



2254-9

Workshop on Sphere Packing and Amorphous Materials

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Calculations of the Probabilities of Jammed Packings

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Calculations of the probabilities of jammed packings

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What is the *best* packing?

What is the *most probable* packing (given a protocol)?



Outline

1. Jammed packings do not occur with equal probability.
2. Basins of attraction for jammed packings.
3. Contact percolation critical point(s).

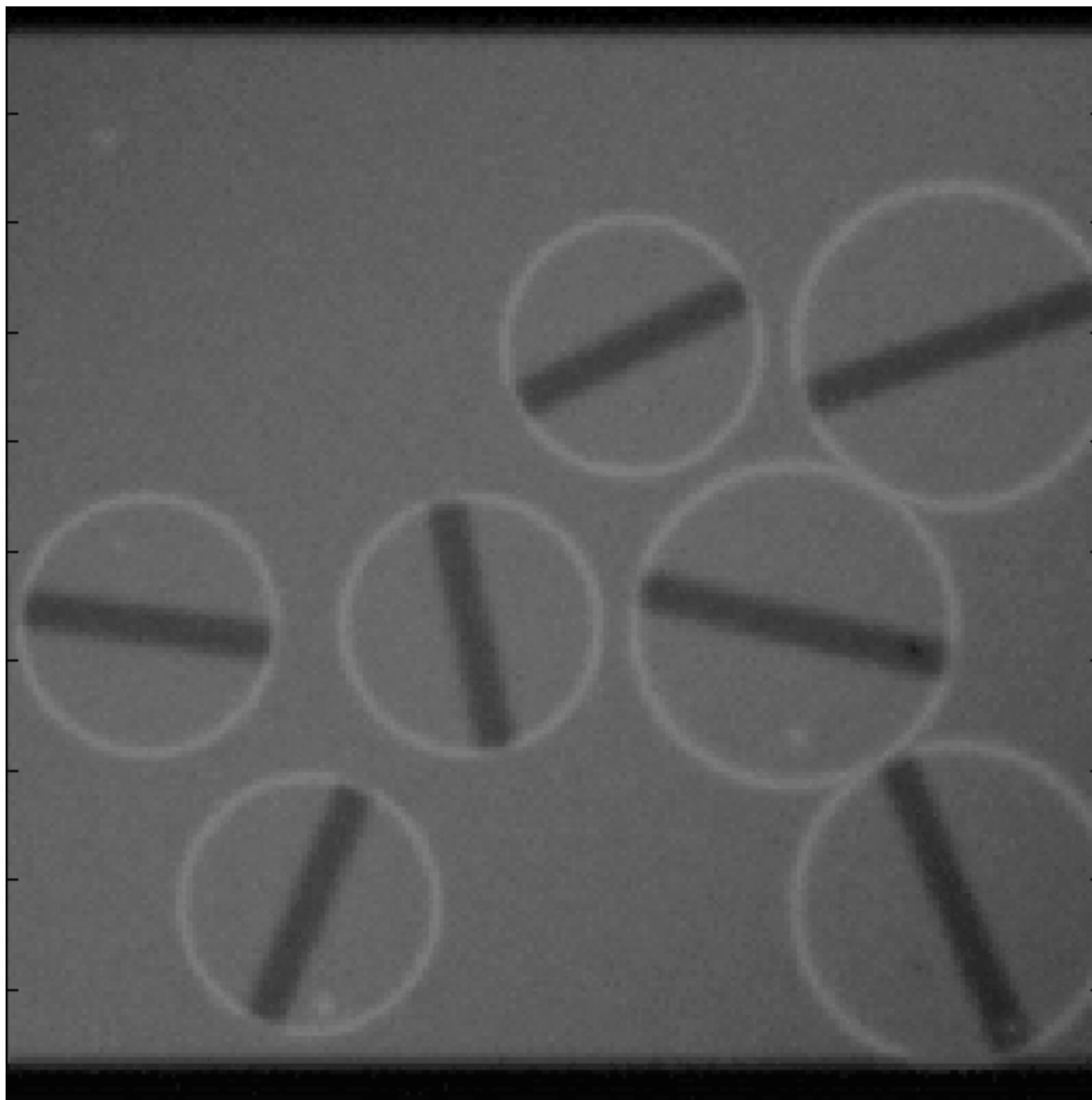
Important Point #1

To accurately measure packing probabilities, one must identify all possible packings...

...first studies must be performed on small systems.

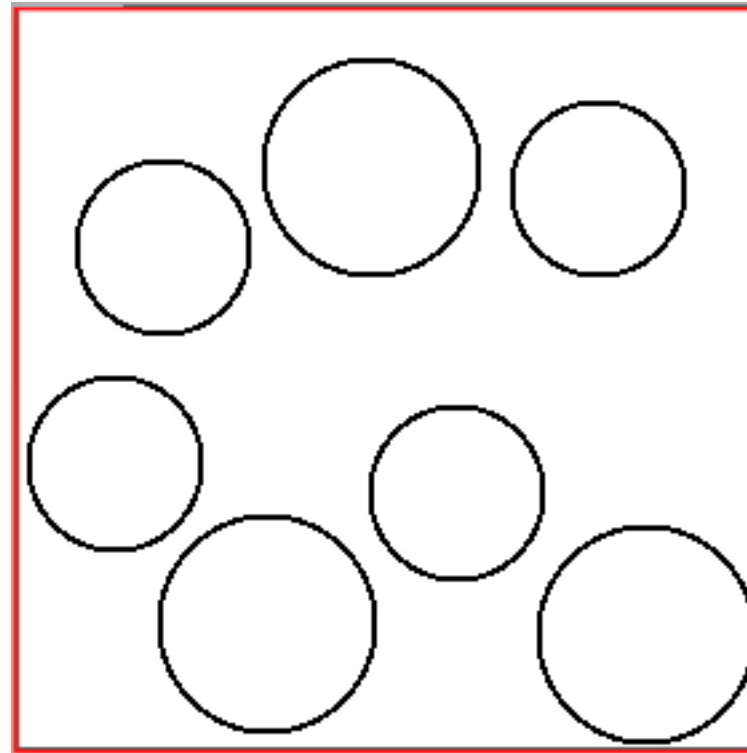
Motivation

- In small systems, we can show that jammed packings occur with very different probabilities. So what?
- In large systems, it appears that packings occur with equal probability, *i.e.* each packing occurs once, but within a narrow set of structural properties (for a given protocol).
- But if the protocol is changed, a different narrow set of packings will occur.
- The problem of understanding packing probabilities in small systems is similar to understanding protocol dependence of packings in large systems.



GG, JB, CSO, MS,
Phys. Rev. E 80
(2009) 061304.

Deposition Algorithm in Simulations

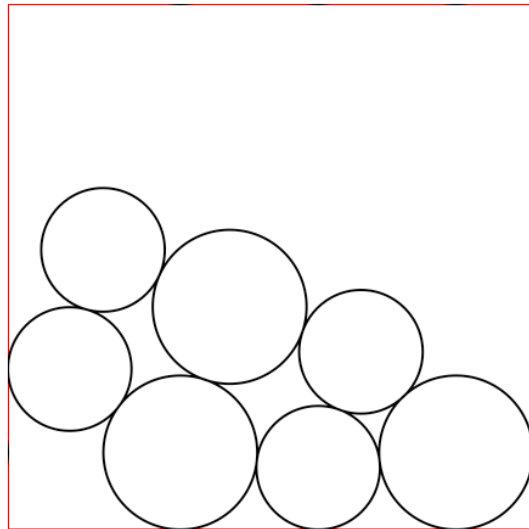


$$\bar{g} = \frac{m_s g}{k \sigma_s}$$

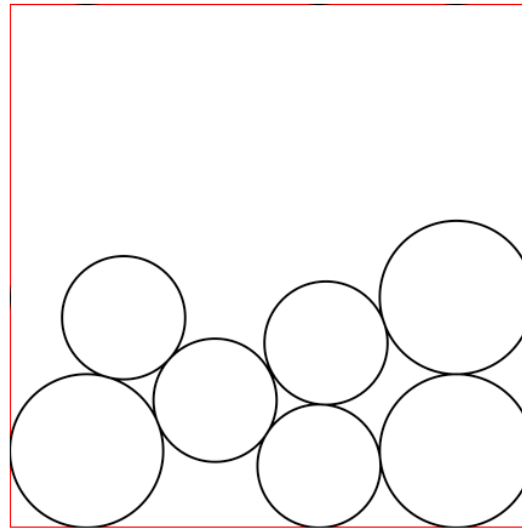
A vertical arrow points downwards from the equation, indicating the direction of gravity.

- All geometric parameters identical to those for experiments
- Terminate algorithm when $F_{\text{tot}} < F_{\text{max}} = 10^{-14}$
- Vary random initial positions and conduct $N_{\text{trials}} = 10^8$ to find 'all' mechanically stable packings for small systems $N=3$ to 10.

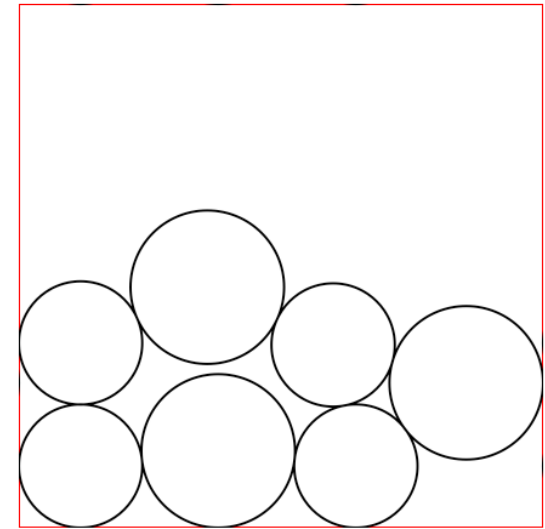
Mechanically Stable Frictionless Packings



1



2



3

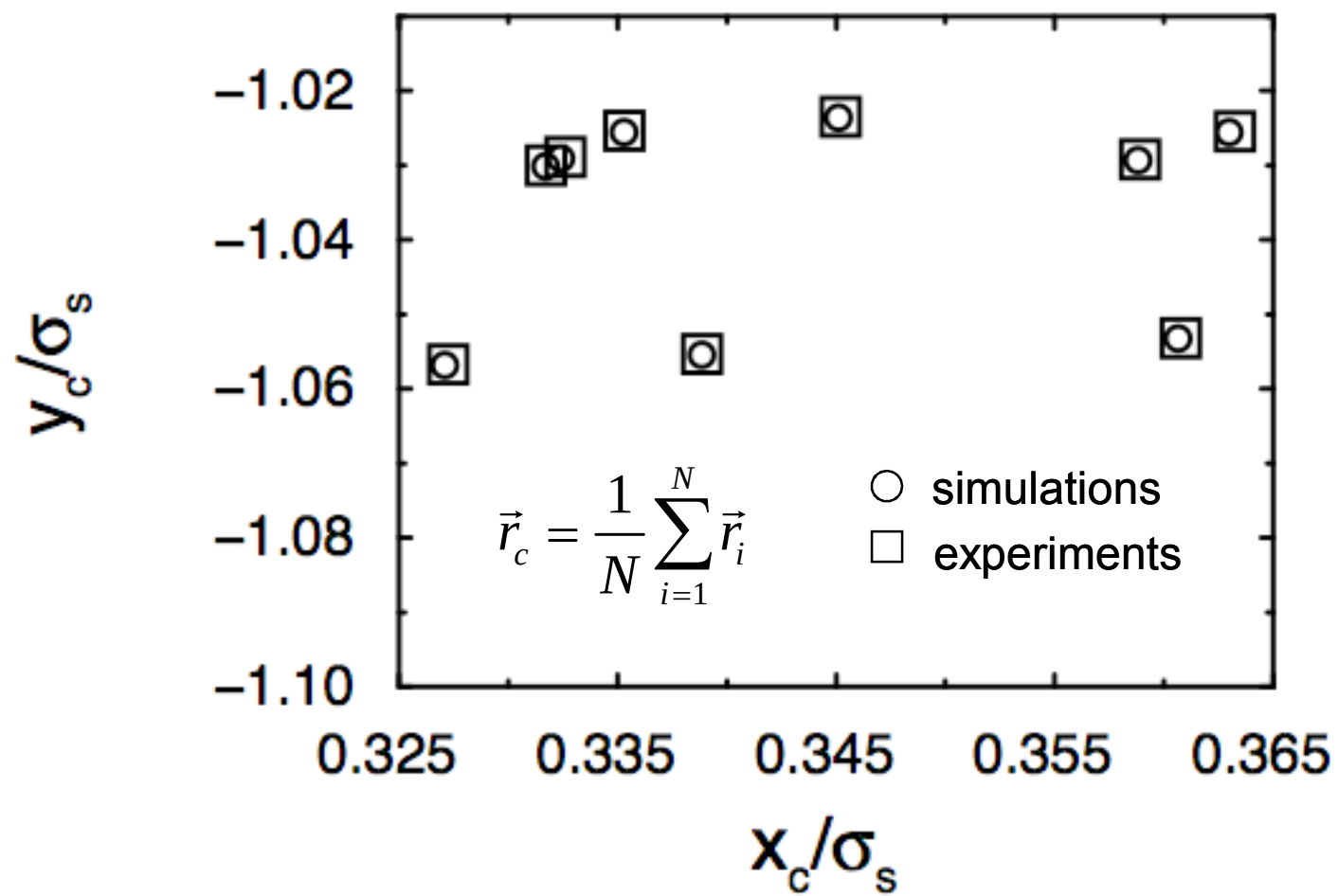
- Distinct MS packings distinguished by particle positions $\{\vec{r}_i\}$
- # of constraints $\geq$ # of degrees of freedom

Mechanical Stability and Distinguishability

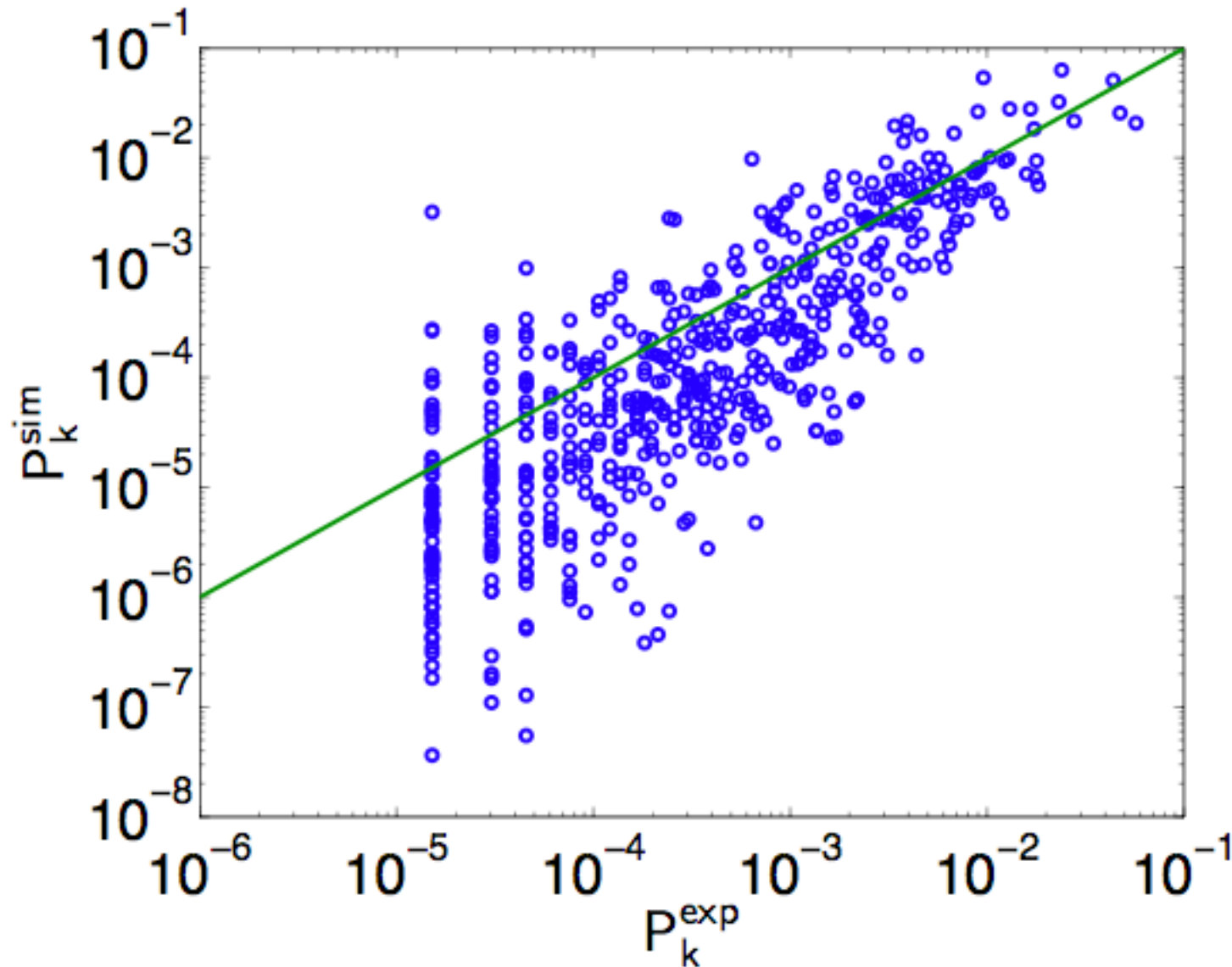
$$M_{\alpha,\beta} = \left. \frac{\partial^2 V(\vec{r})}{\partial r_\alpha \partial r_\beta} \right|_{\vec{r} = \vec{r}_0}$$

$\alpha, \beta = x, y, z$, particle index
 $\vec{r}_0$ = positions of MS packing

Calculate d N- d eigenvalues

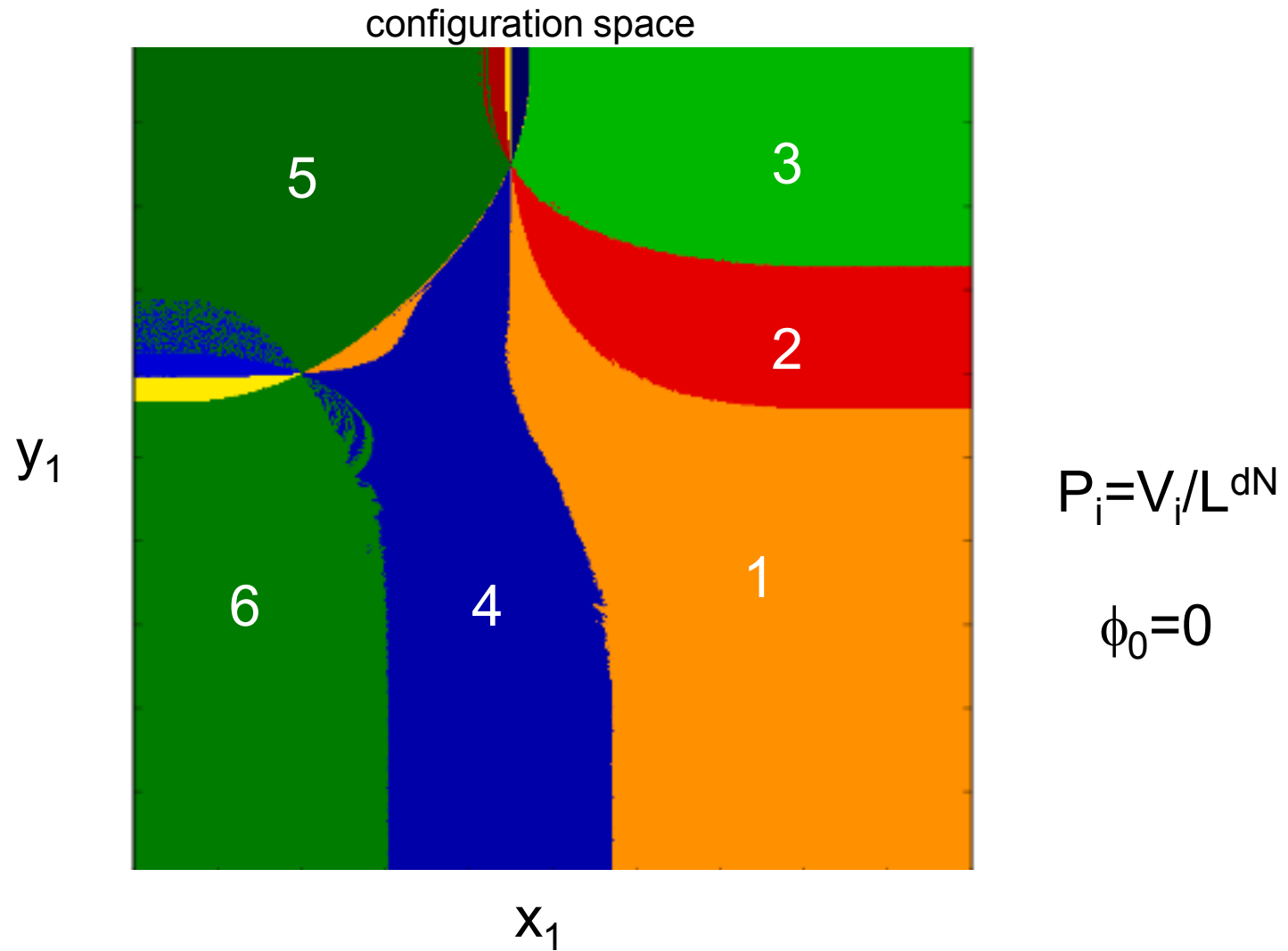


Packing Probabilities Are Robust*

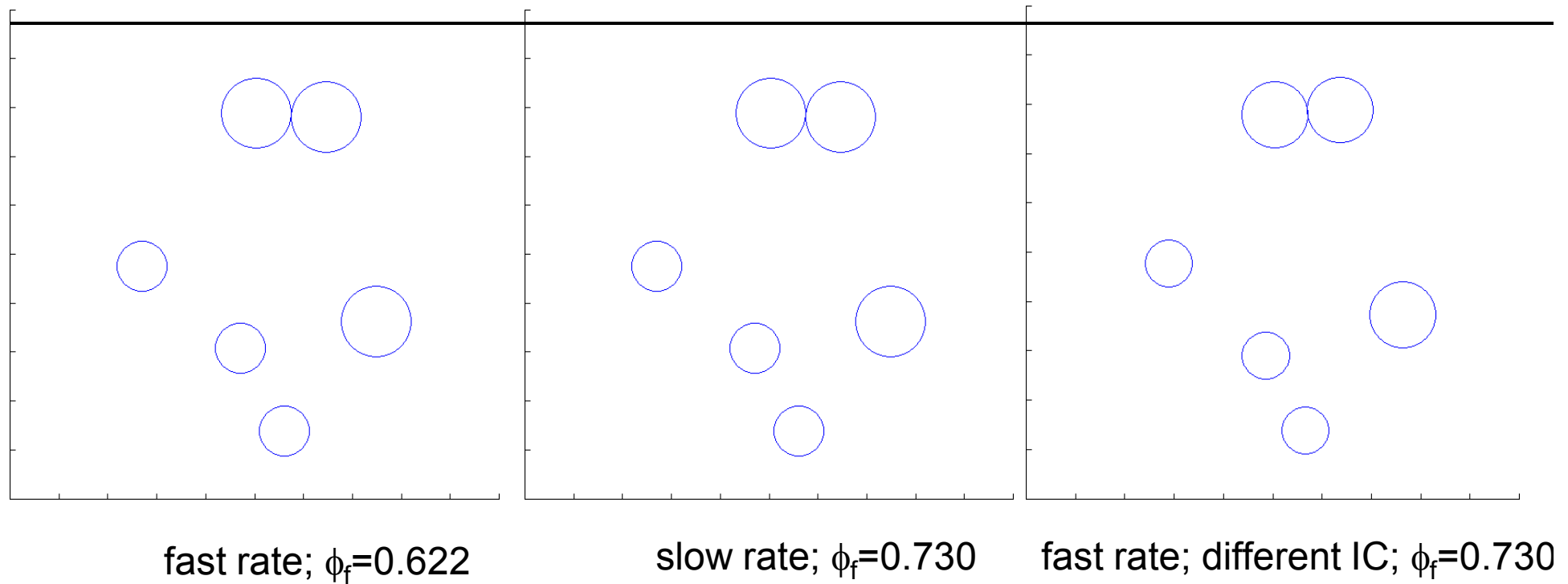


- Rare MS packings in expts are rare in sims; frequent MS packings in expts are frequent in sims

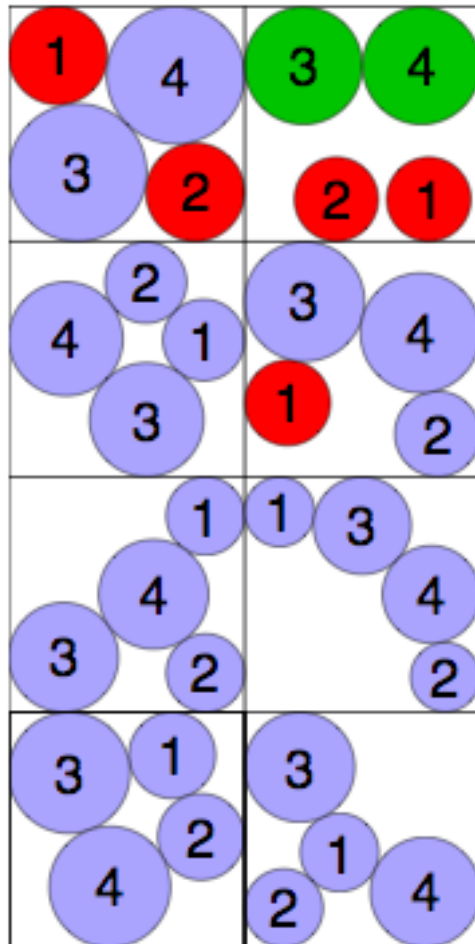
Calculations of Basin Volumes



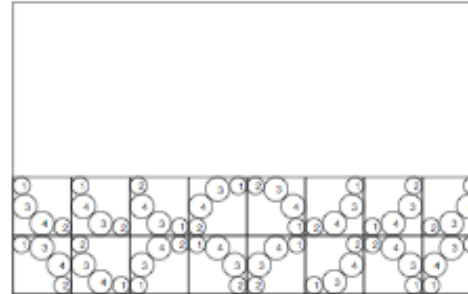
(Dissipation) rate dependence and basin volume



N=4 packings



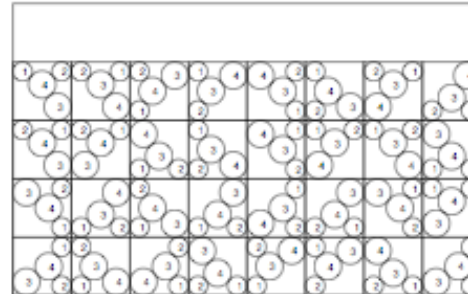
Prob=0.413250%



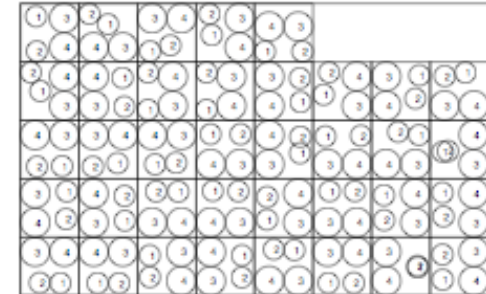
Prob=0.000050%



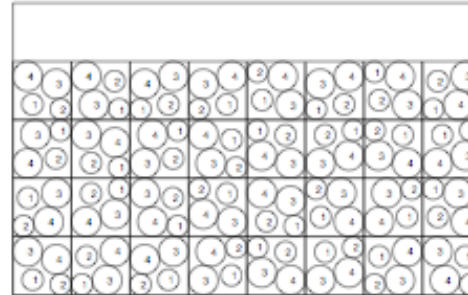
Prob=6.065950%



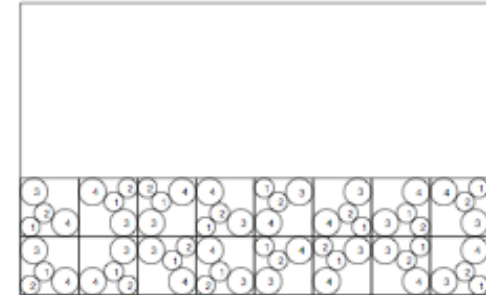
Prob=0.187150%



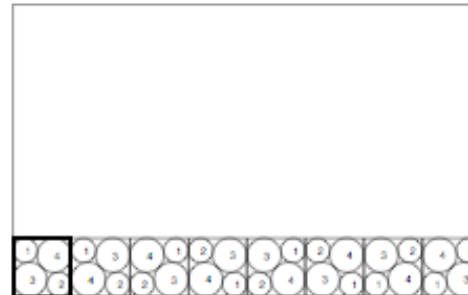
Prob=26.197200%



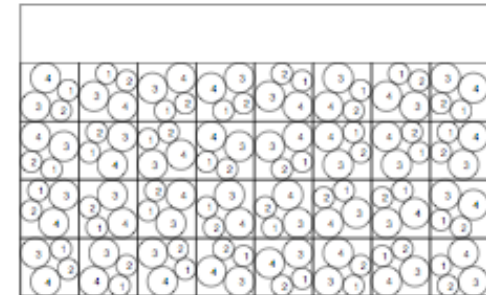
Prob=2.868100%



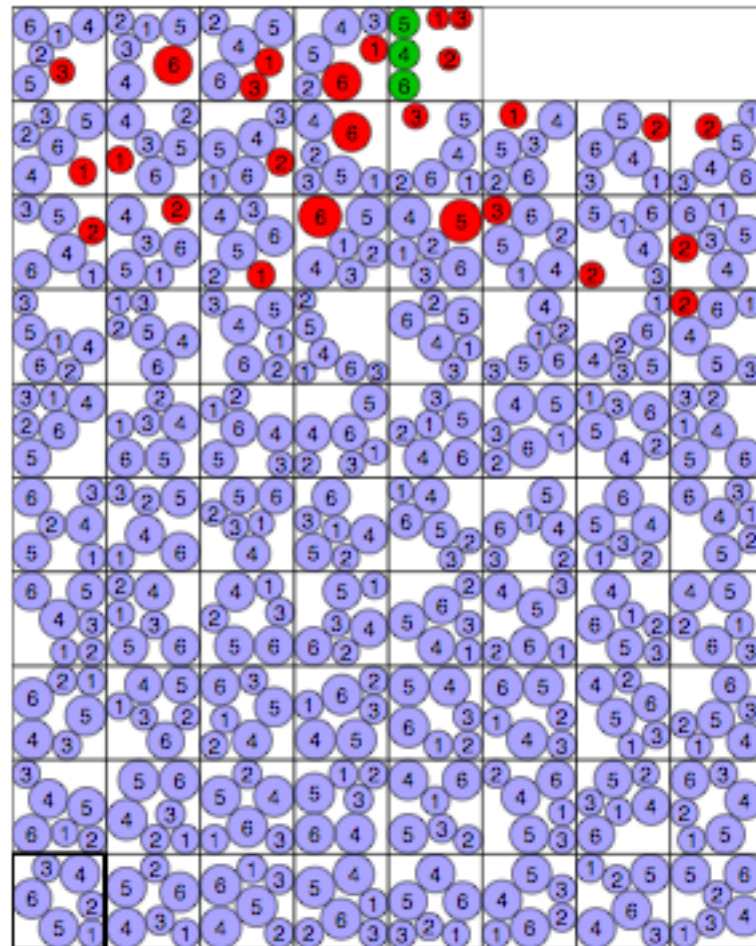
Prob=30.415850%



Prob=33.852450%

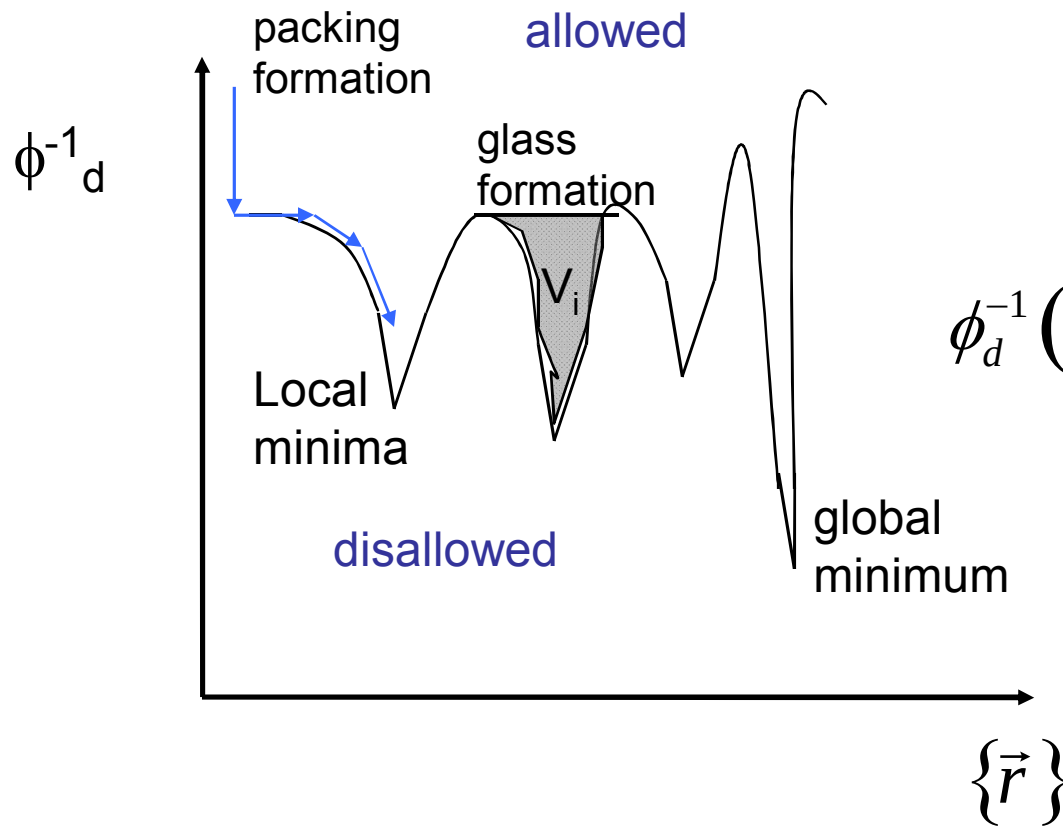


N=6



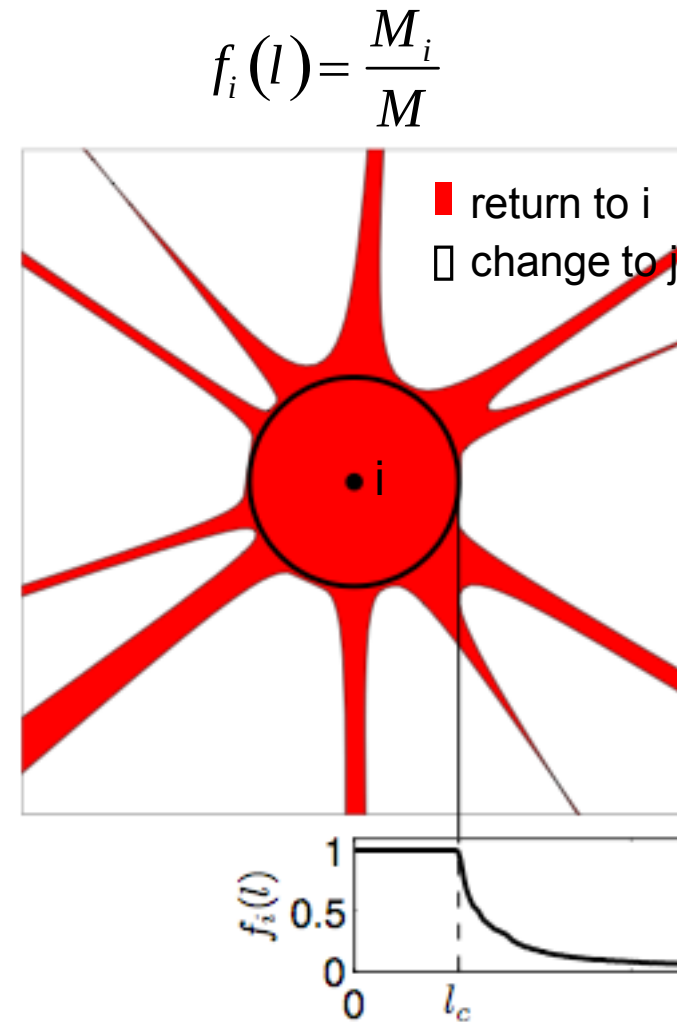
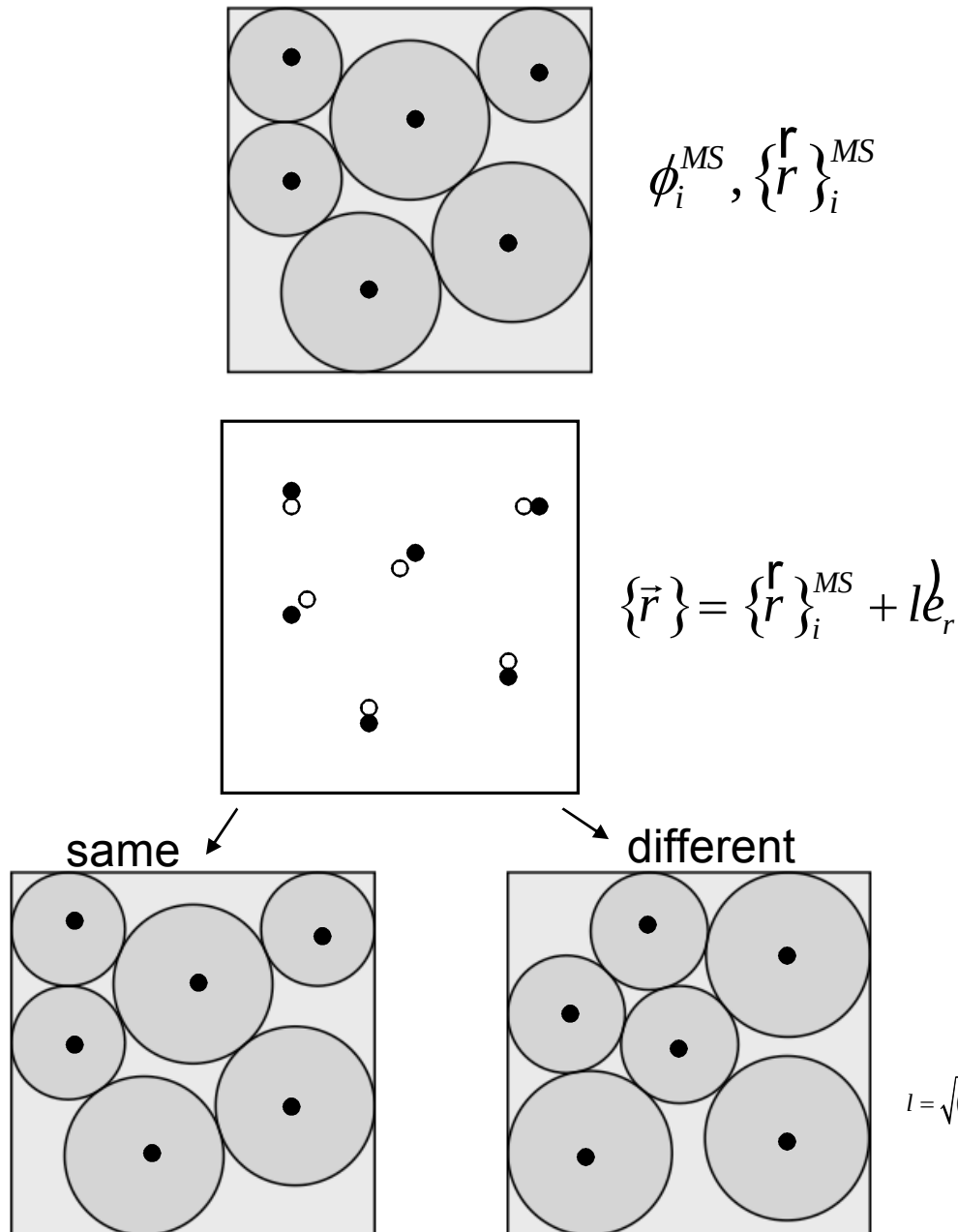
N	N_s
4	7*
6	75*
8	500
10	3983
12	16935

What determines MS packing probabilities: Density landscape for hard spheres



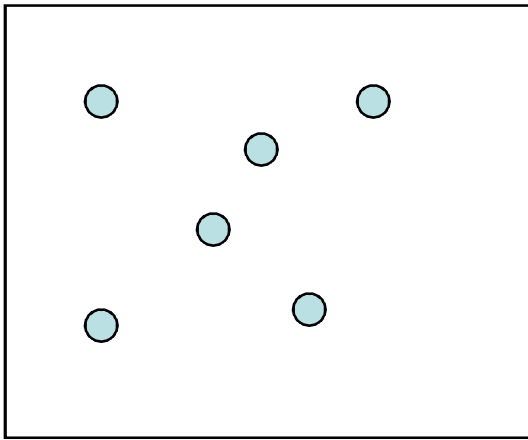
$$\phi_d^{-1}(\{\vec{r}\}) = \frac{6V}{\pi N \min_{mn} |\vec{r}_m - \vec{r}_n|^3}$$

Method 1 (small l): Probability to return to a given MS packing

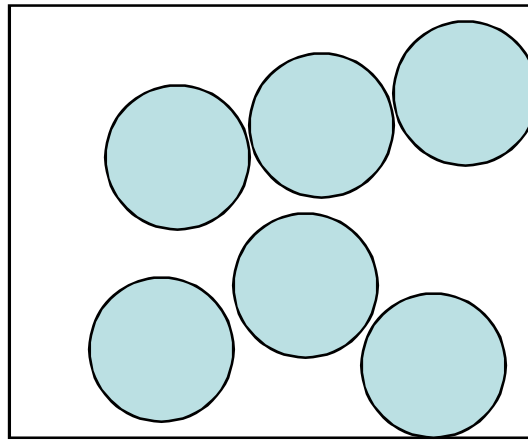


$$l = \sqrt{(x_{1f} - x_{10})^2 + (x_{2f} - x_{20})^2 + L^2 + (x_{Nf} - x_{N0})^2 + (y_{1f} - y_{10})^2 + (y_{2f} - y_{20})^2 + L^2 + (y_{Nf} - y_{N0})^2}$$

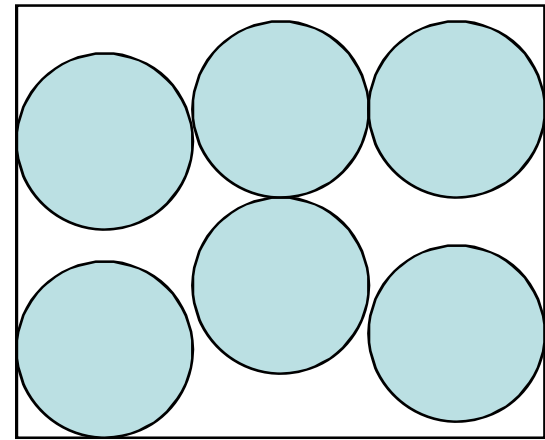
Method 2 (large l): Random initial conditions



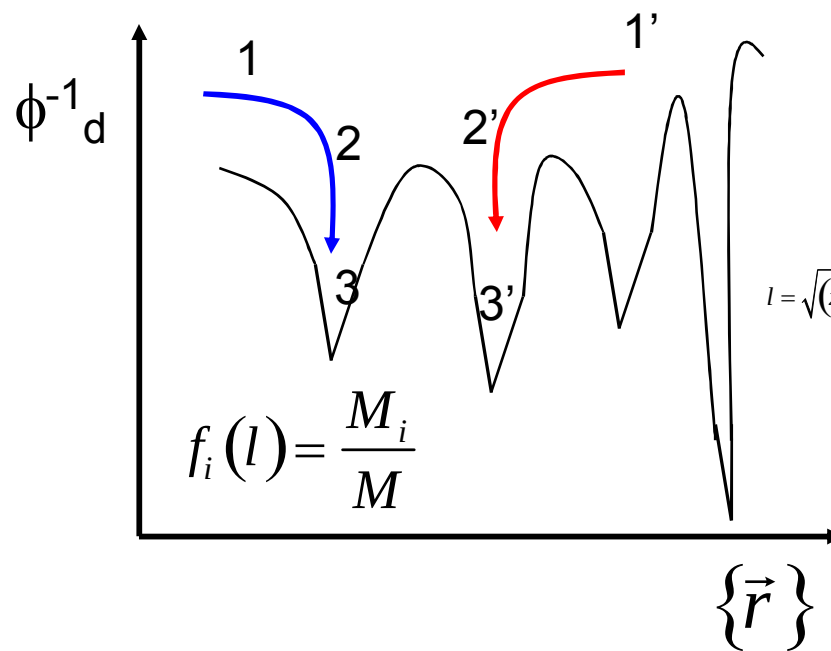
$$\phi_1, \{\vec{r}\}_1$$



$$\phi_2, \{\vec{r}\}_2$$



$$\phi_3, \{\vec{r}\}_3$$



$$l = \sqrt{(x_{1f} - x_{10})^2 + (x_{2f} - x_{20})^2 + L^2 + (x_{Nf} - x_{N0})^2 + (y_{1f} - y_{10})^2 + (y_{2f} - y_{20})^2 + L^2 + (y_{Nf} - y_{N0})^2}$$

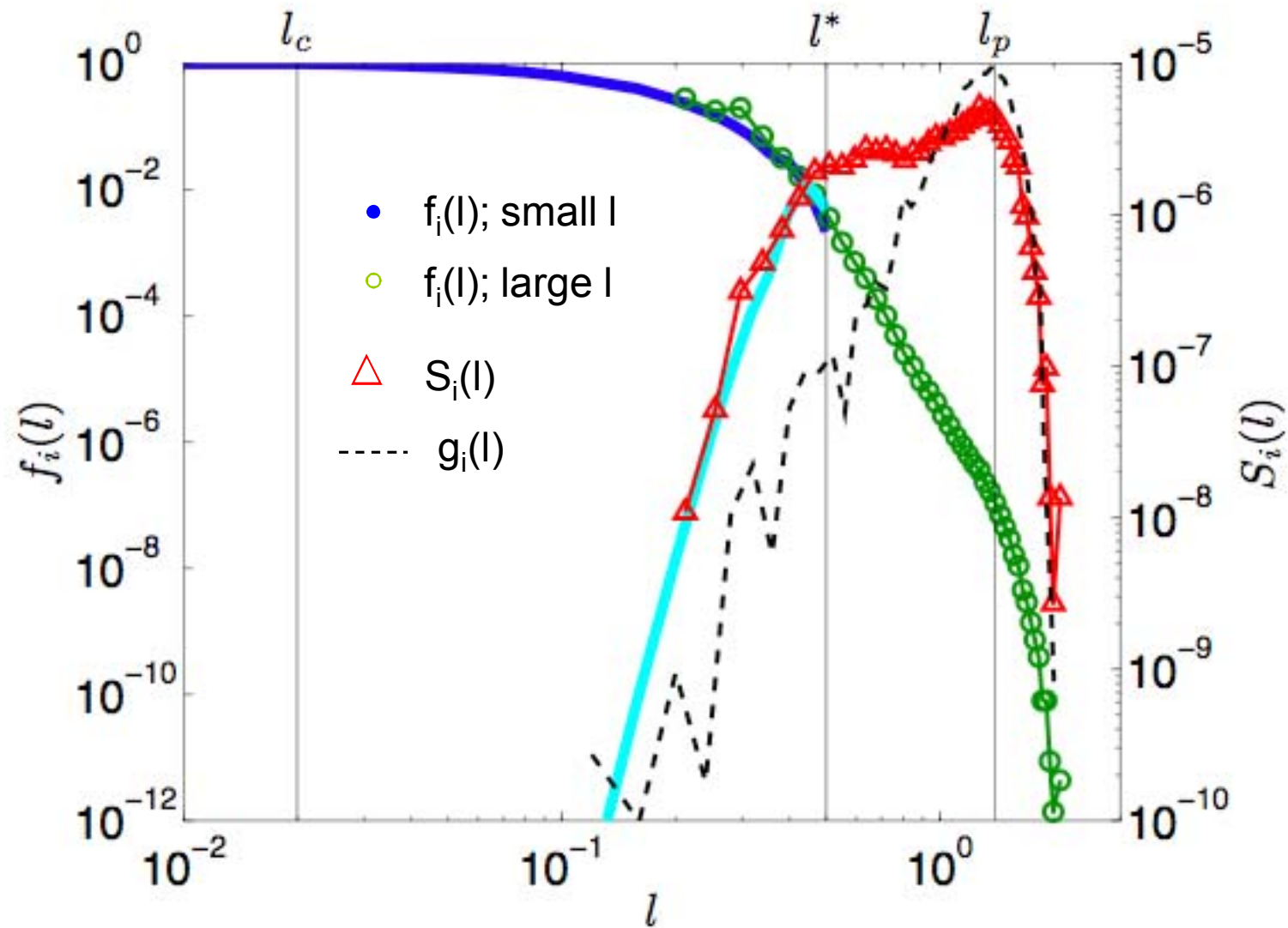
Basin Volumes

$$P_i = \frac{V_i}{L^{dN}} \qquad V_i = \int_0^{\sqrt{dN}} S_i(l) dl$$

$$S_i(l) = A_{dN} f_i(l) l^{dN-1} \rho_i N_s! N_l! \qquad \text{weighted basin profile function}$$

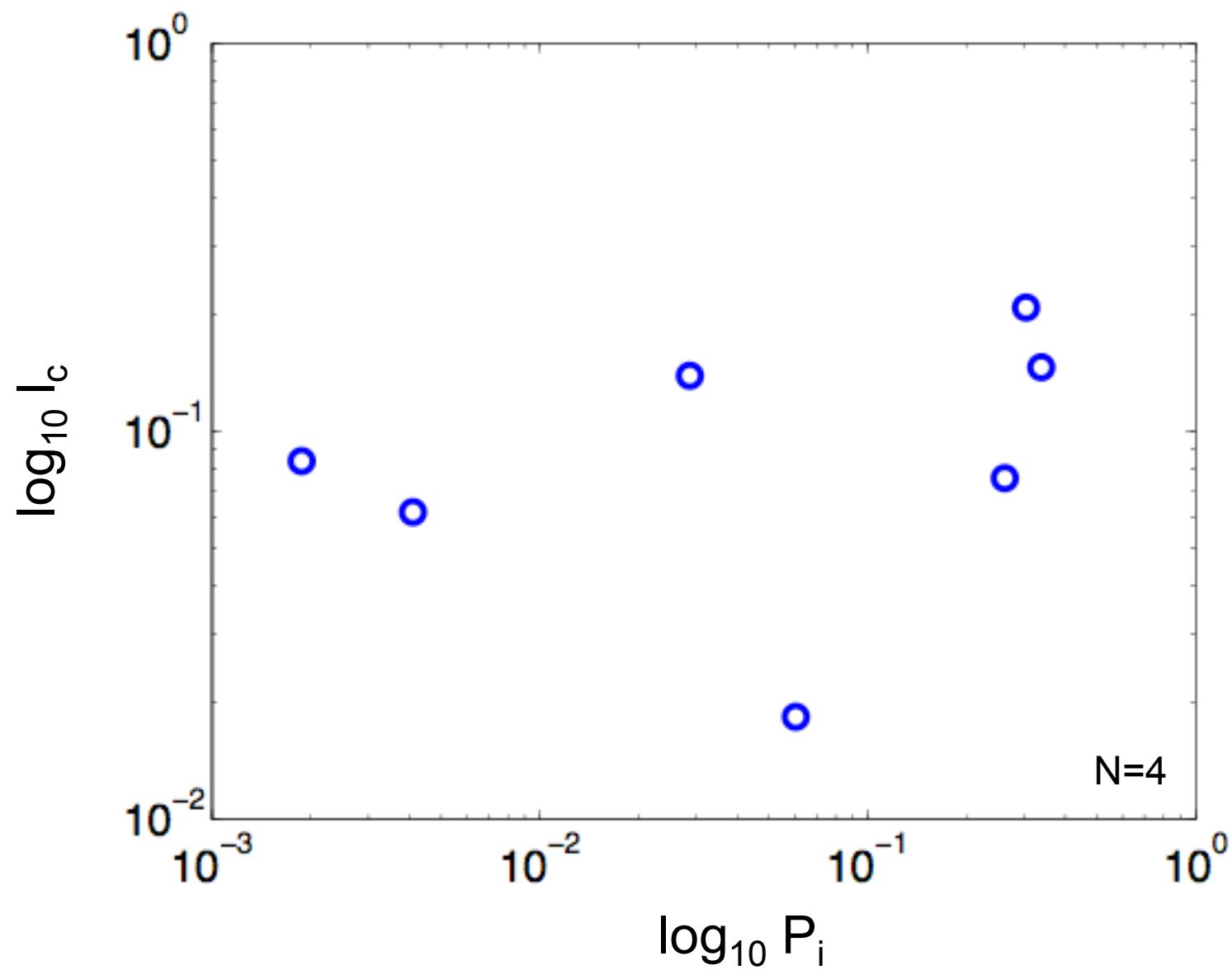
$$f_i(l) \qquad \text{unweighted basin profile function}$$

Weighted/Unweighted basin profile functions

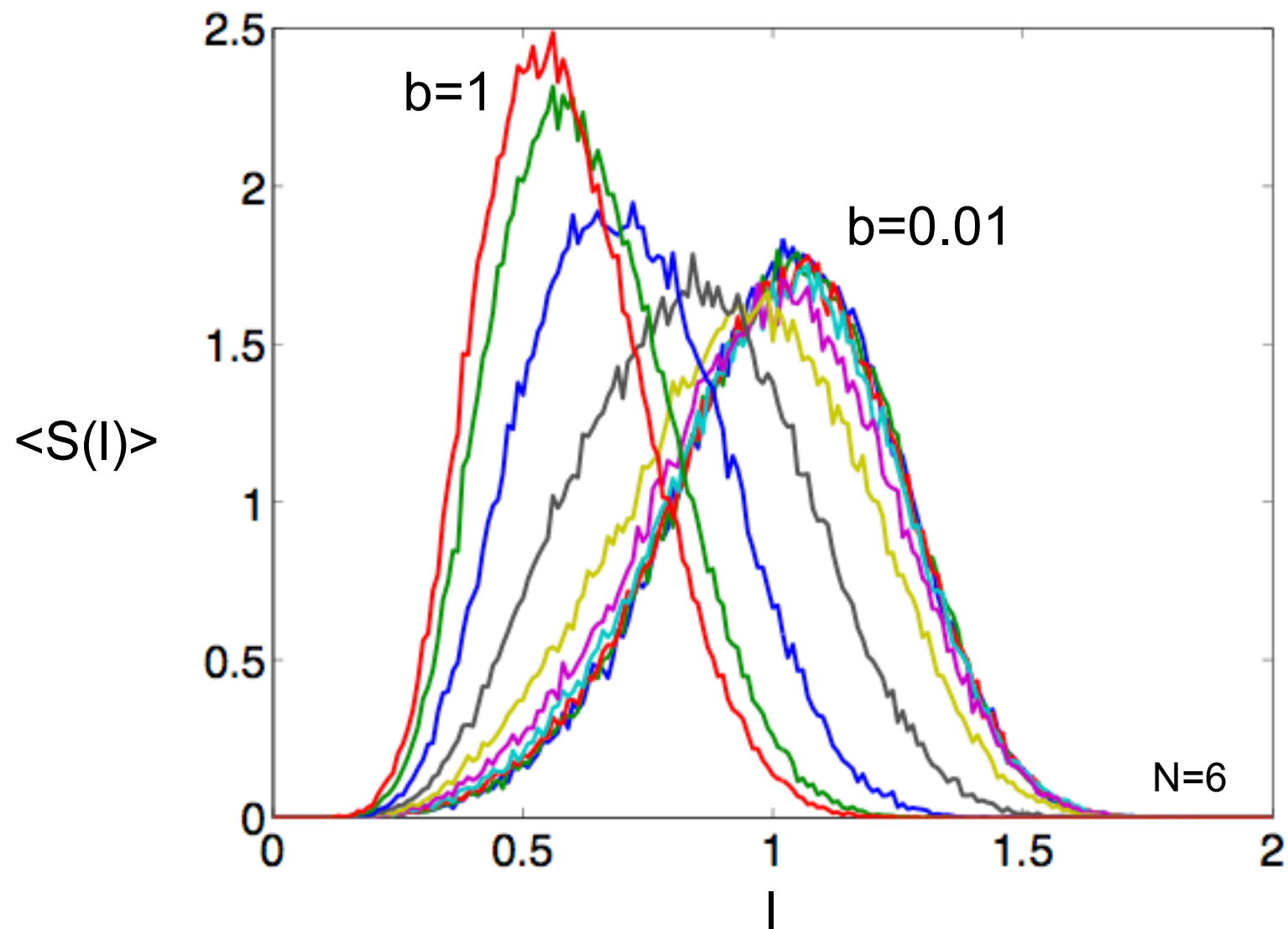


- Probability of MS packing determined by large l , not core region l_c

Do local properties determine probability?

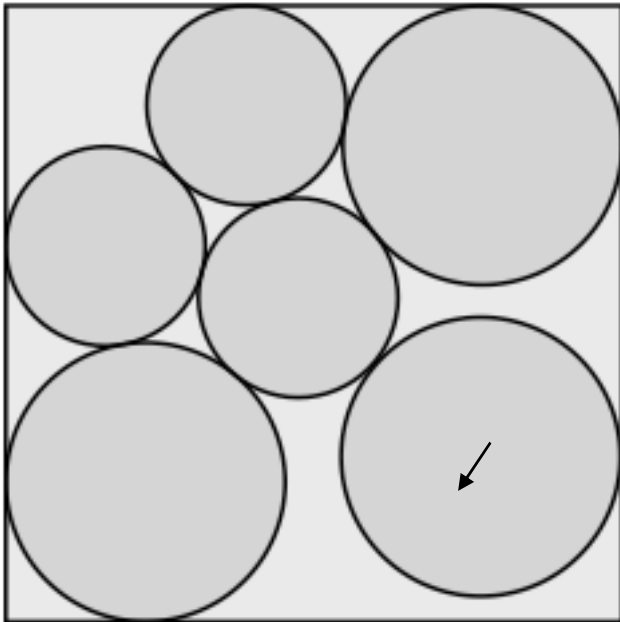


Thermal Quench Rate Dependence

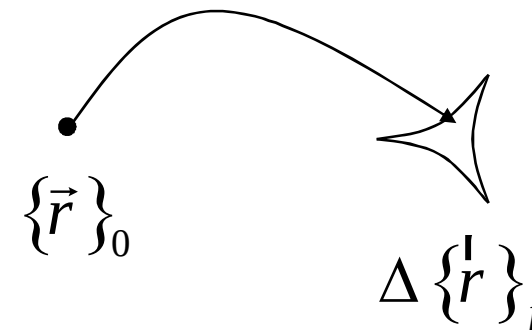
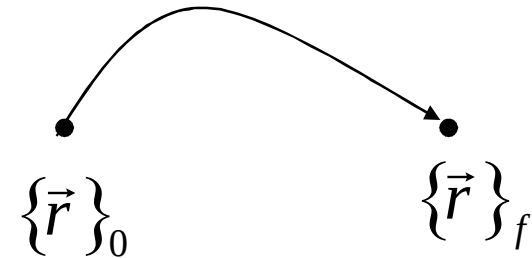


Future Directions

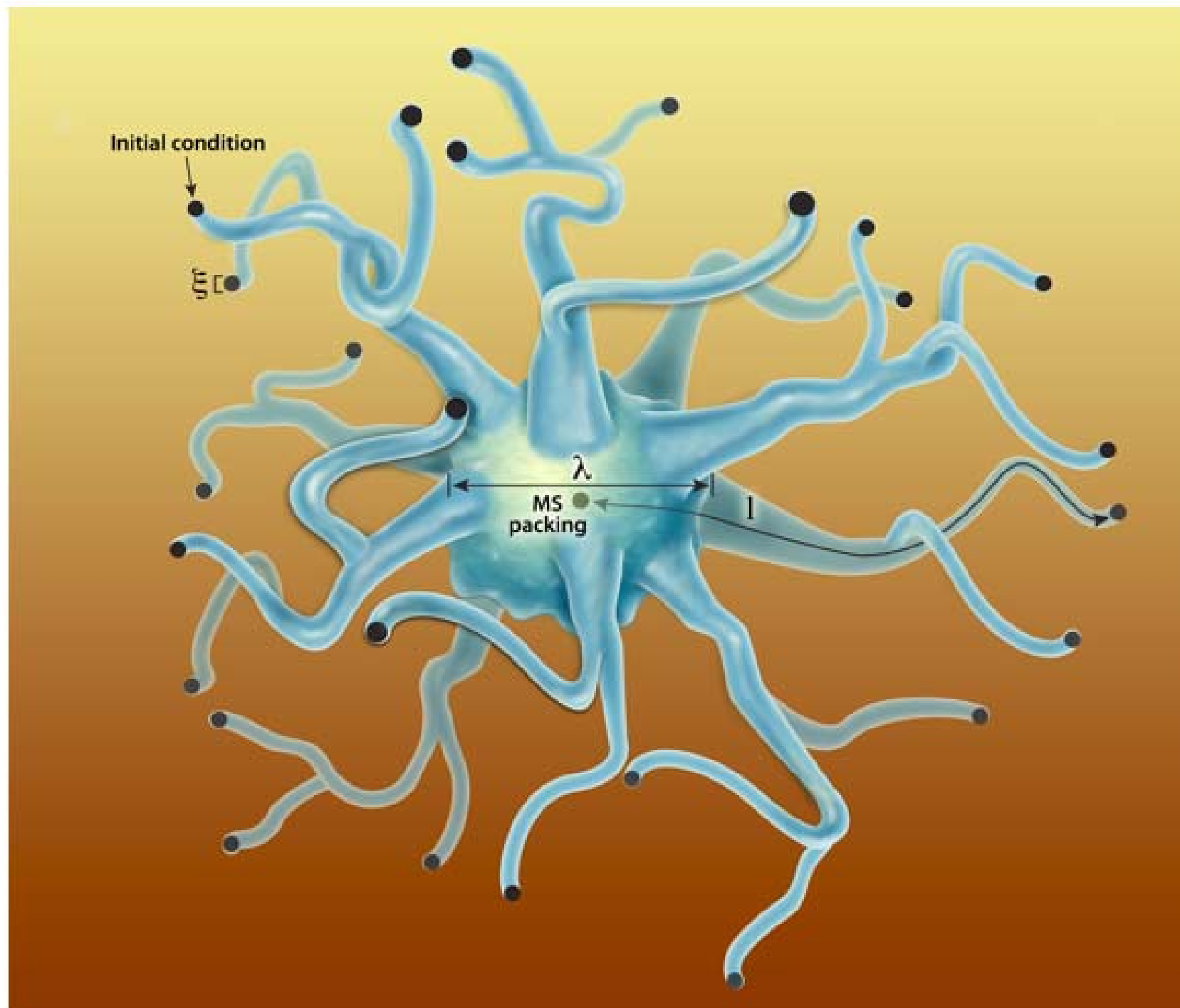
- Rattlers



Particles with fewer than 3 contacts

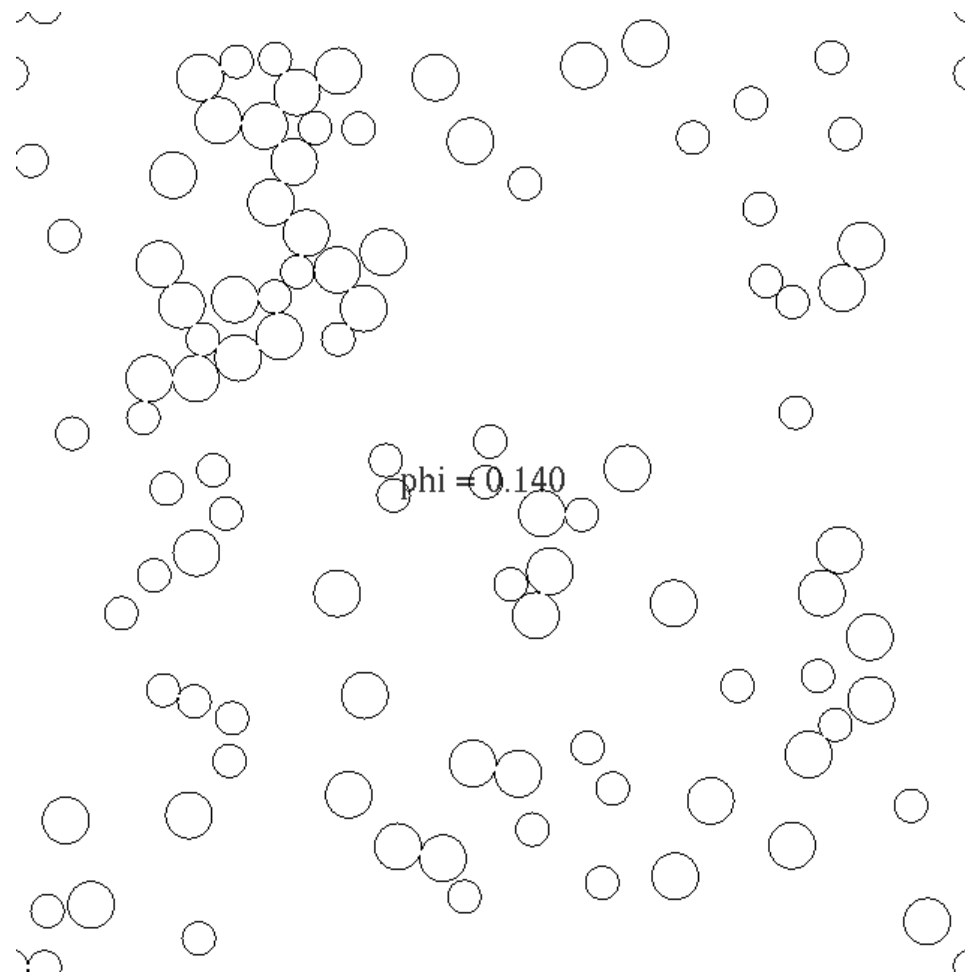


- Study ϕ_i and quench rate dependence of probabilities

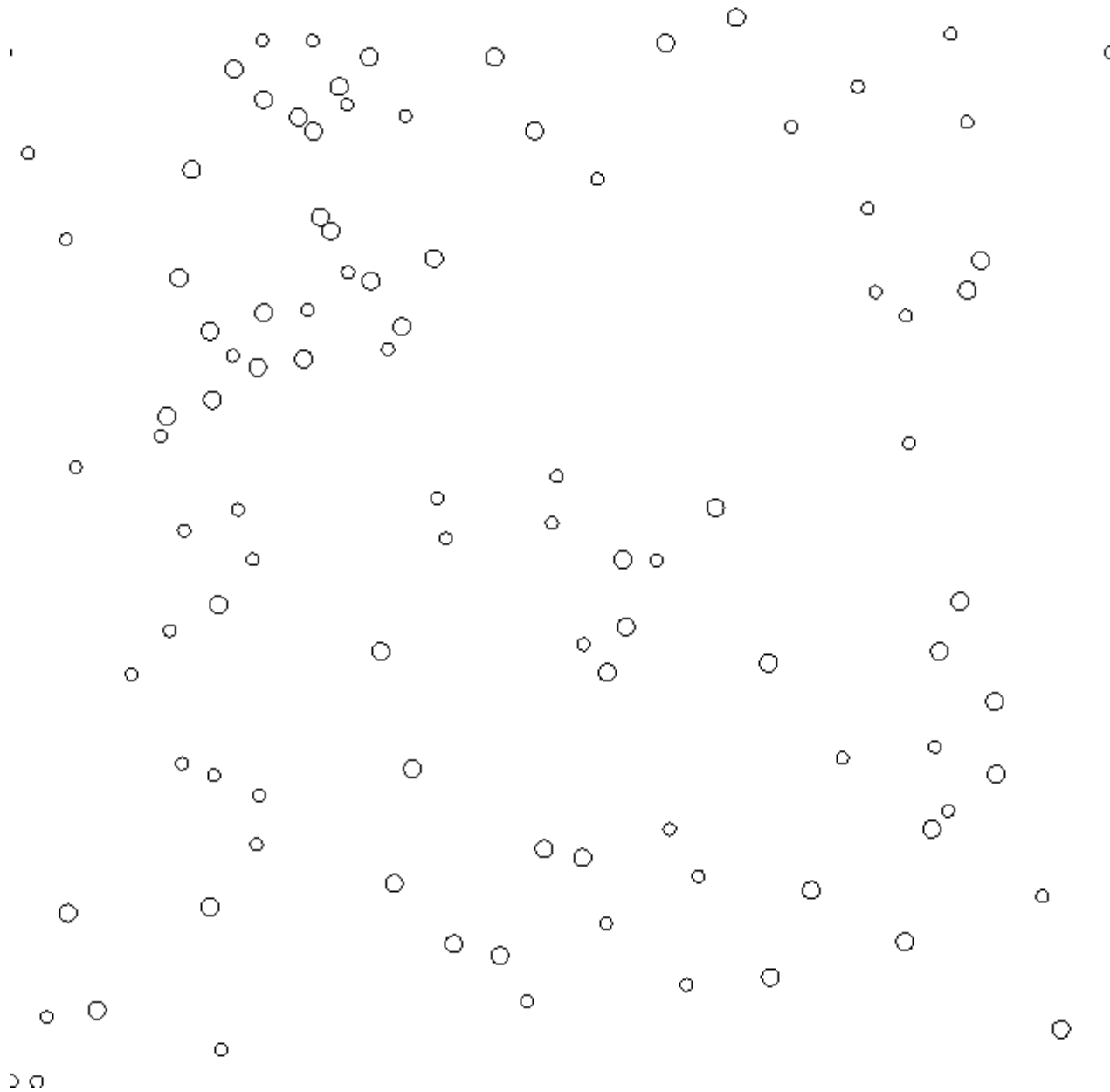


What important processes signal jamming and determine packing probabilities?

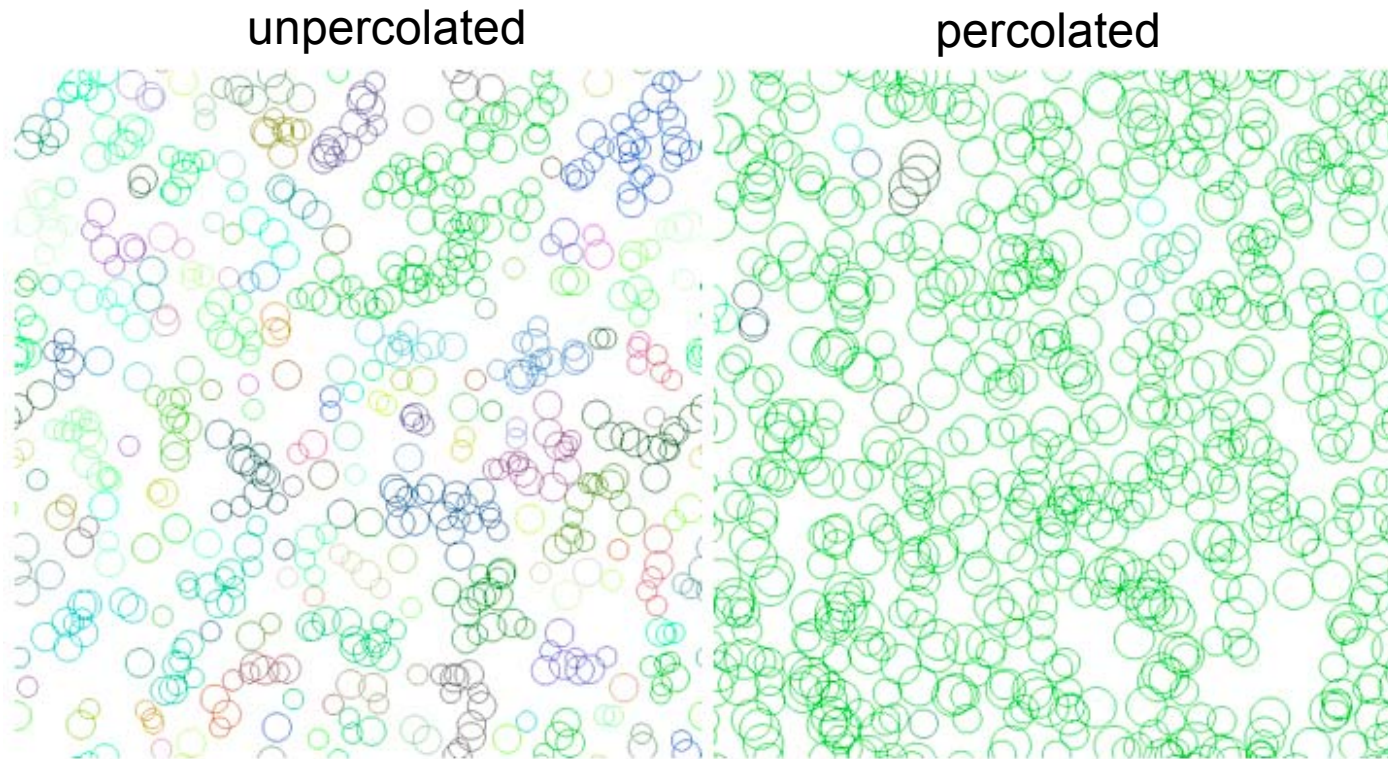
Contact Percolation



Cooperative Motion

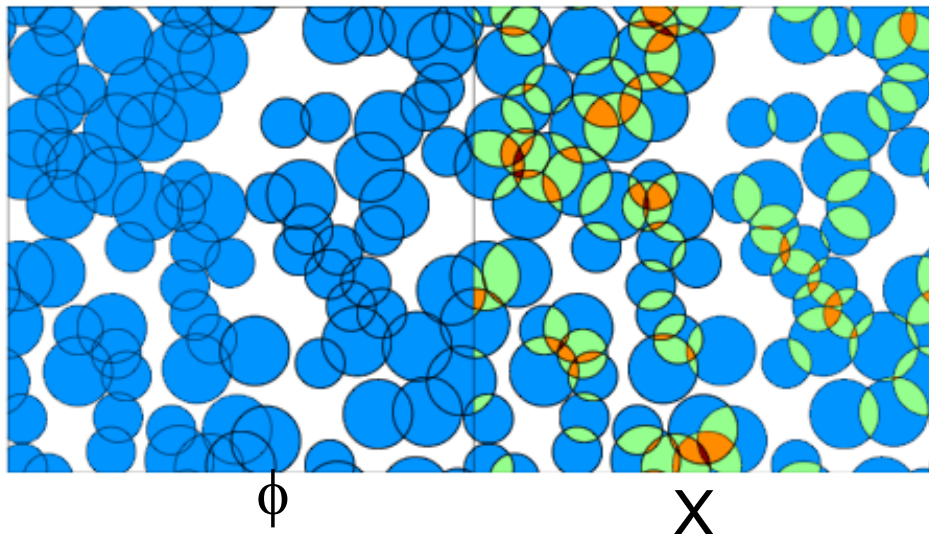
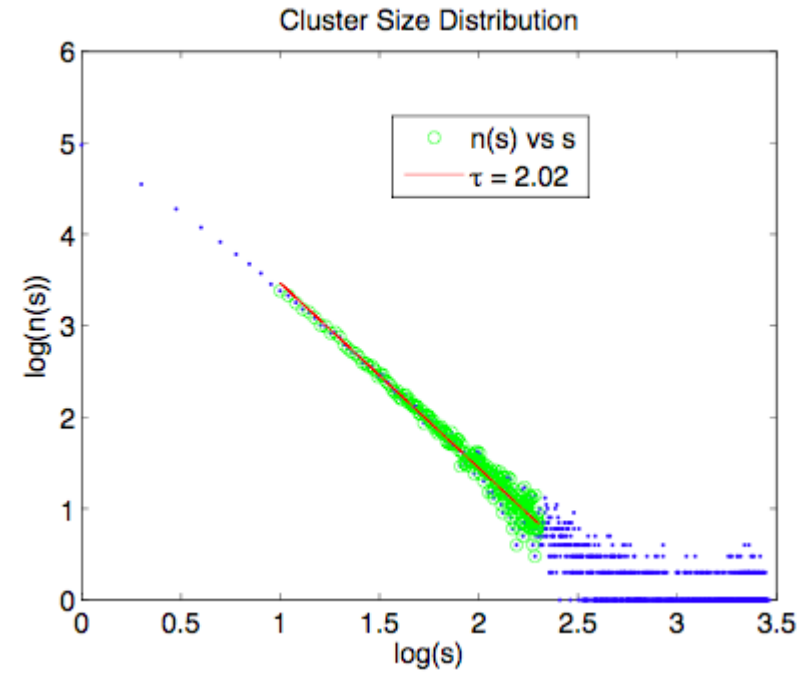
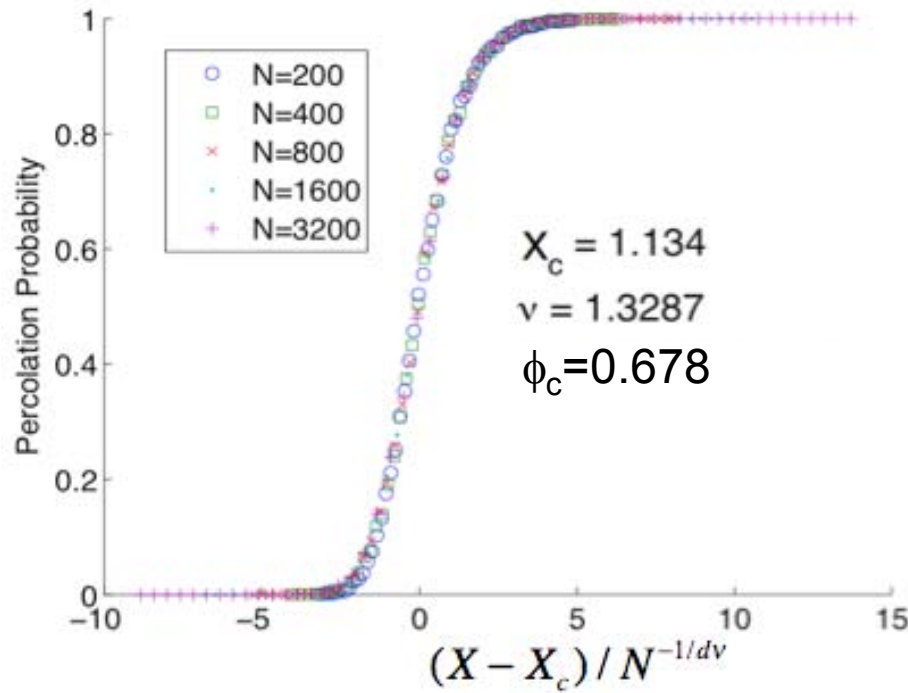


'Random' Continuum Percolation



$$X_p = N\pi R_p^2 / L^2$$

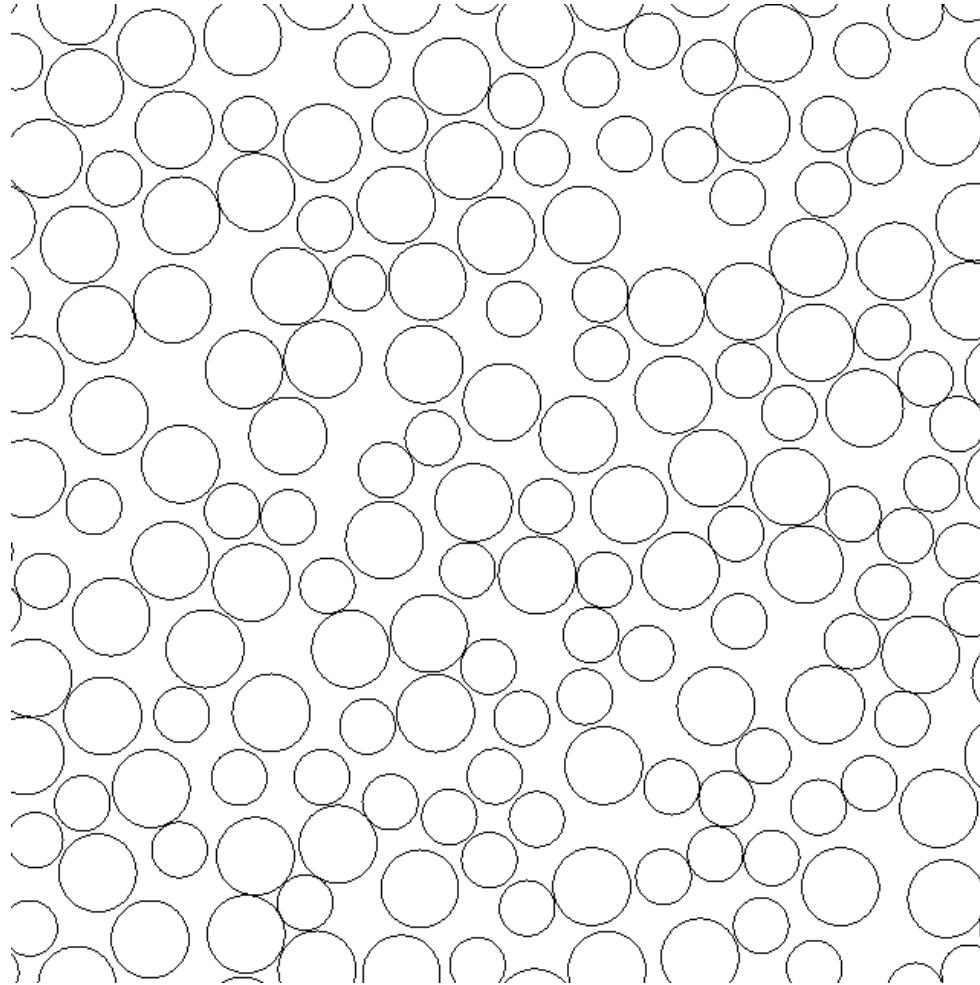
Critical Scaling Exponents



X_c	1.13
ϕ_c	0.678
D	1.91
τ	2.02
ν	1.33

How is the percolation transition influenced by spatial correlations?

$\phi_0=0.6$

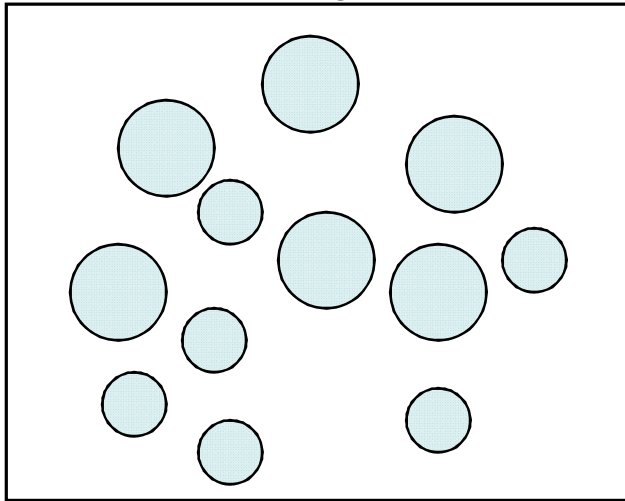


Constant NVE Hard
Sphere Dynamics

“Porosity for the penetrable-concentric-shell model of two-phase disordered media: Computer simulation results”, S. B. Lee & S. Torquato, J. Chem. Phys. 89 (1988) 3258.

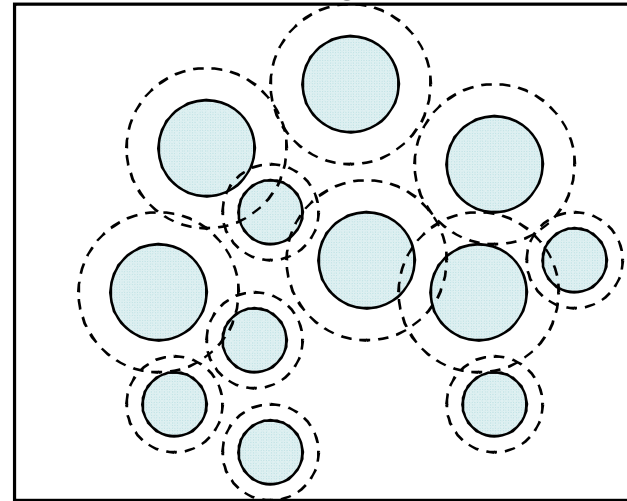
ϕ_0 -dependent Percolation

Non-overlapping initial condition



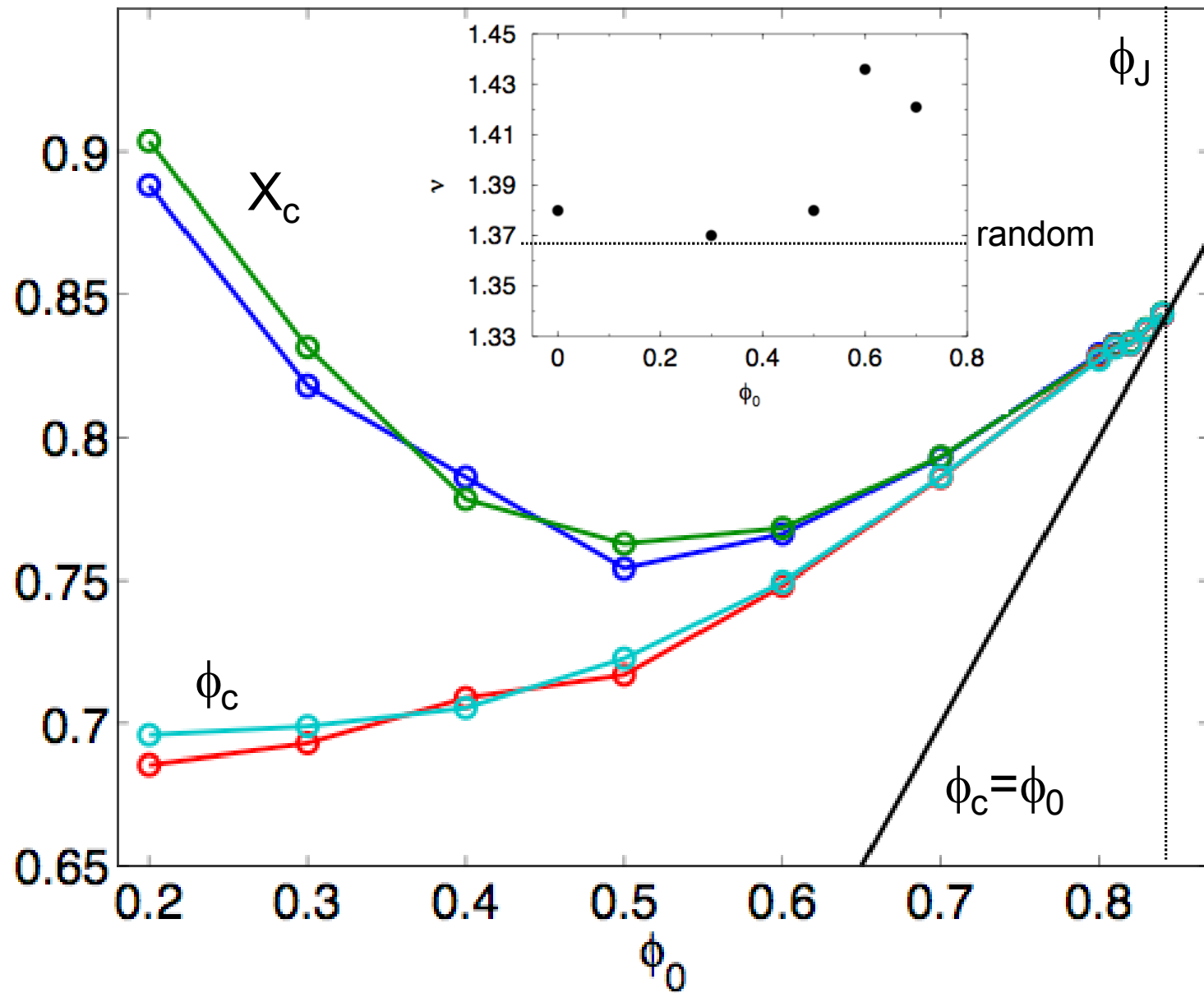
ϕ_0

Percolating network

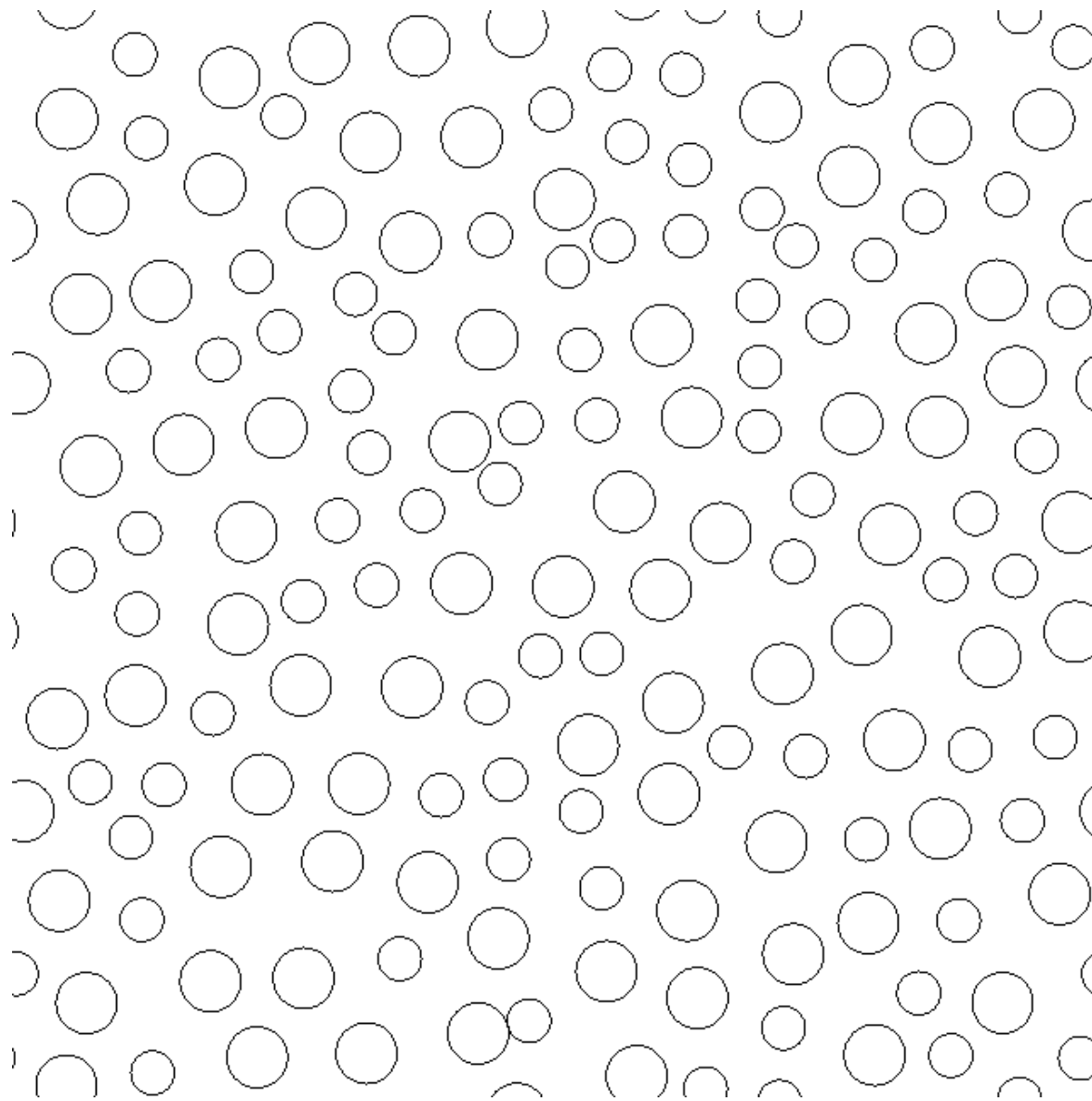


ϕ_c

Percolation Transitions

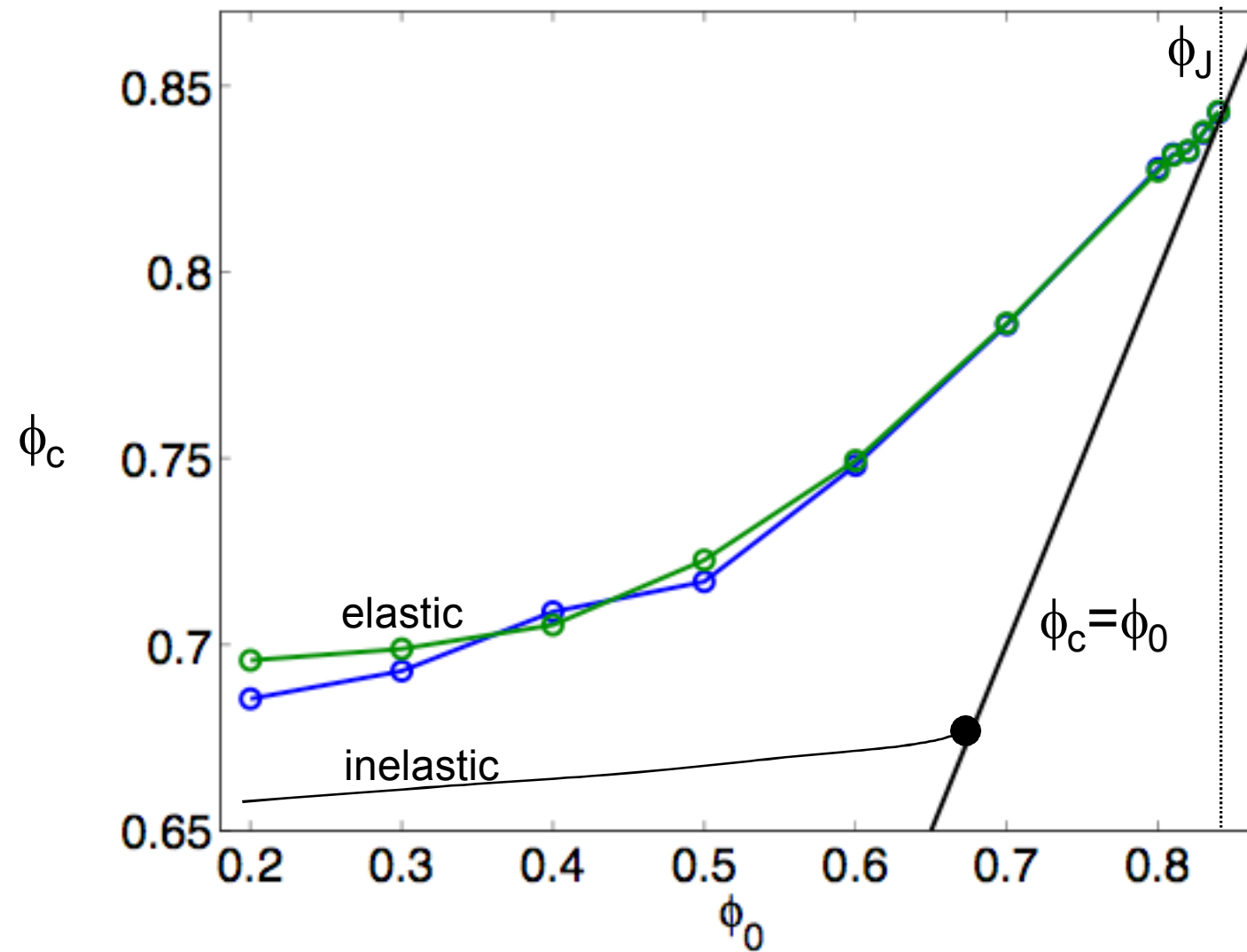


Inelastic Hard Sphere Dynamics

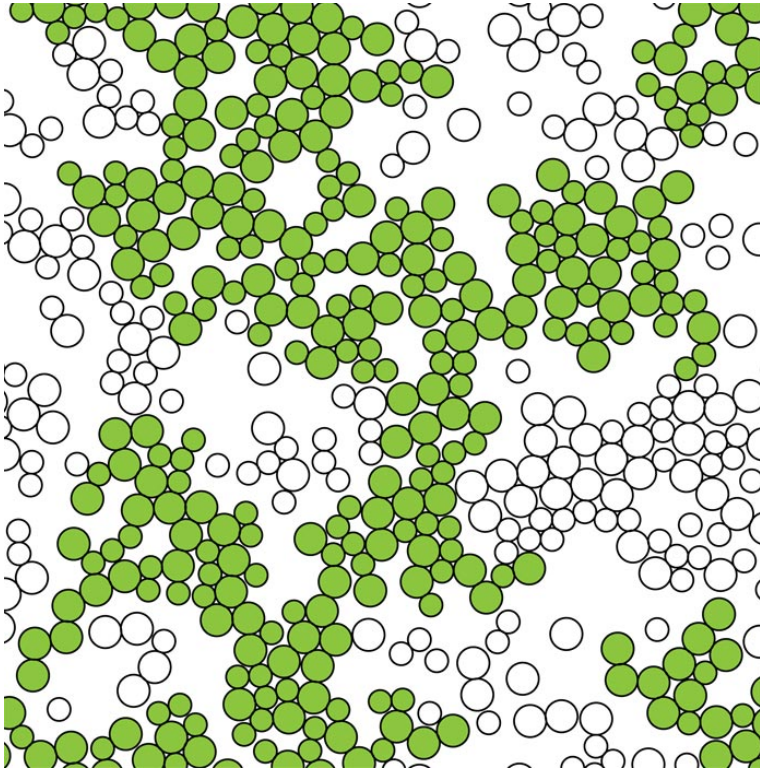


$$\phi_0 = 0.3$$

Inelastic Dynamics



Sticky Disks

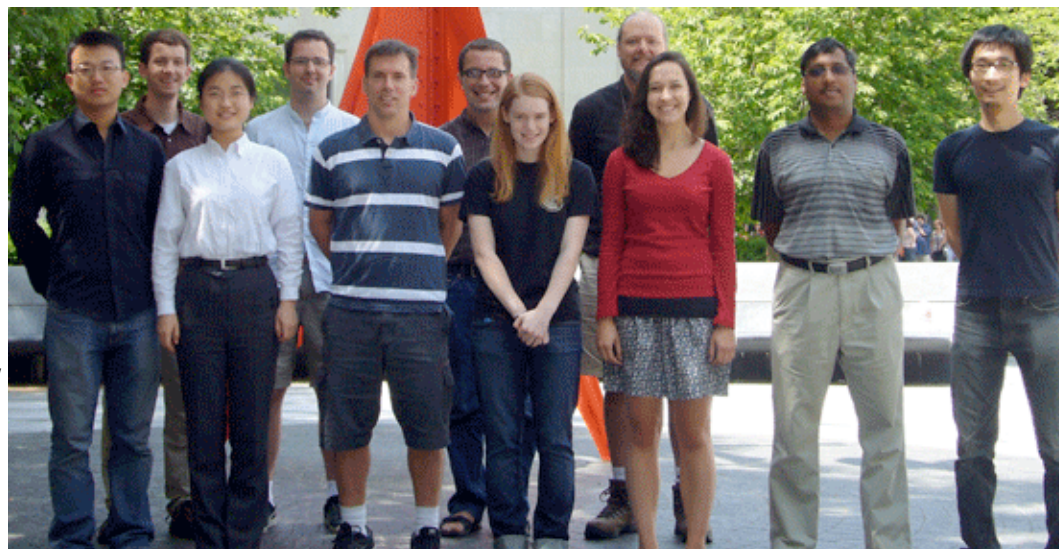


	elastic disks	sticky disks
D	1.91	1.88
τ	2.02	2.04
ν	1.38	1.92

Study cooperative motion/correlation
lengths below jamming?



<http://jamming.research.yale.edu/>



The O'Hern group in the Summer 2010: (back row from left to right) Carl Schreck, Thibault Bertrand, Robert Hoy, and Mark Shattuck; (front row from left to right) Tianqi Shen, Alice Zhou, Corey O'Hern, Sarah Penrose, Amy Werner-Allen, S. S. Ashwin, and Guo-Jie Gao.



NSF DMS-0835742, Duration: 9-1-08 to 8-31-12
 NSF CBET-0967262, Duration: 2-15-10 to 2-14-13
 NSF-PHY-1019147, Duration: 7-1-10 to 6-30-15
 NSF-DMR-1006537, Duration: 9-1-10 to 8-31-13

