

# Classical Statistical Models - Spring 2016

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## Exercise Nr. 4

Discussion on May 23rd, 15:00-16:00, Room V2-121

### 7) Critical Exponents (2+4 points)

Consider the free energy density in the vicinity of a 2nd order phase transition:

$$f(t, h) = t^{2-\alpha} g(t/h^{1/\phi}),$$

where  $h$  is a (reduced) external field and  $t = \frac{T-T_c}{T_c}$  the reduced temperature.

- Show that  $\alpha$  is the critical exponent of the specific heat.
- Express the coefficients  $\beta$  and  $\delta$  by  $\alpha$  and  $\phi$  and show that the following scaling relation holds:

$$2 - \alpha = \beta(\delta + 1).$$

### 8) 1-dimensional Ising model (2+4 points)

- Compute the eigenvalues of the transfer matrix

$$V = \begin{pmatrix} e^{K+h} & e^{-K} \\ e^{-K} & e^{K-h} \end{pmatrix}, \quad K = \beta J, \quad h = \beta H.$$

- Implement the Metropolis algorithm for the 1-dimensional Ising model (Ising chain) for  $H = 0$ . Measure the magnetization and check that you obtain for  $N \rightarrow \infty$  the analytic result

$$M(T, H) = \frac{e^K \sinh(h)}{\sqrt{e^{2K} \sinh^2(h) + e^{-2K}}}.$$

```
procedure metropolis-ising
input { $\sigma_1, \dots, \sigma_N$ },  $E$ 
 $i \leftarrow \text{nrnran}(1, N)$ 
 $h \leftarrow \sum_j \sigma_{\text{Nbr}(j,i)}$ 
 $\Delta_E \leftarrow 2h\sigma_i$ 
 $Y \leftarrow e^{-\beta\Delta_E}$ 
if  $\text{ran}(0, 1) < Y$  then
     $x\sigma_i \leftarrow -\sigma_i$ 
     $E \leftarrow E + \Delta_E$ 
endif
output { $\sigma_1, \dots, \sigma_N$ },  $E$ 
```

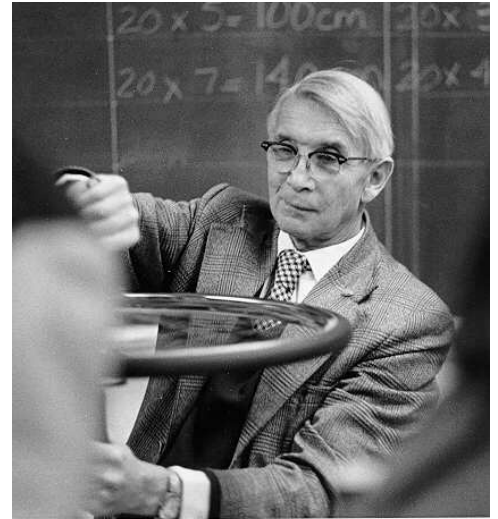
### 9) 2-dimensional Ising Model (8 points)

- Implement the Metropolis algorithm for the 2-dimensional Ising model by modifying the Ising chain to higher dimensions. [It will be advantageous for later applications to construct a lattice container and a method to implement the nearest neighbor relation for any dimension.]
- Measure the Binder cumulant  $B_L(\beta)$  as a function of the inverse temperature  $\beta$  for three different lattice volumes,  $8 \times 8$ ,  $16 \times 16$  and  $32 \times 32$ .

## Ernst Ising

(May 10, 1900, - May 11, 1998) was a German physicist.

He is best remembered for the development of the Ising model. He was a professor of physics at Bradley University until his retirement in 1976. After school, he studied physics and mathematics at the University of Göttingen and University of Hamburg. In 1922, he began researching ferromagnetism under the guidance of Wilhelm Lenz. He earned a Ph.D in physics from the University of Hamburg in 1924. His doctoral thesis studied a problem suggested by his teacher, Wilhelm Lenz. He investigated the special case of a linear chain of magnetic moments, which are only able to take two positions, “up” and “down,” and which are coupled by interactions between nearest neighbors. Mainly through following studies by Rudolf Peierls, Hendrik Kramers, Gregory Wannier and Lars Onsager the model proved to be successful explaining phase transitions between ferromagnetic and paramagnetic states.



After earning his doctorate, Ernst Ising worked for a short time in business before becoming a teacher, in Salem, Strausberg and Crossen, among other places. In 1930, he married the economist Dr. Johanna Ehmer (born February 2, 1902). As a young German-Jewish scientist, Ising was barred from teaching and researching when Hitler came to power in 1933. In 1934, he found a position, first as a teacher and then as headmaster, at a Jewish school in Caputh near Potsdam for Jewish students who had been thrown out of public schools. Ernst and his wife Dr. Johanna Ising, née Ehmer, lived in Caputh near the famous summer residence of the Einstein family. In 1938, the school in Caputh was destroyed by the Nazis, and in 1939 the Isings fled to Luxembourg, where Ising earned money as a shepherd and railroad worker. After the German Wehrmacht occupied Luxembourg, Ernst Ising was forced to work for the army. In 1947, the Ising family emigrated to the United States. Though he became Professor of Physics at Bradley University in Peoria, Illinois, he never published again. Ising died at his home in Peoria in 1998, just one day after his 98th birthday.

The Ising model is defined on a discrete collection of variables called spins, which can take on the value 1 or -1. The spins  $S_i$  interact in pairs, with energy that has one value when the two spins are the same, and a second value when the two spins are different. The energy of the Ising model is defined to be  $E = - \sum_{ij} J_{ij} S_i S_j$ , where the sum counts each pair of spins only once. Notice that the product of spins is either +1 if the two spins are the same (aligned), or -1 if they are different (anti-aligned).  $J$  is half the difference in energy between the two possibilities. Magnetic interactions seek to align spins relative to one another. Spins become randomized when thermal energy is greater than the strength of the interaction. For each pair, if  $J_{ij} > 0$  the interaction is called ferromagnetic, if  $J_{ij} < 0$  the interaction is called antiferromagnetic, and if  $J_{ij} = 0$  the spins are noninteracting. A ferromagnetic interaction tends to align spins, and an antiferromagnetic tends to antialign them. The spins can be thought of as living on a graph, where each node has exactly one spin, and each edge connects two spins with a nonzero value of  $J$ . If all the  $J$ s are equal, it is convenient to measure energy in units of  $J$ . Then a model is completely specified by the graph and the sign of  $J$ . The antiferromagnetic one-dimensional Ising model has the energy function:  $E = \sum_i S_i S_{i+1}$ , where  $i$  runs over all the integers. This links each pair of nearest neighbors.

In his 1925 PhD thesis, Ising solved the model for the 1D case. In one dimension, the solution admits no phase transition. On the basis of this result, he incorrectly concluded that his model does not exhibit phase behaviour in any dimension. It was only in 1949 that Ising knew the importance his model attained in scientific literature, 25 years after his Ph.D thesis. Today, each year, about 800 papers are published that use the model to address problems in such diverse fields as neural networks, protein folding, biological membranes and social behavior.

[from [http://en.wikipedia.org/wiki/Ernst\\_Ising](http://en.wikipedia.org/wiki/Ernst_Ising)]