



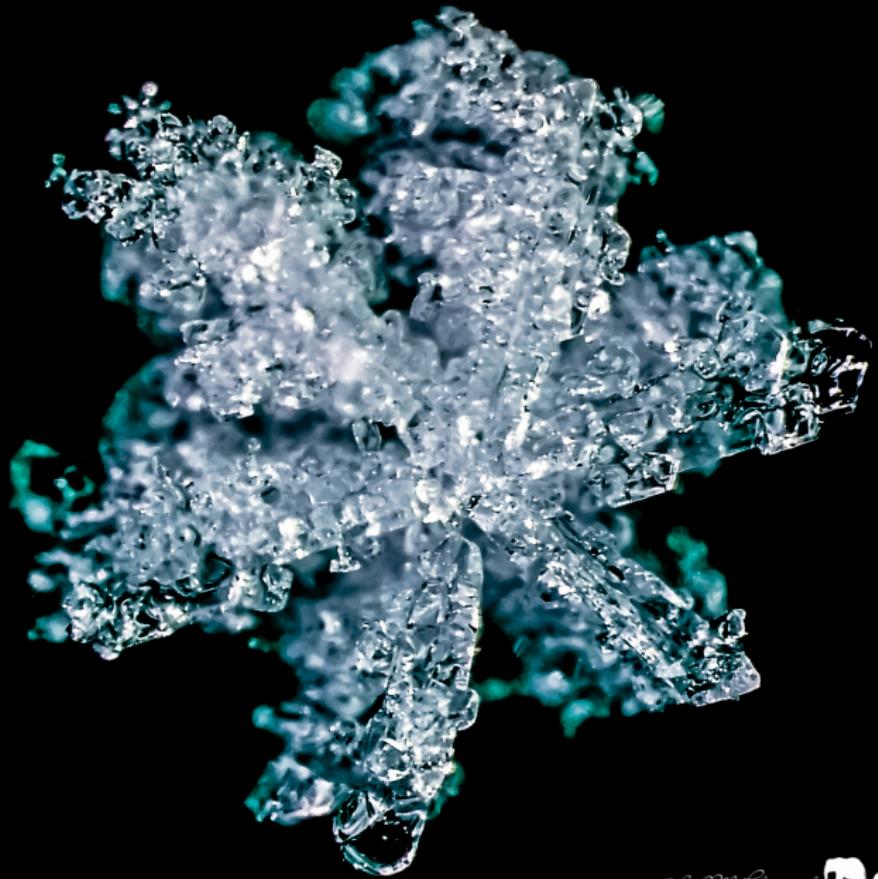
# Random packing lattices

or: Bravais New World

Yoav Kallus

Santa Fe Institute

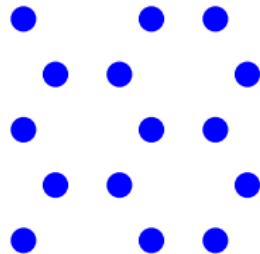
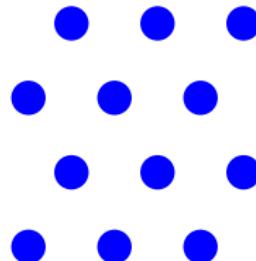
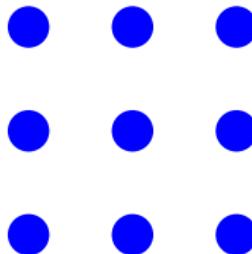
Unifying concepts in glass physics VI  
Aspen Center for Physics  
February 6, 2015



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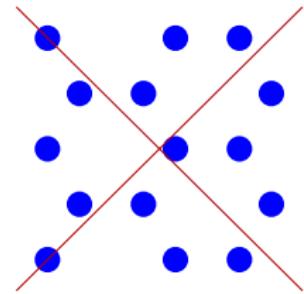
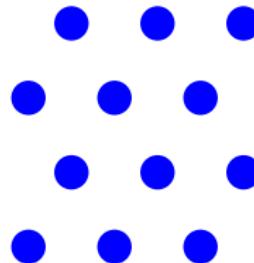
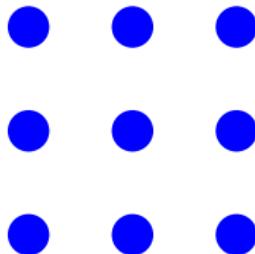
# What do I mean by a lattice

$$L = A\mathbb{Z}^n = \left\{ \sum_{i=1}^n m_i \mathbf{a}_i : m_i \in \mathbb{Z} \right\}$$



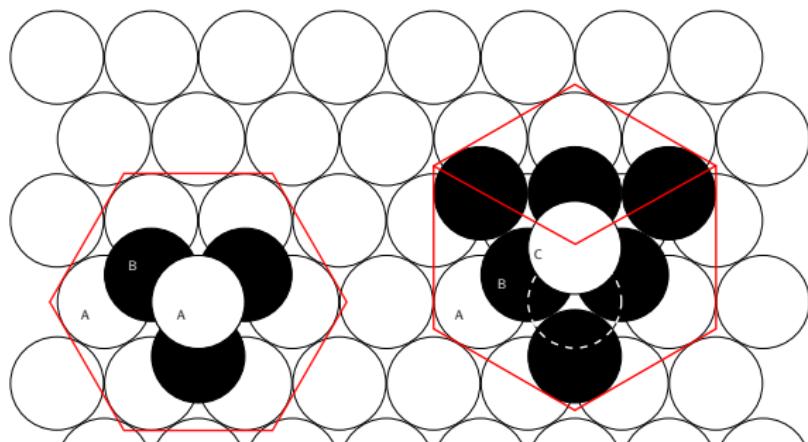
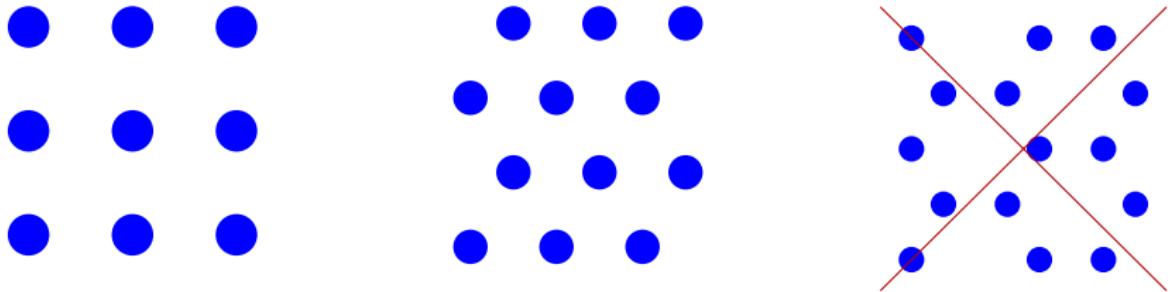
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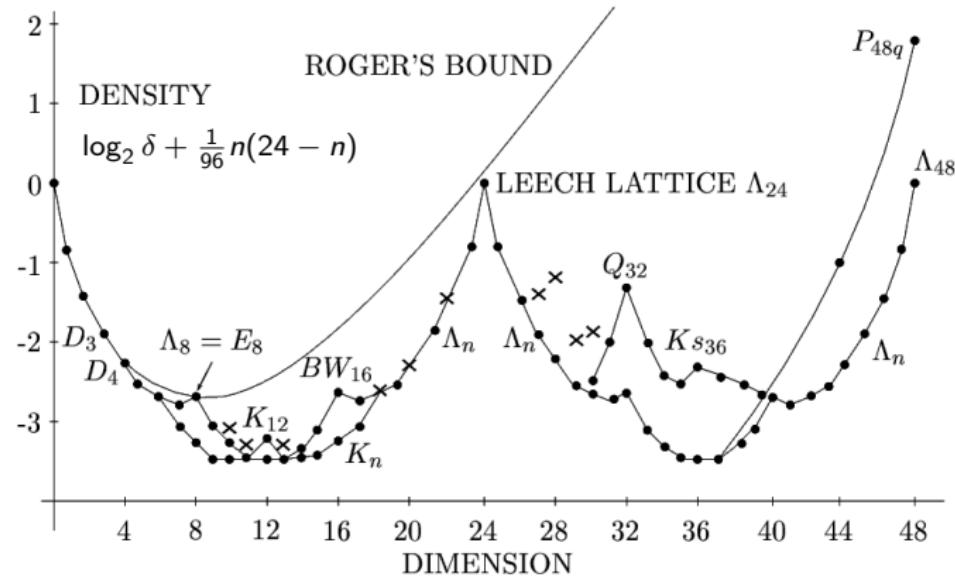


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# Good packings are often lattices



# Why we care about sphere packings in high $d$ ?



# Packing problem restricted to lattices

Restricted to lattices, what is the densest packing structure?

$n$	$L$	
2	$A_2$	Lagrange (1773)
3	$D_3 = A_3$	Gauss (1840)
4	$D_4$	Korkin & Zolotarev (1877)
5	$D_5$	Korkin & Zolotarev (1877)
6	$E_6$	Blichfeldt (1935)
7	$E_7$	Blichfeldt (1935)
8	$E_8$	Blichfeldt (1935)
24	$\Lambda_{24}$	Cohn & Kumar (2004)

# The space of lattices

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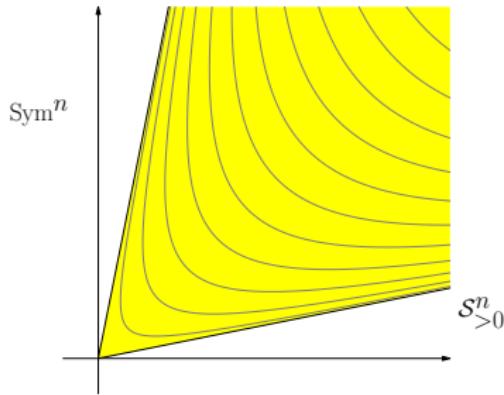
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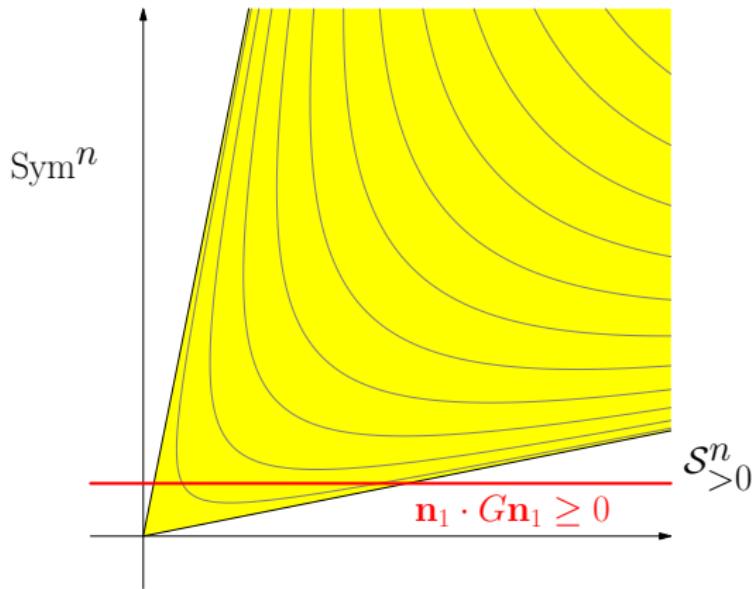
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$O(n) \backslash GL_n(\mathbb{R}) = \mathcal{S}_{>0}^n \subset \text{Sym}^n$ , the space of symmetric, positive definite matrices: take  $G = A^T A$ .



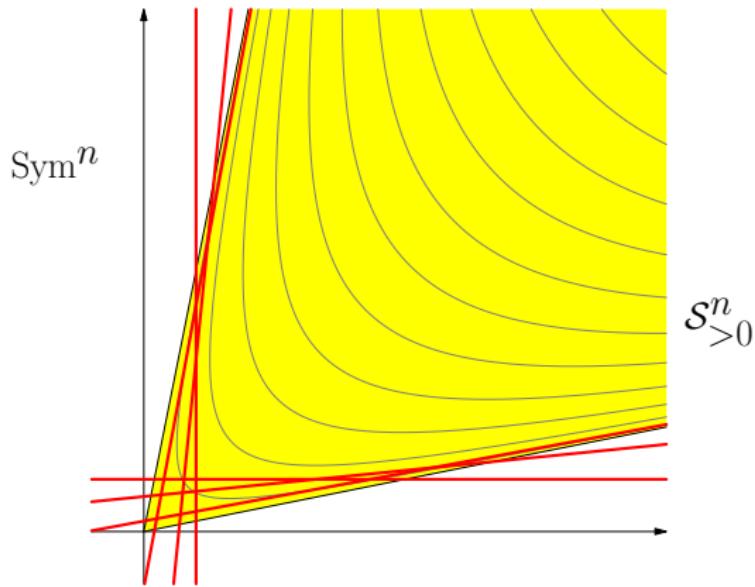
# The Ryshkov polyhedron

We are interested in the lattices with packing radius  $\geq 1$ :  
 $\{G \in \mathcal{S}_{>0}^n : \mathbf{n} \cdot G\mathbf{n} \geq 1 \text{ for all } \mathbf{n} \in \mathbb{Z}^n\}$ .



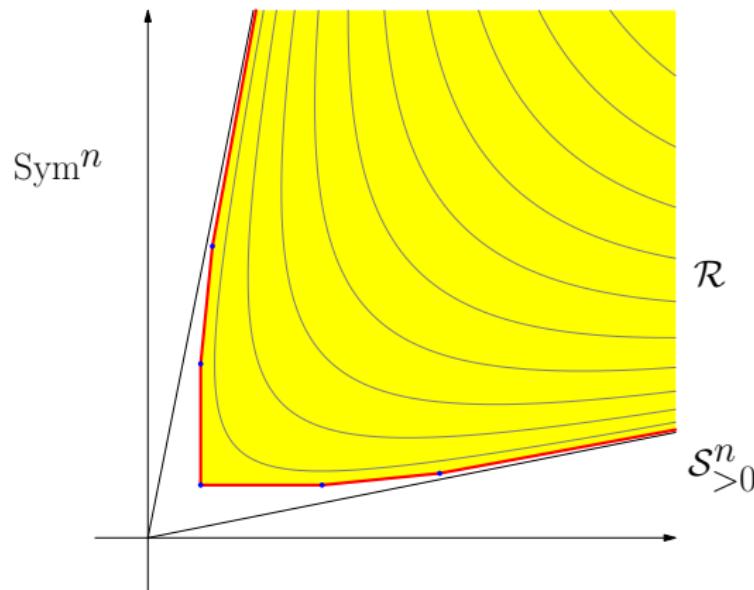
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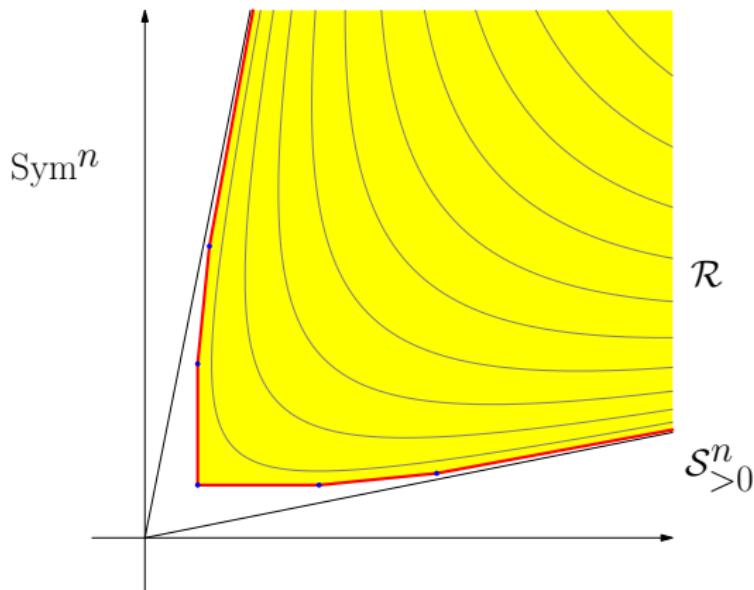
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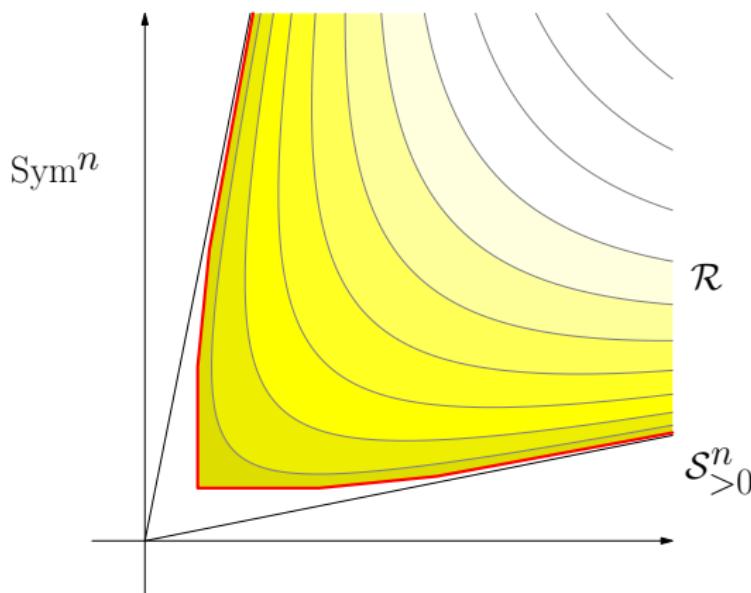
# The Ryshkov polyhedron

Minimum determinant (maximum density) occurs at vertices, which are finitely enumerable.



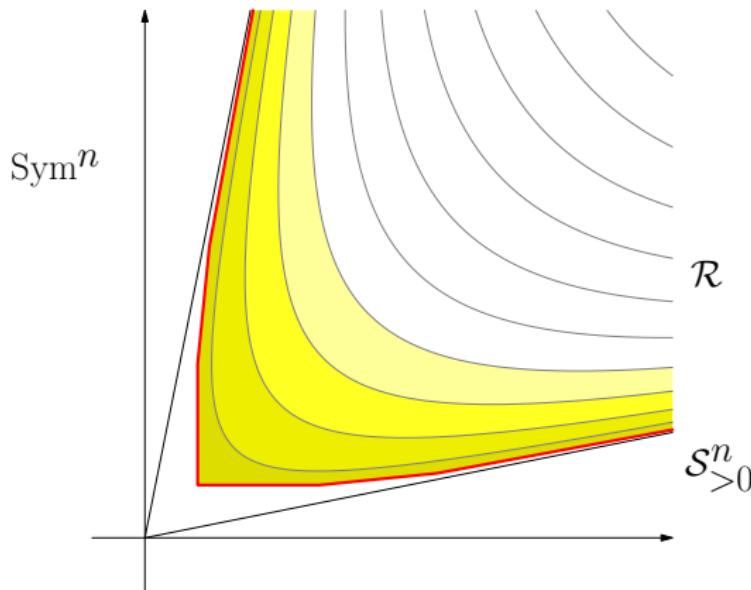
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Instead of optimum (zero  $T$ ), we can ask about finite  $T$ :  
 $P(G) \sim \exp(-\beta p(\det G)^{1/2})$

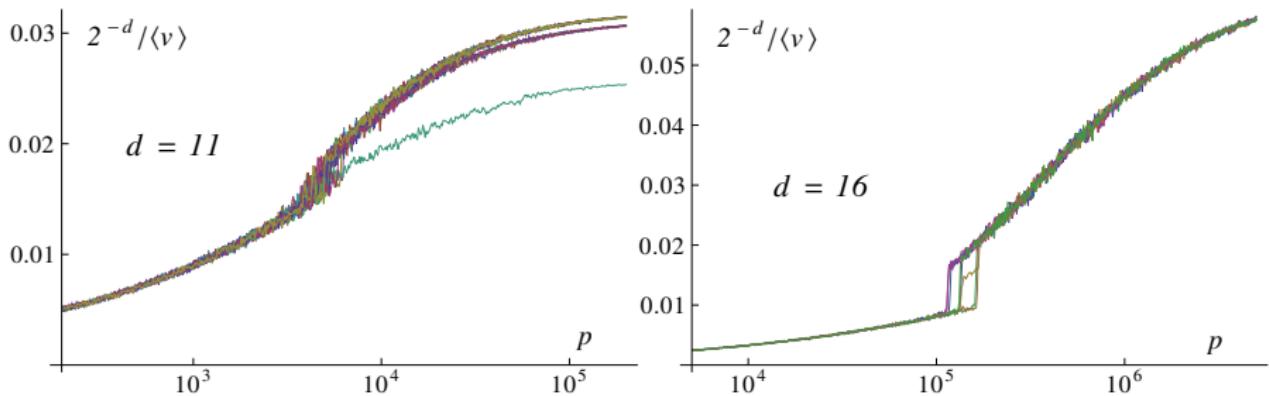


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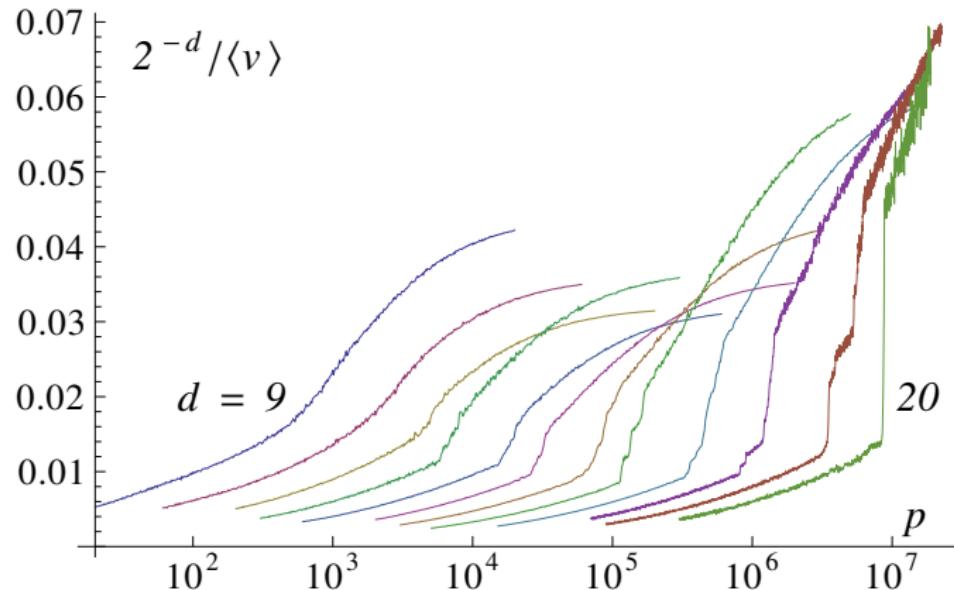


# Thermodynamics of hard-sphere lattices



Kallus, Phys. Rev. E 87, 063307 (2013)

# Thermodynamics of hard-sphere lattices



Densest known lattice recovered in some runs for  $n \leq 20$

Kallus, Phys. Rev. E 87, 063307 (2013)

# A note about symmetry breaking

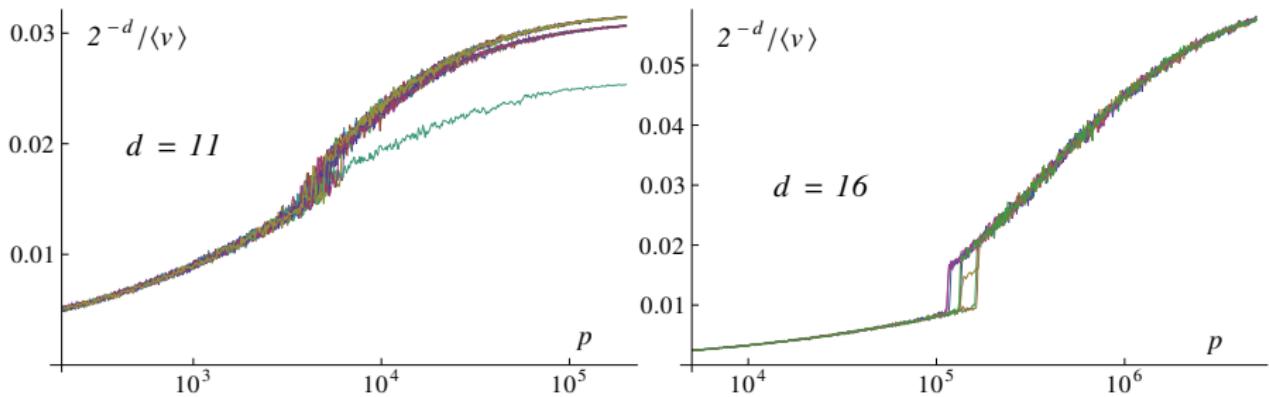
Is there a symmetry broken in the lattice “freezing” transition?

# A note about symmetry breaking

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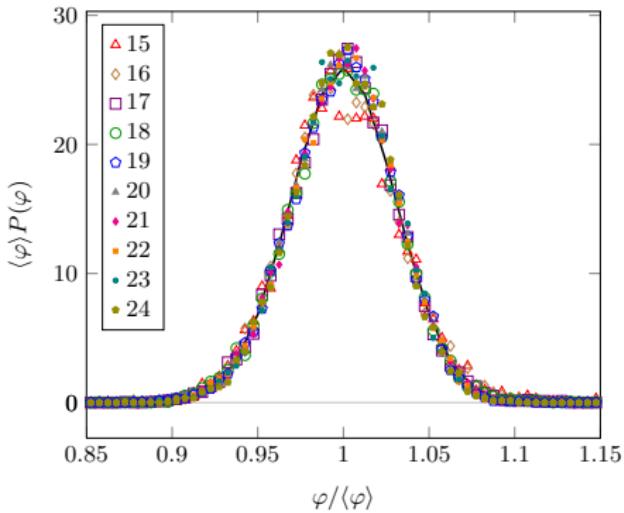
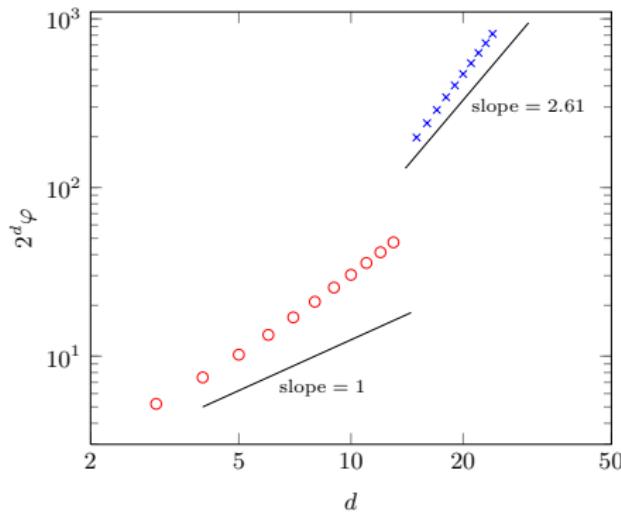
$\mathcal{R}$  and  $\det$  are symmetric under  $GL_n(\mathbb{Z})$ , and so is the “liquid” state, but not the “solid”.

# Thermodynamics of hard-sphere lattices



Kallus, Phys. Rev. E 87, 063307 (2013)

# Lattice RCP



Kallus, Marcotte, & Torquato, Phys. Rev. E 88, 062151 (2013)

# Lattice isostaticity

Isostaticity:

#constraints = #dof's

In RCP, Isostaticity  $\rightarrow$   
average #contacts =  $2d$ .

In Lattice RCP: #dof's

$$= \frac{1}{2}d(d + 1).$$

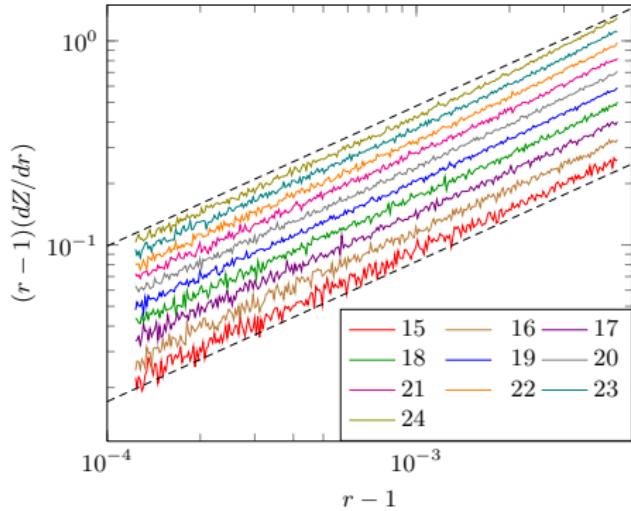
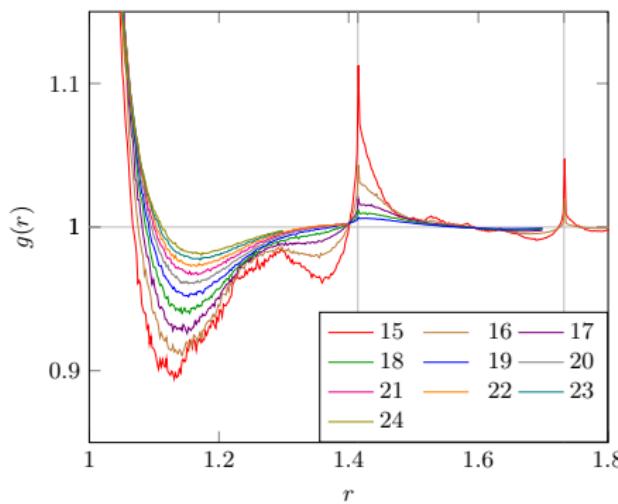
Isostaticity  $\rightarrow$

$$\text{#contacts} = d(d + 1) .$$

*Kallus, Marcotte, & Torquato, Phys.  
Rev. E 88, 062151 (2013)*

$d$	Runs	Isostatic
13	10,000	365
14	10,000	1,625
15	10,000	5,196
16	10,000	6,761
17	10,000	9,235
18	10,000	9,590
19	20,000	19,200
20	20,000	19,085
21	10,000	9,473
22	10,000	9,406
23	10,000	9,281
24	10,000	9,205

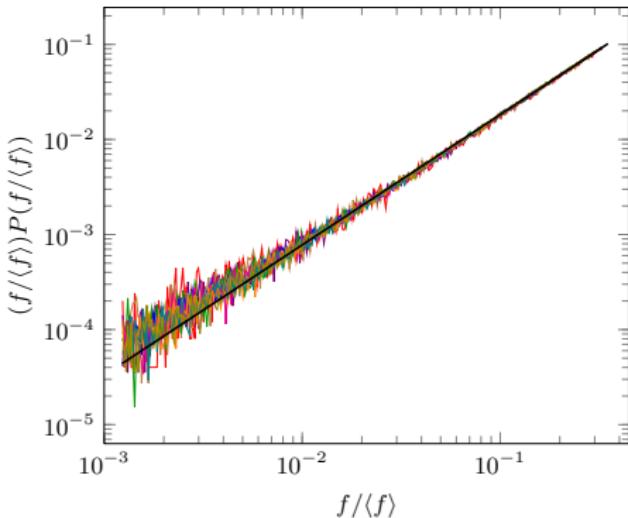
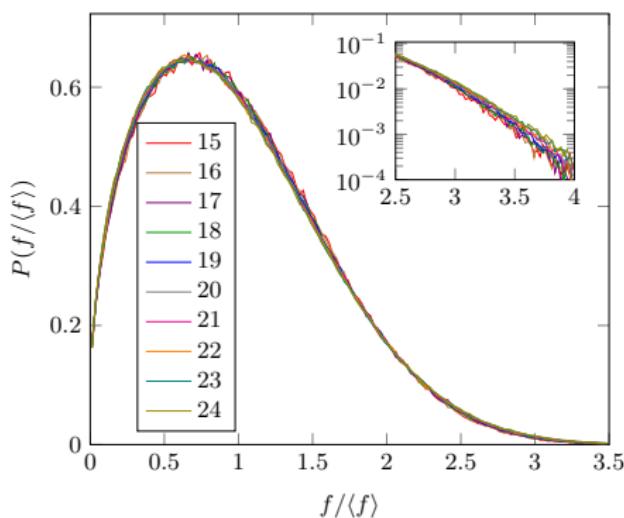
# Pair correlations and quasicontacts



$$g(r) \sim (r - 1)^{-\gamma}$$
$$Z(r) \sim d(d + 1) + A_d(r - 1)^{1-\gamma}$$
$$\gamma = 0.314 \pm 0.004$$

Kallus, Marcotte, & Torquato, Phys. Rev. E 88, 062151 (2013)

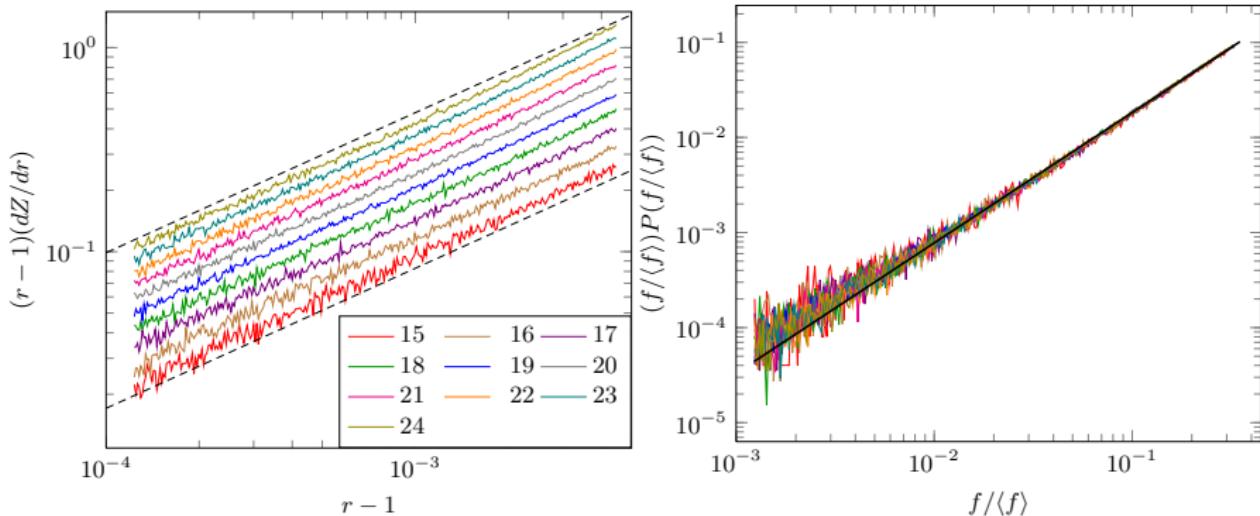
# Contact force distribution



$$P(f) \sim f^\theta$$
$$\theta = 0.371 \pm 0.010$$

Kallus, Marcotte, & Torquato, Phys. Rev. E 88, 062151 (2013)

# Quasicontacts and weak contacts



$$\gamma = 0.314 \pm 0.004$$
$$\theta = 0.371 \pm 0.010$$

Kallus, Marcotte, & Torquato, Phys. Rev. E 88, 062151 (2013)

# Uniform sampling of jammed lattices

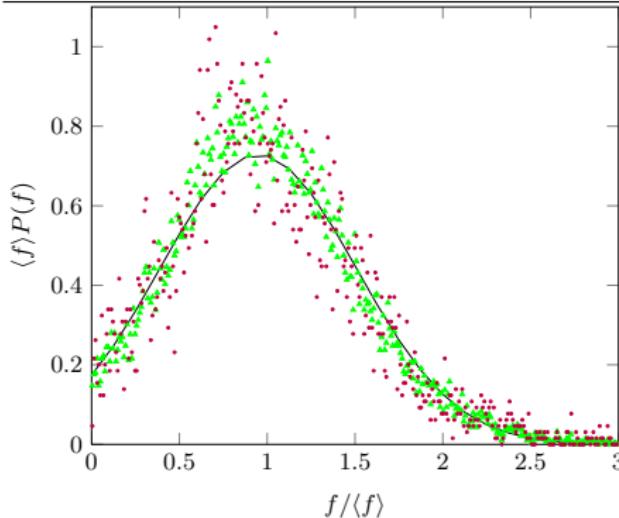
*Extreme* lattices can be exhaustively enumerated.

d	2	3	4	5	6	7	8	9
perfect lattices	1	1	2	3	7	33	10916	>50000
extreme lattices	1	1	2	3	6	30	2408	...

# Uniform sampling of jammed lattices

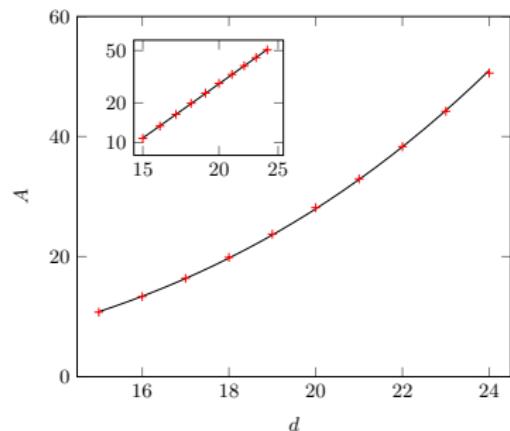
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Kallus & Torquato, Phys. Rev. E 90, 022114 (2014)

# Quasicontact abundance



$$\nu = (1 - \gamma)(3 + 2\theta)/(1 + \theta) \approx 3.05$$

Contacts  $\sim d^2$

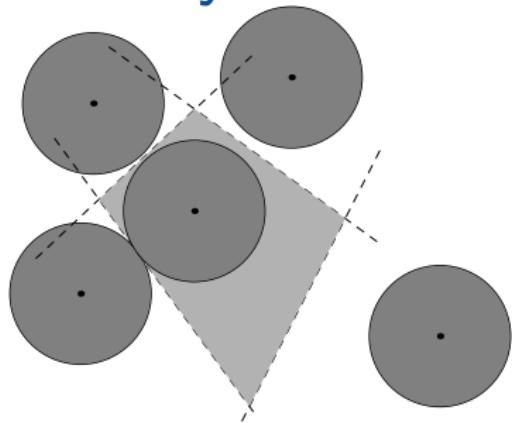
Quasicontacts  $\sim d^\nu$

best fit:  $A \sim d^{3.30}$

In high-enough dimensions the quasicontact network determines the structure more than the contact network.

*Kallus & Torquato, Phys. Rev. E 90, 022114 (2014)*

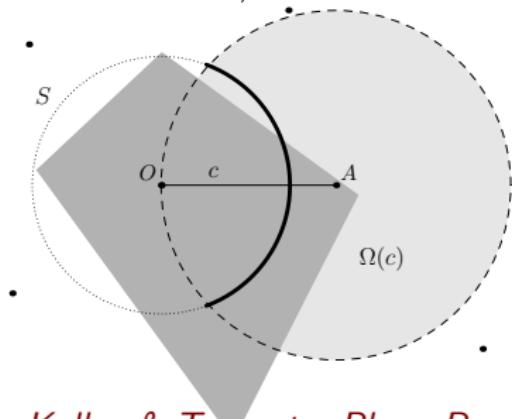
# Density estimate from local structure



Using pair correlation:

$$g(r) = 1 + \frac{z\delta(r-1)}{\rho S_{d-1}} + \frac{(1-\gamma)A_d(r-1)^{-\gamma}}{\rho S_{d-1}r^{d-1}}$$

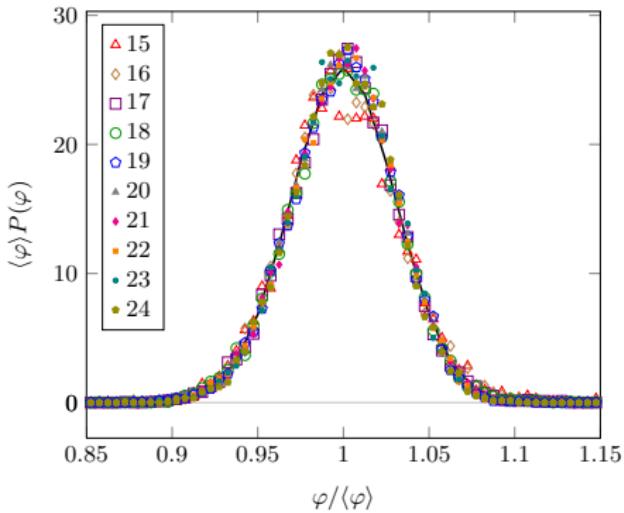
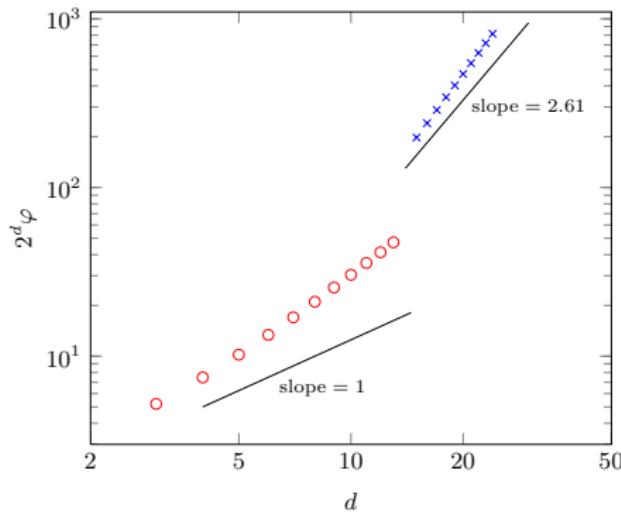
$$g(r) = 0 \text{ for } r < 1$$



	w/o QC	w/ QC
RCP	$2^d \varphi \sim d$	$2^d \varphi \sim d$
LRCP	$2^d \varphi \sim d^2$	$2^d \varphi \sim d^{2.61}$

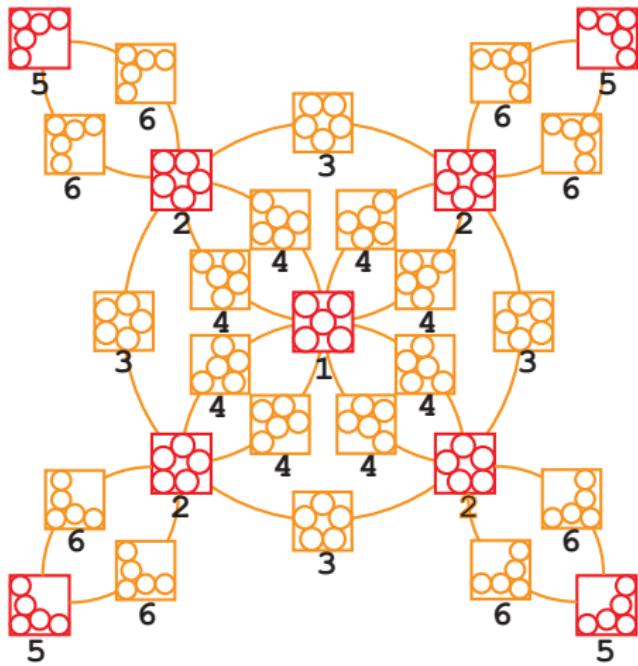
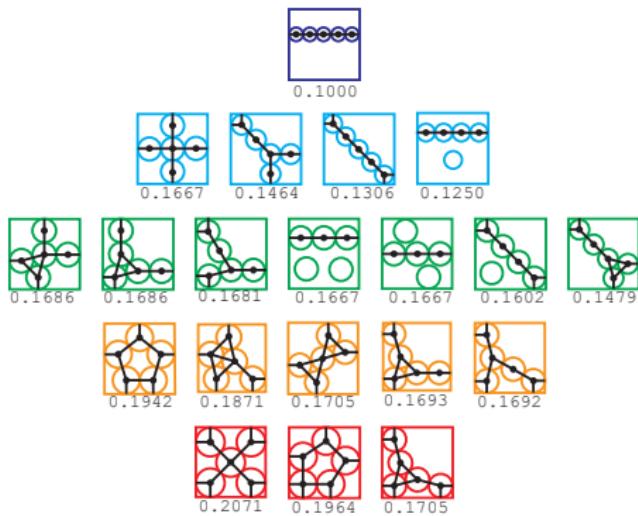
Kallus & Torquato, Phys. Rev. E 90, 022114 (2014)

# Lattice RCP



Kallus, Marcotte, & Torquato, Phys. Rev. E 88, 062151 (2013)

# Computational topology of config'n space



Carlsson, Gorham, Kahle, & Mason, Phys. Rev. E 85, 011303 (2012)

# Conclusions

Lattices in high dimensions have enough dof's to exhibit “disorder”.

Lattices are numerically accessible in much higher dimensions than hard-sphere fluids: crystallization for  $n \leq 20$ , jamming for even larger  $n$ .

Random close packed lattices are much denser than RCP hard spheres in  $n$  dimensions.

Mathematical structure allows complete enumeration, cell decomposition of config space, contacts → structure is a linear problem.