

C

~~Notice that we~~

System of two vortices

(see homework.)

$$\epsilon_{8\sqrt{2}} = 26,383322$$

$$\epsilon_{4\sqrt{2}} = 22,971028$$

$$\hline 3,412294$$

$$U = -\pi J_R [\log 8\sqrt{2} - \log 4\sqrt{2}]$$

$$\Delta U = -\pi J_R \cdot \log 2 = 3.41229$$

Conclusion

$g_2(r) \sim \exp(-kr) (-k_B T / 2\pi J)$   
Sph waves.

$\pi(v)$   
↑  
distance of  
vortices  
 $\sim \left(\frac{r_{ij}}{a}\right)^{-((3\pi J R))}$   
 $\sim \underline{\underline{r^{-\frac{1}{T} \pi J R}}}$

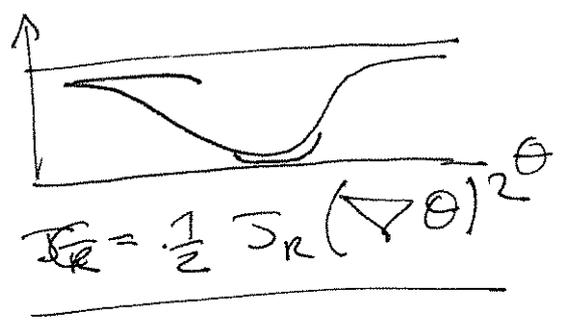
Exact results:

Fröhlich & Spencer 1981: Rigorous proof of the existence of the BKT Phase.

Nonuniversality

$2J$  fixes Energy Scale:  
For  $k_B T \gg J$

$T_{FIRST ORDER} \sim J$
$T_{KT} \propto J R$



~~Domany~~

Domany, Schick, Sorensen (1984)

*Lecture 10. Kosterlitz-Thouless physics in two dimensions: The XY model  
(Transitions without order parameters 1/2)*

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## Lecture 11

# **Kosterlitz-Thouless physics in two dimensions: KTHNY Melting theory (Transitions without order parameters 2/2)**

Physics in two dimensions -

Literature:

- Kosterlitz 2016
- Kosterlitz & Thouless 1973
- Kosterlitz 1974
- Herring 1968
- HALPERIN NELSON 1978

Kosterlitz-Thouless Physics 2/2

Two-dimensional solid and superfluids

- Young 1979 a) 1973 Kosterlitz-Thouless paper -> Motivation
- Nelson & Kosterlitz 1977 b) The Crystalline State.

2) Review of Lecture 7:

At low temperature, spin waves is all there is

Two harmonic models:  
I harmonic approximation to XY model  
Wegner 1973

1D:  $g(r) = \langle \cos(\phi_0 - \phi_r) \rangle \sim \exp(-k_B T / \frac{v}{2c} r)$

2D:  $g(r) \sim r^{-k_B T}$

3D:  $g(r) \sim \exp(-k_B T f_3(r))$

II HARMONIC SOLID

JANCOVICI (1973)

The harmonic solid has no phase transition, but it has logarithmic correlations in 2d

At low temperature, phonon is all there is.

Peierls, Landau, JANCÓ: It is pointed out that the classical two-dimensional harmonic solid exhibits an infinite generalized susceptibility at low temperature, although there is no long-range order and no phase transition.

$\langle u_k^2 \rangle \omega_k^2 \sim k_B T$

$\langle u_k^2 \rangle \sim \frac{k_B T}{\omega_k^2} \sim \frac{k_B T}{k^2}$

$\langle \Delta r^2 \rangle \sim k_B T \int \frac{1 - \cos k R}{k^2} d^d k$

$\propto k_B T \int_{k \geq 1/R}^{\infty} \frac{1}{k^2} d^d k$

$\propto \frac{k_B T R}{k} \log R$   $d=1$   $\propto k_B T R$   $d=2$   $d \geq 3$

ND. MERTIN (1968)

[2]

CRYSTALLINE ORDER IN TWO DIMENSIONS

$$\langle (u(\vec{R}) - u(\vec{R}')) \cdot \vec{R} \rangle \sim \log |\vec{R} - \vec{R}'|$$

but

$$\left[ \vec{r}(\vec{R} + \vec{a}_i) - \vec{r}(\vec{R}) \right] \left[ \vec{r}(\vec{R}' + \vec{a}_i) - \vec{r}(\vec{R}') \right] \sim \text{const}$$



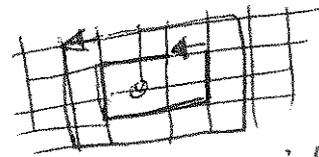
This shows that the harmonic solid, in two dimensions has quasi-longrange positional order but TRUE long-range orientational order.

Kosterlitz-Thouless (1973)

The "paper", but quite buggy.

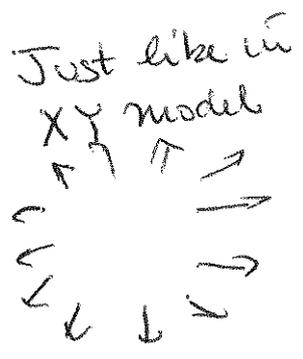
Starting point:

Dislocations:

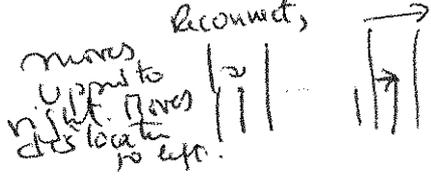


When there is a single dislocation, the strain

A dislocation in 2d is a point. (but with a Burgers vector, that is a lattice vector)



Free dislocation: no resistance to shears.



1934/: Plastic deformations are to be explained in terms of dislocations. Dislocations are the "carriers" of plastic deformation.

The energy of an isolated dislocation with Burgers vector of magnitude  $b$  in a system of area  $A$

$$E_{\text{disloc}} \sim \frac{\sqrt{b^2 (4\pi)} \log \frac{A}{A_0}}{4\pi}$$

Strain produced is inversely proportional to the distance from the dislocation, just like for the XY model.

In XY model, the KT "theory" was essentially

Nobel-prize winning, but very wrong.



This gives the critical temperature of the solid-liquid phase transition, in a similar way as it gives the XY transition temperature.

### MAIN TRICK OF KT:

~~FRABER~~ FORMULATE everything in terms

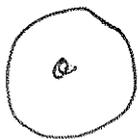
of  $U(r_{ij}) = \sum_i \sum_j q_i q_j \log(r_{ij})$ .

As we did last week.

Coulombs

2d

3d.



$$2\pi \epsilon E = 2\pi$$

$$E \sim \frac{1}{r}$$

$$U(r) \sim \log r$$

$$E \sim \frac{1}{r^2}$$

$$U(r) \sim \frac{1}{r}$$

This is called Coulomb potential in 2 dimensions.

2 dimensional Coulomb gas.



And it really describes KT physics of the XY model, as it is this way.

Young (1979) →  
Melting and the vectors  
Coulomb gas in two dimensions

In the Kosterlitz-Thouless theory the harmonic approximation is exact at all temperatures below  $T_c$ , provided ~~that~~ one only investigates flux

2] 
$$\mathcal{H} = \mathcal{H}_0 + \mathcal{H}_D$$

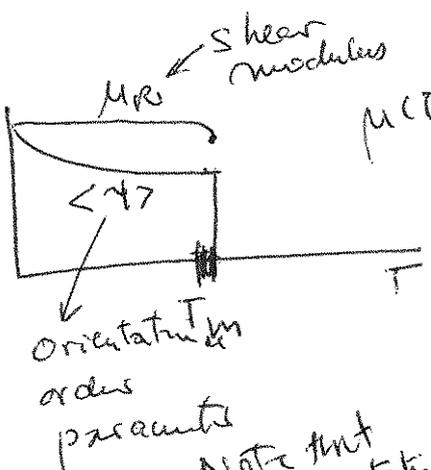
$$\begin{matrix} \uparrow & \uparrow \\ \text{phonon} & \text{dislocation} \\ \text{field} & \end{matrix}$$

1] A dislocation can be regarded as a tightly coupled pair of disclinations HN 78

$$\mathcal{H}_D = -\frac{1}{8\pi} \sum_{R, R'} K_1 \vec{b}(R) \vec{b}(R') \ln \left( \frac{|\vec{R} - \vec{R}'|}{a} \right) + K_2 \frac{\vec{b}(R) \cdot (\vec{R} - \vec{R}') \cdot \vec{b}(R') (\vec{R} - \vec{R}')}{(R - R')^2}$$

Theory of dislocations -  
NABARRO 1967

$K_2 = 0$ : object of initial study by Nelson 1978



$$\mu(T) = \mu(T_m) [1 + \text{const} (T_m - T)^{0.38963 \dots}]$$

\* Picture of a free dislocation to show in ...

\* Picture of a dislocation pair

~~Below~~ Above  $T_m$ , there are free dislocations. This means that to perform shear, one can create pairs of dislocations.

More detailed study shows that the correlations are ~~not~~ algebraically decaying...

# Hexatic Phase

→ (Halperin, Nelson 1978).

Free dislocations destroy positional order

$$H_{\text{hex}} \sim \frac{1}{2} K_A \int [\nabla \theta \omega]^2 d^2 r.$$

↑  
Frank constant

It is this phase that is analogous to the low temperature phase of the XY model...

---

⊕ behind this is a hexatic-liquid transition which is no longer...

+ Picture of a <sup>negative</sup> disclination (7 neighbors)

+ Picture of a positive disclination (5 neighbors).

Is the KTHNY scenario

truly realized in two-dimensional  
particle systems?

⇒ hard disks: No

⇒ soft disks: It depends  
+ improvisation

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*Lecture 11. Kosterlitz-Thouless physics in two dimensions: KTHNY Melting theory  
(Transitions without order parameters 2/2)*

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## Lecture 12

# The renormalization group - an introduction

The present chapter is inspired by the paper by Maris and Kadanoff [23]. Let's resume the situation of equilibrium statistical mechanics, and second-order phase transitions:

- Phase transitions are non-analyticities of the free energy with respect to parameters as the temperature, the magnetic field, etc. This is what we studied in earlier chapters using the transfer matrix. We studied in detail how these non-analyticities can arise from the transfer-matrix formulation.
- Landau theory states that the free energy *is* analytic in parameters such as  $M$ ,  $\nabla M$ ,  $T$ ,  $H$ , etc. The mechanism of how nature constructs a non-analyticity from an analytic function is symmetry breaking: The correct value of the free energy is the minimum of the analytic function. Above  $T_c$ , for example, this minimum is at  $M = 0$ , but below  $T_c$ , this is no longer the case.
- In the chapter on the Ginzburg criterium, we have seen that the predictions of mean-field theory (in other words, of Landau theory) are self-consistent above a critical dimension, but below this dimension they are not consistent, and therefore they are wrong. This has to be understood.
- Finally, there is the subject of universality: Many microscopic models have the same critical exponents, which is a subject to be understood.

Revolutionary clarification was brought about by the renormalization group.

Let us take the example of the one-dimensional Ising model, with the partition function

$$Z = \sum_{\sigma} \exp [K (\sigma_1 \sigma_2 + \sigma_2 \sigma_3 + \sigma_3 \sigma_4 + \cdots +)] \quad (12.1)$$

This can be written as

$$= \sum_{\sigma_1, \sigma_3, \sigma_5 \dots} \{ \exp [k (\sigma_1 + \sigma_3)] + \exp [-k (\sigma_1 + \sigma_3)] \} \{ \exp [k (\sigma_3 + \sigma_5)] + \exp [-k (\sigma_3 + \sigma_5)] \}, \quad (12.2)$$

where we have written out explicitly the  $\pm$  terms of  $\sigma_2$ ,  $\sigma_4$ , etc.

Each of the terms in the above product equals terms as in  $2 \cosh [k (\sigma_1 + \sigma_3)]$ , which can be written as  $f(k) \exp(k' \sigma_1 \sigma_3)$ , where  $f(k)$  does not depend on  $\sigma_1$  nor on  $\sigma_3$ . The solution of this little equation is

$$\sigma_1 = \sigma_3 : e^{2k} + \exp -2k = f e^{k'} \quad (12.3)$$

$$\sigma_1 = -\sigma_3 : 2 = f e^{-k'} \quad (12.4)$$

$$(12.5)$$

with the solution  $f^2 = 2 [\exp(2k) + \exp(-2k)] = 4 \cosh(2k)$  so that we have  $f = 2 \cosh^{1/2}(2k)$ . Entering this into the previous equation, we find  $1 = \cosh^{1/2}(2k) \exp(-k')$  or, in other words:

$$k' = \frac{1}{2} \log [\cosh(2k)] \quad (12.6)$$

... and we have the exact relationship:

$$Z = f(k)^{N/2} e^{k'(\sigma_1 \sigma_3 + \sigma_3 \sigma_5 + \sigma_5 \sigma_7 + \dots)} \quad (12.7)$$

The structure of this equation is  $Z(N, k) = f(k)^{N/2} Z(N/2, k')$ . Let us now write  $\log Z = N\xi$ , which takes us to

$$\xi(k) = \frac{1}{2} \log f(k) = \frac{1}{2} \xi(k') \quad (12.8)$$

$$\xi(k') = 2\xi(k) - \log [2 \cosh^{1/2}(2k)] \quad (12.9)$$

If the partition function is known for one value of  $k$  (or for the temperature  $T$ ), then it is known for another value of  $k$ , namely  $k'$ , where it corresponds to the identical Ising model on a twice larger lattice. From eq. (??), we see that  $k' = \frac{1}{2} \log [\cosh(2k)] < k$  for  $k > 0$ . This means that the "flow goes towards smaller  $k$ " or, in other words, towards  $T \rightarrow \infty$ .

It is interesting that we may write the recursion relation for the free energy per particle going from  $k' \rightarrow k$ . This leads us to

$$\xi(k) = \frac{1}{2} \log 2 + \frac{1}{2} k' + \frac{1}{2} \xi k' \quad (12.10)$$

Now, at  $k' = 0.01$ , we can expect that the free energy per particle equals  $\log 2$  to extremely good approximation. We then deduce the free energy per particle at temperature  $k = 0.100334$ , etc. where we find that the free energy per particle is 0.698147 instead of the exact value 0.698172, and eventually, at  $k = 2.702146$ , we find a  $\xi = 2.706633$  instead of the exact 2.706634.

The flow diagram which gives  $k'$  as a function of  $k$  shows how  $k$  moves under recursions, and we notice that there are only two points where  $k' = k$ , namely 0 and  $\infty$ .  $k = 0$  is a stable fix point and  $k = \infty$  an unstable one.

We now use the same procedure for the two-dimensional Ising model, leaving out every other spin in the operation that resembles our approach in one dimensions. Applying a diagonal elimination, at each spin (that we call 0), we have four neighboring spins  $\sigma_1, \sigma_2, \sigma_3, \sigma_4$ .

$$e^{k(\sigma_1 + \sigma_2 + \sigma_3 + \sigma_4)} + e^{-k(\sigma_1 + \sigma_2 + \sigma_3 + \sigma_4)} \quad (12.11)$$

---

Now it would be great if one could write this in terms of  $\sigma_1\sigma_2$  and  $\sigma_2\sigma_3$  and so on, but this is impossible. What is possible is to write

$$Z = f(k)^{N/2} \sum \exp \left( k_1 \sum_{nn} \sigma_p \sigma_q + k_2 \sum_{nnn} \sigma_p \sigma_q + k_3 \sum_{\text{plaquette}} \sigma_p \sigma_q \sigma_r \sigma_s \right) \quad (12.12)$$

where

$$f(k) = 2 \cosh^{1/2}(2k) \cosh^{1/8}(4k) \quad (12.13)$$

$$k_1 = \frac{1}{4} \log [\cosh(4k)] \quad (12.14)$$

$$k_2 = \frac{1}{8} \log [\cosh(4k)] \quad (12.15)$$

$$k_3 = \frac{1}{8} \log [\cosh(4k)] - \frac{1}{2} \log [\cosh(2k)] \quad (12.16)$$

(Here we see that  $k_1$  is twice larger than  $k_2$ , because the nn terms arise from two plaquettes rather than from a single one.)

We see that on a larger scale, the Ising model on a two-dimensional square lattice is not described through an Ising model.

What to do?

1/ we could simply neglect the values of  $k_2$  and of  $k_3$ , in order to force that on the larger scale, the Ising model is once again described by an Ising model. This leads to the recursion:

$$k' = \frac{1}{4} \log [\cosh(4k)] \quad (12.17)$$

which, when compared with eq. (??), gives the same flow as the one-dimensional Ising model, and leads to the absence of a phase transition.

A much more interesting (but ad-hoc) case is realized as follows: See that  $k_1$  and  $k_2$  are ferromagnetic. Therefore, let us simply add the generated nnn interaction to the new nn interaction (there are as many nearest neighbors as there are next-nearest neighbor interactions). This leaves us with

$$k' = k_1 + k_2 \quad (12.18)$$

$$= \frac{3}{8} \log [\cosh(4k)] \quad (12.19)$$

Note that  $3/8 > 1/4$ . Solving for the fixed point  $k = k'$  leaves us with

$$k = \frac{1}{4} \cosh^{-1} [\exp(\frac{3}{8} \log [\cosh(4k)])] = 0.506981 \quad (12.20)$$

which compares favorably with the exact value 0.44069. The solution with adds  $k_1$  and  $k_2$  is deceptively simple, and not very good physics. In fact, this is the starting point of what is called "real-space renormalization", and of the renormalization in general.

It is also interesting, as was done by Wilson 1975, to compute the values of  $k_1 = 1.00376$ ,  $k_2 = 0.137327$ , and  $k_3 = -0.035960$  at the exactly known critical point.

Here we have that:

*Lecture 12. The renormalization group - an introduction*

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- Singularities in the free energy correspond to nontrivial unstable fixed points of the RG flow.
- Critical exponents correspond to the linearized RG flow close to the fixed point.
- Universality means that the behavior of the system described by the fixpoint of the recursion relation (or a differential equation) close to the fixed point.

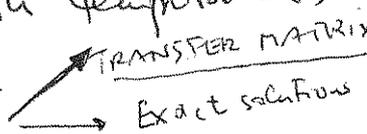
Further reading is Kadanoff and Houghton 1975, and especially Wilson in his 1975 RMP[24] where, instead of 4 spins, he used 15 spins.

Renormalization Group, an Introduction

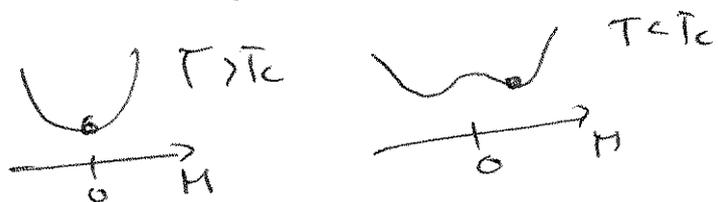
MARIS & Kadanoff  
 ASP 1978  
 Kadanoff  
 1966  
 Wilson  
 RMP... 1975  
 Wilson  
 RMP 1983

Reminders:

- \* Phase transition as non-analyticity of free energy with temperature, magnetic field, etc.
- \* Landau theory: Free energy is analytic in  $T, \Delta T, T_c$ , non-analyticity stems from



\* Above  $T_c$  predictions of MFT are correct, below they are not



\* Universality:  
 Many models have the same exponents, how to explain

Example: one-dimensional Ising model:

$$Z = \sum_{\{\sigma\}} \exp [K (\sigma_1 \sigma_2 + \sigma_2 \sigma_3 + \sigma_3 \sigma_4 + \sigma_4 \sigma_5 + \dots)]$$

$$= \sum_{\sigma_1, \sigma_3} \left[ \exp K [\sigma_1 + \sigma_3] + \exp [-K [\sigma_1 + \sigma_3]] \right] \times \left[ \exp K [\sigma_3 + \sigma_5] + \exp [-K [\sigma_3 + \sigma_5]] \right]$$

Write  $\exp K [2 \cosh [K [\sigma_1 + \sigma_3]]] = f(\sigma) \cdot \exp [K' [\sigma_1, \sigma_3]]$   
 not depend on  $\sigma_1, \sigma_3$

Solution:

$$\sigma_1 = 1 = \sigma_3$$

$$e^{2K} + e^{-2K} = f \exp K'$$

$$2 = f \exp(-K')$$

$$\Rightarrow f^2 = 2 [\exp(2K) + \exp(-2K)] = 4 \cosh(2K)$$

$$f = 2 \cdot \cosh^{1/2}(2K)$$

$$1 = \cosh^{1/2}(2K) \exp(-K')$$

$$\exp(K') = \cosh^{1/2}(2K)$$

$$\boxed{K' = \frac{1}{2} \log(\cosh(2K))} \quad *$$

$$Z = f(K)^{N/2} e^{K'(\sigma_1 \sigma_3 + \sigma_3 \sigma_5 + \sigma_5 \sigma_7 + \dots)}$$

$$Z(N, K) = f(K)^{N/2} Z(N/2, K')$$

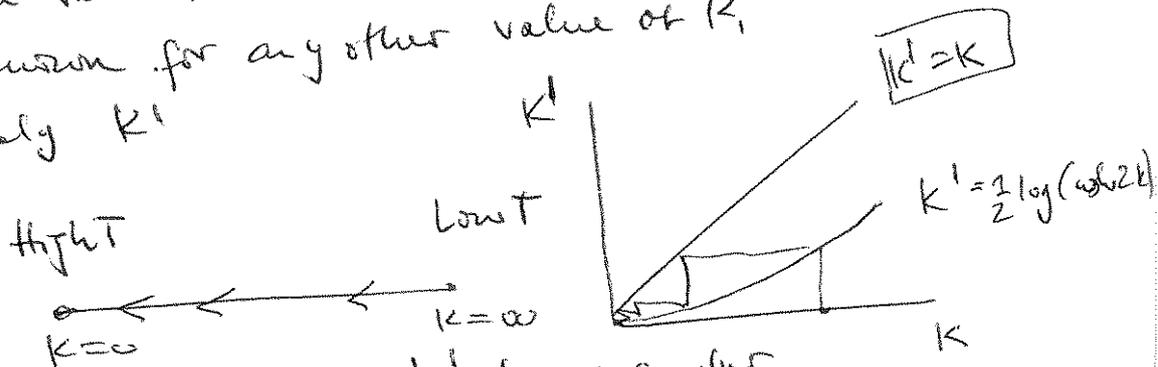
↑  
original partition  
function

$$\ln Z = N \xi$$

$$\downarrow \xi(K) = \frac{1}{2} \log f(K) + \frac{1}{2} \xi(K')$$

$$\xi(K') = 2 \xi(K) = \log(2 \cosh^{1/2}(2K))$$

If the partition function is known for one value of  $K$  (or  $T$ ), then it is known for any other value of  $K$ , namely  $K'$



$K'$  always smaller than  $K$ . This means "Flow goes towards  $T \rightarrow \infty$ "

Practical Maths: One can write the recursion relation in the other way

$$\frac{1}{2} \ln^{-1} \exp(2K') = K. \quad \swarrow \text{using}$$

$$f(K) = \frac{1}{2} \log 2 + \frac{1}{2} K' + \frac{1}{2} f(K').$$

$$K \leftarrow K'$$

~~\*~~

$$K' \approx 0.01$$

$$f(0.01) \approx \log 2.$$

$$K = 0.100334$$

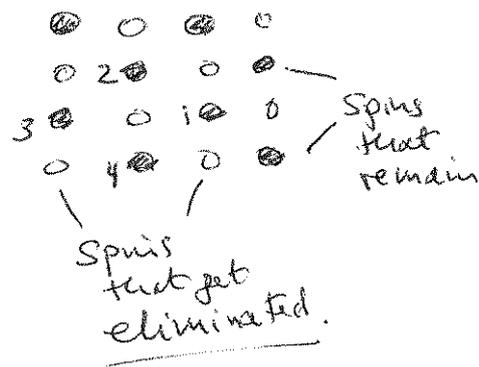


$$K = 0.01.$$



Let's use the same procedure for the two-dimensional Ising model

$$Z = \sum_{\text{nw}} e^{K \sum_i \sigma_i \sigma_j}$$



$$e^{K(\sigma_1 + \sigma_2 + \sigma_3 + \sigma_4)} + e^{-K(\sigma_1 + \sigma_2 + \sigma_3 + \sigma_4)}$$

$$\prod_{\text{plaquettes}} 2 \cosh(K(\underbrace{\sigma_1 + \sigma_2 + \sigma_3 + \sigma_4}_{\text{sums of spins around plaquette}}))$$

Just as before, where we wrote

$$2 \cosh(K(\sigma_1 + \sigma_3)) = f(k) \exp(K' \sigma_1 \sigma_3)$$

We now write

$\sigma_1 + \sigma_2 + \sigma_3 + \sigma_4$  in terms of

$$1, \sigma_1 \sigma_2 + \sigma_2 \sigma_3 + \sigma_3 \sigma_4 + \sigma_2 \sigma_3 + \sigma_2 \sigma_4 + \sigma_3 \sigma_4$$

and  $\sigma_1 \sigma_2 \sigma_3 \sigma_4$

$$\Rightarrow e^{K(\sigma_1 + \sigma_2 + \sigma_3 + \sigma_4)} + e^{-K(\sigma_1 + \sigma_2 + \sigma_3 + \sigma_4)} =$$

$$f \exp \left[ \frac{1}{2} K_1 (\sigma_1 \sigma_2 + \sigma_2 \sigma_3 + \sigma_3 \sigma_4 + \sigma_4 \sigma_1) \right. \\ \left. + K_2 (\sigma_1 \sigma_3 + \dots) \right]$$

$$f(k) = 2 \cosh$$

$$e^{4K}$$

$$K_1 = \frac{1}{4} \log \cosh(4K)$$

$$K_2 = \frac{1}{2} \log \cosh(4K)$$

$$K_3 = \frac{1}{8} \log \cosh(4K) - \frac{1}{2} \log \cosh(2K)$$

2

$$f(k) = 2 \cosh^{1/2}(2k) \cosh^{1/8}(4k)$$

$$K_1 = \frac{1}{4} \log \cosh 4k$$

$$K_2 = \frac{1}{8} \log \cosh(4k)$$

$$K_3 = \frac{1}{8} \log \cosh(4k) - \frac{1}{2} \log \cosh(2k)$$

$$Z = f(k)^{N/2} \sum \exp \left( K_1 \sum_{nn} \sigma_p \sigma_q + K_2 \sum_{nnn} \sigma_p \sigma_q + K_3 \sum_{sf} \sigma_p \sigma_q \sigma_r \right)$$

There is a difference in

$K_1$  is twice larger than  $K_2$ , because the  $nn$  terms arrive for two plaquettes.

We obtain from a hamiltonian with  $nn$  interactions  $\rightarrow$  hamiltonian with  $nn, nnn + sf$  interactions.

What to do?

(1) Simply ignore  $K_2, K_3$ .

$$\rightarrow K' = \frac{1}{4} \log \cosh(4k)$$

(compare, earlier  $\frac{1}{2} \log \cosh(2k)$ )

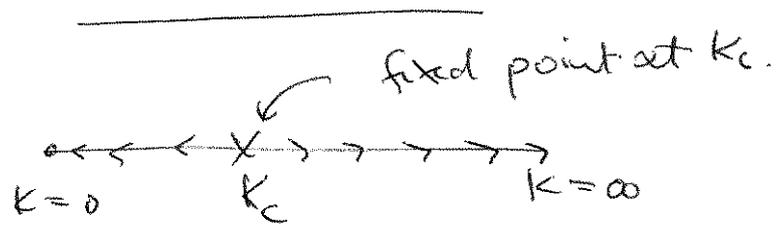


Bell's result:

$K_1$  and  $K_2$  are ferromagnetic.  
Therefore, let us simply add the  
generated  $nnn$  interaction to the  
new  $nn$  interaction (there are  
as many nearest-neighbour as  
next-nearest-neighbour interactions)

$$K' = K_1 + K_2$$
$$= \frac{3}{8} \log \cosh(4K)$$

Ad hoc



Solving for fixed point:  $k \rightarrow \tilde{k}$

$$\tilde{k} = \frac{1}{4} \text{acosh} \left[ \exp \frac{8}{3} k' \right] = 0.5069 K'$$

It is at this point that the  
correlation function is infinite,  
and that one has an infinite correlation length.

A fixed point can only appear when  
the  
1. Stat Mechanics, ~~a fixed point~~  
A new variable the...

Solution which adds  $K_1$  and  $K_2$  is  
deceptively simple.

In fact, this is the starting point of  
what is called "Real-space renormalization".

- Singularities of the free energy  $\Leftrightarrow$  continuous unstable fixed points of the RG Flow
- CRITICAL EXPONENTS  $\Leftrightarrow$  Behavior of the ~~renormalized~~ RG Flow close to the fixed point //
- Universality  $\Leftrightarrow$  Behavior of the system described by the fix of a recursive relation (or a differential equation) close to the fixed point.

Think globally; act locally

Further reading:

Kadanoft & Houghton 1975

And especially Wilson RMP 1975

↳  
Instead of using 4 spins

↳  
15 spins in the 2d  
Ising model

↳  
15 spins + 65000 configurations

Exact expands to 92%.

---

```

import math
K0 = 1.0
Knn = 2.0
for k in [-1, 1]:
    for l in [-1, 1]:
        for m in [-1, 1]:
            for n in [-1, 1]:
                S0 = 1.0
                S2 = k * l + k * m + k * n + l * m + l * n + m * n
                S4 = k * l * m * n
                L0 = (2.0 * K0 + math.log(2.0) + math.log(math.cosh(4.0 * Knn)) / 8.0
+
                    math.log(math.cosh(2.0 * Knn)) / 2.0)
                L2 = math.log(math.cosh(4.0 * Knn)) / 8.0
                L4 = math.log(math.cosh(4.0 * Knn)) / 8.0 - math.log(math.cosh(2.0 * K
nn)) / 2.0
                first_term = 2.0 * math.exp(2.0 * K0) * \
                    math.cosh(Knn * (k + l + m + n) )
                second_term = math.exp(L0 * S0 + L2 * S2 + L4 * S4)
                print first_term, second_term

```

```

22026.4682736 22026.4682736
403.564128776 403.564128776
403.564128776 403.564128776
14.7781121979 14.7781121979
403.564128776 403.564128776
14.7781121979 14.7781121979
14.7781121979 14.7781121979
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403.564128776 403.564128776
403.564128776 403.564128776
22026.4682736 22026.4682736

```



## Lecture 13

# Quantum statistics 1/2: Ideal Bosons



## Lecture 14

# Quantum statistics 2/2: $^4\text{He}$ and the 3D Heisenberg model, Non-classical rotational inertia



## Lecture 15

# The Fluctuation–Dissipation theorem (an introduction)



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