# Clusters, loops and trees in the Ising model

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# statistical physics:

#### macroscopic effects of microscopic interactions





DNA by atomic force microscopy © Lawrence Livermore National Laboratory

#### erosion simulation © J.-F. Colonna

# **The Lenz-Ising model**



To explain the phase transition in ferromagnetics, Lenz with his student lsing, suggested a model: Squares of two colors, representing spins s=±1 Nearby spins want to align, temperature parameter x : W(config)=x<sup>#{+-neighbors}</sup> **Partition function**  $Z = \sum_{\text{config}} W \text{ (config)}$ **Probability** P(cfg) = W(cfg)/Z

# **The Lenz-Ising model**



To explain the phase transition in ferromagnetics, Lenz with his student lsing, suggested a model: Often written : W(config)=x<sup>#{+-neighbors}</sup>  $\approx \exp(-\beta \sum_{\text{neighbors}} s(u)s(v))$ Here spins  $s(u)=\pm 1$ and  $x = exp(2\beta)$ In magnetic field multiply by exp(- $\mu \sum_{u} s(u)$ )

# The 2D Ising model

Ising, 1924 There is no phase transition in 1D Peierls, 1936 There is a phase transition in 2D **Kramers-Wannier, 1941** Derive  $x_{crit} = 1/(1 + \sqrt{2})$ **Onsager, Kaufman, K-O, 1944-50** Derive the partition function, magnetization,... Yang, Kac, Ward, Potts, Montroll, Hurst, Green, Kasteleyn, McCoy, Wu, Tracy, Widom, Vdovichenko, Fisher, Baxter, ... many results by different methods. "Exact solvability" (not always rigorous!) Petermann-Stueckelberg, Fisher, Kadanoff, Wilson,

**1951-66,** renormalization group

Belavin-Polyakov-Zamolodchikov, Cardy, 1985, Conformal Field Theory

### The phase transition in 2D

 $X \leq X_{crit}$ 



 $X = X_{crit}$ 







Dobrushin BC: boundary is red below, blue above. Remark. For square lattice  $x_{crit} = 1/(1+\sqrt{2})$ 

 $Prob \approx x^{\#\{+-neighbors\}}$ 

## The renormalization picture

[Stueckelberg, Fisher, Kadanoff, Wilson]



Well understood: interfaces for  $x < x_{crit}$  [Pfister-Velenik], at  $x_{crit}$  [Chelkak-Smirnov], for  $x > x_{crit}$  should get percolation.

## **Conformal Field Theory**

- a physics approach to critical points

**Conformal transformations** = those preserving angles = analytic maps Locally translation + + rotation + rescaling **CFT** [Belavin, Polyakov, Zamolodchikov 1984]: In the scaling limit, postulate conformal invariance Infinite symmetries allow to (unrigorously) derive many quantities [Cardy, ...]





# **Physics of the Ising model**

- Phase transition in D>1
- Curie point and exponents arise from renormalization
- Exact solvability in D=2

   (incl. some math results)
   E.g. magnetization exponent = 1/8
- Conformal Field Theory in D=2
- **D=3 expected to be similar**, recent advances of CFT [Rychkov, ...]
- D≥4 easier

### **Mathematical approaches**

Schramm-Loewner **Evolution:** a geometric description of the interfaces scaling limits at criticality – an SLE(к) random curve • Discrete complex analysis: a way to rigorously establish existence and conformal invariance of the scaling limit

- a recent rigorous alternative







### **Loewner Evolution**

A tool to study variation of conformal maps and domains, introduced to attack Bieberbach's conjecture K. Löwner (1923), "Untersuchungen  $G_t$ über schlichte konforme Abbildungen des Einheitskreises. I", Math. Ann. 89 Instrumental in the eventual proof L. de Branges (1985), "A proof of the Bieberbach conjecture", Acta Mathematica 154 (1): 137–152 **Thm** Let  $F(z) = \sum a_n z^n$  be a map of unit disk into the plane. Then  $|a_n| \le n$ , equality for a slit map. Wide open: find  $\gamma$  s.t.  $|a_n| \leq n^{\gamma}$  for bounded maps.



conformal  $G_t$ 





**Schramm-Loewner Evolution Loewner Equation**  $\partial_t (G_t + U_t) = \frac{2}{G_t}$ Schramm's SLE: a fractal curve obtained for random  $U_r = \sqrt{\kappa} B_r$ - a Brownian motion SLE=BM on the moduli space. Calculations from Itô calculus, interesting fractal properties Lemma [Schramm] If an interface has a conformally invariant scaling limit, it is **SLE(κ)** 

• Draw the slit







- Draw the slit
- Stop at **ε** capacity increments









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- Open it up by a conformal

map 
$$G_{\varepsilon} = z - U_{\varepsilon} + \frac{2\varepsilon}{z} + ...$$





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• Composition of iid maps

$$G_{n\varepsilon} = z - U_{n\varepsilon} + \frac{2m\varepsilon}{z} + \dots =$$
  
=  $G_{\varepsilon}(G_{\varepsilon}(G_{\varepsilon}(\dots))) =$   
 $2n\varepsilon$ 

$$= z - (U_{\varepsilon} + ... + U_{\varepsilon}) + \frac{z_{m}}{z} + ...$$



- Draw the slit
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map 
$$G_{\varepsilon} = z - U_{\varepsilon} + \frac{2\varepsilon}{z} + ...$$

- Composition of iid maps
  - $G_{n\varepsilon} = z U_{n\varepsilon} + \frac{2n\varepsilon}{z} + \dots =$
  - $= G_{\varepsilon}(G_{\varepsilon}(G_{\varepsilon}(\dots))) =$ =  $z - (U_{\varepsilon} + \dots + U_{\varepsilon}) + \frac{2n\varepsilon}{z} + \dots$
- $U_t$  is a Brownian motion!
- "A random walk on the moduli space"



**SLE=BM on the moduli space.** Calculations reduce to Itô calculus, interesting fractal properties Lemma [Schramm] If an interface has a conformally invariant scaling limit, it is  $SLE(\kappa)$ **Theorem [Schramm-Rohde]** SLE phases:



**Theorem** [Beffara]  $\mathrm{HDim}(SLE(\kappa)) = 1 + \frac{\kappa}{\rho},$  $\kappa < 8$ **Theorem** [Zhan, Dubedat]  $SLE(\kappa) = \partial (SLE(16/\kappa)),$ 

 $\kappa < 4$ 

# **Discrete complex analysis**

For 2D models (pioneered by Kenyon for dimers)

- Find an observable F (edge density, spin correlation, exit probability,...) which is discrete analytic (preholomorphic) or harmonic
- Deduce scaling limit and conformal invariance.
   Relation to SLE and exponents

### **Discrete analytic function**

(on a planar graph) = a flow which satisfies two Kirchhoff laws. Local relations but leads to global info!



# **Ising and SLE**

[Chelkak, S] Critical Ising and FK-Ising models have preholomorphic observables. Interfaces converge weakly to SLE(3) & SLE(16/3). Strong convergence – more work [Chelkak, Duminil-Copin, Hongler, Kemppainen, S]



Hdim = 11/8

Hdim = 5/3

## Random cluster (FK) model

Fortuin-Kasteleyn mapping (to the random cluster model) Rewrite Ising probability:

 $\operatorname{Prob} \asymp \prod_{\langle ij \rangle} \left( (1-p) + p \, \delta_{s(i)-s(j)} \right)$ 



Expand, to each term prescribe an edge configuration:  $p \rightarrow \text{edge} \text{ is open}, (1-p) \rightarrow \text{edge} \text{ is closed}$ Edges only connect neighbors of same spin, but not all of them Erase spins, probability of edge configuration is

 $\operatorname{Prob} \asymp p^{\# \text{ open edges}} (1-p)^{\# \text{ closed edges}} q^{\# \text{ open clusters}}$ 

All sites in a cluster are of the same spin, q ways to chose it.

 $\operatorname{Prob}_{\operatorname{Potts}}\left(s(i)=s(j)
ight)=\operatorname{Prob}_{\operatorname{FK}}\left(i\leftrightarrow j
ight)rac{q-1}{a}+rac{1}{a}$ 

### **FK loop model**

#### Loop representation of the FK model



Configurations are dense loop collections on the medial lattice Loops separate clusters from dual clusters Dobrushin b.c.: besides loops an interface  $\gamma : a \leftrightarrow b$ For  $p = \sqrt{q}/(1 + \sqrt{q})$  the probability **Prob**  $\asymp (\sqrt{q})^{\# \text{ loops}}$ 

Which observable is discrete analytic for the FK Ising?

$$F(z) := \mathbb{E} \; \chi_{oldsymbol{z} \in oldsymbol{\gamma}} \; \cdot \; \exp\left(-i \; rac{1}{2} \operatorname{winding}(oldsymbol{\gamma}, b o z)
ight)$$

- A fermion, spin  $\sigma=1/2$
- For general q-FK model take spin  $\sigma = 1 2 \arccos(\sqrt{q}/2)$

Motivation: orient loops randomly  $\Leftrightarrow$  height function changing by  $\pm 1$  whenever crossing a loop

(geographic map with contour lines)

Orient interface  $b \rightarrow z$  and  $a \rightarrow z \Leftrightarrow +2$  monodromy at z

 $F(z) = Z_{+2 \text{ monodromy at } z}$ Complex weights per loop and interface make Z local (cf. [Baxter])

FK Ising preholomorphic observable:  $F(z) := \mathbb{E} \chi_{z \in \gamma} \cdot \mathcal{W}$ 

• Fermionic weight  $\mathcal{W} := \exp\left(-i \frac{1}{2} \operatorname{winding}(\gamma, b \to z)/2\right)$ 



Note: through a given edge interface always goes in the same direction, so complex weight is uniquely defined up to sign. **Theorem [S, Chelkak & S].** For FK Ising when lattice mesh  $\epsilon \to 0$  $F(z) / \sqrt{\epsilon} \Rightarrow \sqrt{\Phi'(z)}$  inside  $\Omega$ ,

where  $\Phi$  maps conformally  $\Omega$  to a horizontal strip,  $a, b \mapsto$  ends.

Proof: discrete analyticity by local rearrangement



If a-b interface passes through x,

changing connections at x creates two configurations.

Additional loop on the right  $\Rightarrow$  weights differ by a factor of  $\sqrt{q} = \sqrt{2}$ 

**Proof:** discrete CR relation F(N) + F(S) = F(E) + F(W)



 $\lambda = \exp(-i\pi/4)$  is the weight per  $\pi/2$  turn. Two configurations together contribute equally to both sides of the relation:

$$\begin{aligned} X\lambda^2 + X + X\sqrt{2} &= X\bar{\lambda} + X\lambda + X\lambda\sqrt{2} \\ i + 1 + \sqrt{2} &= \left(\frac{1}{\sqrt{2}} - \frac{i}{\sqrt{2}}\right) + \left(\frac{1}{\sqrt{2}} + \frac{i}{\sqrt{2}}\right) + \left(\frac{1}{\sqrt{2}} - \frac{i}{\sqrt{2}}\right)\sqrt{2} \quad \Box \end{aligned}$$

#### Proof: Riemann-Hilbert boundary value problem

When z is on the boundary, winding of the interface  $b \to z$  is uniquely determined, same as for  $\partial \Omega \Rightarrow$  determine  $\operatorname{Arg}(F)$  on  $\partial \Omega$ .

F solves the discrete version of the covariant Riemann BVP  $\operatorname{Im} \left( F(z) \cdot (\operatorname{tangent} \operatorname{to} \partial \Omega)^{\sigma} \right) = 0 \text{ with } \sigma = 1/2.$ 

Continuum case:  $F = (\Phi')^{\sigma}$ , where  $\Phi : \Omega \rightarrow \text{horizontal strip}$ .

**Proof: convergence** Consider  $\int_{z_0}^{z} F^2(u) du$  – solves Dirichlet BVP. **Big problem:** in the discrete case  $F^2$  is no longer analytic!!!

**Proof of convergence:** set  $H := \frac{1}{2\epsilon} \text{Im} \int^z F(z)^2 dz$ 

- well-defined
- approximately discrete harmonic:  $\Delta H = \pm |\partial F|^2$
- H = 0 on the arc ab, H = 1 on the arc ba
  - $\Rightarrow H \Rightarrow Im \Phi$  where  $\Phi$  is a conformal map to a strip

 $\Rightarrow \nabla H \Rightarrow \Phi' \Rightarrow \frac{1}{\sqrt{\epsilon}} F \Rightarrow \sqrt{\Phi'}$ 

**Problems:** we must do all sorts of estimates (Harnack inequality, normal familes, harmonic measure estimates, . . . ) for *approximately* discrete harmonic or holomorphic functions in the absence of the usual tools. For more general graphs even worth.

**Question:** what is the most general discrete setup when one can get the usual complex analysis estimates? (while being unable to multiply functions)

#### **Interfaces and SLEs**

**Proof: convergence of interfaces.** Assume  $\exists$  observable with a conformally invariant limit  $\Rightarrow$  [Kemppainen-Smirnov]  $\Rightarrow$  a priori estimates  $\Rightarrow \{\gamma\}_{\text{mesh}}$  is precompact in a nice space. Enough to show: limit of any converging subsequence = SLE. Pick a subsequential limit, map to  $\mathbb{C}_+$ , describe by Loewner Evolution with unknown random driving force w(t). From the martingale property  $F(z, \Omega) = \mathbb{E}_{\gamma'}F(z, \Omega \setminus \gamma')$  of the observable extract expectation of increments of w(t) and  $w(t)^2$ ,

conclude that w(t) and  $w(t)^2 - \frac{8t}{\sigma+1}$  are martingales.

By Lévy characterization theorem  $\mathbf{w}(\mathbf{t}) = \sqrt{\frac{8}{\sigma+1}}\mathbf{B}_{\mathbf{t}}.$ 

So interface converges to  $SLE\left(\frac{8}{\sigma+1}\right)$ , i.e.  $SLE\left(\frac{16}{3}\right)$  when  $\sigma = \frac{1}{2}$ .  $\Box$ 

#### **Interfaces and SLEs**

**Proof: convergence of interfaces.** Recall normalization  $G_t(z) = z - w(t) + 2t/z + \mathcal{O}(1/z^2)$  at  $\infty$ .



Rem A posteriori the method calculates all martingale observables for SLE!

#### How to describe the full scaling limit?



Spin correlations. (Chelkak, Hongler, Izyurov, Smirnov, . . .)

A collection of clusters or crossings.

(Schramm, Smirnov)

A collection of loops. (Lawler, Werner, Sheffield, Miller, Wu, . . .)

#### A branching tree of SLEs.

(Camia-Newman, Sheffield, Kemppainen-Smirnov, ...)

#### Exploration tree



#### Exploration tree



#### Boundary touching loops and exploration tree in FK Ising



#### Boundary touching loops and exploration tree in FK Ising



#### Boundary touching loops and exploration tree in FK Ising



The loop soup is canonically converted into a tree. There is also an inverse map from the tree to the loops.

#### Theorem (Antti Kemppainen – Stanislav Smirnov)

Suppose a sequence of discrete domains  $(z_0 \in) \quad \Omega_{\delta_n}$  converges to  $\Omega$  in Carathéodory metric. Then

- Branches of discrete exploration trees converge to SLE(16/3,16/3 - 6).
- Exploration tree converges to a tree of canonically coupled SLEs.
- Soup of loops converges to CLE(16/3) a soup of SLE loops.
- Chordal case arXiv:1509.08858
- Radial case arXiv:1609.08527
- 4-point case arXiv:1704.02823

#### SLE generalizations

- When exploring a branch, besides the tip and the target we have an additional marked point on the boundary: the rightmost point in the explored hull (= the other endpoint of the current loop)
- (Chordal case) The Loewner map  $g_t(z) := G_t(z) + U_t$  uniformizes the tip to  $U_t$ , and the new point to  $V_t$ , which flows with the Loewner flow:

$$\mathrm{d}(G_t(z)+U_t)=rac{2}{G_t(z)}\mathrm{d}t$$
 hence  $\mathrm{d}(V_t)=rac{2}{(V_t-U_t)}\mathrm{d}t.$ 

But now the driving force  $U_t$  is a **BM** + **a drift depending on**  $V_t$ .

• A special role is played by  $SLE(\kappa, \rho)$  processes. In this case  $V_t - U_t$  is a Bessel process of dimension  $D = 1 + 2(\rho + 2)/\kappa$  times  $\sqrt{\kappa}$ :

$$\mathrm{d}(V_t - U_t) = -\sqrt{\kappa} \mathrm{d}B_t + \kappa \frac{D-1}{2} \frac{\mathrm{d}t}{V_t - U_t}$$

Note:  $\mathrm{d}U_t = \sqrt{\kappa}\mathrm{d}B_t + \ldots$ 

- SLE(κ, κ 6) enjoys locality property: it does not see where it is going until it hits it (a theorem by [Lawler, Schramm & Werner]. E.g., SLE(6) = SLE(6,0) is local and so describes percolation.
- We see how SLE( $\kappa, \kappa 6$ ) appear naturally as tree branches.

#### New observables (from adding a long edge)



- The branch  $\gamma$  follows  $\gamma_1$  until the next loop-to-loop jump where it starts to follow new  $\gamma_1.$
- Set

- Observable is defined as before, and is discrete holomorphic for the same reasons.
- The boundary conditions are similar with jumps at 4 marked points.
- The tree observable is obtained by fusing two marked points.

#### Simple martingales from the observable

 The tree branch observable can be calculated: e.g., in the upper half-plane 
 ⊞ with a = u, b = v and c = ∞ with u < v, it is
 </li>

$$f^{\mathbb{H},u,v}(z) = \sqrt{1+\beta\left(-\frac{1}{z-u}+\frac{1}{z-v}\right)}$$

$$f^{\mathbb{H},U_t,V_t}(z)=\sqrt{g_t'(z)}\,\sqrt{1+eta_t\left(-rac{1}{g_t(z)-U_t}+rac{1}{g_t(z)-V_t}
ight)}$$

- $U_t = g_t(\gamma(t)), V_t = \max g_t(K_t) = g_t(v)$ .
- t → V<sub>t</sub> is increasing and satisfies LE when t satisfies U<sub>t</sub> ≠ V<sub>t</sub>.
   Then

$$\beta_t = \frac{1}{4}(V_t - U_t).$$

 Take the leading non-trivial coefficient of f<sup>II,u,v,w</sup> in the expansions as z → ∞. Then

$$M_t := \pm \sqrt{4\beta_t}$$
$$N_t := 4 \left( \beta_t (V_t - U_t) - 2t \right) = M_t^4 - 8t$$

are martingales.

 $\pm$  independent random sign for each excursion.

#### Determination of the driving process

- Note that  $\{t : U_t = V_t\} = \{t : M_t = 0\}.$
- What is the law of  $(M_t)$  if we know that

$$M_t$$
 and  $N_t = M_t^4 - 8t$ 

#### are martingales?

Cf. Lévy chracterization of BM and Stroock-Varadhan.

- Then  $\mathbb{E}[\int_0^t \chi_{M_s=0} ds] = 0$  and  $(M_t)$  defines a standard Brownian motion  $(B_t)$  so that  $M_t = M_0 + \int_0^t \sigma_s dB_s$ .
- N<sub>t</sub> is martingale only when

$$\sigma_t = \sqrt{\frac{4}{3}} \frac{1}{|M_t|}.$$

• If we define  $X_t = \sqrt{3/16}(V_t - U_t) = \sqrt{3/16}M_t^2$ , then

$$\mathrm{d}X_t = \mathrm{d}\tilde{B}_t + \frac{1}{4}\frac{\mathrm{d}t}{X_t}$$

• Bessel process of dimension D = 3/2. SLE $(\kappa, \rho)$  with  $\kappa = 16/3$  and  $\rho = -2/3$ .  $\implies \rho = \kappa - 6$ .

# **Clusters, loops and trees**

- There is a canonical way to explore FK clusters, leading to a branching tree
- Tree are equivalent to clusters and loops
- Branches are nicely coupled (coincide up to separation, then independent)
- Branch independence suggests locality, so
   expect a continuum tree of branching SLE(κ,κ-6)
- There are observables related to the tree
- Characterization of a diffusion by two moments is possible, gives us a Bessel process, and hence SLE(16/3,-2/3)
- Similar approach to spin Ising?

# Happy birthday!

