

# Exact computation of the critical exponents of the jamming transition

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## Special thanks

Rome 3, June 5, 2014

# Outline

- 1 Glass and jamming transitions
- 2 A theory of the jamming transition: large  $d$  expansion
- 3 The Gardner transition and the critical exponents

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# The liquid-glass transition

Macroscopically well-known for thousands of years . . .



Dynamical arrest of a liquid into an amorphous solid state  
No change in structure,  $g(r)$  unchanged  
Driven by thermal fluctuations: entropic effects, entropic rigidity

# The liquid-glass transition

Macroscopically well-known for thousands of years...



...yet constructing a first-principle theory is a very difficult problem!

- No natural small parameter to construct a perturbative expansion
  - Low density virial expansion: fails, too dense
  - Harmonic expansion: fails, reference positions are not known
- Several processes simultaneously at work: crystal nucleation, ergodicity breaking, activated barrier crossing, dynamic facilitation
- Laboratory glasses are very far from criticality (if any)
  - Theory must take into account strong pre-critical corrections

[Berthier, Biroli, RMP 83, 587 (2011)]

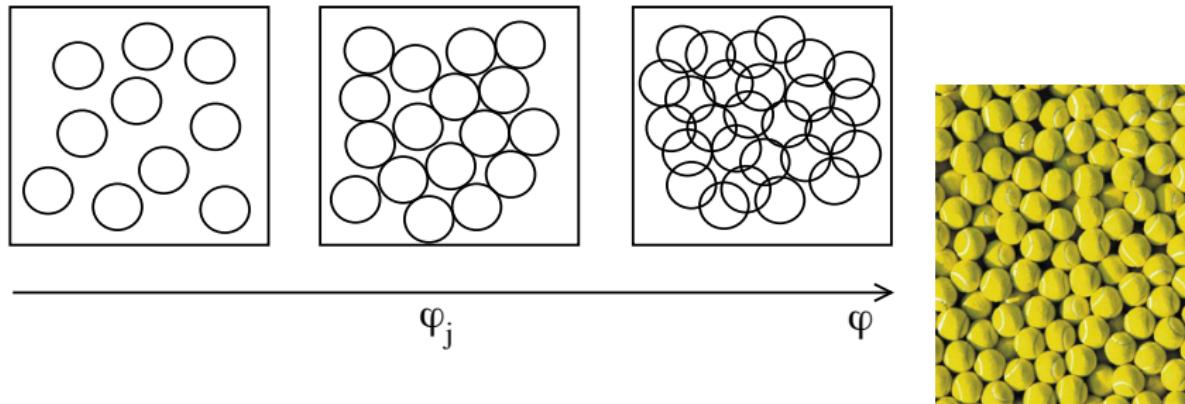
# The jamming transition

A transition that is observed in everyday experience

An *athermal* assembly of repulsive particles

Transition from a loose, floppy state to a mechanically rigid state

Above jamming a mechanically stable network of particles in contact is formed



For hard spheres,  $\varphi_j$  is also known as *random close packing*:  $\varphi_j(d = 3) \approx 0.64$

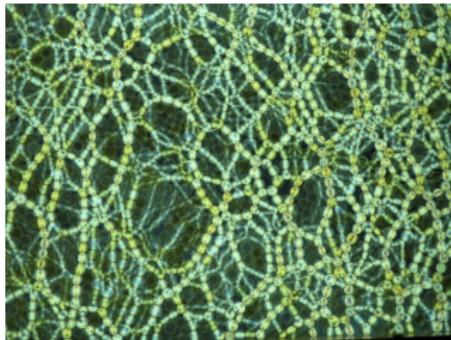
[Bernal, Mason, Nature 188, 910 (1960)]

[Liu, Nagel, Nature 396, 21 (1998)]

[O'Hern, Langer, Liu, Nagel, PRL 88, 075507 (2002)]

# The jamming transition

Granular materials, emulsion droplets, colloidal suspensions, powders, ...

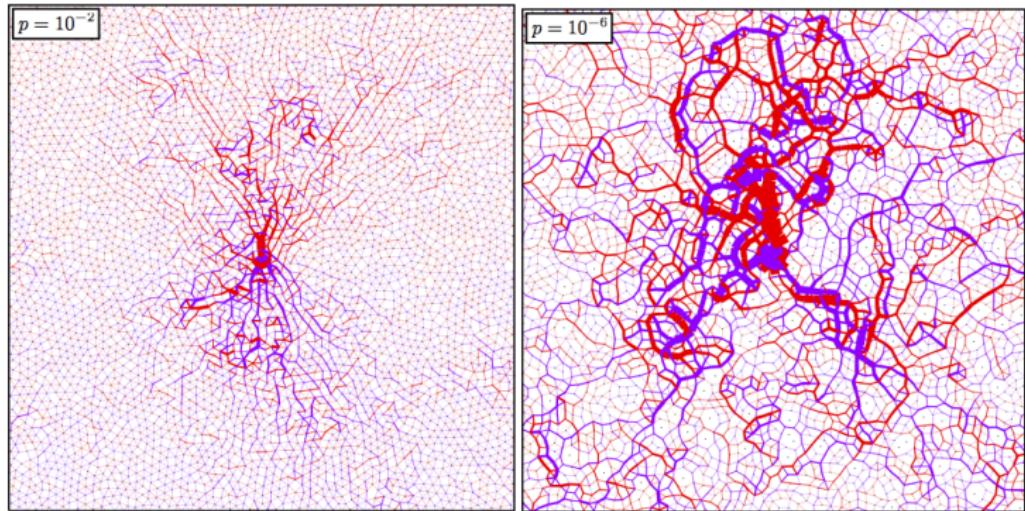


..., board games, ...

Photoelastic disks from B.Behringer's group  
ZipZap courtesy of O.Dauchot

# The jamming transition

Anomalous “soft modes” associated to a diverging correlation length of the force network



[Wyart, Silbert, Nagel, Witten, PRE 72, 051306 (2005)]  
[Van Hecke, J.Phys.: Cond.Mat. 22, 033101 (2010)]

# Marginality and criticality at jamming

- Force balance on each particle:  $\vec{F}_i = \sum_j \vec{f}_{ij} = \sum_j f_{ij} \hat{r}_{ij} = 0$

Given packing  $\{\hat{r}_{ij}\}$ :  $dN$  linear equations for  $zN/2$  variables  $f_{ij}$

To have a solution  $z \geq 2d$

**Numerical simulations:** at  $\varphi_j$ ,  $z = 2d$ , *isostatic packings*

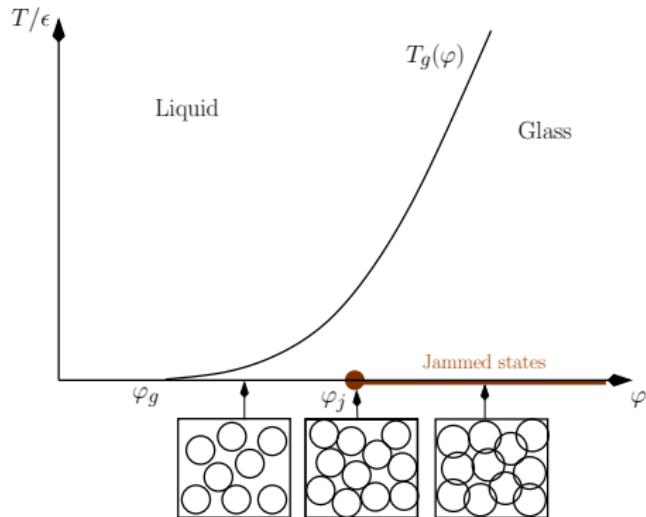
- Open one contact  $\rightarrow$  remove one variable  $f_{ij} \rightarrow$  no solution, unstable  $\rightarrow$  floppy mode
- Stable system of  $N$  particles with  $(z + \delta z)N/2$  contacts,  $N = L^d$   
 Cut in two parts: remove  $cL^{d-1}$  contacts  
 $\Delta z = \delta z L^d / 2 - cL^{d-1} > 0 \leftrightarrow \delta z > 2/(cL)$   
 Stable packing only for  $L > L^* = 2/(c\delta z)$  where continuum elasticity holds
- Numerical simulations:**  $\delta z \sim |\varphi - \varphi_j|^\nu \rightarrow L^* \sim |\varphi - \varphi_j|^{-\nu}$ ,  $\nu \approx 1/2$

Criticality and a divergent  $L^*$  are direct consequences of *isostaticity* and *marginal stability*

[Wyart, Nagel, Silbert, Witten, PRE 72, 051306 (2005)]

# Glass/jamming phase diagram

- Statistical mechanics:  
introduce temperature  $T$   
and eventually send  $T \rightarrow 0$
- The soft sphere model:  
 $v(r) = \epsilon(1 - r/\sigma)^2\theta(r - \sigma)$
- Two control parameters:  
 $T/\epsilon$  and  $\varphi = v_\sigma N/V$
- $T/\epsilon = 0$  &  $\varphi < \varphi_j \leftrightarrow$  hard spheres



Jamming is a transition from “entropic” rigidity to “mechanical” rigidity  
A theoretical description of the glass transition is difficult; and jamming happens inside the glass!

[Berthier, Jacquin, FZ, PRE 84, 051103 (2011)]  
[Ikeda, Berthier, Sollich, PRL 109, 018301 (2012)]

# Criticality around jamming

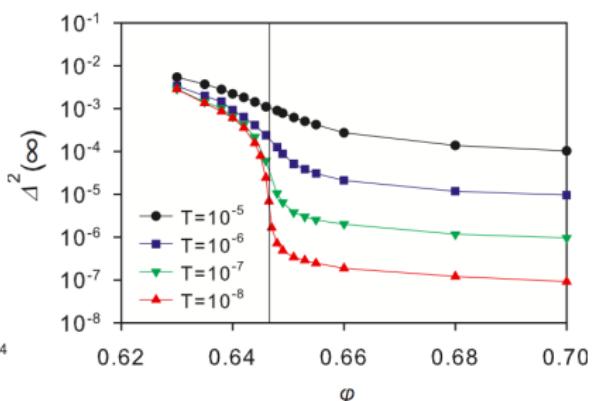
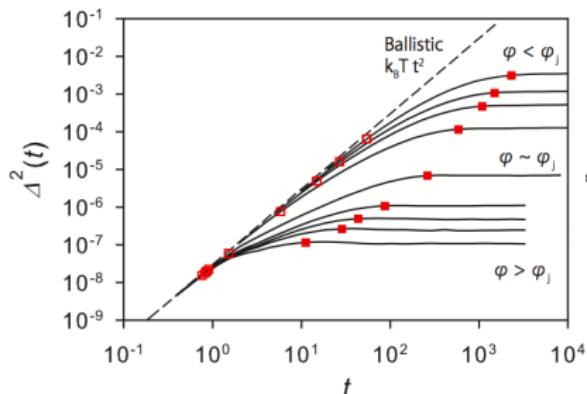
- In the glass the MSD has a plateau: diffusion is arrested, only vibrations
- The plateau value  $\Delta_{\text{EA}}$  is the Debye-Waller factor
- Scaling  $\Delta_{\text{EA}} \sim T^{\kappa/2} \mathcal{D}[(\varphi - \varphi_j)/\sqrt{T}]$
- Shear modulus of the glass  $\mu \sim T/\Delta_{\text{EA}}$  has a similar scaling
- At  $\varphi = \varphi_j$  &  $T = 0$ , gap distribution  $g(h) \sim h^{-\alpha}$  and force distribution  $P(f) \sim f^\theta$

[Donev, Torquato, Stillinger, PRE 71, 011105 (2005)]

[Wyart, PRL 109, 125502 (2012)]

[Charbonneau, Corwin, Parisi, FZ, PRL 109, 205501 (2012)]

[Ikeda, Berthier, Biroli, JCP 138, 12A507 (2013)]



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- At  $\varphi = \varphi_j$  &  $T = 0$ , gap distribution  $g(h) \sim h^{-\alpha}$  and force distribution  $P(f) \sim f^\theta$
  
- Three critical exponents  $\kappa, \alpha, \theta$
- Scaling relations based on *marginal mechanical stability of the packing*
- $\alpha = 1/(2 + \theta)$  and  $\kappa = 2 - 2/(3 + \theta)$
- Only one exponent remains undetermined
- Numerically  $\alpha \approx 0.4$  in all dimensions, which implies  $\theta \approx 0.5$  and  $\kappa \approx 1.4$

[DeGiuli, Lerner, Brito, Wyart, arXiv:1402.3834]

The jamming transition is a new kind of zero-temperature critical point,  
characterized by scaling and non-trivial critical exponents

# Glass/jamming transitions: summary

- Liquid-glass and jamming are new challenging kinds of phase transitions
- Disordered system, no clear pattern of symmetry breaking
- Unified phase diagram, jamming happens at  $T = 0$  inside the glass phase
- Criticality at jamming is due to *isostaticity* and associated anomalous response

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- 1 Glass and jamming transitions
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- 3 The Gardner transition and the critical exponents

# Expansion around $d = \infty$ in statistical mechanics

Many fields of physics (QCD, turbulence, critical phenomena, non-equilibrium ... liquids&glasses!) struggle because of the absence of a small parameter

In  $d = \infty$ , exact solution using mean-field theory

Proposal: use  $1/d$  as a small parameter [E.Witten, Physics Today 33, 38 (1980)]

Question: which features of the  $d = \infty$  solution translate smoothly to finite  $d$ ?

For the glass transition, the answer is very debated!

For the jamming transition, numerical simulations show that the properties of the transition and the values of  $\kappa$ ,  $\alpha$ ,  $\theta$  are *very weakly dependent on d*

[Goodrich, Liu, Nagel, PRL 109, 095704 (2012)]

[Charbonneau, Corwin, Parisi, FZ, PRL 109, 205501 (2012)]

# Expansion around $d = \infty$ in statistical mechanics

## Theory of second order PT (gas-liquid)

- Qualitative MFT (Landau, 1937)

*Spontaneous  $Z_2$  symmetry breaking  
Scalar order parameter  
Critical slowing down*

- Quantitative MFT (exact for  $d \rightarrow \infty$ )

*Liquid-gas:  $\beta p/\rho = 1/(1 - \rho b) - \beta a\rho$   
(Van der Waals 1873)  
Magnetic:  $m = \tanh(\beta Jm)$   
(Curie-Weiss 1907)*

- Quantitative theory in finite  $d$  (1950s)  
(approximate, far from the critical point)

*Hypernetted Chain (HNC)  
Percus-Yevick (PY)*

- Corrections around MFT

*Ginzburg criterion,  $d_u = 4$  (1960)  
Renormalization group (1970s)  
Nucleation theory (Langer, 1960)*

## Theory of the liquid-glass transition

- Qualitative MFT (Parisi, 1979; KTW, 1987)

*Spontaneous replica symmetry breaking  
Order parameter: overlap matrix  $q_{ab}$   
Dynamical transition "à la MCT"*

- Quantitative MFT (exact for  $d \rightarrow \infty$ )

*Kirkpatrick and Wolynes 1987  
Kurchan, Parisi, Urbani, FZ 2006-2013*

- Quantitative theory in finite  $d$

*DFT (Stoessel-Wolynes 1984)  
MCT (Bengtzelius-Götze-Sjolander 1984)  
Replicas (Mézard-Parisi 1996, +FZ 2010)*

- Corrections around MFT

*Ginzburg criterion,  $d_u = 8$  (2007, 2012)  
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# $1/d$ as a small parameter – amorphous hard spheres

- Geometric argument:

kissing number  $e^d \gg$  coordination at jamming  $2d$

$\Rightarrow$  uncorrelated neighbors

Uncorrelated neighbors correspond to a mean field situation  
(like Ising model in large  $d$ )

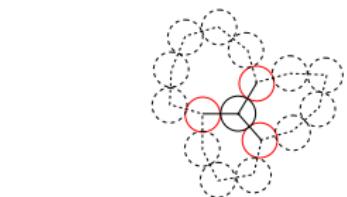
- Statistical mechanics argument:

third virial (three body terms)  $\ll$  second virial (two-body term).

Rigorously true for  $2^d \varphi \lesssim 1$

Re-summation of virial series (in the metastable liquid state) gives a pole at  $2^d \varphi \sim e^d$ .

Glass transition is around  $2^d \varphi \sim d$



Percus, Kirkwood

Keep only ideal gas + second virial term (as in TAP equations of spin glasses):

$$-\beta F[\rho(x)] = \int dx \rho(x)[1 - \log \rho(x)] + \frac{1}{2} \int dx dy \rho(x)\rho(y)[e^{-\beta v(x-y)} - 1]$$

Solve  $\frac{\delta F[\rho(x)]}{\delta \rho(x)} = 0$  to find minima of  $F[\rho(x)]$

Exact\* solution for  $d = \infty$  is possible, using your favorite method (we used replicas)

\*Exact for theoretical physics, not rigorous for the moment

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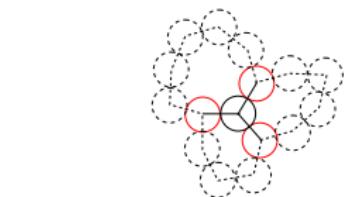
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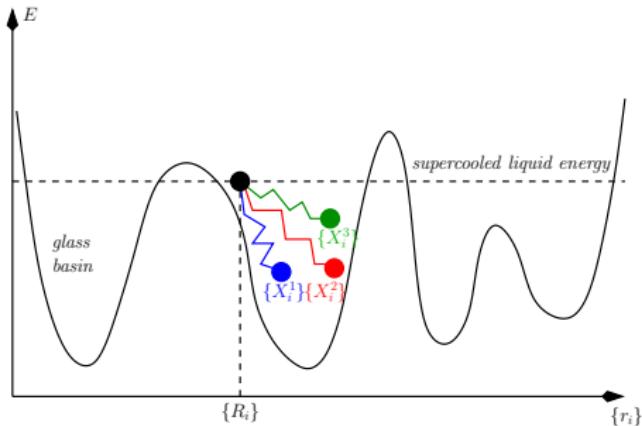
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# Why replicas? (no quenched disorder!)



Gibbs measure split in many glass states

$$F_g = -k_B T \int dR \frac{e^{-\beta H[R]}}{Z} \log Z[X|R] \quad Z[X|R] = \int dX e^{-\beta' H[X] + \beta' \varepsilon \sum_i (X_i - R_i)^2}$$

Need replicas to average the log, **self-induced disorder**

[Franz, Parisi, J. de Physique I 5, 1401 (1995)]  
 [Monasson, PRL 75, 2847 (1995)]

# Theory of glass/jamming: summary

- A  $1/d$  expansion around a mean-field solution is a standard tool when the problem lack a natural small parameter
- Hard spheres are exactly solvable when  $d \rightarrow \infty$   
They have a glass phase and a jamming transition
- You can choose your preferred method of solution: replicas are convenient
- An approximate mean field solution in finite  $d$  is obtained by resumming virial diagrams

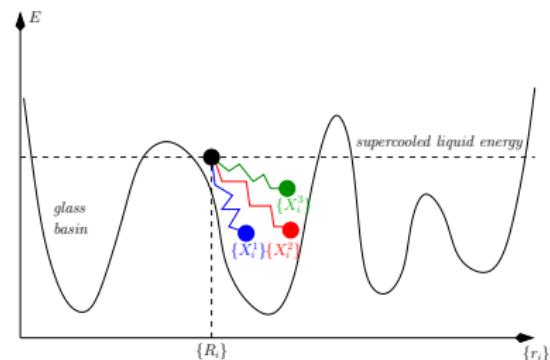
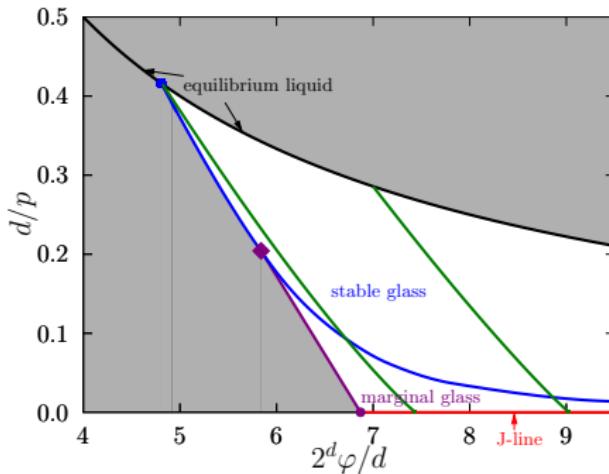
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# The phase diagram

Crucial result:

- A *Gardner transition* inside the glass phase
- Stable  $\rightarrow$  marginally stable glass *in phase space*  
[Gardner, Nucl.Phys.B 257, 747 (1985)]
- The jamming line falls inside the marginal phase

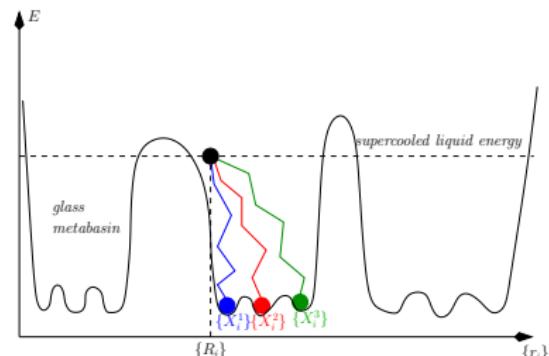
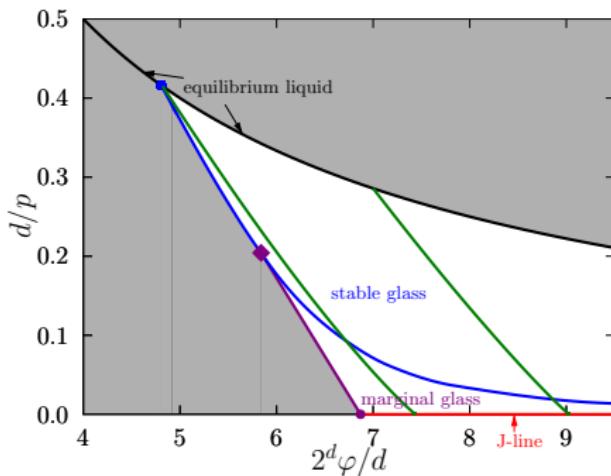


[Charbonneau, Kurchan, Parisi, Urbani, FZ, Nature Comm. 5, 3725 (2014)]

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# Critical exponents of jamming

- Neglecting the Gardner transition gives  $\theta = 0$  and  $\alpha = 1$ : plain wrong
- Taking into account the Gardner transition gives correct values:  
 $\kappa = 1.41574\dots$ ,  $\alpha = 0.41269\dots$ ,  $\theta = 0.42311\dots$
- Consistent with scaling relations  $\alpha = 1/(2 + \theta)$  and  $\kappa = 2 - 2/(3 + \theta)$
- $\alpha$  and  $\kappa$  are perfectly compatible with the numerical values
- Some debate on  $\theta$  in low dimensions
- Marginal stability in phase space and marginal mechanical stability are intimately connected

[Charbonneau, Kurchan, Parisi, Urbani, FZ, Nature Comm. 5, 3725 (2014)]

# Critical exponents of jamming

A short technical detour on the computation of exponents:

- In the replica language the Gardner phase is described by the Parisi fullRSB structure  
**unexpected analogy between HS in  $d \rightarrow \infty$  and the SK model!**

[Wyart, PRL 109, 125502 (2012)]

- Order parameter is  $\Delta(y)$  for  $y \in [1, 1/m]$ , the overlap probability distribution
- Coupled Parisi equation for  $\Delta(y)$  and a function  $P(y, f)$ , probability of the forces
- At jamming,  $m \rightarrow 0$ ,  $y \in [1, \infty)$
- Scaling solution at large  $y$ :  $\Delta(y) \sim y^{-1-c}$  and  $P(y, f) \sim y^a p(f y^b)$
- $a$ ,  $b$  and  $c$  are related to  $\kappa$ ,  $\alpha$  and  $\theta$
- Equation for  $p(t)$  in scaling limit: boundary conditions give scaling relations for  $a$ ,  $b$ ,  $c$
- One free exponent is fixed by the condition of marginal stability of the fullRSB solution

[Charbonneau, Kurchan, Parisi, Urbani, FZ, arXiv:1310.2549]

# Summary

- The jamming transition is a new kind of zero-temperature critical point, characterized by scaling and non-trivial critical exponents
- The  $d = \infty$  phase diagram is qualitatively realized in finite  $d$   
Quantitative computations in finite  $d$  are possible, in progress
- Critical properties of jamming are obtained only by taking into account the Gardner transition to a marginal phase  
Analytic computation of the non-trivial critical exponents  $\alpha, \theta, \kappa$
- An unexpected connection between hard spheres in  $d \rightarrow \infty$  and the SK model

THANK YOU FOR YOUR ATTENTION