



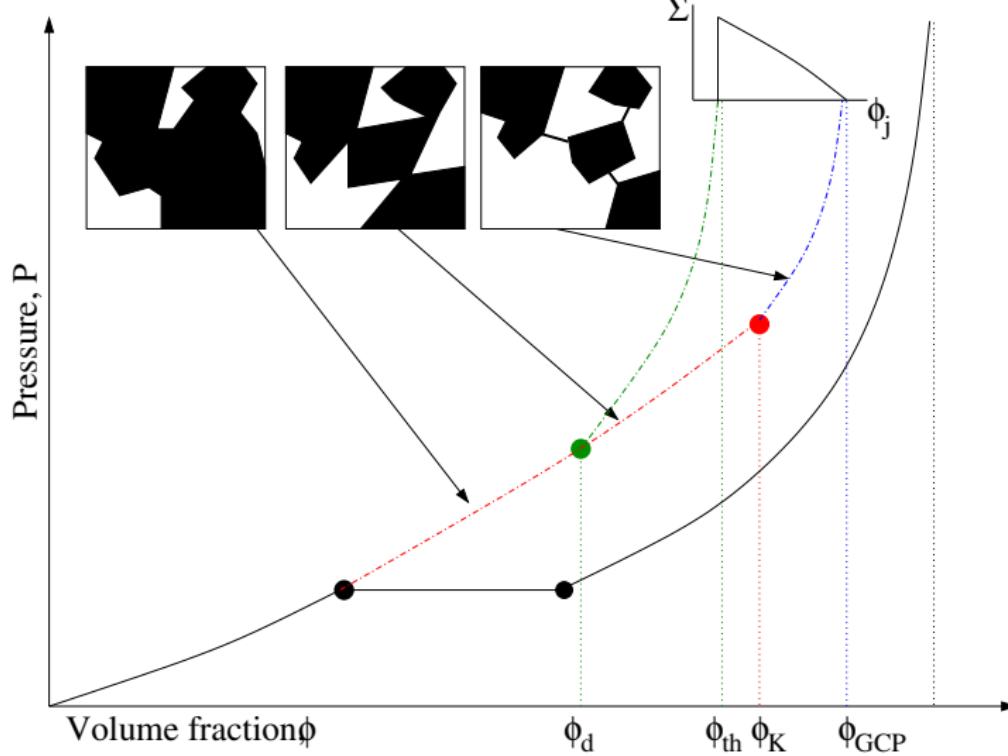
# Computational topology of configuration spaces

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Stochastic Topology and Thermodynamic Limits  
ICERM, Providence  
October 17, 2016

# Clustering of the phase space



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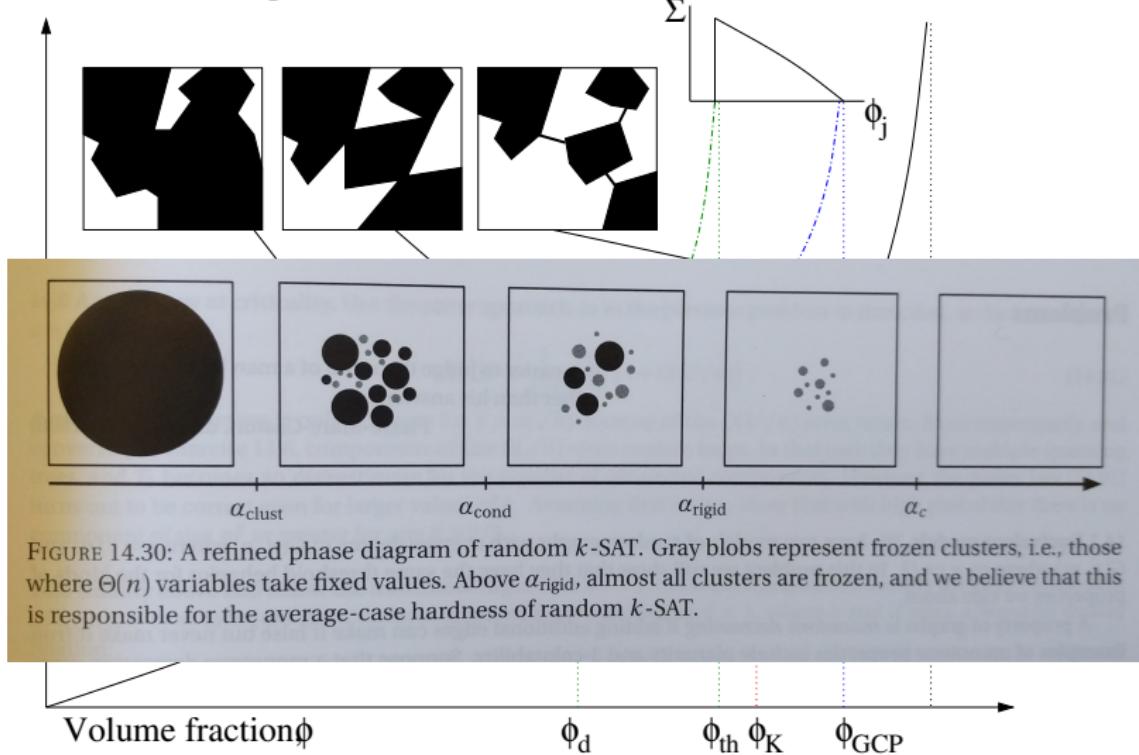
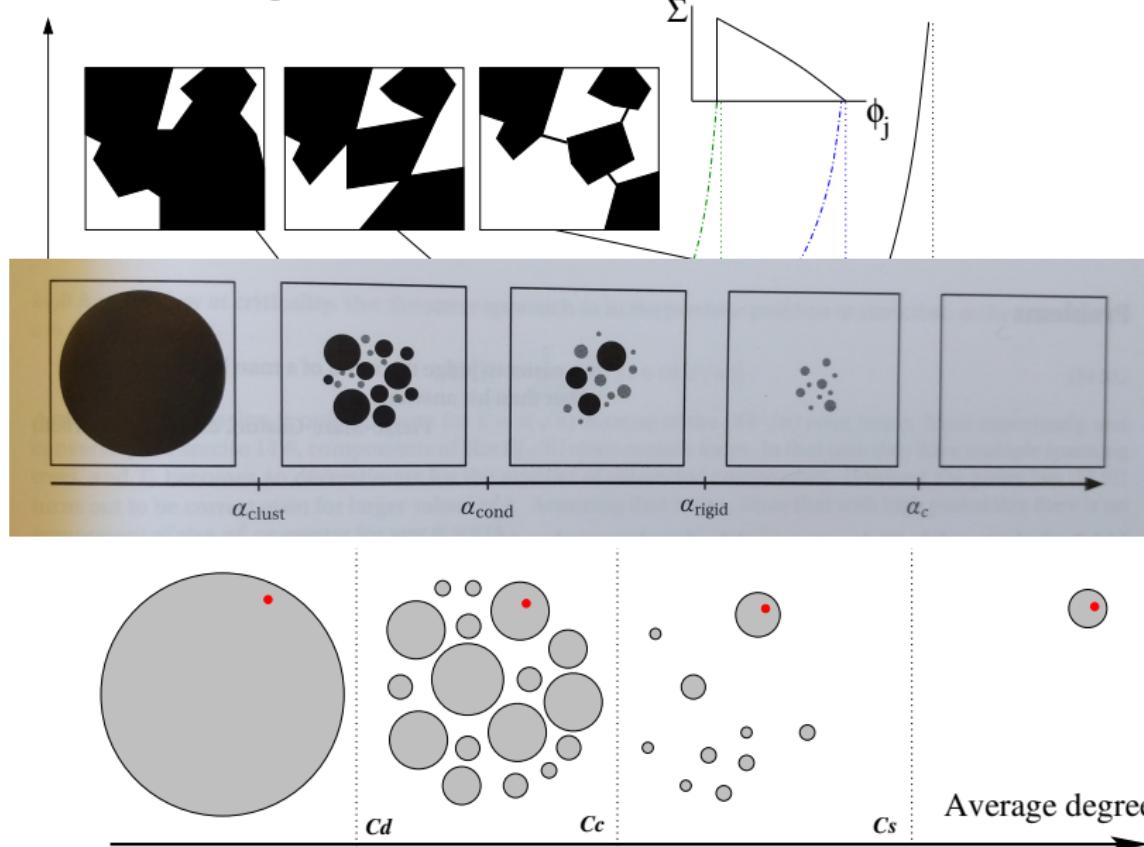


FIGURE 14.30: A refined phase diagram of random  $k$ -SAT. Gray blobs represent frozen clusters, i.e., those where  $\Theta(n)$  variables take fixed values. Above  $\alpha_{\text{rigid}}$ , almost all clusters are frozen, and we believe that this is responsible for the average-case hardness of random  $k$ -SAT.

# Clustering of the phase space



# $k$ -SAT clustering

## Theorem

$\beta, \gamma, \theta, \delta$  and  $\epsilon_k \rightarrow 0$  exist such that for a random  $k$ -SAT formula with  $n$  variables and  $m = \alpha n$  clauses, where

$$(1 + \epsilon_k)2^k \log(k)/k \leq \alpha \leq (1 - \epsilon_k)2^k \log(2)$$

the solution can be partitioned w.h.p. into clusters, s.t.

- there are  $\geq \exp(\beta n)$  clusters,
- any cluster has  $\leq \exp(-\gamma n)$  of all solutions,
- solutions in distinct clusters are  $\geq \delta n$  apart, and
- any connecting path violates  $\geq \theta n$  clauses along it.

Moore & Mertens, *The Nature of Computation*

# Clustering phenomenology

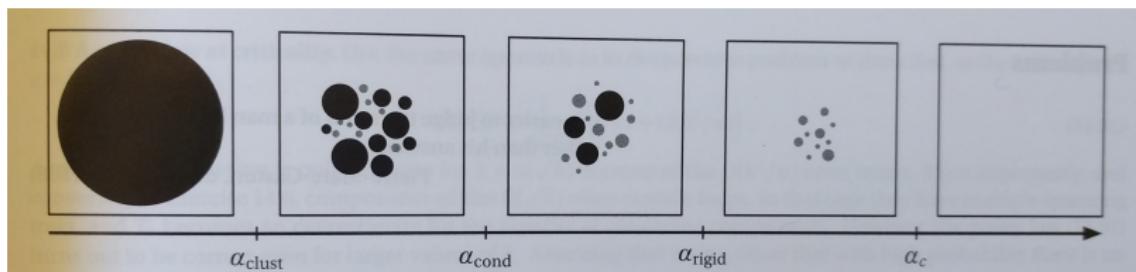


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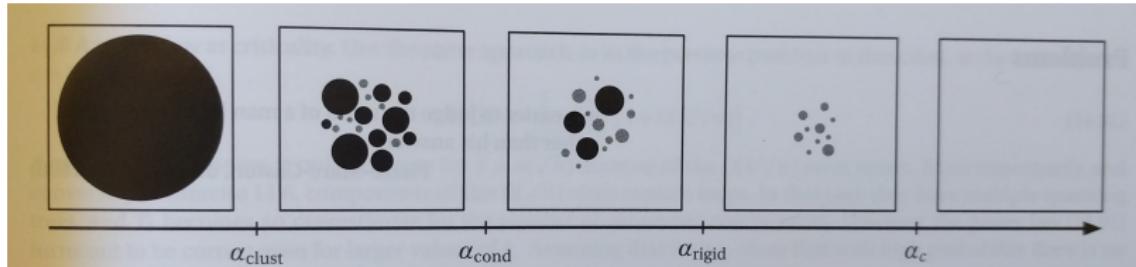
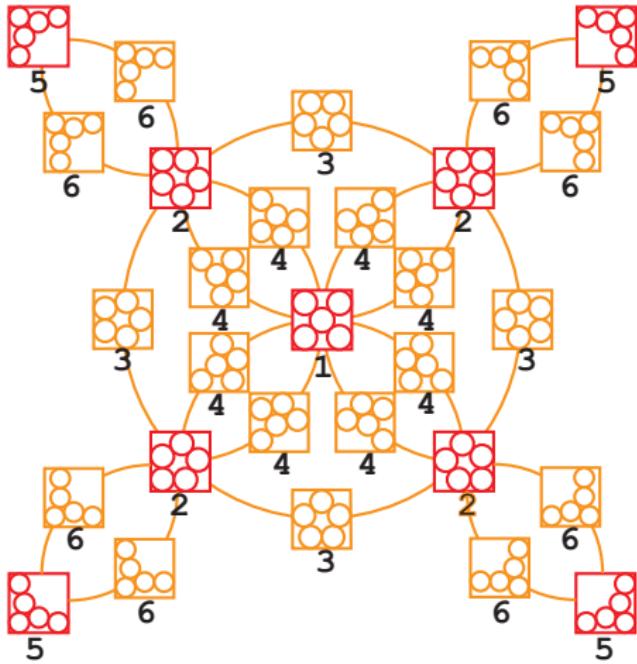
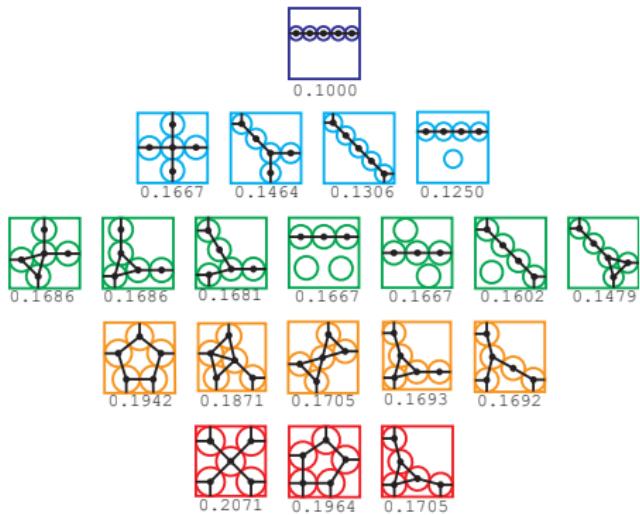


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All about connected components of the configuration space. What about higher dimensional topological invariants?

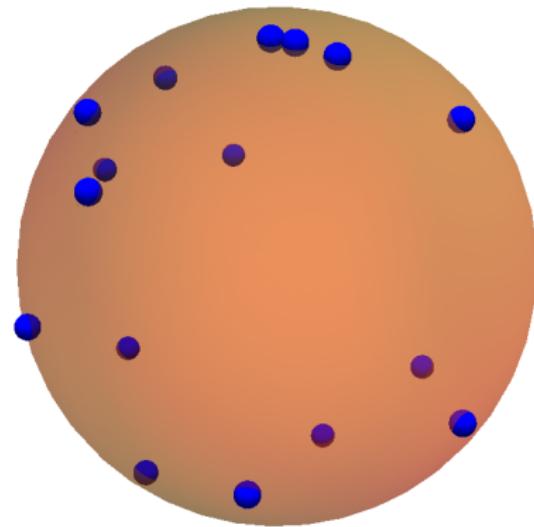
*Moore & Mertens, The Nature of Computation*

# 5 disks in a square

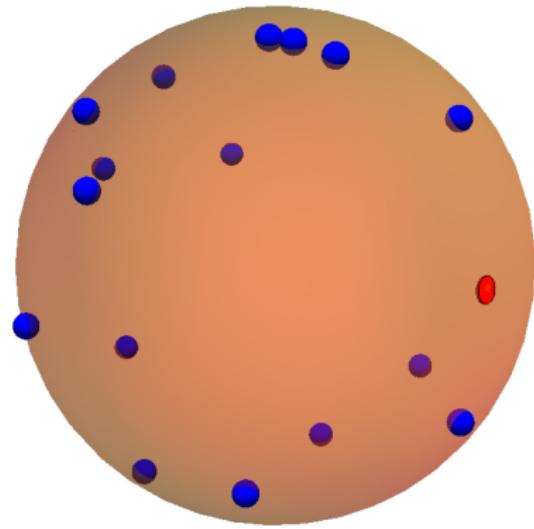


Carlsson, Gorham, Kahle, & Mason, Phys. Rev. E 85, 011303 (2012)

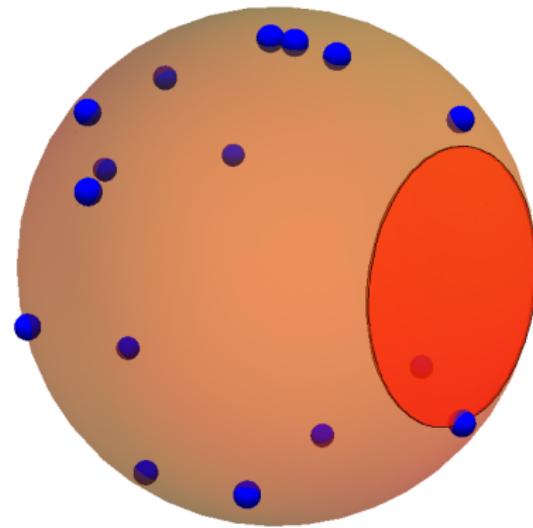
# The perceptron



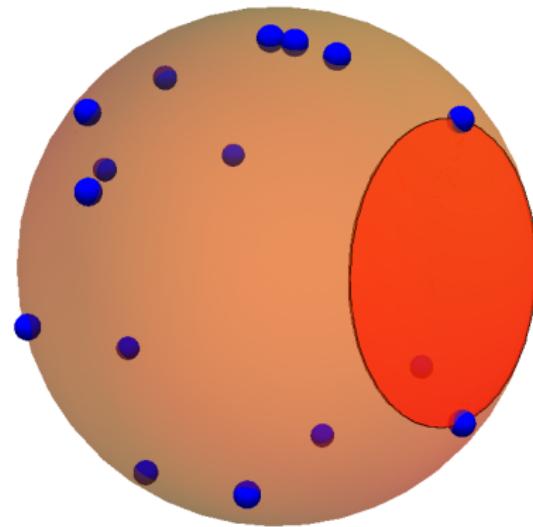
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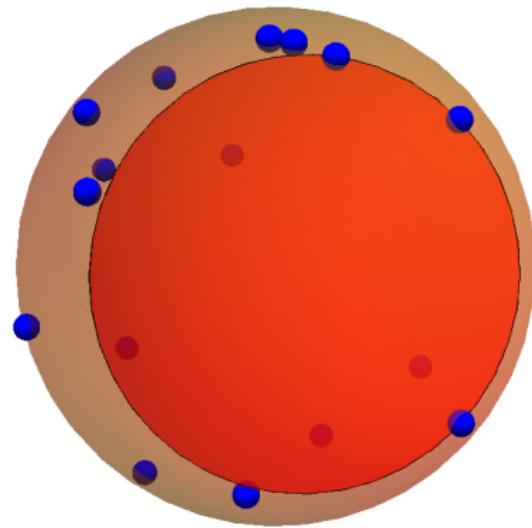
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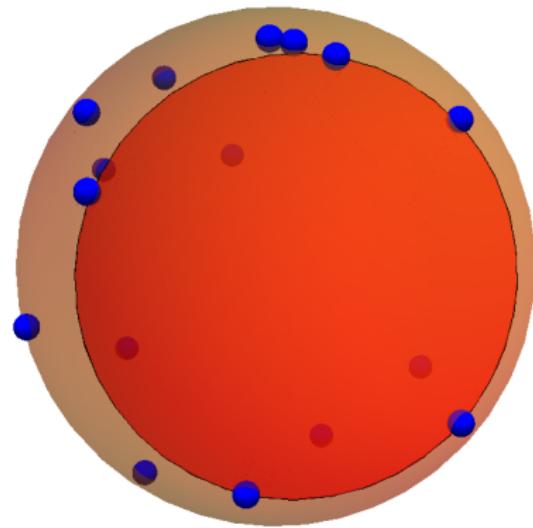
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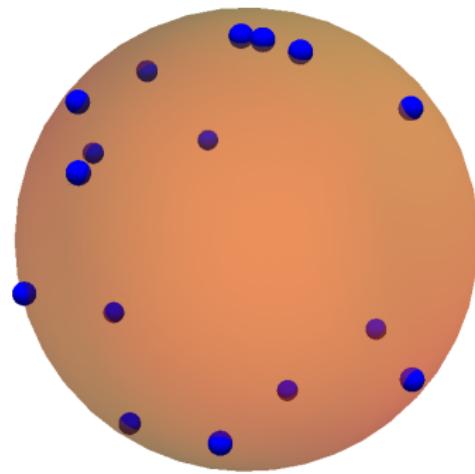
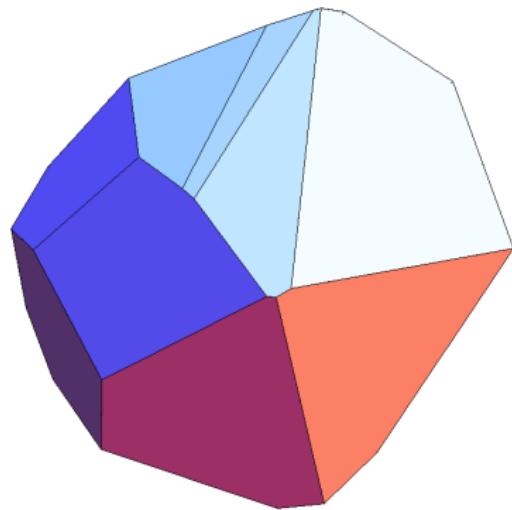
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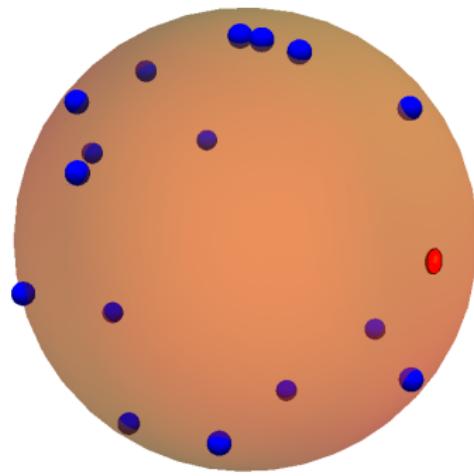
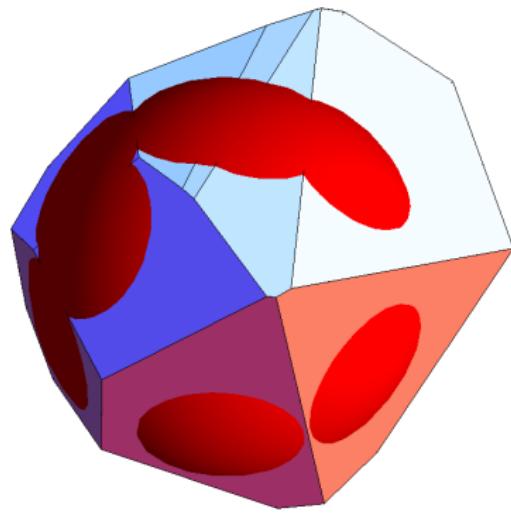
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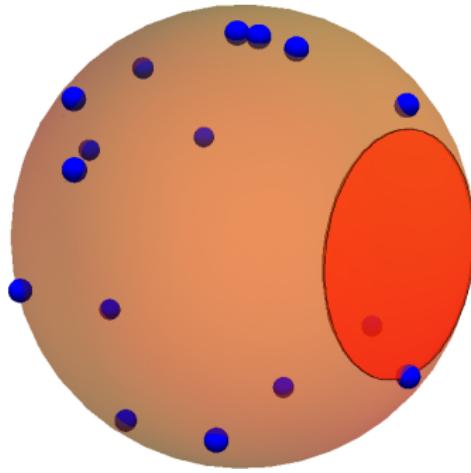
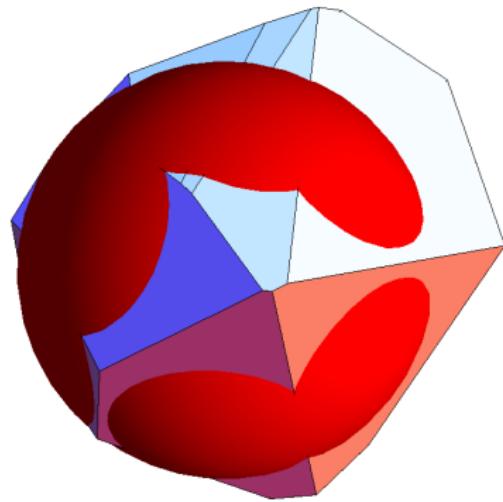
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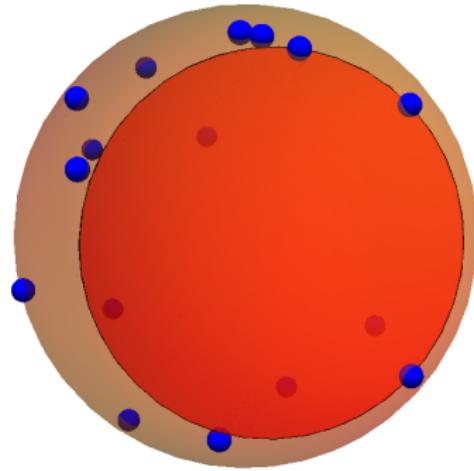
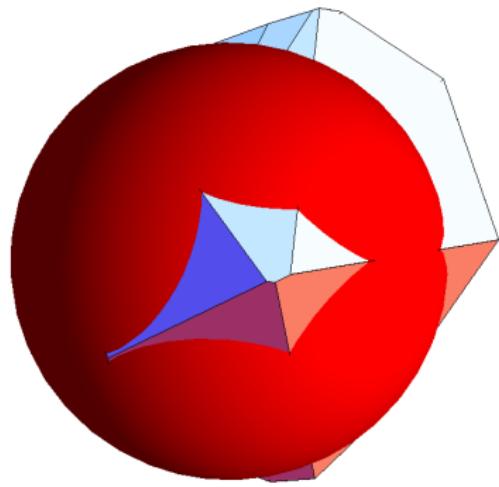
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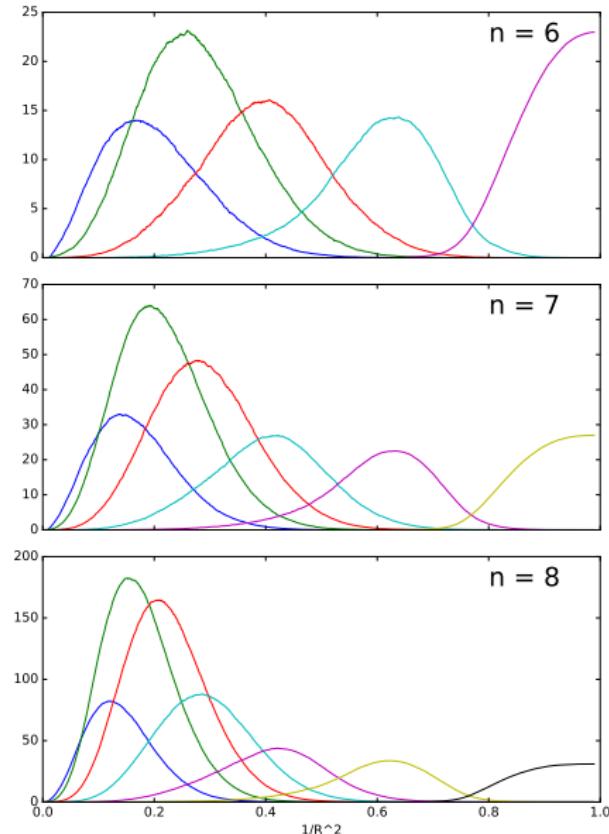
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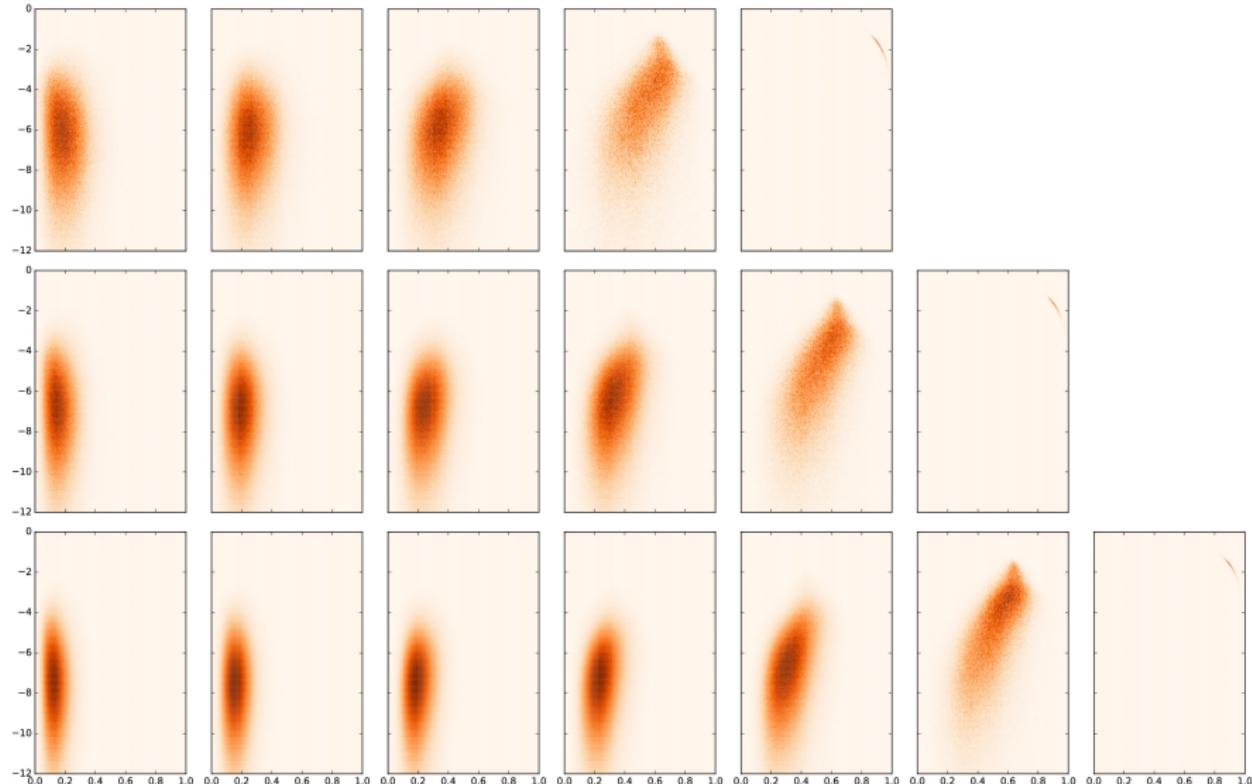
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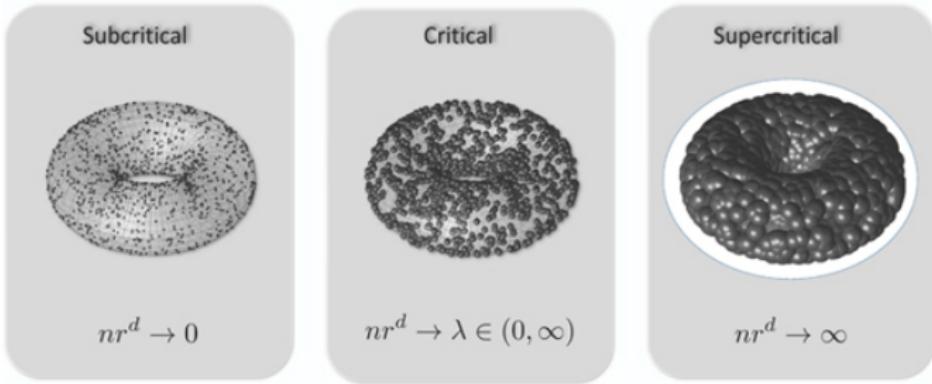
# The perceptron – Betti numbers



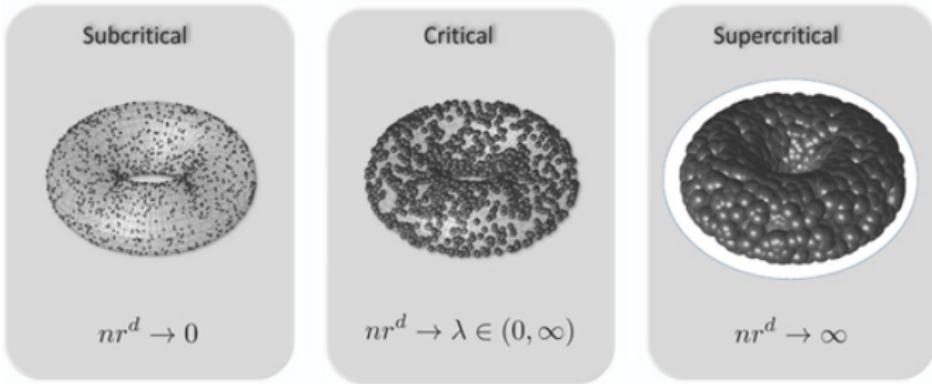
# The perceptron – persistence homology



# Stochastic topology, a different criticality

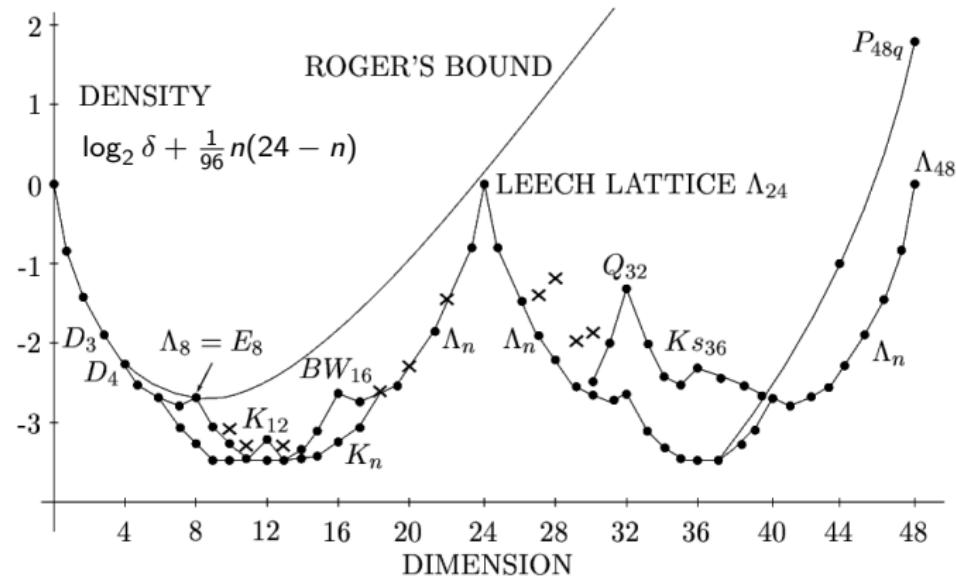


# Stochastic topology, a different criticality



$d$  fixed,  $n \rightarrow \infty$ : structure only at local scale  
 $d, n \rightarrow \infty$ ,  $d \sim \exp(n^2)$ : no spatial structure  
 $d, n \rightarrow \infty$ ,  $d \sim n$ : structure at all scales

# The sphere packing problem



Conway & Sloane, SPLAG

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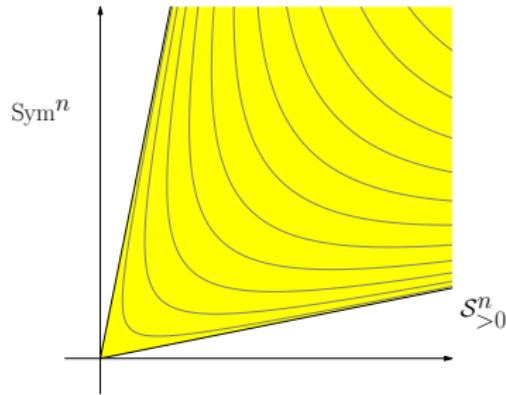
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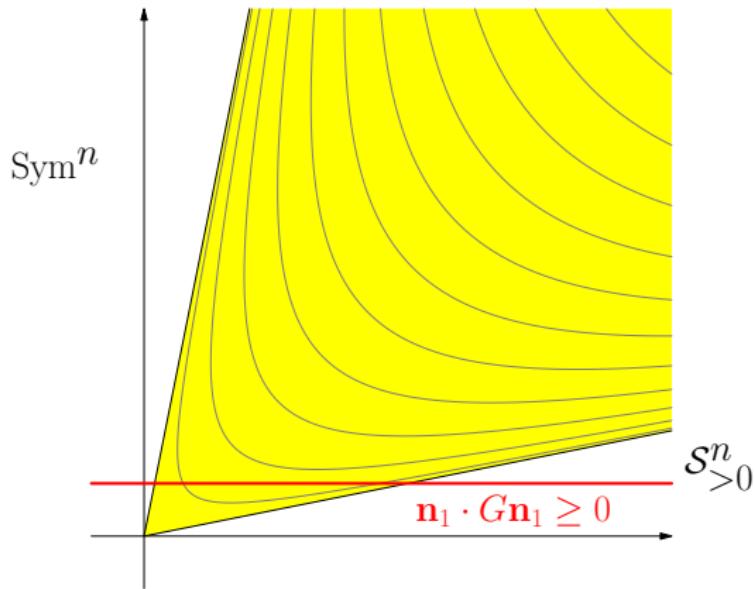
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$O(n) \backslash GL_n(\mathbb{R}) = \mathcal{S}_{>0}^n \subset \text{Sym}^n$ , the space of symmetric, positive definite matrices: take  $G = A^T A$ .



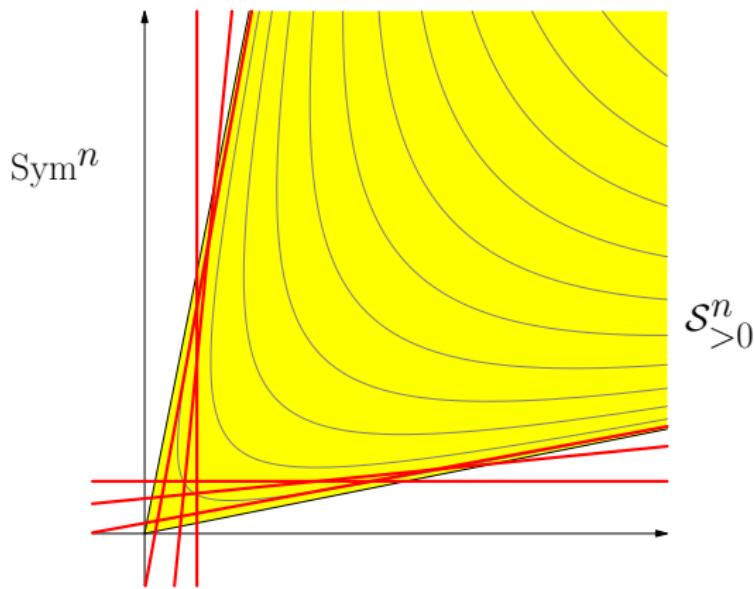
# The Ryshkov polyhedron

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



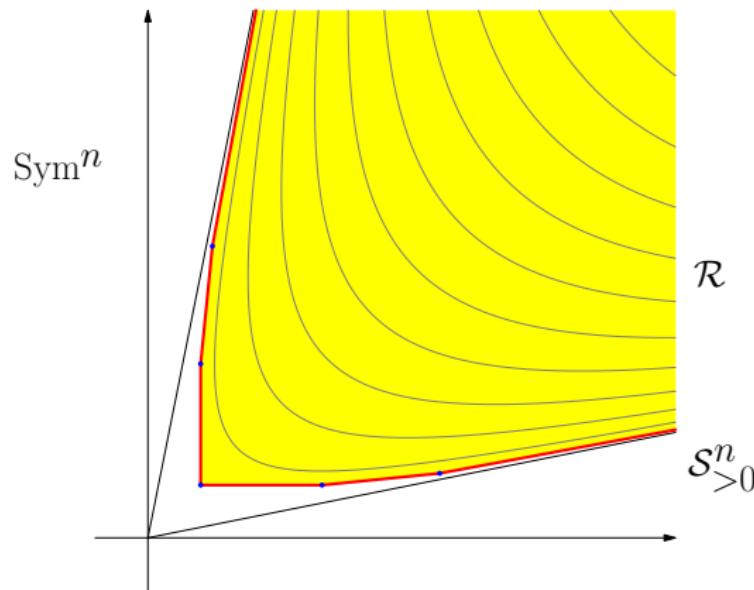
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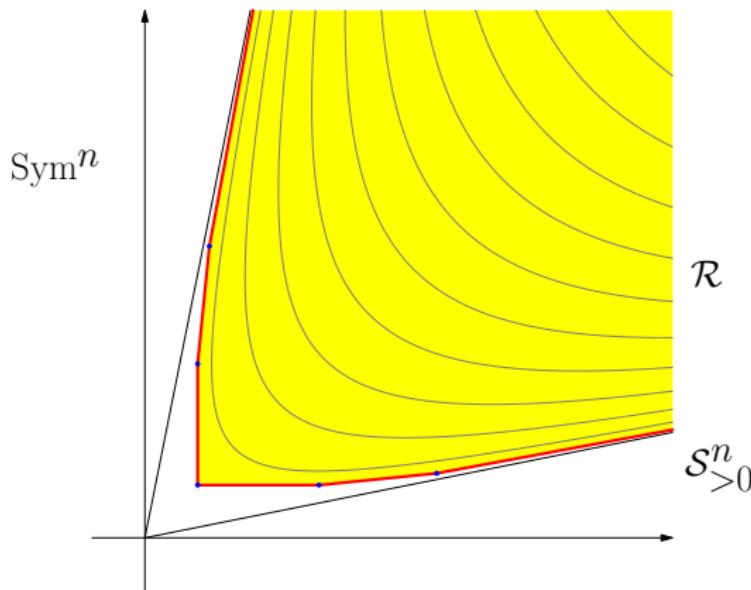
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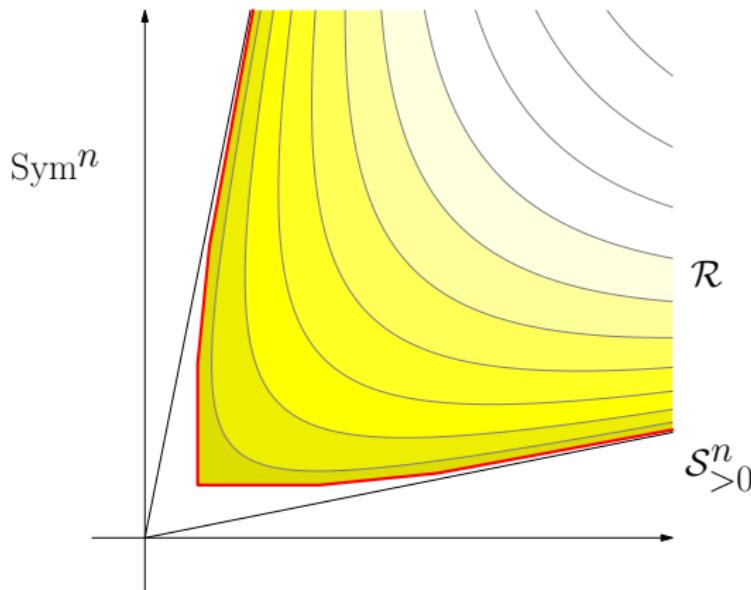
# The Ryshkov polyhedron

The polytope is locally finite, and has finitely many faces modulo  $GL_n(\mathbb{Z})$  action

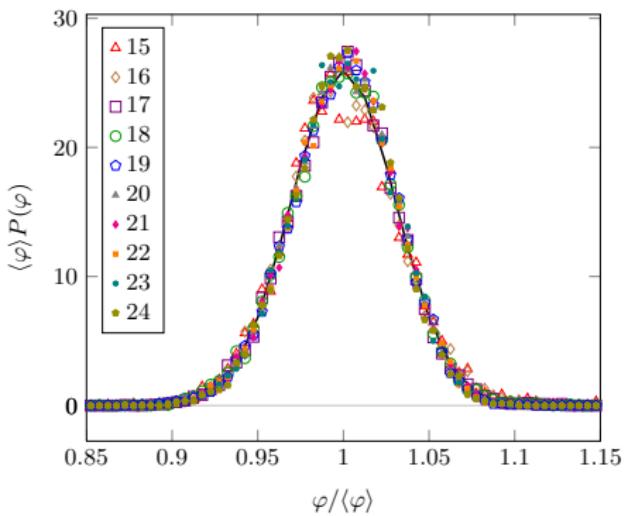
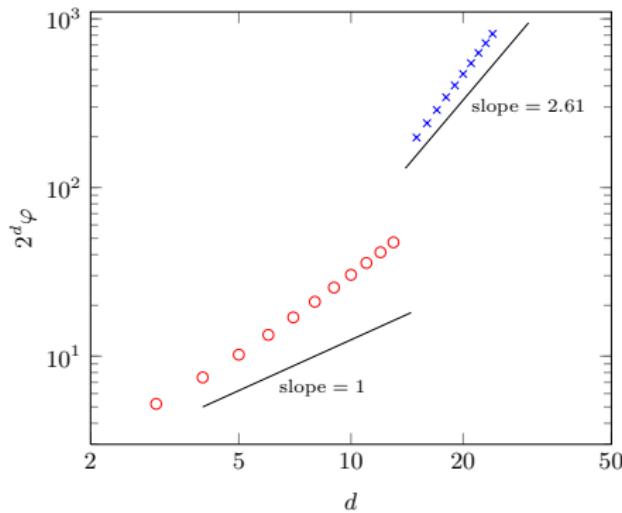


# The Ryshkov polyhedron

We determinant (equivalently, density) gives a filtration of the space

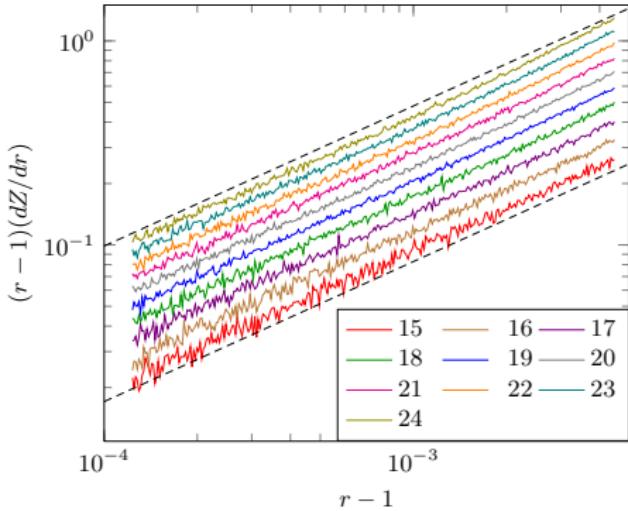
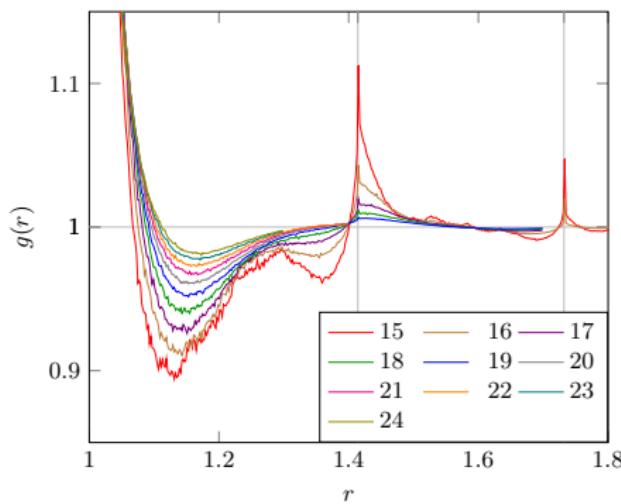


# Lattice RCP



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

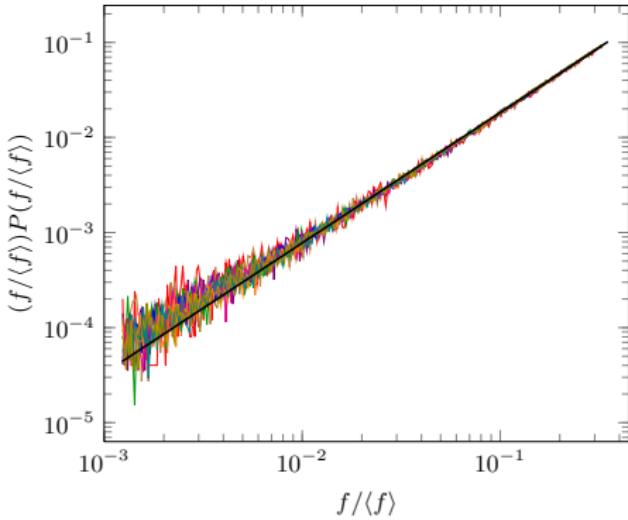
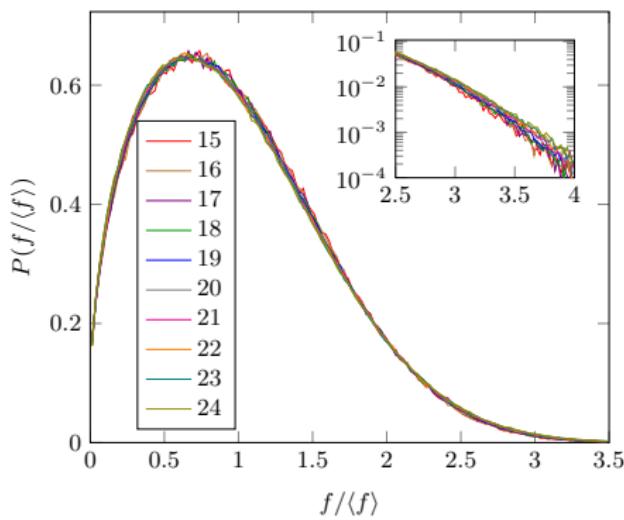
# Pair correlations and quasicontacts



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

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

# Contact force distribution



$$P(f) \sim f^\theta$$

$$\theta = 0.371 \pm 0.010$$

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

# Topology of the space of lattices

n	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
$\Sigma_n^*(GL_5(\mathbb{Z}))$	2	5	10	16	23	25	23	16	9	4	3						
$\Sigma_n(GL_5(\mathbb{Z}))$					1	7	6	1	0	2	3						
$\Sigma_n^*(GL_6(\mathbb{Z}))$		3	10	28	71	162	329	589	874	1066	1039	775	425	181	57	18	7
$\Sigma_n(GL_6(\mathbb{Z}))$					3	46	163	340	544	636	469	200	49	5			
$\Sigma_n^*(SL_6(\mathbb{Z}))$		3	10	28	71	163	347	691	1152	1532	1551	1134	585	222	62	18	7
$\Sigma_n(SL_6(\mathbb{Z}))$			3	10	18	43	169	460	815	1132	1270	970	434	114	27	14	7

FIGURE 1. Cardinality of  $\Sigma_n$  and  $\Sigma_n^*$  for  $N = 5, 6$  (empty slots denote zero).

n	6	7	8	9	10	11	12	13	14	15	16
$\Sigma_n^*$	6	28	115	467	1882	7375	26885	87400	244029	569568	1089356
$\Sigma_n$				1	60	1019	8899	47271	171375	460261	955128
n	17	18	19	20	21	22	23	24	25	26	27
$\Sigma_n^*$	1683368	2075982	2017914	1523376	876385	374826	115411	24623	3518	352	33
$\Sigma_n$	1548650	1955309	1911130	1437547	822922	349443	105054	21074	2798	305	33

FIGURE 2. Cardinality of  $\Sigma_n$  and  $\Sigma_n^*$  for  $GL_7(\mathbb{Z})$ .

*Elbaz-Vincent, Gangl, & Soulé, Perfect forms and the cohomology of modular groups, arXiv:1001.0789*

# The perceptron – persistence homology

