Statistical and mathematical physics of discrete lattice models

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Statistical mechanics

Boltzmann (1844 – 1906) and Gibbs (1839 – 1903)









(b) Boltzmann's tombstone

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Statistical mechanics

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Canonical ensemble: *N* particles of mass *m*, momentum \mathbf{p}_i^2 , in a volume *V* at temperature *T*, and $\beta = 1/k_BT$.

• Canonical partition function

$$Z(V, N, T) = \frac{1}{N!} \int d\Gamma \exp(-\beta H)$$

- Hamiltonian $H = \sum_{i=1}^{N} \frac{\mathbf{p}_i^2}{2m} + \sum_{1 \le i < j \le N} \phi(|\mathbf{r}_i \mathbf{r}_j|)$
- Momentum integral gives $(2\pi m k_B T)^{3N/2}$, so

$$Z(V, N, T) = \lambda \int \cdots \int d\mathbf{r}_1 \cdots d\mathbf{r}_N \exp\left(-\beta \sum_{i < j} \phi(|\mathbf{r}_i - \mathbf{r}_j|)\right)$$

where
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• Thermodynamics comes from $\Psi(V, N, T) = -k_B T \log Z(V, N, T).$

• The *thermodynamic limit* exists for appropriate $\phi(r)$, $\lim_{N, V \to \infty, N/V \text{ fixed}} \frac{1}{N} \Psi(V, N, T) = \psi(\rho = N/V, T).$

• The TL is essential for a phase transition

 For a variable number of particles, one has the Grand Canonical Partition Function – just the ogf of the CPF:

$$\mathcal{Z}(V,T,z)=\sum_{n=0}^{\infty}Z(V,n,T)z^{n},$$

where *z* is called the *fugacity*.

• Thermodynamics follow from, e.g. $PV = k_B T \log \mathcal{Z}(V, T, z), \langle N \rangle = z \frac{\partial}{\partial z} \log \mathcal{Z}(V, T, z).$



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Some well-known models

The Lenz-Ising (1900–1998) model and Potts (1925 – 2005) model







(f) Ren Potts

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• $H = -J \sum_{\langle i,j \rangle} \sigma_i \cdot \sigma_j, \quad \sigma_i = \pm 1.$ • $Z = \sum_{\sigma_1 = \pm 1} \cdots \sum_{\sigma_N = \pm 1} \exp(-\beta H).$

- Generalise to the O(n) model, where σ_i is now an *n*-dimensional vector. (Stanley 1968).
- The Ising model is O(1). de Gennes pointed out that O(0) is the SAW model (1972).
- n = ∞ gives the spherical model. n = 2 the XY model, n = 3 the PCH model, n = -2 the Gaussian model.



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 It is simple to solve the 1d Ising model. The free-energy in the TL is:

$$rac{-\psi}{k_BT} = \log(2\cosh(eta J)).$$

- No phase transition. Boring!
- Rescued by metallurgists interested in binary alloys.
- Onsager, in 1944, solved the 2d model:

$$\frac{-\psi}{k_BT} = \frac{\log 2}{2} + \frac{1}{2\pi} \int_0^{\pi} \log\left(c^2 + \sqrt{s^2 + 1 - 2s\cos\theta}\right) d\theta.$$

Here $c = \cosh(2K)$, $s = \sinh(2K)$.



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de Gennes and Onsager





(g) Pierre-Gilles de Gennes 1932–2007, Nobel Physics 1991 (h) Lars Onsager 1903–1976, Nobel Chem. 1968



$$Z = \sum_{\{\sigma\}} \prod_{\langle i,j \rangle} \exp(K\sigma_i \sigma_j); \ K = J/k_B T.$$

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- On a lattice, σ_iσ_j can be represented by a bond from σ_i to neighbouring bond σ_j.
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- Thus *Z* is a sum over all graphs on the lattice with every vertex of even degree. We now have a combinatorial counting problem!



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The Potts model

• At each lattice site place one of *q* colours, {1,2,...,*q*}. The Hamiltonian is

$$H = -J \sum_{\langle i,j \rangle} \delta(\sigma_i, \sigma_j),$$

so the interaction is 1 if adjacent spins have the same colour, and 0 otherwise. Then with $K = J/k_BT$,

$$Z(q, K) = \sum_{\{\sigma_i\}} \exp\left(K \sum_{\langle i, j \rangle} \delta(\sigma_i, \sigma_j)\right)$$

 When q = 2 it is just the Ising model. But as q → 1 we get a percolation problem. As q → 0 one obtains the number of spanning forests. Other interesting limits exist.



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- One connection with combinatorics is through the Tutte polynomial. Set $x = 1 + \frac{qe^{-\kappa}}{1-e^{-\kappa}}$, $y = e^{k}$, then $T(x, y) = \sum_{i,j\geq 0} t_{i,j}x^{i}y^{j}$.
- The Tutte polynomial coincides with the Potts model along the hyperbola (x 1)(y 1) = q.
- The Potts model for $q \ge 2$ has, like the Ising model, a straightforward graphical expansion.



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Near a (second-order) phase transition, as exhibited, e.g. by the Ising model, thermodynamic quantities behave as

$$f(z)=\sum a_n z^n\sim A(1-z/z_c)^{\gamma}.$$

Then
$$a_n \sim \frac{A \cdot n^{-\gamma-1}}{\Gamma(\gamma) \cdot z_c^n}$$
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- In combinatorics, we ideally seek closed form expressions for the generating functions, or rigorous asymptotics.
- In statistical mechanics, one is often content to identify *γ*, *z_c* and *A*, the critical exponent, critical point and critical amplitude respectively.
- Universality: The exponent is common across many different problems.



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Scaling

If f(ξ) ~ Aξ^γ where ξ = 1 − z/z_c, this can be considered a solution of

$$f(\lambda\xi) = \kappa f(\xi),$$

with $\kappa = A\lambda^{\gamma}$. That is, a scaling of ξ corresponds to a rescaling of *f*. (Equivalently, $f(\lambda^{1/\gamma}\xi) = \lambda f(\xi)$.)

• This rescaling can be applied to functions of more than one variable, so for a magnetic system (Hamiltonian has a second, field variable, say *H*), we have

$$f_{s}(\lambda^{y_{t}}\xi,\lambda^{y_{h}}H)=\lambda^{d}f_{s}(\xi,H),$$

where *d* is the spatial dimension, and y_t and y_h are exponents in terms of which all other related exponents may be derived.

• This then implies

$$f_s(\xi, H) \sim |\xi|^{-d/y_t} F(H|\xi|^{y_t/y_h})$$



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Polygons - Richard, Jensen, Guttmann

• For square lattice polygons,

$$P(x,q)\sim P^{(reg)}(x,q)+(1-q)\cdot F\left(rac{x_c-x}{(1-q)^{2/3}}
ight)+C(q)$$

• Here,

 $F(s) = const. \log Ai(const.s),$

and $C(q) = \frac{1}{12\pi}(1-q)\log(1-q)$.

 These scaling ideas, due to Kadanoff, Widom, Fisher and others in the '60s are a mathematical manifestation of the physical idea that at the critical point, all length scales are important.



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• Precedes K Wilson, Kadanoff 1966



- Assume physics stays the same as we reblock. Then H(T, J) → H(T', J') → H(T'', J'') etc. Iterates to a fixed point.
- For the 1d Ising model, the RG flow goes from order (T = 0) to disorder $(T = \infty)$.
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- Not a group. No renormalization. "The" is inappropriate. (Cardy).
- More generally, if $\{\sigma_i\} \rightarrow \{\sigma'_i\}$, and $\{J_k\} \rightarrow \{J'_k\}$ such that

$$Z(\{\sigma_i\}, \{J_k\}) = Z(\{\sigma'_i\}, \{J'_k\}),$$

- Then $\{J'_k\} = \beta\{J_k\}$. The β -function is said to induce a renormalization flow on the *J* space.
- In momentum space, one applies a Fourier transform, and the renormalization idea corresponds to integrating out the highest momentum components. Reminiscent of QED, which is renormalizable.
- The physics is given by the behaviour of the β function, usually describable by a system of DEs.



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- In 2d, the conformal group is infinite.
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$$F = W f_{\infty} - \frac{\pi c}{6W} + \mathrm{o}(1/W).$$

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- Put arrows on the square lattice bonds, 2 pointing in/out.
- There are only 6 possible configurations.
- Give a Boltzmann weight w_i to configuration $i \in [1, \dots, 6]$.
- The partition function is

$$Z = \sum_{\{configs\}} \prod_{i=1}^{6} w_i^{m_i}$$

- Different choices of weights lead to different models.
 Solved by Lieb/Sutherland in 1967, for w_{1,2} = a, w_{3,4} = b, w_{5,6} = c.
- Adding two extra vertices (4 arrows in/out with $w_{7,8} = d$) leads to the 8-vertex model. Solved by Baxter in 1973.



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- The partition function is then given by eigenvalues of the TM.
- For the 6-v problem, the arrow conservation rules leads to a block diagonal structure of the TM.
- For small lattices, Lieb produced an Ansatz for the eigenvectors (the Bethe Ansatz. Bethe 1931 1d a-f H model)
- In fact the TM commutes, T(a, b, c)T'(a', b', c') = T'(a', b', c')T(a, b, c), and Baxter realized that invoking this bypasses the Bethe Ansatz.



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- In this case the TM doesn't commute.
- Baxter investigated the conditions under which T(a, b, c, d) and T'(a', b', c', d') commute.
- He introduced a model with a third set of weights (a", b", c", d"), and found that if a condition relating the three models holds, then the TMs commute.
- This equation is called the *star-triangle* or *Yang-Baxter* equation.
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SOS and RSOS models

• The Bethe Ansatz gives TM eigenvectors, but the CTM method does not.

- Eigenvectors are needed to calculate other properties, e.g. correlation functions.
- Baxter devised an SOS model by putting a height variable h_i on each *face*, s.t. $|h_i h_j| = 1$.
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- For a restricted set of parameters, Andrews, Baxter and Forrester(1984) found the 8v SOS model yields an infinite hierarchy of solvable *restricted SOS* (RSOS) models.
- The first two members of this hierarchy are the Ising model and the hard hexagon model (Baxter 1980).
- One merely restricts the heights to the set $\{1, \dots, L\}$.
- In 1987 Pasquier rewrote the weights in terms of elements of an adjacency matrix, and realised that it could be replaced by *any* symmetric L × L matrix with elements 0 and 1, and all solvability properties still held.
- Now such adjacency matrices can of course be represented as graphs! Hence any graph gives rise to an associated solvable RSOS model. Graph state models.
- These models with ABF Boltzmann weights satisfy a T-L algebra with a simple set of generators.
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- Now such adjacency matrices can of course be represented as graphs! Hence any graph gives rise to an associated solvable RSOS model. Graph state models.
- These models with ABF Boltzmann weights satisfy a T-L algebra with a simple set of generators.
- Models other than the ABF models, but with the same weights, include the *q*-state self-dual Potts model.



- Nienhuis and colleagues showed that the p.f of an O(n) model can be written as a loop model
- Take a honeycomb lattice of 2N sites. Place arrows on edges such that at each vertex there are 0 or 2 arrows (1 in, 1 out). Gives oriented loops.
- Let *L* = # of arrows, *I*, *r* = # of vertices with a left/right turn.
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- Next consider a *q*-state Potts model on the triangular lattice, with *N* sites σ_i, with i ∈ 1, · · · , *q*.
- Then $Z_{Potts} = \sum_{\{\sigma\}} \exp\left(K \sum_{\langle ij \rangle} \delta(\sigma_i, \sigma_j)\right)$,
- Both the loop model and the Potts model are equivalent to a 6-v model on a kagomé lattice of 3*n* sites
- They are equivalent to the *same* model, and to one another, iff

- Then Z_{loop} = Z_{Potts}. Nienhuis argues, based on the properties of the system of ODEs specifying the Potts model RG, that this determines the critical point with α real and q ∈ [0, 4]. Thus for all n ∈ [-2, 2].
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