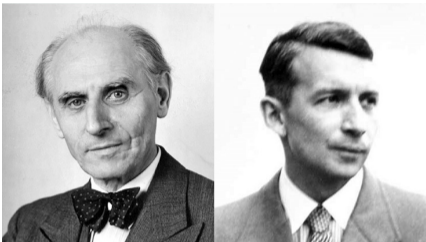


# The Ising model: Highlights and perspectives

**Christof Külske,**  
Ruhr University Bochum, Germany

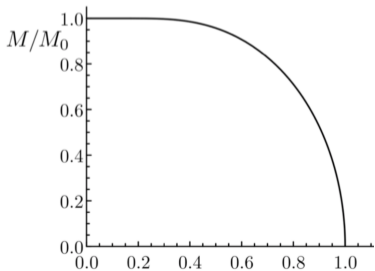
15 August 2024, Bernoulli-IMS world congress, Bochum

# A theory for ferromagnetic ordering?



**Wilhelm Lenz** (1888 Frankfurt - 1957 Hamburg) was Ph.D. advisor to

**Ernst Ising** (1900 Cologne - 1998 Peoria, Illinois) at Hamburg



**Spontaneous magnetization** of a ferromagnet as a function of temperature.

Can this be explained by a short-range probabilistic model, following statistical mechanics?

## Definition of the Ising model

Model invented by Wilhelm Lenz in 1920 with the idea:

Only minimal local structure, only nearest neighbor interaction

### Magnetic moments (spins)

$\sigma_i \in \{1, -1\}$  are sitting at sites  $i \in \Lambda \subset \mathbb{Z}^d$ ,

(Other choices of base spaces of interest today: networks,  
other interpretations of magnetic moments e.g. as "opinions")

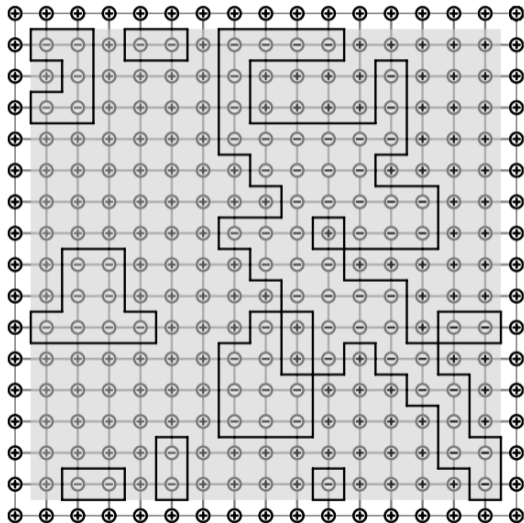
### Gibbs distribution

(Probability measure depending on inverse temperature  $\beta$ ):

Probability to see a configuration  $\sigma_\Lambda = (\sigma_i)_{i \in \Lambda}$  given by

$$\frac{1}{Z_\Lambda} \exp\left(\beta \sum_{i \sim j} \sigma_i \sigma_j + h \sum_i \sigma_i\right)$$

# Definition of the Ising model



Two-dimensional Ising model with plus-boundary condition

picture from Friedli-Velenik book

# Phase Transitions and long-range order

## Questions:

- Spontaneous magnetization at large  $\beta$ ?
- Does the model have a magnetic phase transition ?
- What is actually a phase transition mathematically?
- Behavior of other physical quantities?

**Ernst Ising (Ph.D. thesis 1924 Hamburg):** Explicit computations show that the model has **no phase transition in spatial dimension  $d = 1$** , published in Zeitschrift für Physik (since 1997 European Physical Journal) 1925

# Phase Transitions and long-range order in lattice dimensions $d \geq 2$



Rudolph Peierls  
(1907 Berlin - 1995 Oxford)

**Proof of long-range order  
in space dimensions  $d \geq 2$**

given in the year 1936

## Phase Transitions and long-range order in lattice dimensions $d = 2$



Lars Onsager (1903 Oslo - 1976 Florida),  
Nobel prize chemistry 1968 for non-equilibrium  
statistical mechanics

**L. Onsager, Phys. Rev. (1944):** The **free energy** of the Ising model in zero external field  $h = 0$  in lattice dimension  $d = 2$  is

$$\lim_{\Lambda} \frac{1}{|\Lambda|} \log Z_{\Lambda} = \log 2 + \frac{1}{8\pi^2} \int_0^{2\pi} \int_0^{2\pi} \log \left( \cosh(2\beta)^2 - \sinh(2\beta) (\cos \vartheta_1 + \cos \vartheta_2) \right) d\vartheta_1 d\vartheta_2$$

Onsager uses combinatorics, algebra, determinants

Modern proof via fermionic integration

## Phase Transitions and long-range order in lattice dimensions $d = 2$

Critical inverse temperature  $2\beta_c = \log(1 + \sqrt{2})$

at which specific heat diverges

Hendrik Kramers - Gregory Wannier: self-duality temperature (1941)

**Onsager/Kaufmann: Power law behavior for magnetisation** via computation

$$m(\beta) = \langle \sigma_0 \rangle \sim (\beta - \beta_c)^{\frac{1}{8}} \text{ as } \beta \downarrow \beta_c$$



# Critical behavior and universality: a physical perspective

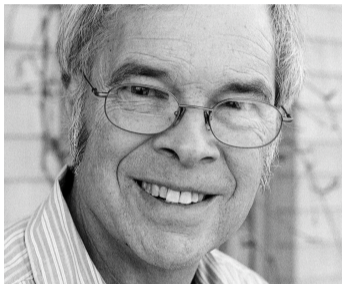
**Universality conjecture** (supported by physical experiments):

Critical behavior and **critical exponents** for short-range systems depend only on spatial dimension  $d$ , spin dimension (universality classes)

$$m(\beta) = \langle \sigma_0 \rangle \sim \begin{cases} (\beta - \beta_c)^{0.3264\dots} & d = 3 \\ (\beta - \beta_c)^{\frac{1}{2}} & d \geq 4 \end{cases}$$

Many materials behave like prototypical models, e.g. like the Ising model!

# Critical behavior and universality: a physical perspective



Kenneth Wilson  
(1936 Massachusetts - 2013 Maine)

Nobel prize in theoretical physics 1982

**Universality and power laws  
explained by (non-rigorous)  
renormalization group theory**

**Renormalization group theory investigates the system under scaling**  
(zooming out) looking for non-standard limit theorems

# What is a phase transition? Infinite systems and Gibbs simplex



Roland Dobrushin  
(1929 St Petersburg - 1995 Moscow)



Oscar Lanford  
(1940 NYC -  
2013 Switzerland)



David Ruelle  
(1935 Ghent, Belgium - )

Rigorous theory of phase transition for **infinite systems**

# What is a phase transition? Infinite systems and Gibbs simplex

## DLR-formalism

$$\mu \gamma_\Lambda = \mu$$

DLR consistency equation for  $\mu$  probability measure on  $\{-1, 1\}^{\mathbb{Z}^d}$

**Multiple Gibbs measures**  $\mu$  (multiple macroscopic states)

for the same model parameters (temperature, external fields, ...)

**indicate a phase transition**

Aizenman, Fröhlich, Lebowitz, ...

Varadhan (**large deviations**)

# Scaling limits of critical systems in $d = 2$ : Stochastic Loewner evolution

**Ising model**, (percolation, random walks with interaction, ...)

at critical point of the model, after a **scaling limit**

give rise to **fractal random curves described by SLE $_{\kappa}$**

$\kappa \in (0, 8)$  captures all model-dependence,

e.g. Ising interfaces  $\kappa = 3$

$\kappa$  relates to critical exponents

# Scaling limits of critical systems in $d = 2$ : Stochastic Loewner evolution



Oded Schramm  
(1961 Jerusalem -  
2008 Washington)  
Invented SLE 2000



Wendelin Werner  
(1968 Cologne - )  
Fields medal 2006



Stanislav Smirnov  
(1970 Leningrad - )  
Fields medal 2010



Hugo Duminil-Copin  
(1985 Île-de-France - )  
Fields medal 2022  
 $d = 3, 4$

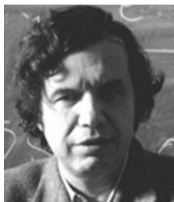
## Disordered Ising models

**Random "disordered" Gibbs distribution** with spin probabilities

$$\frac{1}{Z_\Lambda} \exp\left(\beta \sum_{i \sim j} J_{ij} \sigma_i \sigma_j + \sum_i h_i \sigma_i\right)$$

Random field systems, spin glasses  $J_{ij} \sim \mathcal{N}(0, 1)$

- When does randomness of the interaction **destroy a phase transition**?
- When does randomness of the interaction **create new complex phases**?



**Giorgio Parisi** (1948 Rome - )  
**(mathematically non-rigorous) solution of quenched mean-field spin-glass**

Nobel Prize in Physics (2021) "interplay of disorder and fluctuations in physical systems"

# Disordered Ising models



**Michel Talagrand** (1952 Béziers, France - )

Concentration of measure, chaining

**Validity of Parisi Formula (2006)**

Abel Prize 2024

- What about influence of **Spatial Disorder** on collective spin-behavior?

Dilute lattices, random networks, point clouds,

**spin dynamics,**

dynamical networks, ... ?