## **LETTER**

# Glassy critical points and the random field Ising model

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**Abstract.** We consider the critical properties of points of the continuous glass transition that one can find in liquids in the presence of constraints or in liquids in porous media. Through a one-loop analysis we show that the critical replica field theory describing these points can be mapped in the  $\phi^4$ -random field Ising model. We confirm our analysis by studying the finite size scaling of the p-spin model defined on a sparse random graph, where a fraction of the variables are frozen such that the phase transition is of a continuous kind.

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### 1. Introduction

Research in recent years has emphasized the importance of fluctuations in understanding glassy phenomena. The present comprehension of long lived dynamical heterogeneities in supercooled liquids compares the growth of their typical size to the appearance of long range correlations at second order phase transition points [1]. Unfortunately, in supercooled liquids, the theoretical study of these correlations beyond the mean field is just at an embryonic level. It has been recently proposed that the putative discontinuous dynamical transition of mode coupling theory, which is present when all activated processes are neglected, belongs to the universality class of the unstable  $\phi^3$  theory in a random field ( $\phi^3$ -RFIM in the following) [2]. However, in real systems the activated processes cannot be neglected, the only remnant of the transition is a dynamical crossover and it is not clear whether there is a range where the prediction of the theory can be tested.

In usual phase transitions often we have a line of first order transitions that ends at a second order terminal critical point. The most popular case is ferromagnets: at low temperatures there is a first order transition when the magnetic field crosses zero (the magnetization has a discontinuity), and this transition line ends at the usual critical point. The same phenomenon occurs for the gas—liquid transition: it is a first order transition at low temperatures that ends in a second order transition at the critical point.

A similar situation can occur for liquids undergoing a glass transition, where lines of discontinuous glass transitions can terminate in critical points. In this letter we focus our attention on these terminal points, where the glass transition becomes continuous and activation does not play a major role in establishing equilibrium. This transition has both a dynamic and a thermodynamic character, and it is not necessarily wiped out in finite dimension. Glassy critical points have been theoretically studied in detail both at the dynamic and at the thermodynamic level. In dynamical mode coupling theory (MCT) [3] these are known as  $A_3$  singularities, and have been recently observed in simulations of

kinetically constrained models on the Bethe lattice [4]. At the thermodynamic level they are known from mean field spin glass models [5] and integral equation approximations of liquid theory [6]. At these points the discontinuity in the Edwards–Anderson non-ergodicity parameter vanishes and, correspondingly, the separation of dynamics in the  $\alpha$  and  $\beta$  regimes is blurred. On approaching the critical points from the discontinuous transition side the MCT exponents characterizing the  $\beta$  relaxation go to zero and the  $\alpha$  relaxation follows a universal scaling function [7]. In general, bulk liquids display a discontinuous transition pattern. However, the transition can become continuous for a particular choice of the parameters, e.g. in the presence of constraints or quenched disorder. It has been argued that within MCT the glass transition can become continuous for liquids that are confined in porous media [8]. If one studies the transition as a function of the spatial density of the confining matrix  $\rho_{\rm M}$ , one finds lines of discontinuous dynamic and thermodynamic transition that get displaced at lower and lower liquid densities, until they merge at a common critical point where the transition becomes continuous.

From the theoretical side, a suitable way of constraining a glassy system consists in introducing a 'pinning field' term in the Hamiltonian, pushing the system in the direction of a randomly chosen reference equilibrium configuration. In [9] a phase diagram in the plane of the temperature and pinning field was proposed, showing lines of first order dynamical and thermodynamical transition that merge and terminate in a common critical point, as reproduced in figure 1. This view, based on simple spin glass models, was confirmed for liquids in the replica hypernetted chain approximation in [10] and supported by numerical simulation of realistic model liquids in [10, 11].

More recently, interest in the phase diagram of constrained systems has been renewed by liquid simulations where a finite fraction of the particles are frozen to the position they take in a selected equilibrium configuration [12]. The effect of the frozen particles is similar to that of an adsorbing matrix in a porous medium or of a pinning field, with the important addition that in this case the unfrozen particles remain in the original equilibrium state.

The detailed phase diagram for spin models on random graphs was computed in [13, 14]. A theoretical discussion of the physical relevance of this situation for liquids and glasses and an exact computation for the mean field p-spin models were presented in [15]. Differently from the case of the pinning field where the field transforms the glass transition into first order and spinodal transitions, in the case of frozen particles the dynamic and thermodynamic transition lines keep their glassy random first order character that one finds at zero pinning.

In all these cases, the existence of a critical terminal point is interesting because while the dynamical critical line has to disappear in finite dimension thanks to dynamical activation, the critical terminal point, which is also the terminating point of the thermodynamic transition line, could survive in finite dimensions and can be studied in numerical simulations and experiments.

As it is usual for lines of phase transitions terminating in a critical point, the critical terminal point lies in a different universality class of the line. The critical properties of discontinuous dynamical transitions have been recently analyzed in [2]. It has been proposed that the time independent part of the fluctuations in the  $\beta$  and early  $\alpha$  dynamical regimes admits a description in terms of a cubic replica field theory. The leading singularities of this theory in perturbation theory happen to coincide with the

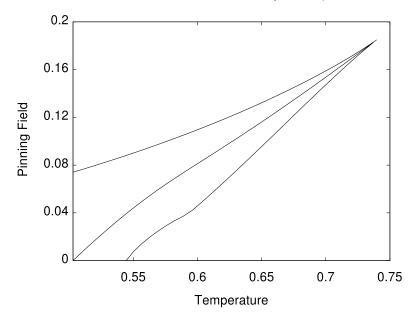


Figure 1. Phase diagram in the plane of the temperature and pinning field in a schematic mean field system. At small temperatures for large values of the pinning field the system at equilibrium stays near the reference configuration (high overlap phase), while at small values of the pinning field the system stays far from the reference configuration (low overlap phase). The upper curve is the line of dynamical transition below which a dynamically stable high overlap phase exists. The middle curve is the thermodynamic first order transition line between the low overlap and high overlap phases. The lower curve is the spinodal of the high overlap phase, i.e. the point where it becomes unstable. The three curves terminate in the critical terminal point. (Figure from [9].)

ones of a  $\phi^3$  field theory in a random magnetic field. At the critical point the coefficient of the  $\phi^3$  term vanishes and it is natural to make the hypothesis that the next relevant term is a  $\phi^4$  term so that the resulting theory is the standard  $\phi^4$ -RFIM [16].

Arguments in this direction have been put forward in [15] using an RG procedure. Unfortunately, the arguments in [15], though suggestive, are not fully convincing. They are based on a Migdal–Kadanoff renormalization scheme, which uses a hybrid formalism where replicas are used to average out the randomness in couplings, but the additional quenched disorder introduced to mimic the effect of the frozen particle is kept unaveraged.

In this letter we use the tools of replica field theory to support the hypothesis that glassy critical points are in the universality class of the  $\phi^4$ -RFIM. We analyze in detail the case of a dynamical transition line terminating in a critical point. Such a scenario applies exactly in the case in which a finite fraction of particles are pinned in an equilibrium condition. The case of a pinning field or an adsorbing matrix presents additional complications that will be left to future work. Replica field theory can be used to find the nature of this transition. We have to consider a system with n clones in the presence of some constraint. When the number n of components goes to 1, one of the clones is at equilibrium and the other clones feel the effect of a quenched field. Since one does not specify which of the clones is privileged the final theory is replica symmetric. From a field theoretical perspective, at first sight the RFIM hypothesis is self-evident.

Indeed if we take care of the leading terms, the replica theory corresponds to a theory with a random temperature that maps onto a theory with a potential  $V(\phi)$  with a random magnetic field and the critical terminal point is described by a  $\phi^4$  interaction. However, this argument holds only for the leading terms and neglects sub-leading orders that may play a crucial role if the leading terms cancel.

More precisely, the mapping of the dynamical transition to the  $\phi^3$ -RFIM comes from the extraction of the most singular contribution of a cubic replica field theory, with multiple fields of different scaling dimension. The neglected sub-leading terms turn out to become dimensionally relevant below dimension 6, the same dimension as the quartic terms of the  $\phi^4$ -RFIM. The contribution of cubic vertices cannot therefore be directly dismissed on the basis of dimensional analysis. To understand the nature of the terminal critical point and the possibility of cancellations that restore the RFIM mapping, a careful analysis of the perturbative series is needed. The scope of this letter is to investigate this problem at the level of the Ginzburg criterion, computing the one-loop corrections to the propagators due to the residual cubic vertices and comparing them to the ones coming from the quartic terms. We find that a priori unexpected cancellations are present so that the cubic vertices' contributions appear to be irrelevant as compared to the quartic ones.

In order to test our theoretical results, we consider a diluted p-spin model (random XOR-SAT problem) on a random graph in the presence of frozen spins and perform extensive numerical simulations to study the finite size scaling close to the critical point. The simulations on large systems fully confirm our analysis, making us confident that the one-loop result indeed holds to all orders.

In section 2 we present the theoretical analysis and in section 3 the numerical simulation. We then conclude the letter in section 4. An appendix is devoted to the technical details of the theoretical computations.

#### 2. Analysis

Our starting point is the replica field theory [17, 18]

$$\mathcal{L} = \frac{1}{2} \int dx \left( \sum_{ab} (\nabla \phi_{ab})^2 + m_1 \sum_{ab} \phi_{ab}^2 + m_2 \sum_{abc} \phi_{ab} \phi_{ac} + m_3 \sum_{abcd} \phi_{ab} \phi_{cd} \right)$$

$$- \frac{1}{6} \omega_1 \operatorname{Tr} \phi^3 - \frac{1}{6} \omega_2 \sum_{ab} \phi_{ab}^3,$$

$$(1)$$

where the field  $\phi_{ab}(x)$  is an  $n \times n$  space dependent matrix order parameter with vanishing diagonal terms, describing the fluctuations of the correlation function around its plateau value. Among all possible cubic replica invariants we have retained only the ones giving rise to the leading and possible next to leading singular behavior. It has been shown in [2] that in the limit  $n \to 1$  the theory describes fluctuations close to the dynamical transition, which occurs for  $m_1 \to 0$  (while  $m_2$  and  $m_3$  remain finite).

According to the discussion in [2], the components of the matrix  $\phi_{ab}$  do not share a unique scaling dimension. Similarly to what was found in the RFIM problem [19], in order to use dimensional analysis one needs to change basis and define linear combinations  $\phi$ ,  $\omega$  and  $\chi_{ab}$  of the  $\phi_{ab}$  that exhibit good scaling properties. The actual linear transformation

reads

$$\phi_{ab} = \left(\phi - \frac{1}{2}\omega\right)\left(1 - \delta_{ab}\right) + U_{ab}\omega + \chi_{ab},\tag{2}$$

where  $U_{ab} = \delta_{a,a-(-1)^a}$  is a size two band matrix and  $\chi_{ab}$  is a symmetric matrix null on the diagonal and such that

$$\sum_{b} \chi_{ab} = 0 \qquad \text{for all } a \sum_{ab} U_{ab} \chi_{ab} = 0.$$
 (3)

The analysis of the resulting quadratic form (see below) shows that  $\phi$ ,  $\omega$  and  $\chi_{ab}$  have well defined scaling dimensions  $D_{\phi}$ ,  $D_{\omega}$  and  $D_{\chi}$  that, fixing the dimension  $D_{m_1} = 1$ , verify  $D_{\omega} = D_{\phi} + 1$  and  $D_{\chi} = D_{\phi} + \frac{1}{2}$ . Fixing the dimension of  $\phi$  by the condition that the action is adimensional one finds  $D_{\phi} = D/4 - 1$ . Notice that if the normalization of the dimension were to be fixed by the condition that the dimension of the momentum is one, we should multiply all dimensions by a factor two.

In terms of the new fields, keeping only the terms giving rise to the leading singularities in perturbation theory and sending  $n \to 1$ , one finds that (1) is equivalent to the Parisi–Sourlas action [20]

$$\mathcal{L} = \int dx \frac{1}{2} (m_2 + m_3) \omega^2 + \omega \left( -\Delta \phi + m_1 \phi + 3g \phi^2 \right) + \frac{1}{2} \sum_{a,b} \chi_{ab} \left( -\Delta + m_1 + 6g \phi \right) \chi_{ab}, \quad (4)$$

where the matrix of fields  $\chi_{ab}(x)$  has (n-1)(n-2)/2-2 independent components. These fields enter quadratically in (4). Explicit integration over them gives rise to a determinant to the power that tends to -2 for  $n \to 1$  and is equivalent to the one generated by fermion fields. The cubic vertex has a coupling constant  $g = \omega_1 - \omega_2$ , it has scaling dimension D/4-2 and becomes relevant below dimension 8.

In different systems the various parameters appearing in the action are functions of the physical control parameters, e.g. temperature and pinning field amplitude, or fraction of blocked particles. At the critical point one has  $\omega_1 = \omega_2$ , the cubic coupling constant g is equal to zero and sub-leading singular vertices need to be considered in the Landau free-energy expansion. We should therefore consider quartic terms and sub-leading cubic ones. Dimensional analysis, through repeated use of (2), shows that among all possible quartic replica symmetric invariants, the most singular ones are<sup>3</sup>

$$u_1 \operatorname{Tr} \phi^4 + u_2 \sum_{ab} \phi_{ab}^4 + u_3 \sum_{abc} \phi_{ab}^2 \phi_{ac} \phi_{cb}.$$
 (5)

After the change of basis (2), the leading terms (lowest scaling dimension) of (5) give rise to the RFIM terms

$$(u_1 + u_2 - u_3) \left[ \omega \phi^3 + 2\phi^2 \sum_{ab} \chi_{ab}^2 \right]. \tag{6}$$

The scaling dimension of this vertex is D/2-3, which thus becomes relevant below 6 dimensions. In addition, one needs, in principle, to consider the cubic vertices that do not vanish for  $\omega_1 = \omega_2$ . Among these, the ones of higher scaling dimension are  $\text{Tr }\chi^3$  and  $\sum_{ab}\chi_{ab}^3$ , which for  $\omega_1 = \omega_2$  give rise to the term  $\omega_1(\text{Tr }\chi^3 + \sum_{ab}\chi_{ab}^3)$ . This term does not

<sup>&</sup>lt;sup>3</sup> We thank T Rizzo and L Leuzzi for pointing out a contribution to us that we had previously neglected.

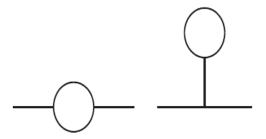


Figure 2. One-loop self-energy diagrams of a generic cubic theory.

have evident reasons to vanish. Its superficial scaling dimension (when multiplied by  $d^D x$ ) is  $D/4 - \frac{3}{2}$  and in the absence of additional cancellations it would also become relevant below 6 dimensions. The relevance of these vertices would spoil the equivalence with the RFIM at the critical point.

In order to investigate the possible relevance of these terms in the action we could, in principle, analyze their contribution to the correlation functions of the various fields in perturbation theory. To do this one needs to take into account the constraints (3) which give rise to some cumbersome combinatorics.

We have preferred, therefore, to turn back to the original replica field theory (1) and compute the exact contribution of the cubic vertices to the self-energy and to the correlation functions to the one-loop level. The diagrams contributing to the self-energy of a generic cubic theory are depicted in figure 2, they are the diagrams irreducible against cuts that separate the ending points [21].

The structure of the bare propagator of the theory in momentum space induced by replica symmetry is

$$G_{ab;cd}(k) = (1 - \delta_{ab})(1 - \delta_{cd}) \left[ g_1(k) \frac{\delta_{ac}\delta_{bd} + \delta_{ad}\delta_{bc}}{2} + g_2(k) \frac{\delta_{ac} + \delta_{bd} + \delta_{ad} + \delta_{bc}}{4} + g_3(k) \right],$$
(7

where the three coefficients  $g_i(k)$ , i = 1-3, can be expressed as functions of the mass parameters  $m_i$  appearing in the action (1), in the limit  $n \to 1$ ,

$$g_1(k) = \frac{2}{m_1 + k^2},\tag{8}$$

$$g_2(k) = \frac{4m_2}{(m_1 + k^2)(-2(m_1 + k^2) + m_2)},\tag{9}$$

$$g_3(k) = \frac{2(-2m_3(m_1 + k^2) + m_2(m_2 + m_3))}{(m_1 + k^2)^2(2(m_1 + k^2) - m_2)}.$$
(10)

Notice that while  $g_1$  and  $g_2$  have a simple pole behavior for small k and  $m_1$ ,  $g_3$  has a double pole.

Given the structure of the propagator and the vertices, direct manual evaluation of the self-energy diagrams to include the sub-leading order is rather awkward. The formal expression of the diagrams of figure 2 is given in the appendix. Fortunately, the computation of the diagrams, which basically involves sums of constants and delta functions over replica indices and momentum integration, can be fully automatized. We

have achieved this goal using the algebraic manipulator Mathematica, defining functions that implement the Kronecker delta on the one hand and the sum of constants and delta functions on the other. In order to compute the contribution to the correlation function one needs to further multiply the resulting expression to the right and to the left by the bare propagator, which can also be carried out by automatic means.

The result for the corrections to the correlation function can be cast in a form similar to the one of the bare propagator (7), parametrized by three numbers  $r_1, r_2, r_3$  analogous to the gs of (7). The resulting expressions, available upon request, are rather lengthy and we do not reproduce them here. For  $\omega_1 \neq \omega_2$  the leading singularity behaves as  $m_1^{D/2-6}$ , with corrective terms of order  $m_1^{D/2-5}$  and higher. Comparing the leading contribution with the behavior of the bare propagator  $m_1^{-2}$  one sees that, as already found with the  $\phi^3$ -RFIM mapping of [2], non-Gaussian fluctuations become important below dimension 8. For  $\omega_1 = \omega_2$  the leading terms vanish. Remarkably, the computation shows that at the same time the corrective terms of order  $m_1^{D/2-5}$  also vanish. In fact these contributions are proportional to  $\omega_1 - \omega_2$ . The first non-vanishing contributions are of order  $m_1^{D/2-4}$ . These are irrelevant down to dimension 4, as opposed to the quartic RFIM contribution which becomes relevant in dimension 6.

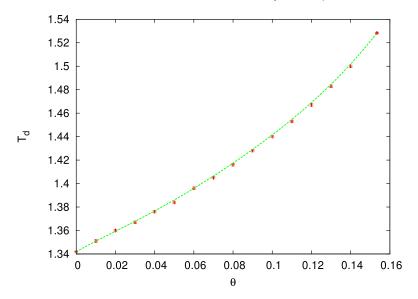
This result proves the  $\phi^4$ -RFIM mapping to the one-loop order in perturbation theory. Although we believe the result to be valid to all orders, the general mechanism for cancellation of the contribution of the cubic vertices remains to be found. It would be tempting to think that for  $n \to 1$  the fields  $\chi_{ab}(x)$  in (2) verify fermionic algebraical relations that go beyond the simple identification of the replica determinant with the fermionic one that was used in [2].

# 3. Simulations

In order to check whether the universality class of the terminal critical point is that of a  $\phi^4$ -RFIM we have simulated the 3-spin model on a random regular graph with fixed degree z=8. The Hamiltonian of the model is

$$\mathcal{H} = -\sum_{\mu=1}^{zN/3} J_{\mu} S_{i_1^{\mu}} S_{i_2^{\mu}} S_{i_3^{\mu}},$$

where  $S_i = \pm 1$  are N Ising variables and the zN indices  $\{i_1^{\mu}, i_2^{\mu}, i_3^{\mu}\}$  are randomly chosen such that each variable appears exactly z times and each interaction involves three different variables. The couplings are independent random binary variables, generated according to  $\mathbb{P}(J_{\mu}=1)=r$  and  $\mathbb{P}(J_{\mu}=-1)=1-r$ . In the thermodynamical limit, the model has been solved with the cavity method [22] and presents a dynamical phase transition at a temperature  $T_{\rm d}=1.3420(5)$  [2], followed by the Kauzmann ideal glass transition at a lower temperature  $T_{\rm K}$ . As long as  $T>T_{\rm K}$ , the thermodynamical and dynamical properties of the model do not depend on the choice of the coupling bias r, because almost any coupling configuration has the same free energy, thanks to the fact that the annealed average equals the quenched one  $(\log \mathbb{E}_J Z_J = \mathbb{E}_J \log Z_J)$ . In particular, we can choose the couplings according to the Nishimori prescription [23] that corresponds to  $r=(1+\tanh\beta)/2$ . This choice has the great advantage that the all-spin-up configuration  $S_i=1$  is an equilibrium configuration and we can use it as the starting configuration for



**Figure 3.** The dynamical critical line as a function of the fraction  $\theta$  of frozen variables in the 3-spin model on a random regular graph with a fixed degree z = 8. Critical temperatures are shown with errors; the curve is just a guide for the eyes, not a fit.

the study of the equilibrium dynamics and also as the initial configuration for a Monte Carlo simulation, which does not require thermalization [24].

#### 3.1. Phase diagram with frozen variables

We are interested in studying the 3-spin model defined above, when a fraction  $\theta$  of variables are frozen to an equilibrium configuration (the all-spin-up configuration in the present case). The phase diagram in the  $(\theta, T)$  plane resembles closely the one derived in [13, 14] for the 3-XORSAT model<sup>4</sup> in the  $(\theta, \alpha)$  plane (see figure 3 in [14]). It is also very similar to the one derived in [15] for the spherical 3-spin model.

In figure 3 we show the numerical data for the dynamical critical temperatures as a function of  $\theta$  obtained by the cavity method. All the critical points shown (except for the terminal point that we discuss in the following) have been obtained by looking at the overlap with the reference equilibrium configuration ( $S_i = 1$ ): the dynamical critical temperature corresponds to the negative jump in this overlap when the temperature is slowly increased.

A much more careful discussion requires the determination of the terminal critical point, which we estimate to be located at  $\theta_{\rm c} = 0.1534(2)$  and  $T_{\rm c} = 1.5277(5)$ . Indeed, at the terminal critical point the phase transition is no longer of first order and there is no jump in the overlap with the reference configuration to be exploited (even for  $\theta < \theta_{\rm c}$  but close to the terminal point the jump is so small that it is not useful for the estimation of the transition location). In contrast, for  $\theta > \theta_{\rm c}$  the model has no phase transition at

<sup>&</sup>lt;sup>4</sup> The 3-XORSAT model is nothing but the 3-spin model on a random graph of mean degree  $3\alpha$  at T=0. Phase transitions take place and vary  $\alpha$ , which plays the same role as the temperature in thermal models.

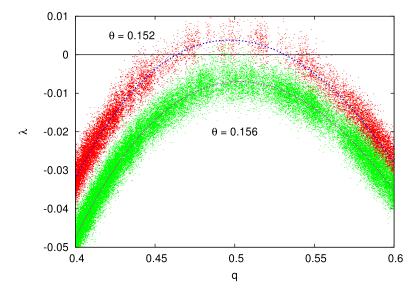


Figure 4. The stability parameter  $\lambda$  as a function of the overlap q with the reference configuration for two values of the fraction of frozen variables,  $\theta=0.512$  and 0.156. The data points are from fixed point distributions measured at several different temperatures around the critical one. The curves are the best fitting quartic polynomials. The data at  $\theta=0.152$  show a discontinuous transition, while the data at  $\theta=0.156$  show the absence of any critical point. In this plot, the terminal critical point  $\theta_{\rm c}$  would correspond to a maximum  $\lambda$  value equal to 0.

all and one can at most look at the precursors of the continuous phase transition taking place at the terminal critical point.

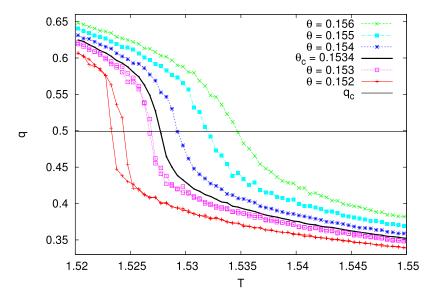
The problem of locating the terminal critical point with high accuracy is delicate and we have followed a method based on solving the cavity equations in population, while looking at the instability parameter  $\lambda$ . More precisely, we ran the belief propagation (BP) algorithm to determine the fixed point distribution of cavity magnetizations P(m) that solves the equation

$$P(m) = \theta \delta(m-1) + (1-\theta) \mathbb{E}_J \int \prod_{i=1}^{z-1} P(m_1^i) \, dm_1^i P(m_2^i) \, dm_2^i$$

$$\times \delta \left( m - J \frac{\prod_i (1 + t_\beta m_1^i m_2^i) - \prod_i (1 - t_\beta m_1^i m_2^i)}{\prod_i (1 + t_\beta m_1^i m_2^i) + \prod_i (1 - t_\beta m_1^i m_2^i)} \right),$$

where  $t_{\beta} = \tanh(\beta)$ . Then we computed the local stability of the fixed point distribution by adding a small perturbation to each element m of the population and checking whether such a perturbation grows or decreases under BP iterations: the stability parameter  $\lambda$  is defined such that the perturbation goes like  $e^{\lambda t}$  for large times t. Therefore, the fixed point is stable only if  $\lambda < 0$ . In a discontinuous transition the condition  $\lambda = 0$  identifies the spinodal points where the two states becomes locally unstable, while in a continuous transition the condition  $\lambda = 0$  marks the unique critical point.

In figure 4 we show the stability parameter  $\lambda$  as a function of the overlap q with the equilibrium reference configuration. For each value of  $\theta$ , the plot contains a few tens of thousands of points measured at different temperatures around the critical one (both



**Figure 5.** The average value for the overlap with the equilibrium reference configuration as a function of the temperature for several  $\theta$  values. The lowest dataset shows a clear hysteresis cycle at the first order phase transition. The data plotted with a black line have been measured at the critical  $\theta_c$ . The horizontal line is the critical value for the overlap.

above and below the critical temperature). The noise in the data is due to the stochastic nature of the BP algorithm and to fluctuations related to the finiteness of the population (we have used populations of sizes  $10^6$ ). It is worth stressing that  $\lambda$  mainly depends on q, while its dependence on the temperature is rather weak; indeed figure 4 shows data measured at different temperatures that lie on the same curve. The interpolating curves shown in figure 4 are quartic polynomials.

For  $\theta = 0.152$  the model undergoes a discontinuous phase transition: the two q values for which  $\lambda = 0$  bracket an interval where no state can exist in the thermodynamical limit (since it would be locally unstable); by varying the temperature, the thermodynamic overlap has a jump not smaller than the size of this interval. Moreover, the larger overlap where  $\lambda = 0$  is the plateau value at the dynamical critical temperature  $T_{\rm d}$ . For  $\theta = 0.156$  the stability parameter  $\lambda$  never becomes positive and consequently the model has a unique paramagnetic phase and no phase transition. The  $\theta_{\rm c}$  value of the terminal critical point is clearly in between these two  $\theta$  values and for  $\theta = \theta_{\rm c}$  the  $\lambda(q)$  function must have a maximum of height  $\lambda = 0$ . The quartic interpolations shown in figure 4 allow us to obtain a reliable estimate of the position and height of the maximum of the function  $\lambda(q)$  for each  $\theta$  value. Fitting these maxima we then arrive at the following estimates for the terminal critical point:  $\theta_{\rm c} = 0.1534(2)$  and  $q_{\rm c} = 0.499(1)$ .

A reliable way to estimate the temperature of the terminal critical point is by plotting the average overlap as a function of the temperature for  $\theta$  values at and around  $\theta_c$  (see figure 5). In this way we can estimate  $T_c$  as the temperature at which the average overlap measured at  $\theta_c$  reaches the critical value  $q_c$ . The uncertainty on this value comes both from the statistical error in this fitting procedure and from the propagation of the uncertainty on the value  $\theta_c$ . In figure 5 we plot data for several  $\theta$  values such that one can appreciate how

much the average overlap changes by varying  $\theta$ . The final estimate for the temperature of the terminal critical point is  $T_c = 1.5277(5)$ . The error is mainly given by the uncertainty on the value of  $\theta_c$ .

#### 3.2. Fluctuations at the terminal critical point

Once we had obtained a reliable estimate for the location of the terminal critical point,  $\theta_{\rm c} = 0.1534(2)$  and  $T_{\rm c} = 1.5277(5)$ , we ran extensive Monte Carlo simulations for these critical parameters. We simulated sizes up to  $N = 3 \times 10^4$ . For each size, except the largest, we simulated  $10^4$  different samples (for the largest size only 2500 samples were used). Thermalization is not an issue, given that the all-spin-up configuration is an equilibrium configuration by construction.

As already discussed in detail in [2], there are three different sources of randomness in this model: the coupling configuration, the starting equilibrium spin configuration and the thermal noise. Thanks to the fact that the annealed approximation is exact in this model above  $T_{\rm K}$ , in the thermodynamical limit every sample behaves in exactly the same way when the average over starting configurations and thermal noise is performed. However, we do not take the average over many initial spin configurations, and we only use  $S_i=1$  as the starting configuration to avoid thermalization. Therefore, the average over the many coupling configurations we consider does actually correspond to the average over the initial spin configurations: indeed we could gauge transform each sample in order to have roughly the same couplings and the initial spin configuration would change from sample to sample.

Therefore, we are left with only two sources of randomness: heterogeneities in the initial configuration (het) and thermal noise (th). Using angular brackets for the thermal average and square brackets for the average over the initial spin configurations, two different susceptibilities can be defined as follows:

$$\chi_{\rm th} = N \left[ \langle q^2 \rangle - \langle q \rangle^2 \right], \tag{11}$$

$$\chi_{\text{het}} = N\left(\left[\langle q \rangle^2\right] - \left[\langle q \rangle\right]^2\right),\tag{12}$$

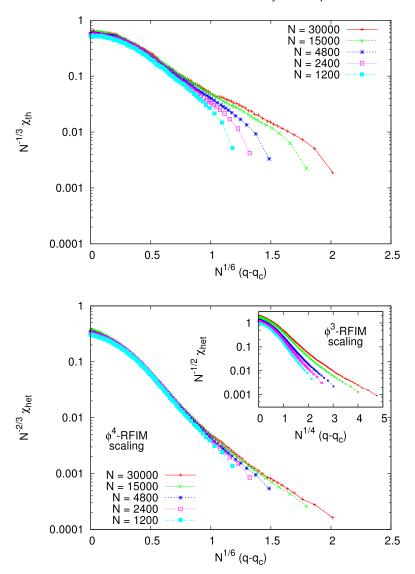
where the former measures thermal fluctuations within the same sample (averaged over the samples), while the latter quantifies sample to sample fluctuations in the mean value of q (which is as usual the overlap with the equilibrium reference configuration). The total susceptibility is the sum of the two:  $\chi_{\text{tot}} = N([\langle q^2 \rangle] - [\langle q \rangle]^2) = \chi_{\text{th}} + \chi_{\text{het}}$ .

A dimensional analysis of the action of the  $\phi^4$ -RFIM leads straightforwardly to the following scaling relations for the susceptibilities:

$$\chi_{\rm th} = N^{1/3} \hat{\chi}_{\rm th} \left( N^{1/6} (q - q_{\rm c}) \right),$$
(13)

$$\chi_{\text{het}} = N^{2/3} \hat{\chi}_{\text{het}} \left( N^{1/6} (q - q_c) \right).$$
(14)

In figure 6 we show the data collapse using the theoretically predicted exponents. We can see that the scaling for the largest fluctuations,  $\chi_{\text{het}}$ , is very well verified, while some corrections to the scaling are still present in the data for the thermal fluctuations at the sizes we have simulated.



**Figure 6.** Fluctuations over the thermal noise  $\chi_{\rm th}$  (top) and the initial heterogeneities  $\chi_{\rm het}$  (bottom) rescaled according to the exponents predicted by a  $\phi^4$ -RFIM theory. For comparison, in the inset we plot the same quantity using the scaling appropriate for the  $\phi^3$ -RFIM. The data have been measured at the terminal critical point of the diluted 3-spin model by Monte Carlo simulations.

# 4. Summary

Summarizing, we have found that the replica field theory of glasses predicts that fluctuations close to glassy critical points can be mapped into the random field Ising model. This observation calls for the search for glassy critical points in liquid systems. In simulations one can use the method of a pinning field or blocking a fraction of the particles. In experiments critical points could be found in liquids confined by porous media.

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# **Appendix**

This appendix is devoted to the explanation of some technical details of the evaluation of the one-loop corrections to the propagator.

The diagrams that we need to evaluate are conceptually simple, but practically complicated by the presence of the replica indices in the propagator and the vertices which we write as

$$G_{ab;cd}(k) = (1 - \delta_{ab})(1 - \delta_{cd}) \left[ g_1(k) \frac{\delta_{ac}\delta_{bd} + \delta_{ad}\delta_{bc}}{2} + g_2(k) \frac{\delta_{ac} + \delta_{bd} + \delta_{ad} + \delta_{bc}}{4} + g_3(k) \right],$$

$$(A.1)$$

$$\Gamma_{ab;cd;ef} = \mathbf{S} [\omega_1 \delta_{ac}\delta_{ae}\delta_{bd}\delta_{be} + \omega_2 \delta_{bc}\delta_{de}\delta_{fa}],$$

$$(A.2)$$

where **S** denotes symmetrization against exchange of indices in each couple (ab), (cd) and (ef) and exchange of the couples among themselves. The first self-energy diagram reads

$$\Sigma_{ab;cd}^{(1)}(k) = \int dq \, \mathbf{S} \left( \omega_1^2 \sum_{e,f} G_{ae;cf}(q) G_{be;df}(k+q) + \omega_1 \omega_2 \sum_{e} [G_{ae;cd}(q) G_{be;cd}(k+q) + G_{ab;ce}(q) G_{ab;de}(k+q)] + \omega_2^2 G_{ab;cb}(q) G_{ab;cb}(k+q) \right); \tag{A.3}$$

the second one is

$$\Sigma_{ab;cd}^{(2)}(k) = \mathbf{S} \int dq \Big( \omega_1^2 \sum_{e,f,g} G_{ef;fg}(q) G_{eg;ac}(0) \delta_{bd} + \omega_2^2 \sum_{e,f} G_{ef;ef}(q) G_{ef;ab}(0) \delta_{ac} \delta_{bd} + \omega_1 \omega_2 \sum_{e,f,g} G_{ef;fg}(q) G_{eg;ab}(0) \delta_{ac} \delta_{bd} + \omega_1 \omega_2 \sum_{e,f} G_{ef;ef}(q) G_{ef;ac}(0) \delta_{bd} \Big).$$
 (A.4)

In order to compute the correction to the propagator the one-loop self-energy  $\Sigma_{ab;cd}^{1L}(k)$  should be multiplied to the right and to the left by the bare propagator,

$$\delta G_{ab;cd}(k) = \sum_{a',b',c',d'} G_{ab;a'b'}(k) \Sigma_{a'b';c'd'}^{1L}(k) G_{c'd';cd}(k). \tag{A.5}$$

The whole calculation involves sums of constants and delta functions over replica indices. In order to avoid mistakes we have automatized the calculation through the use of the software Mathematica. The commented worksheet used in the calculation is available as supplementary material from stacks.iop.org/JSTAT/2013/L02001/mmedia.

#### References

- [1] Berthier L, Biroli G, Bouchaud J-P, Cipelletti L and van Saarloos W (ed), 2011 Dynamical Heterogeneity in Glasses, Colloids and Granular Media (Oxford: Oxford University Press)
- [2] Franz S, Ricci-Tersenghi F, Rizzo T and Parisi G, 2011 Eur. Phys. J. E 34 102 Franz S, Ricci-Tersenghi F, Rizzo T and Parisi G, 2011 arXiv:1105.5230
- [3] See e.g. Götze W, 2009 Complex Dynamics of glass forming liquids. A Mode-Coupling Theory (Oxford: Oxford University Press)
- [4] Sellitto M, De Martino D, Caccioli F and Arenzon J J, 2010 Phys. Rev. Lett. 105 265704 Sellitto M, 2012 Phys. Rev. E 86 030502(R)
- [5] Crisanti A and Sommers H-J, 1992 Z. Phys. B 87 341
- [6] Krakoviack V, 2010 Phys. Rev. E 82 061501
- [7] Franz S, Parisi G, Ricci-Tersenghi F, Rizzo T and Urbani P, 2012 arXiv:1211.1616
- [8] Krakoviack V, 2005 Phys. Rev. Lett. 94 065703
   Krakoviack V, 2011 Phys. Rev. E 84 050501(R)
- [9] Franz S and Parisi G, 1997 Phys. Rev. Lett. **79** 2486
- [10] Cardenas M, Franz S and Parisi G, 1998 J. Phys. A: Math. Gen. 31 L163 Cardenas M, Franz S and Parisi G, 1999 J. Chem. Phys. 110 1726
- [11] Franz S and Parisi G, 1998 Physica A **261** 317
- [12] Berthier L and Kob W, 2012 Phys. Rev. E 85 011102
- [13] Montanari A, Ricci-Tersenghi F and Semerjian G, Solving constraint satisfaction problems through belief propagation-guided decimation, 2007 Proc. 45th Annual Allerton Conf. on Communication, Control, and Computing (Monticello, IL) p 352
- [14] Ricci-Tersenghi F and Semerjian G, 2009 J. Stat. Mech. P09001
- [15] Cammarota C and Biroli G, 2012 Proc. Nat. Acad. Sci. 109 8850 Cammarota C and Biroli G, 2012 arXiv:1210.8399
- [16] For a review, see Nattermann T, 1998 Spin Glasses and Random Fields (Singapore: World scientific) p 277
- [17] Temesvari T, De Dominicis C and Pimentel I R, 2002 Eur. Phys. J. B 25 361
- [18] Campellone M, Parisi G and Ranieri P, 1999 Phys. Rev. B 59 1036
- [19] Cardy J, 1983 Phys. Lett. B 125 470
   Cardy J, 1985 Physica D 15 123
- [20] Parisi G and Sourlas N, 1979 Phys. Rev. Lett. 43 744
- [21] Coleman S and Glashow S, 1964 Phys. Rev. 134 B671
- [22] Ricci-Tersenghi F and Montanari A, 2004 Phys. Rev. B 70 134406
- [23] Nishimori H, 1980 J. Phys. C: Solid State Phys. 13 4071
- [24] Krzakala F and Zdeborova L, 2011 J. Chem. Phys. 134 034512
   Krzakala F and Zdeborova L, 2011 J. Chem. Phys. 134 034513