

# The Ising model

M2 Mathématiques de l'aleatoire  
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## References:

- "Statistical mechanics of Lattice Systems",  
Friedli & Velenik.

- "Percolation et Modèle d'Ising",  
Werner.

physio:- "Exactly solved Models in Statistical Mechanics",  
Baxter.

## chap. 0 - Introduction

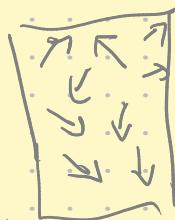
Pierre Curie's experiment: ( $\approx 1895$ )

- Put a piece of iron in a high magnetic field.  
It becomes a magnet.
- Remove the magnetic field.  
Depending on the temperature,



noise  
transition!  
(of Percolation  
course)  $\hookrightarrow$  IF  $T > T_c$  ( $\approx 770^\circ\text{C}$  for iron),  
the iron loses its magnetisation  
 $\hookrightarrow$  IF  $T < T_c$ , it stays magnetic.

Idea: The piece is made of many small magnetic dipoles



subject to ① local alignment forces  
(nearby dipoles tend to be close  
to parallel)

② variations due to heat.

Depending on  $T$ , either ① or ② dominates.

Rk: this depiction is actually physically misleading, as it was shown later that exchange of electrons play a key role in ferromagnetism...

In 1920, Lenz introduces a model for Ferromagnetism that takes ① and ② into account, and tries to analyse the phase transition using it. In 1925 he gives the 1-dimensional case to his student Ising, who solves it, shows that there is no phase transition... Peierls, 1936

However, it was later found that there is a phase transition in dimension  $\geq 2$ . The Lenz-Ising model gained huge interest throughout the development of modern statistical mechanics during the 20<sup>th</sup> century and still does. Parts of the reason for this success are:

- it is relatively simple and yet provides rich phenomena & behaviours
- it has several algebraic properties that make it possible to study rigorously, (cf. exact solution in 2D: Kaufman-Onsager, 1950)
  - continuity of phase transition for any dimension: Aizenman, Duminil-Copin, Sidoravicius 2015
  - conformal invariance in 2D: Smirnov, ...  $\approx 2010$
- it is related to many other systems (percolation / random clusters, spanning trees, dimer model, 6v/8v ...)
- it is extremely beautiful.

The model:

For now...

Let  $G = (V, E)$  be a finite graph, with vertices  $V$  and edges  $E$  (non-oriented).

Let  $\Omega = \{-1, +1\}^V$  be the configuration space<sup>?</sup>. An element  $\sigma \in \Omega$  is a function  $\sigma: V \rightarrow \{-1, +1\}$  and is called a spin configuration.

Let  $J = (J_e)_{e \in E}$  be a family of numbers in  $\mathbb{R}_+$ , called coupling constants, and let  $\beta > 0$  be the inverse temperature.

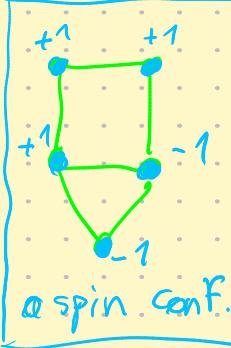
We consider the probability  $\mu_{\beta, J}$  on  $\Omega$  given by:

$\forall \sigma \in \Omega$ ,

$$\mu_{\beta, J}(\sigma) = \frac{1}{Z_{\beta, J}} \exp\left(\beta \sum_{e=\{u,v\} \in E} J_e \sigma_u \sigma_v\right)$$

we will often drop the dependencies in  $\beta, J$ .

where  $Z_{\beta, J} = \sum_{\sigma \in \Omega} \exp\left(\beta \sum_{e=\{u,v\} \in E} J_e \sigma_u \sigma_v\right)$  is called the partition function.



Remarks: • as  $\beta > 0$  and  $J_e \geq 0$ , this proba "favors" neighbouring sites to be equal ( $+1 \rightarrow +1$  or  $-1 \rightarrow -1$ ) . A

This effect is stronger if  $\beta$  is large (low temp.)

- the previous "dipoles' orientation are discretized to  $\pm 1$  (makes study easier)
- This is a Boltzmann probability:

in general,  $P(\sigma) \propto \exp\left(-\frac{1}{k_B T} \cdot H(\sigma)\right)$  in Boltzmann's Formalism.

$\uparrow$   
 $\beta$  energy = (an extensive Function)

rough idea: the energy tends to favor order, while  $T$  tends to favor disorder. Which one wins?

• In stat. mechanics, we often work directly with  $\Omega$  being the actual space of configurations ... contrary to Kolmogorov's Formalism.

• We will often take  $J_e, J_e = 1$  and work with  $\beta$  only.

Q What does  $\sigma$  typically look like depending on  $\beta$ ?

Exercise: we take  $G = \{J_1, J_2, J_3\}$  with  $J_1, J_2, J_3 \geq 0$ .



Show that as  $\beta \rightarrow 0$ ,  $\mu_\beta \xrightarrow[\beta \rightarrow 0]{} \text{Unif}(\Omega)$

and as  $\beta \rightarrow \infty$ ,  $\mu_\beta \xrightarrow[\beta \rightarrow \infty]{} \frac{1}{2} S_{(++)} + \frac{1}{2} S_{(--)}$

in general, as  $\beta \rightarrow 0$  ("high temperature") we get site Bernoulli perco ( $\frac{1}{2}$ ), & as  $\beta \rightarrow \infty$  ("zero temperature") we get frozen config.

Q Can we study average magnetization?

We would like to consider  $\frac{1}{|V|} \sum_{v \in V} \sigma_v$  the "global spin",  
and its average value  $M = \left\langle \frac{1}{|V|} \sum_{v \in V} \sigma_v \right\rangle$

↑ expectation for  $\mu$ , that is, for  $f: \Omega \rightarrow \mathbb{R}$ ,

$$\langle f \rangle := \sum_{\sigma \in \Omega} f(\sigma) \mu(\sigma).$$

we can also specify:  $\langle \cdot \rangle_B$ ,  $\langle \cdot \rangle_{B,h}$  ...

Problem: by symmetry,  $m=0$ .

Possible solutions:

① consider  $\left\langle \frac{1}{|V|} \sum_{v \in V} \sigma_v \right\rangle$ . Can work but not always practical.

② (the physics way) Add a magnetic field  $h \in \mathbb{R}$   
and consider instead

$$\mu_{B,h}(\sigma) = \frac{1}{Z_{B,h}} \exp \left[ \beta \sum_{\substack{c=v,v' \\ e \in c}} J_e \sigma_v \sigma_{v'} + h \sum_{v \in V} \sigma_v \right]$$

Magnetization:  $m_{B,h} = \underbrace{\left\langle \frac{1}{|V|} \sum_{v \in V} \sigma_v \right\rangle}_{B,h}$  if  $h > 0$ , ↑ spins are favored.

For simply  $\sigma_v$  for a given site  $v$   
"deep into the graph". How does  $m_{B,h}$  behave as  $h \rightarrow 0$ , for a "big graph"?

③ (The most common in math)

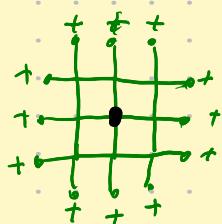
Introduce boundary conditions.

For instance, let  $d \geq 1$ , and let  $\Lambda_n = [-n, n]^d \subset \mathbb{Z}^d$   
be a piece of  $\mathbb{Z}^d$ .

Consider the model with  $J \geq 1$  on  $\Lambda_n$ ,

with  $+$  boundary conditions: we fix the spins on  
 $\partial \Lambda_n$  to be  $+1$ .

Let  $\mu_{\Lambda_n}^+$  be the corresponding proba, and  $\langle \cdot \rangle_{\Lambda_n}^+$  its  
expectation. We consider  $\langle \sigma_0 \rangle_{\Lambda_n}^+ = \mu_{\Lambda_n}^+(\sigma_0=1) - \mu_{\Lambda_n}^+(\sigma_0=-1)$

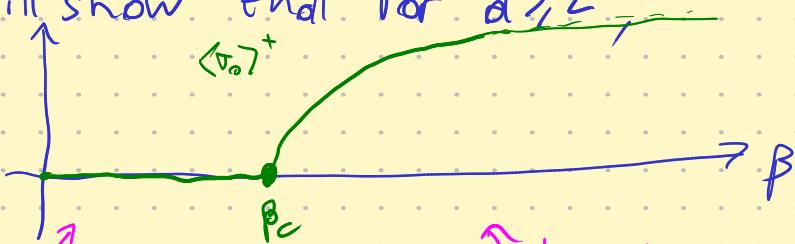


We want to consider  $\langle \sigma_0 \rangle^+ := \lim_{n \rightarrow \infty} \langle \sigma_0 \rangle_{\lambda_n}^+$ .

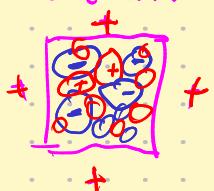
Q: does this limit exist?

- Can we define a satisfying measure on the infinite graph  $\mathbb{Z}^d$ ?
- How does it depend on  $\beta$ ?

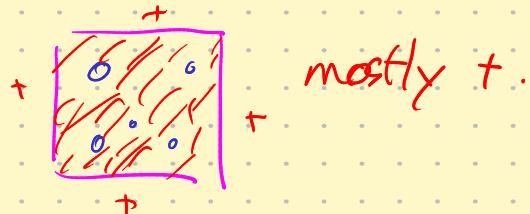
We will show that for  $d \geq 2$ ,



high temp:  $\langle \sigma_0 \rangle^+ = 0$ , the system does not see the boundary condition:



low temp:  $\langle \sigma_0 \rangle^+ > 0$



(we take  $\beta=1$  (imagine that  $\beta$  is absorbed in  $\mathbb{J}$ ))

Exercise: Consider a finite graph  $G = (V, E)$  with coupling constants  $\mathbb{J}_e$ , all  $> 0$ . Suppose that  $G$  contains a triangle. Transform this triangle into a star to get a new graph  $G'$ :



$$G = (V, E)$$

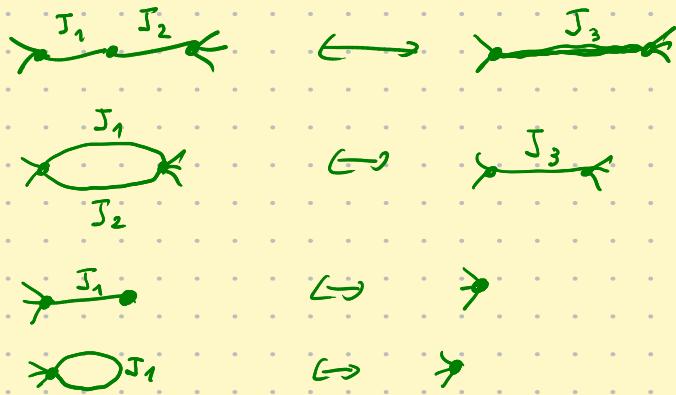
$$G' = (V', E')$$

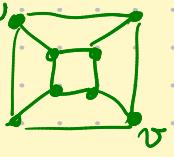
$(J'_e = J_e \text{ for any non-represented edge } e)$

1) Show that one can find  $J'_1, J'_2, J'_3$  s.t. the distribution of the Ising model is unchanged. That is, if  $\sigma$  in  $\{\pm 1\}^V$  has distribution  $\mu_{G, \mathbb{J}}$ , and  $\sigma'$  in  $\{\pm 1\}^{V'}$  has distri.  $\mu_{G', \mathbb{J}'}$ , then  $\sigma \stackrel{d}{=} \sigma'|_{V' \setminus \{u_0\}}$ .

2) Show that the converse transformation is possible as well. (while keeping the distribution)

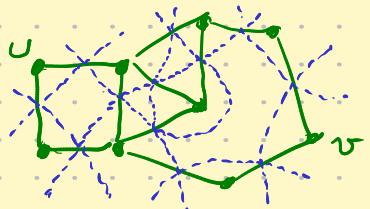
3) Show in addition that the following transformations can be made:



4) Transform the graph  into  with such transformations, keeping  $u, v$  untouched.

5) (\*) Show that any connected planar graph with 2 marked vertices <sup>( $u, v$ )</sup> on the boundary can be transformed into  by such transformations.

Hint: Consider the medial graph, here in dashed lines:



Feasible problem  
1993 This is actually doable in polynomial time (in the size of the graph)

6) Deduce that there is a polynomial algorithm that takes as entry  $G, \beta, u, v$  satisfying 5) and gives  $\langle J, J_{u,v} \rangle_{G,\beta}$  and  $Z_{G,\beta}$ .

This is surprising: quantities like  $Z$  should be exponential in nature. It is a first glimpse at the fact that the Ising model is exactly solvable in dimension 2.

EpiForor,  
1998