# Thermodynamic fluctuations in model glasses

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Critical Phenomena in Random and Complex Systems – Capri, September 12, 2014



#### **Coworkers**

• With:

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#### The glass "transition"



- Activated dynamics: "super-Arrhenius" growth of viscosity.
- "No change of structure" accompanying dynamic arrest.

## **Dynamic heterogeneity**

• Growth of spatio-temporal correlations.



["Dynamical heterogeneities in glasses, colloids and granular materials", Oxford, 2011]

• Major puzzle: Link with static length scales? Statics vs. dynamics.

fast

## Lessons from a simpler problem

• Liquid-gas transition: First-order transition ending at a critical point.



- Van der Waals (1873): Mean-field equation of state predicts nature of phase transition, and a simple "landscape" with (only) 2 states.
- Missing in mean-field: Nucleation ('27-'60) and critical fluctuations ('75).
  -Convex free energy (interfaces); super-activated dynamics from CNT.
  -Non-trivial finite *d* exponents, mean-field valid for *d* ≥ 4(≥ *d* = 3).

## Less simple problems: disorder

- Random field Ising model (Imry-Ma '75):  $H = -J \sum_{ij} S_i S_j \sum_i h_i S_i$ .
- Edwards-Anderson spin glass model ('75):  $H = -\sum_{ij} J_{ij}S_iS_j$ .

• Some lessons:

- RFIM: Super-Arrhenius dynamics (T = 0 critical point), non-trivial exponents for the barriers, nonperturbative treatment needed for d < 6.

- SG: Mean-field solution using replica symmetry breaking (Parisi '79-'83), encoding hierarchical free energy landscape.

- Below d = 6: Mean-field results vs. phenomenological 'droplet' (low dimensional excitations) theory? Unsolved to this day.

- Numerical studies of critical properties and low-temperature phases notoriously difficult (e.g. AT line...). Multiple models useful.

- Decisive experiments are difficult.

# **Structural glasses**

- Hard spheres as a canonical glass model (Pusey van Megen '86).
- Mean-field thermodynamic solution  $d \rightarrow \infty$  established in 2013. Solution confirms density functional theory, Bethe lattice, etc.

[Kurchan, Parisi, Zamponi '13-'14]

• Universality class identified earlier using models such as *p*-spin model.

 $H = -\sum_{i_1 \cdots i_p} J_{i_1 \cdots i_p} S_{i_1} \cdots S_{i_p}.$  [Kirkpatrick, Thirumalai, Wolynes '87-'89]

 Mean-field dynamics unsolved to this day. This is probably not Götze's mode-coupling theory.

- Lessons learnt from earlier problems:
  - Well-defined path (vdW  $\rightarrow$  Wilson)... possibly incorrect!
  - Non-trivial critical fluctuations below d = 8 (or 6?)  $\gg d = 3$ ;
  - Difficulty of numerical simulations;
  - Experiments not always decisive.

# RFOT

- Random First Order Transition (RFOT) theory is a theoretical framework constructed over the last 30 years using a diverse set of analytical techniques. [Structural glasses and supercooled liquids, Wiley '12]
- Mean-field character now fully understood. Complex free energy landscape gives rise to sharp transitions ('guessed' in experimental data):
  - Onset (apparition of metastable states);
  - "Mode-coupling" singularity (long-lived metastable states,  $\mathcal{N} \sim e^{N\Sigma}$ );
  - Entropy crisis ( $\Sigma = \frac{1}{N} \ln \mathcal{N} \to 0$ ).
- Ideal glass = zero configurational entropy, replica symmetry breaking.
- Proliferation of 'states' identified by density profiles. Overlap between (coarse-grained) density profiles is the order parameter:

$$Q_{12} = \frac{1}{N} \sum_{i,j=1}^{N} \theta(a - |\mathbf{r}_{1,i} - \mathbf{r}_{2,j}|), \text{ with } a \approx 0.3\sigma.$$

#### Landau free energy

• Effective potential V(Q) is the free energy cost to have 2 configurations at fixed overlap  $Q_{12}$ : [Franz & Parisi, PRL '97]

$$V(Q) = -(T/N) \int d\mathbf{r}_2 e^{-\beta H(\mathbf{r}_2)} \log \int d\mathbf{r}_1 e^{-\beta H(\mathbf{r}_1)} \delta(Q - Q_{12})$$



• 'van der Waals' picture of the glass transition.

• Large *Q* metastable state has infinite lifetime in mean-field.

• First-order jump at  $T_K$ , when 'driving force'  $\Sigma \rightarrow 0$ .

• Finite *d* implies convex V(Q): Surface tension between 'metastable' states appears. Suggests to interpret relaxation as nucleation process driven by entropic forces (super-Arrhenius). [KTW, '89]

## **Direct** 3d measurement?

• V(Q) is a 'large deviation' function, mainly studied in mean-field RFOT limit:  $P(Q) = \overline{\langle \delta(Q - Q_{12}) \rangle_T} \sim \exp[-\beta NV(Q)].$ 

• Principle: Take two equilibrated configurations 1 and 2, measure their overlap  $Q_{12}$ , record the histogram of  $Q_{12}$ .

• Problems:

- $T > T_K$ : typical configurations have  $Q_{12} \ll 1$ .
- Thermalizing near/below  $T_K$ ?
- Translational/rotational invariance:  $Q_{12} \ll 1$  even in ideal glass.

• A possible solution: Seek large deviations using umbrella sampling techniques for coupled copies with  $\epsilon \to 0$ : [e.g. Frenkel & Smit]

- Biased sampling using  $W_i(Q_{12}) = k_i(Q_{12} Q_i)^2$  to explore  $Q_{12} \approx Q_i$ .
- Vary  $(k_i, Q_i)$  to explore entire  $Q_{12}$ -range with careful thermalization.
- Reconstruct P(Q) using histogram reweighting techniques.

#### Free energy measurements

• Thermalized MD simulations of harmonic spheres with N = 108;  $T_{\text{onset}} \approx 12$ .

• Linear part below  $T_{\text{onset}}$ : phase coexistence between multiple metastable states in 3d bulk liquid.

• Non trivial thermodynamic fluctuations accompany slow dynamics.

• The 'structure' changes dramatically with T – just not g(r). Mirrors dynamical large deviations.

[Berthier, PRE '13]



# Link with dynamic heterogeneity

- Large deviations of global fluctuations of local activity  $m_t = \int dx \int_0^t dt' m(x; t', t' + \Delta t)$ :  $P(m) = \langle \delta(m - m_t) \rangle \sim e^{-tN\psi(m)}.$
- Dynamic heterogeneity seen as exponential tail in P(m).
- Phase coexistence in (d+1) dimensions: High and low activity phases.
- $10^{0}$  $10^{-3}$  $(m)_{d}$ 10<sup>-6</sup>  $- t_{obs} = 320$  $t_{obs} = 640$  $10^{-9}$  $\rightarrow t_{obs} = 960$  $t_{obs} = 1280$  $10^{-12}$ 0.1 0.00.2 0.3 m [Jack et al., JCP '06]
- Equivalently, a field coupled to local dynamics induces a nonequilibrium first-order phase transition in the "s-ensemble". [Garrahan et al., PRL '07]
- Also seen within mean-field RFOT [Jack & Garrahan, PRE '10].
- Global thermodynamic and dynamic fluctuations behave very similarly.

# **Equilibrium phase transitions**

• Non-convex V(Q) implies that an equilibrium phase transition can be induced by a field conjugated to Q. [Kurchan, Franz, Mézard, Cammarota, Biroli...]

• Annealed: 2 coupled copies.



• Quenched: copy 2 is frozen.





• Within RFOT: Different universality classes for quenched and annealed.

[Biroli et al., Franz & Parisi, '14]

- First order transition emerges from  $T_K$ , ending at a critical point near  $T_{\text{onset}}$ .
- Extended phase diagrams as useful probe of RFOT/glass physics.

## Numerical evidence in 3d liquid



# Spin plaquette models

• Plaquette models are spin models intermediate between KCM and spin glass RFOT models: statics not fully trivial, localized defects and facilitated dynamics. E.g. in d = 2 on square lattice:  $E = -\sum_{n=1}^{\infty} s_1 s_2 s_3 s_4$ .

 Plausible scenario for emergence of facilitated dynamics out of interacting Hamiltonian with glassy dynamics.
 [Garrahan, JPCM '03]

• Dynamic heterogeneity similar to standard KCM. [Jack *et al.*, PRE '05]

• "High-order" or "multi-point" static correlations develop without finite T phase transitions.

• Triangular plaquette model, annealed transition occurs [Garrahan, PRE '14]. No quenched?



#### **Quenched transition**

• Important because transition not seen in lattice glass models or spin plaquette models, but predicted within RFOT: Deep link with Kauzmann transition? Several on-going works by Garrahan/Jack, Hukushima, etc.



Confirms smaller system size results for harmonic spheres.

• Naive first estimate for d = 3 Lennard-Jones binary mixture:  $T_c \leq 0.6$ .

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#### **Overlap fluctuations**

• Overlap distributions are Gaussian at  $T > T_c$ , look "critical" at  $T_c$ , and become bimodal at  $T \leq T_c$ .



• Two types of fluctuations:  $\chi_T = \overline{\langle Q^2 \rangle_T - \langle Q \rangle_T^2}$  and  $\chi_{\text{dis}} = \overline{\langle Q \rangle_T^2} - \overline{\langle Q \rangle_T^2}^2$ . Simulations indicate  $\chi_{\text{dis}} \approx \chi_T^2$ : Critical point is controlled by disorder.

• (Much) more work needed for exponents...

# **Configurational entropy** $\Sigma(T)$

•  $\Sigma = \frac{k_B}{N} \log N$  signals entropy crisis. Problem when  $d < \infty$ , because metastable states cannot be (rigorously) defined.

• Experiments and simulations use approximations:  $\Sigma \approx S_{tot} - S_{vib}$ .



[Berthier & Coslovich, PNAS '14]

• Sensible estimate:  $\Sigma \approx \beta [V(Q_{\text{high}}) - V(Q_{\text{low}})]$ 

• Free energy cost to localize the system 'near' a given configuration.

• Well-defined in finite d ( $T < T_c$ ), consistent with mean-field.

• Definition of 'states', 'vibrations', exploration of energy landscape not needed.

## **Results for two liquids**



- Configurational entropy not defined in high-T liquid.
- Discontinuous emergence of  $\Sigma(T)$  at  $T_c$  signals slow dynamics.
- Strong temperature dependence, qualitatively correlated with dynamics.
- $\Sigma(T)$  can be used to study  $T_K$  directly in bulk systems.

# More ideal glass transitions

• Random pinning of a fraction *c* of particles: unperturbed Hamiltonian.

Slowing down observed numerically.
 [Kim, Scheidler... '00's]





• Within RFOT, ideal glass transition line extends up to critical point.

[Cammarota & Biroli, PNAS '12]

• Pinning reduces multiplicity of states, i.e. decreases configurational entropy:  $\Sigma(c,T) \simeq \Sigma(0,T) - cY(T)$ . Equivalent to  $T \to T_K$ .

• Ideal glass transition with quenched disorder - overlap can be used.

# Pinning in plaquette models

 Random pinning studies in spin plaquette models offer an alternative scenario to RFOT. [Jack & Berthier, PRE '12]

• Crossover  $f^{\star}(T)$  from competition between bulk correlations and random pinning: directly reveals growing static correlation lengthscale.



Light blue: mobile. Deep blue: frozen. Black: pinned.

#### **Smooth crossover**

• Static overlap q increases rapidly with fraction f of pinned spins, crossover  $f^* = f^*(T)$ , but no phase transition.

• Overlap fluctuations reveal growing static correlation length scale, but susceptibility remains finite as  $N \to \infty$ .

• Dynamics barely slows down with f, unlike atomistic models.



# **Random pinning in** 3*d* liquid

• Challenge: fully exploring equilibrium configuration space in the presence of random pinning: parallel tempering. Limited (for now) to small system sizes: N = 64, 128. [Kob & Berthier, PRL '13]



Low-c fluid

High-c glass

- From liquid to equilibrium glass: freezing of amorphous density profile.
- We performed a detailed investigation of the nature of this phase change, in fully equilibrium conditions.

#### **Order parameter**

• We detect this 'glass formation' using an equilibrium, microscopic order parameter: The global overlap  $Q = \langle Q_{12} \rangle$ .



• Gradual increase at high T to more abrupt emergence of amorphous order at low T at well-defined c value. First-order phase transition or smooth crossover?

#### **Fluctuations: Phase coexistence**

• Probability distribution function of the overlap:  $P(Q) = \overline{\langle \delta(Q - Q_{12}) \rangle}$ .



N = 64

• Bimodal distributions appear at low enough T, suggestive of phase coexistence at first-order transition, rounded by finite N effects. More work needed to study  $N \rightarrow \infty$ ...

# Equilibrium phase diagram

 Location of the transition from liquid-to-glass determined from equilibrium measurements of microscopic order parameter on both sides.



• Glass formation induced by random pinning has clear equilibrium thermodynamic signatures which can be studied directly.

Results compatible with Kauzmann transition – this can now be decided.

## Conclusion

• Non-trivial thermodynamic fluctuations of the overlap in 3*d* bulk supercooled liquids: non-Gaussian V(Q) losing convexity below  $\approx T_{\text{onset}}$ .

- Statics and dynamics seem to go hand in hand.
- Adding a thermodynamic field can induce equilibrium phase transitions.



- Theory: Mean-field limit well understood at thermodynamic level, finite d (i.e. d = 3) will be difficult. Dynamics?
- Simulations have entered a new phase: equilibrium phase transitions, microscopic order parameters.
- A genuine glass transition may exist, and its existence can be studied directly.



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#### **Thermodynamic limit?**

• Phase transition can only be proven using finite-size scaling techniques to extrapolate toward  $N \rightarrow \infty$ .



• Limited data support enhanced bimodality and larger susceptibility for larger N. Encouraging, but not quite good enough: More work needed.