# 2D SG Partition Functions

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Work in collaboration with A. Galluccio, J. Lukic, O. C. Martin and G. Rinaldi (cond-mat 0309238, in print on PRL). Compute (many) exact partition functions of (large) 2D Ising SG,  $J=\pm 1$  with PBC. Galluccio, Löbl and Vondrák: Pfaffians, modular arithmetics, Chinese remainder theorem. Results:

- Solve dispute. Physical scaling as  $\beta \longrightarrow \infty$   $c_V \sim \beta^2 e^{-2\beta}$  (anomalous, see 1D Ising).
- $\xi \sim e^{\beta}$ , and hyperscaling works.
- Ground state properties ( $\theta^E = \theta_{DW} = 0$  etc...).
- Number of excitations (possible mechanism for anomalous scaling).
- MKA anomalous scaling (to be published).

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# Summary

- Spin glasses, 2D Ising spin glasses. The quenched physics.
- T = 0 and low T physics. Choice of couplings and "universality".
- Monte Carlo versus ground states computations. Computations of  $Z_{\beta}$ .
- The dispute: Swendsen and Wang with (optimized) Monte Carlo versus Kardar-Saul with exact transfer matrix.
- The Galluccio-Löbl-Vondrák algorithm.
- Our findings. The anomalous scenario.

SG: frustration + disorder (complexity)

Quenched averages

$$H = -\sum_{ ext{nn } i,j} J_{ij} \sigma_i \sigma_j$$

couplings  $J_{ij}$  are random quenched.

Huge interest:

- 1. Parisi solution of mean field SK theory.
- 2. paradigmatic role (boring as materials, as such).

Open debate on behavior in finite D.

"For sure":  $D_c^L \ge 2$ , no transition in 2D for T > 0.

As  $T \longrightarrow 0$ : scaling theory. Coarse graining and scaling Ansatz.

$$\tilde{J}(l) \sim l^{\theta}$$

effective coupling among (block) spins at large distance.

2D:  $\theta < 0$  (and/or zero, see later). Coupling becomes weaker at large scale, and the ordered state is unstable and breaks down.

Typical choices for the probability distribution of quenched couplings:  $P(J) \sim \exp(-J^2/2)$  or  $J = \pm 1$  with uniform probabilities, or many other possibilities (but equivalent, see later).

In 2D this can play (and does play) a role in deciding the "critical behavior" as  $T \longrightarrow 0$  (see C. Amoruso, EM, O. Martin and A. Pagnani, PRL **91** (2003) 087201).

Starting point is

$$\delta E \equiv E_{GS}^{(P)} - E_{GS}^{(AP)}$$
and as  $L \longrightarrow \infty$ 

$$\overline{\left(\delta E - \overline{\delta E}\right)^2} \sim L^{2\theta}$$

While for Gaussian J one has  $\theta = -0.28$  for binary couplings one finds clearly (Hartmann and Young)  $\theta = 0$ .

We find that all P(J) which can only produce quantized energies give  $\theta = 0$ , while all distribution that can generate continuous energies without a gap give  $\theta \simeq -0.28$  (even if for example are built on only two coupling values, but with an irrational ratio).

- 1.  $D \leq D_c^L \Longrightarrow \text{small } \delta E$  values are relevant for the large distance behavior of the system  $\Longrightarrow$  gap in coupling distribution can play a role.
- 2.  $\theta_{(D)} = 0$  does only mean  $D \leq D_c^L$ , not  $D = D_C^L$ .

Monte Carlo versus Ground State computations.

- 1. MC for Spin Glasses is very difficult.

  "Naive" MC is basically of no use. High free energy barriers make impossible exploring the full phase space.

  Optimized Monte Carlo (multicanonical.)
  - Optimized Monte Carlo (multicanonical, replica MC, parallel tempering) helps.
  - Still: it is difficult to go at low T. You are never sure you thermalized...
- 2. Computing GS you study directly T=0 physics. No problems with thermalization. Main problem: what do you learn, say, about finite T physics? (it seems it works...).
- 3. A third approach: compute directly the full partition function. "Best of both worlds" (but: depending on the algorithm only reach some observables) (but: can only do it in some models, see later...).

#### The dispute

Saul and Swendsen (PRL **38** (1988) 4840) after a very accurate optimized MC simulation claimed to detect an anomalous scaling behavior.

2D Ising Spin Glass,  $J = \pm 1$ , Periodic Boundary Conditions.  $V=128^2$ 

$$c_V \sim \beta^2 e^{-A\beta}$$
 ,  $A = 2$  .

Would expect A = 4, since minimal excitation costs 4J.

Periodic Boundary Conditions 1D Ising model analogy. Minimal excitation is 4J, since  $\downarrow \uparrow \downarrow$ 



kink - antikink

Still, an easy computation gives  $c_V \sim \beta^2 e^{-2\beta}$ .

Now. With fixed boundary conditions minimal excitation only costs 2J.



#### kink

But infinite volume limit does not depend on boundary conditions... Answer: kink-antikink excitation is no elementary. Notice that there are too many of them,  $O(V^2)$ .

 $T \longrightarrow 0$ , V fixed: eventually find  $e^{-4\beta}$ . But scaling limit, small T and large V:  $e^{-2\beta}$ .

Kardar and Saul, NP B **432** (1994) 641. They reanalyzed the problem by computing exactly the full partition function. 2D Ising Spin Glass with PBC,  $J=\pm 1$ .

They follow Kac and Ward:

1. From high T expansion, in terms of closed graphs on the square lattice (including graphs wrapping around the lattice).

$$Z = 2^{V} \left(\cosh(\beta J)\right)^{2V} \sum_{c:B} A_{B} \tanh(\beta J)^{B}$$

where the sum is on closed graphs with B bonds.

2. Kac-Ward  $\longrightarrow$  the problem is rephrased in a local random walk with non-trivial weights.  $4V \times 4V$  hopping matrix.

PBC: need four matrices (see later Galluccio-Löbl theorem for graphs of bounded genus). In this case one finds (Potts-Ward, 1955):

$$Z = \frac{1}{2} \left( -Z_1 + Z_2 + Z_3 + Z_4 \right)$$

$$Z_{\lambda} = 2^{V} \left(\cosh(\beta J)\right)^{V} \sqrt{\det(1 - U_{\lambda} \tanh(\beta J))}$$

 $U_{\lambda}$ : 4 different hopping matrices, of size  $4V \times 4V$ .

So:  $\{J_{ij}\}\longrightarrow$  four matrices  $U_{\lambda}\longrightarrow$  traces of  $U_{\lambda}^{W}$  for  $W \leq V \longrightarrow$  polynomial in  $e^{-\beta}$ , density of states  $\longrightarrow$   $Z = \sum_{E} N(E) e^{-\beta E}$ .

Lot of precautions to deal with large numbers (Kardar and Saul also compute zeroes of Z).

Polynomial time estimated roughly as  $\sim V^{3.2}$ .

They have basically:

| L     | S    |                                      |
|-------|------|--------------------------------------|
| 4-8   | 8000 | and few samples for larger lattices. |
| 10-14 | 2000 |                                      |
| 16-18 | 800  |                                      |

This turns out to be too small...

So, they disagree with Swendsen-Wang, and claim

$$c_V \sim \beta^3 e^{-4\beta}$$

(note the anomalous power, see fully frustrated Ising model in 2D).

Number of excitations looks smaller than in 1DIsing. Claim is here that

$$\log V < S_1 - S_0 < \log V^2$$

But, again, the authors notice (as a sign of severe warning) that they cannot clearly detect the asymptotic behavior.

Our approach (Galluccio, Löbl and Vondrák PRL 84 (2000) 5924)

Similar to Kardar-Saul, but many further:

- 1. theoretical results
- 2. technical improvements

### Summary:

 $Z_{eta}^{ISG2D} \longrightarrow {
m generating} \ {
m function} \ {
m of} \ {
m cuts}$  Galluccio-Löbl: it is possible to solve the Max Cut problem in polynomial time for any graph of genus bounded by a constant. The method provides directly the generating function of cuts.

- → Eulerian subgraphs
  - → perfect matching
- $\longrightarrow$  (on graphs of bounded genus) Pfaffian computation (square root of the determinant of an antisymmetric matrix). Need  $4^g$  Pfaffians.
- compute Pfaffian by using modular arithmetics (no need for infinite precision).
  - use the Chinese Remainder Theorem to reconstruct the exact partition function.

Cut of a graph G = (V, E) (vertices, edges) is a partition of its vertices into two disjoint subsets  $V_1, V_2 \subset V$  and the implied set of edges between the two parts (each edge can carry a weight  $w_e$ , and the total weight of the cut is w(C)).

Max Cut (min Cut): divide vertices in two parts so that total weight of edges between the two parts is max (min).

Generating function of cuts: polynomial

$$\sum_{\text{over all cuts}} x^{w(C)} .$$

Eulerian subgraph: set of edges U such that each vertex of V is incident with an even number of edges from U.

Perfect matching: set of edges P such that each vertex of V is incident with exactly one edge from P.

#### From Ising to Cuts

Assign spins to  $\overline{+1}$  or -1.  $V_{+} = \{i \in V | \sigma_{i} = +1\}$   $V_{-} = \{i \in V | \sigma_{i} = -1\}$ . Let  $C(V_{+}, V_{-})$  be the cut of spins +1 and -1.  $W \equiv \sum_{\{i,j\} \in E} J_{ij}$  is the sum of all edge weights in G.

$$H = \sum_{\{i,j\} \in C} J_{ij} - \sum_{\{i,j\} \in (E-C)} J_{ij} = 2w(C) - W$$

Let the generating function of cuts be

$$C(G, x) = \sum_{\text{cuts in G}} c_k x^{W(C)} ,$$

where  $c_k$  is the number of cuts with weight k.

$$Z(\beta) = \sum_{\{\sigma\}} e^{-\beta H} \simeq \sum_{\text{cuts}} e^{-2\beta w(C) + \beta V} \simeq e^{\beta V} \mathcal{C}(G, e^{-2\beta})$$

From cuts to Eulerian subgraphs

$$\mathcal{C}(G, e^{-2\beta}) \sim x^{\frac{V}{2}} \prod_{\{i,j\} \in E} \left( \frac{x^{\frac{w_{ij}}{2}} + x^{-\frac{w_{ij}}{2}}}{2} \right)$$

$$\mathcal{E} \qquad \left( G, \frac{x^{\frac{w_{ij}}{2}} - x^{-\frac{w_{ij}}{2}}}{x^{\frac{w_{ij}}{2}} + x^{-\frac{w_{ij}}{2}}} \right)$$

E: generating function of Eulerian subgraphs.

By the Fischer construction Eulerian subgraphs can be rewritten as a perfect matching problem.

- Kasteleyn for planar graphs
   Galluccio-Löbl for graphs of bounded genus
   Perfect matching can be translated to a Pfaffian computation (of 4<sup>g</sup> Pfaffian).
- Modular arithmetics. Work modulo some given prime number.

Theorem: Let P(x) be a polynomial of degree n with integer coefficients,  $\Phi(p)$  a finite field of size p > n, and  $x_0, x_1, \ldots x_n$  distinct elements of  $\Phi(p)$ . Then there exists a unique polynomial of degree n over  $\Phi(p)$  such that

$$Q(x_i) = P(x_i) \mod p, \quad i = 0, \dots, n$$
.

The coefficients of Q(x) are equal to the coefficients of P(x) mod p.

• The Chinese Remainder Theorem. If we work in a number large enough of fields, i.e.  $p_1, p_2, \ldots, p_k$  such that

$$\prod_{i=1}^{k} p_i > 2^n$$

we can reconstruct the exact polynomial, i.e. the exact partition function. Great!

### Summary of the Algorithm

1. Find prime numbers  $p_i$  such that

$$\prod_{i=1}^k p_i > 2^V .$$

For each of them repeat steps 2, 3, 4 performing all operations in  $\Phi(p_i)$ .

- 2. Select (m+1) distinct elements  $x_j$  of  $\Phi(p_i)$ . For each of them repeat step 3.
- 3. Write the  $4^g$  matrices encoding the relevant orientations of the modified graph. This gives  $Z_{\beta}$  (in the point  $e_{\beta} = x_i$ ).
- 4. From these values of  $Z_{\beta} \pmod{p_i}$  in given points interpolate in  $\Phi(p_i)$  and get the coefficients of the polynomial.
- 5. Apply the Chinese Remainder Theorem: compose the results from each  $\Phi(p_i)$  to get the full  $Z_{\beta}$ .

Complexity: O(V) finite fields, O(V) evaluations in each field (for edge weights bounded by a constant),  $O(V^{\frac{3}{2}})$  operations for a single evaluation of a polynomial  $\Longrightarrow$  Total  $O(V^{\frac{7}{2}})$ .

Technically this approach and implementation by GLR looks to a "naive beginner" like me full of very brilliant ideas.

## Main features:

- parallel;
- no problems with precision;
- basically only bound by CPU time, not by memory or word length;
- scaling  $V^{\frac{7}{2}}$ .

Our work. J. Lukic, A. Galluccio, EM, O. Martin, G. Rinaldi.

2D Ising Spin Glass, PBC,  $J = \pm 1$ .

## For example:

| L  | S      |
|----|--------|
| 6  | 400000 |
| 10 | 100000 |
| 30 | 10000  |
| 40 | 1000   |
| 50 | 300    |

(and similar values for different L values).

$$F_J(\beta) = -\frac{1}{\beta} \log Z_J(\beta) , \ U_J(\beta) = \langle H_J \rangle ,$$

$$c_V = L^{-2} \frac{dU_J}{dT} ,$$

and average over samples. We mainly look at  $c_V$  (irrelevant constants are already subtracted).

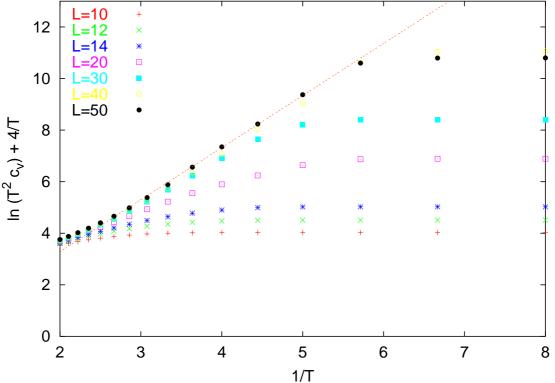
$$c_V \sim \beta^2 e^{-A\beta}$$

(we have checked that p = 2 is the best available choice for power corrections).

$$\log \frac{c_V}{\beta^2} \sim -A\beta$$

$$y \equiv \left(\log \frac{c_V}{\beta^2} + 4\beta\right) = (4 - A)\beta$$

So if we have naive scaling  $y \sim \text{constant}$  in the scaling regime. If not: slope is (4-A).



Small T: saturation at constant value.

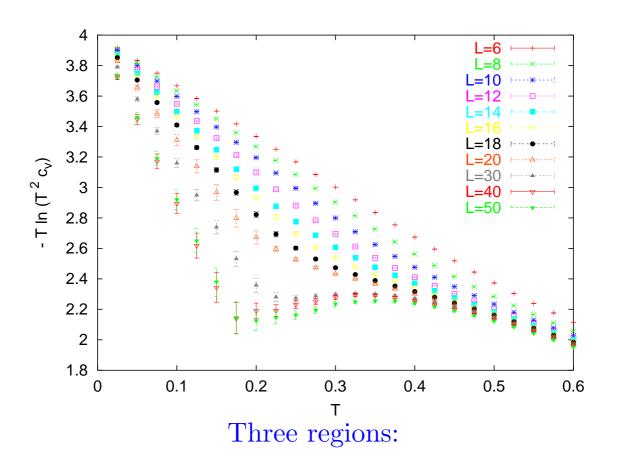
Intermediate  $T: A \sim 2$ .

Straight line: best fit  $\beta \in [2.5, 5.5]$  gives  $A = 2.02 \pm 0.03$ .

$$-T\log\left(T^2c_V\right) \sim A$$

So look at limit  $T \longrightarrow 0$ .

Very interesting scaling pattern.



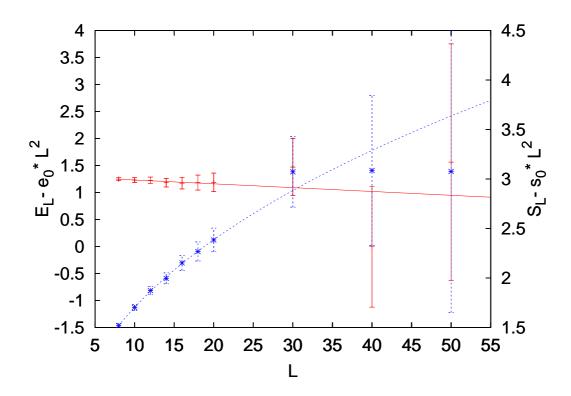
- high T "no scaling";
- low T A = 4 naive behavior;
- intermediate T, large lattices: A = 2.

## T=0 properties.

Lines in the plot are best fits.

$$e_0(L) = e_0^* + aL^{-2+\theta^e}$$

 $e_0^* = -1.4017(3)$ ,  $\theta^e = -0.08(7)$ . We see that as good evidence that  $\theta^e = \theta_{DW} = 0$  (Hartmann-Young).



$$s_0(L) = s_0^* + aL^{-2+\theta^s}$$

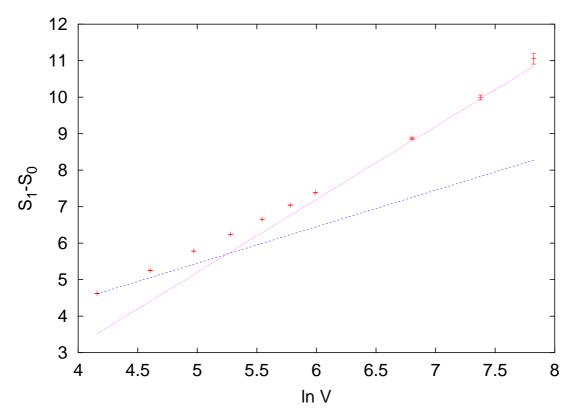
 $s_0^* = 0.0714(2)$  (most precise estimate available),  $\theta^s = 0.42(2)$ . Could be that  $\theta^s = 0.5$ .

# Anomalous density of excitations.

$$S_1 - S_0 = S(E_0 + 4J) - S(E_0)$$

Straight lines:  $\log V$ ,  $2 \log V$ .

On large lattices:  $2 \log V$  (Kardar-Saul could only see the transient behavior on smaller lattices).



4J excitations "not elementary" (following the 1D Ising model terminology)?

## Finite Size Scaling.

Difficult to fit from the numerical data the exact scaling law. We use two approaches.

1. For each L value we determine  $T^*(L)$  as the temperature where "something happens" (where the data separate from the envelope).

Scaling of such  $\xi(T)$  obtained by inverting  $T^*(L)$  prefers

$$\xi \sim e^{\beta}$$

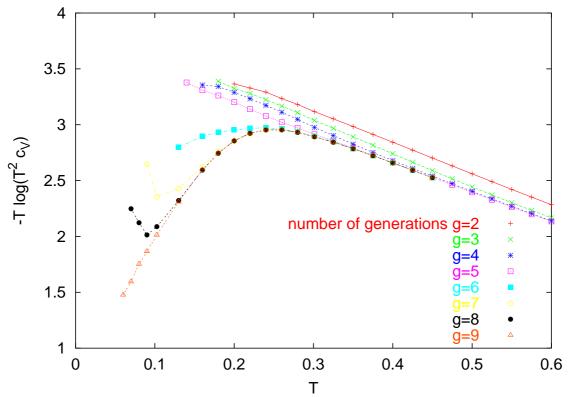
far over  $\xi \sim e^{2\beta}$ . Hyperscaling works.

2. We can use a simple scaling argument based on the finding  $S_1 - S_0 \sim 2 \log V$  to find the same behavior.

MKA approximation (to be published).

Very similar scaling pattern!

But A = 1? Here: MKA, b = 3 branches, s = 3 segments.



10<sup>4</sup> samples for 3 generations. 200 samples for 9 generations.

Here we know that  $\theta = 0$  (Amoruso et al.).

Gaussian couplings:  $c_V \sim T^{\alpha}$  as  $T \longrightarrow 0$ .

 $J = \pm 1$ : figure here. Very similar to 2D EA spin glass.