

# The Ising-Model

Model of interacting quantum spins in a magnetic field, introduced as model for ferromagnetism by Wilhelm Lenz (~ Runge-Lenz vector) and Ernst Ising in Ising's PhD thesis (Hamburg, 1924).  
 (10.5.1900-11.5.1998)

[Ising later became teacher, emigrated via Luxemburg to the USA. After Onsager's solution (1944) he became professor at Bradley university, Peoria, Illinois, but never published another journal article.]

Hamiltonian of general Ising model ( $N$  lattice sites): \*

$$\mathcal{H} = -\frac{1}{2} \sum_{i,j=1}^N J_{ij} \sigma_i \sigma_j - \mu_B B \sum_{i=1}^N \sigma_i \quad \sigma_i \in \{+1, -1\}$$

specifically for translation-invariant, isotropic nearest-neighbor interaction:

$$\mathcal{H} = -J \sum_{\langle i,j \rangle} \sigma_i \sigma_j - \mu_B B \sum_i \sigma_i$$

sum over  $NN$  pairs, each pair counted once

- important special case:  $B=0$
- trivial single-spin (noninteracting) limit:  $J=0$

- ferromagnetic/antiferromagnetic coupling for  $J \gtrless 0$
- properties strongly dependent on lattice (i.e. also on dimensionality)

\* more general spin Hamiltonian:

$$\mathcal{H} = -\frac{1}{2} \sum_{ij} \vec{S}_i \cdot \vec{I}_{ij} \cdot \vec{S}_j$$

↑ Eigenvalues  $\pm \frac{1}{2}\hbar$

(isotropic) Heisenberg model:  $\vec{I}_{ij} = I_{ij} \mathbb{1}$

Ising model:  $(I_{ij})_{\mu\nu} = I_{ij} \delta_{\mu 3} \delta_{\nu 3}$

use scaled interactions  $J_{ij} = \left(\frac{1}{2}\hbar\right)^2 I_{ij}$

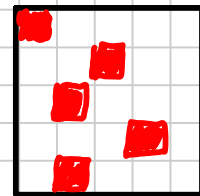
possible visualization:



$$\sigma_i \equiv \frac{2}{\hbar} S_i^z \quad (\vec{S}_i: \text{spin vector})$$

alternative visualizations:

+	-	-	+	+
-	+	-	+	-
-	+	+	-	+
+	-	-	+	-
+	+	-	+	+



closely related: lattice gas model (lattice sites occupied/empty):

$$\mathcal{H}_{LGM} = U_{NN} \sum_{\langle ij \rangle} n_i n_j - \mu \sum_i n_i$$

↑ chem. potential (in grand canonical ensemble)

# Excursion: reminder on statistics

(cf. Landau/Binder)  
chapter 2

partition function in canonical ensemble:

$$Z = \sum_{\text{all states}} e^{-\mathcal{E}/k_B T} = \sum_{\text{states}} e^{-\beta \mathcal{E}}$$

free energy  $F = -k_B T \ln Z$

internal energy  $E = \frac{\sum \mathcal{E} e^{-\beta \mathcal{E}}}{\sum e^{-\beta \mathcal{E}}}$

$$= \frac{-\partial Z / \partial \beta}{Z} = -\frac{\partial \ln Z}{\partial \beta} = \frac{\partial (\beta F)}{\partial \beta}$$

$$= -T^2 \frac{\partial (F/T)}{\partial T} = F - T \frac{\partial F}{\partial T}$$

entropy  $S = -\frac{\partial F}{\partial T}$  (e.g. from  $F = E - TS$ )

Specific heat:  $C = \frac{\partial E}{\partial T} = \frac{\partial E}{\partial \beta} \frac{\partial \beta}{\partial T}$

$$\stackrel{*}{=} \frac{\langle \mathcal{E}^2 \rangle - \langle \mathcal{E} \rangle^2}{k_B T^2}$$

Very useful in simulations: avoids numerical differentiation.

magnetic dipole moment  $m = \langle \mu_B \sum_i \sigma_i \rangle$  } for Ising model  
 $= \frac{1}{\beta Z} \frac{\partial Z}{\partial B} = \frac{1}{\beta} \frac{\partial \ln Z}{\partial B}$  ;  $M = \frac{m}{N \mu_B}$

**phase transitions:** singularities in thermodynamic quantities (i.e. points/lines/planes in phase space where  $F, E, m$  etc. are nonanalytic).

However:  $F$  is always continuous (as function of  $T, B$ )

Classification according to Ehrenfest:

**1<sup>st</sup> order transition:** discontinuities in first derivatives of  $F$

**2<sup>nd</sup> order transition:**

- continuous first derivatives of  $F$
- discontinuities in second derivatives of  $F$

**Examples:** liquid-gas transition etc.

Note: systems with a finite number of states cannot undergo phase transitions since a finite sum of analytic functions is analytic:

$$Z = \sum_{s=1}^{\text{state } s_{\max}} e^{-\beta \mathcal{E}_s} \quad \text{analytic}$$

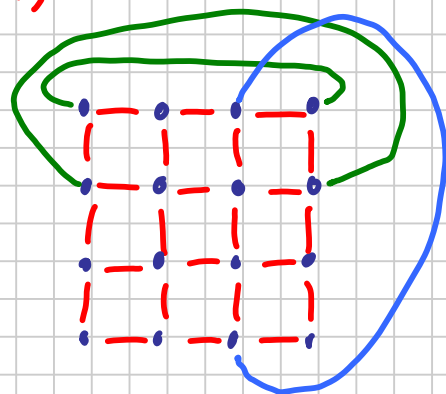
**Critical exponents:** characterize behavior near 2<sup>nd</sup> order transitions

magnetization	$m = m_0 \epsilon^\beta$	} $\epsilon =  1 - \frac{T}{T_c} $
susceptibility	$\chi = \chi_0 \epsilon^{-\gamma}$	
specific heat	$C = C_0 \epsilon^{-\alpha}$	
correlation length	$\xi = \xi_0 \epsilon^{-\nu}$	
magnetization at $T_c$ :	$m \propto B^{1/\delta}$	

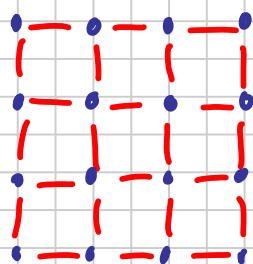
# Ising model: simulation

1<sup>st</sup> consideration: Hamiltonian for finite-size system, i.e. **boundary conditions**

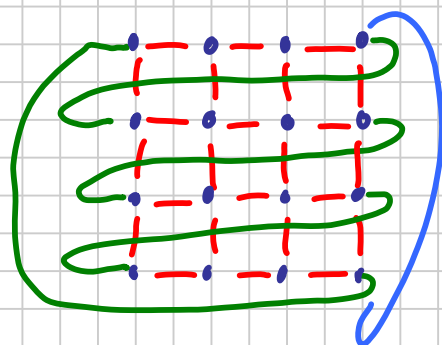
(i) conventional choice: periodic boundary conditions  
⇒ all sites equivalent



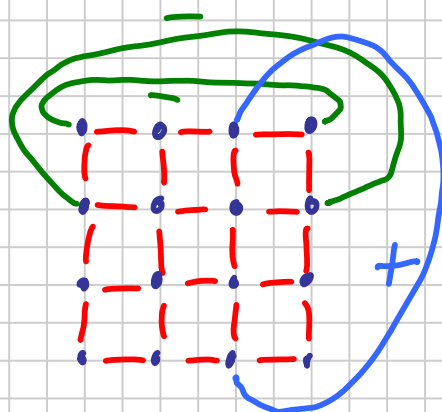
(ii) other extreme: open/free edge boundary conditions  
⇒ inner + surface sites



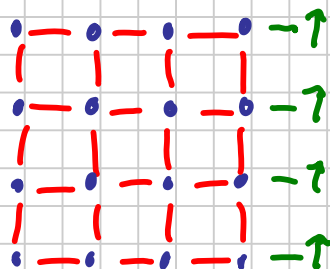
(iii) screw periodic boundary cond.  
easy to implement on 1d vector ⇒ introduces seam



(iv) antiperiodic boundary conditions:  
flip sign of interaction along some boundaries  
⇒ generate odd number of domain walls (e.g. 1) at  $T \rightarrow 0$



(v) fixed or mean-field boundary conditions: boundary sites couple to external medium



Possibilities can be combined/mixed...

# Metropolis importance sampling Monte Carlo scheme

(i) choose initial spin configuration

→ (ii) select site  $i$

(iii) calculate  $\Delta E = E\{\sigma_0, \sigma_i \rightarrow -\sigma_i\} - E\{\sigma_e\}$

(iv) Metropolis step:

- if  $\Delta E < 0$ : accept move

- else generate random number  $r \in [0, 1)$

- if  $r < \exp[-\Delta E/k_B T]$ : flip spin ( $\sigma_i \rightarrow -\sigma_i$ )

- else: keep state

(v) after warm-up: measure

$$n_{\text{sum}} += 1$$

$$m_{\text{sum}} += \text{mag}\{\sigma_e\}$$

$$E_{\text{sum}} += E\{\sigma_e\}$$

⋮

} compute internally  
or print for  
external analysis

(vi) enough sweeps ( $N = L^d$  attempted spin flips)?

- yes: compute averages (if done internally) + error bars

- no: →

note:  $\Delta E$  depends only on nearest neighbors of site  $i$ , specifically only on number of up spins in neighborhood (and  $\sigma_i$ )  
→ look-up table possible

# Home work (see course page)

- 2007/11/22 Monte Carlo simulation of 2D Ising model (due: 2007/11/29)
  - Write a Monte Carlo program for computing energy and magnetization of the 2 D square Ising model using single-spin flips (possibly using the template C program linked below).
  - Compute  $E(T)$ ,  $|M(T)|$  in a useful temperature range for lattices with linear sizes between about 4 and 20-40
  - Plot Binder's 4th order cumulant  $U_4(T)=1-\langle M^4 \rangle / (3\langle M^2 \rangle^2)$  and determine  $T_c$
  - Optional: determine specific heat and susceptibility at selected temperatures

Example:

Magnetization ( $10^5$  sweeps)

