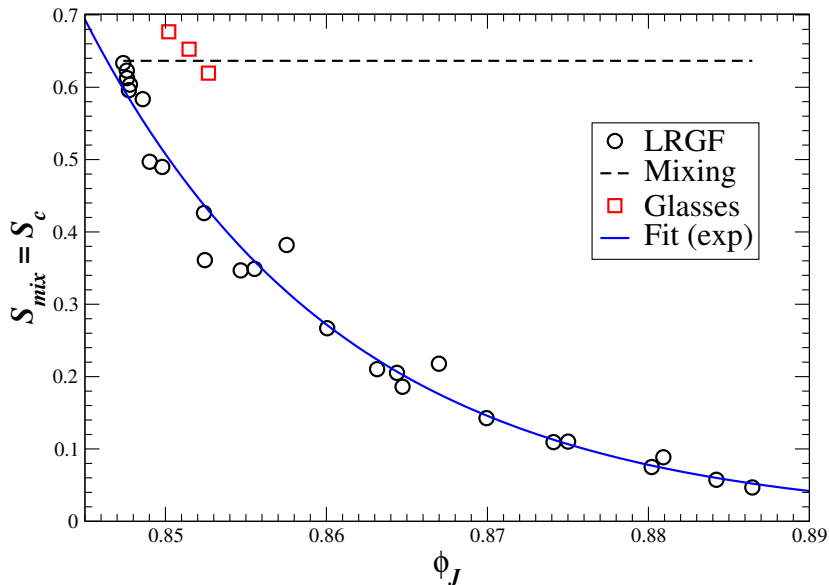


# Levelled Random Gaussian Fields





## Mixing Entropy vs Clustering



# Can Entropy Really be Measured?

- Can disorder be measured for **finite samples** without appealing to **ensembles** of packings?
- *Can we generalize to other systems: monodisperse spheres in 3D, 4D, etc.?*
- Can we **discretize the problem** of enumerating jammed packings? Disks are special because jammed monodisperse configurations are (poly)crystalline!
- Blind attempt at monodisperse spheres: Filling **octahedral holes** ( $p = 0.05$ ,  $p = 0.65$ ,  $p = 0.95$ )



# Conclusions

- There is no reproducible metastable mono sphere liquid above  $\phi \approx 0.55$ , so talking about a **metastable liquid EOS is not justified**
- Monodisperse disks do not show any glassy behavior and freeze in a nearly continuous manner
- Bidisperse disks show a pronounced dynamical slowdown near  $\phi \approx 0.80$ , and no known algorithm can equilibrate above that density
- All measurements of  $s_c$  to date have been done on bidisperse systems and are close to  $s_{\text{mix}}$  close to the glass transition



## Contd.

- We have constructed by an explicit model an **exponential** number of amorphous jammed packings as dense as the crystal
- Extrapolating  $s_c(\phi)$  to zero is unjustified: It crosses zero only for a phase-separated crystal
- There is no (thermodynamic) ideal glass transition (in the sense proposed so far) for binary disk mixtures
- We expect this result to apply to all other models, and in particular bidisperse spheres
- Similarly for monodisperse packings: **The old RCP concept assumed that there is some magical most disordered jammed packing**, but there is none: *You can trade partial ordering (clustering into small crystals) for density, and still have a positive configurational entropy!*

