### Phase transitions in long-range spin models Transitions de phase dans les systèmes de spins régis par des interactions à longue portée

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E.N.S.E.A.

### **Organization of the thesis**

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights III. Spinodals Spinodals points Inverse-square interactions Unusual FSS IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion

## Models: phase diagram of classical spin models with a long-range potential

- Q-state Potts model (controversies reexamined, crossovers)
- Random-Field Ising model (first numerical study)

#### Methods: multicanonical ensemble algorithms

- Multicanonical algorithm with single-spin updates (tailored to long-range potentials)
- Spinodal method (detection of the order of phase transitions)
- Breathing cluster method (extends the range of attainable lattice sizes)

### **Organization of the talk**

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- I. Long-range Potts model: controversies and summary of the results of the thesis
- II. The Multicanonical method
- III. Spinodal method and phase diagram of the LR Potts model
- IV. Breathing clusters: rationale, performance, and results

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights III. Spinodals Spinodals points Inverse-square interactions Unusual FSS IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion

### I. Long-range Potts chain

### Long-Range Q-state Potts Chain

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$$s_i = 1 \dots q$$

$$\uparrow \qquad \uparrow \qquad \qquad \uparrow \qquad \qquad \uparrow$$

$$H = \sum_{i>j} J(|i-j|)\delta_{s_i,s_j}$$

Algebraically decaying ferromagnetic potential:

$$J(|i - j|) = \frac{-1}{|i - j|^{1 + \sigma}}$$

 $\sigma$  is an adjustable decay parameter of the interaction, akin to

an effective dimension.

Ordered phase: condensation in one of q phases.

### LR spin models in microscopic modelling

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#### In condensed matter physics:

- Systems with Van der Waals forces, Casimir effect.
- Kondo effect:  $1/r^2$  interactions
- Spin glasses: RKKY interaction  $r^{-D}\cos(k_0r + \phi)$ )
- Thin magnetic films

#### In connected fields:

- Neural networks, small-world networks.
- Spreading epidemics and Lévy flights
- Tsallis generalized thermodynamics

### Phase diagram: open questions and controversies





### Phase diagram: addressed issues

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Krech/Luijten, Glumac/Uzelac: standard Monte Carlo (cluster, histogramming)

### Phase diagram: addressed issues

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Nature of the transition at  $\sigma=1.0$ : topological vs first-order?



Bayong: single-histogram Monte Carlo

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#### **Cross-over from LR to SR behavior**



### Results

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- Phase diagram refined to two-digit accuracy
- Transition at  $\sigma = 1.0$  is not of the first-order (unusual finite-size effect)
- Crossover SR/LR inside a narrow window [1.0, 1.1].
- Methods: multicanonical ensemble + spinodal points.

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### **II. Multicanonical ensemble**

### Markov chains and detailed balance

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Generate a Markov chain of configurations  $\{\sigma_1, \sigma_2, \ldots\}$ using a transition probability  $W(i \rightarrow f)$  from  $\sigma_i$  to  $\sigma_f$ 

• Detailed balance for an equilibrium distribution  $w_i$ :

$$w_i W(i \to f) = w_f W(f \to i)$$

In the canonical ensemble:  $w_i = w(E_i) = e^{-\beta E_i}$ 

$$W(i \to f) = \min\left(1, e^{\beta(E_i - E_f)}\right)$$

#### Limitations of canonical algorithms

- Supercritical slowing down at first-order transitions
- Reweighting procedure cumbersome.

### Supercritical slowing down at first-order transitions

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### Supercritical slowing down at first-order transitions

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The surface tension  $\Delta F$  increases with the lattice size  $\rightarrow$  exponential suppression of mixed-phase configurations.



### **Multicanonical weights: algorithm**

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#### **Overcome supercritical slowing down:**

Enhance rare events

Reduce tunneling times from  $\tau \sim e^{aL^b}$  to  $\tau \sim L^z$  (Berg, Neuhaus)

#### Algorithm:

- Compute density of states n(E) iteratively: Berg-Neuhaus's, Wang-Landau's or transition matrix schemes
- Feed the Markov chain with  $w(E) \sim 1/n(E) = e^{-S(E)}$
- Thus sample a flat energy distribution: random walk in energy space
- Accept single-spin updates with a rate

$$W_{i \to f} = \min(1, e^{S(E_i) - S(E_f)})$$

### Multicanonical weights: algorithm

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### Multicanonical weights: random-walker

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#### Random walk in energy space



### **Reweighting of thermodynamic averages**

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights **III.** Spinodals Spinodals points Inverse-square interactions **Unusual FSS** IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion

Goal: obtain thermodynamic averages as continous functions of the temperature. Energy distribution:



### **Multicanonical reweighting: metastable states**

I. LR Potts model Modelling **Open questions** Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights **III.** Spinodals Spinodals points Inverse-square interactions Unusual FSS IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion Compute free energy over a large range of **energy** and **temperature**, thus yielding reliable estimates of **metastability temperatures**.



- Temperatures of metastability form the basis of the spinodal method exposed in the following.
- We have  $T_2 \rightarrow T_1$  as the first-order transition weakens.

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# III. Detecting the order of phase transitions: the spinodal method

### **Issue: weakening of the transition**



- Traditional estimators ( $\Delta F$ , Binder cumulants) fail: tend too smoothly to their limit value
- Need distinct indicator: ratio of spinodals points

### Weakening of the first-order transition

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- Assume FSS holds also for metastability temperatures:  $T_2(L) - T_2(\infty) \propto 1/L + O(1/L^2).$
- Metastability temperatures  $T_1$  and  $T_2$  (spinodal points) merge into  $T_c$  as  $\sigma \to \sigma_c$
- Yet  $T_2 T_1$  is **not** a good estimator.

### Spinodal points and the transition order

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A polynomial fit to infinite-size temperatures yields  $\sigma_c(3) = 0.72(1)$ 

Ratio T<sub>2</sub>/T<sub>c</sub> has a *negative* curvature
 Higher slope at σ<sub>c</sub> yields higher precision

### $\sigma = 1.0$ : controversy over the nature of the transition

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights **III.** Spinodals Spinodals points Inverse-square interactions Unusual FSS IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion



Topological transitions on the whole line (Cardy)

- $\sigma_c(q)$  crosses at q = 8 (Bayong)
- Transition at  $\sigma = 1.0$  is **not** of the first-order by virtue of an unusual finite-size effect.

### $\sigma = 1.0$ : unusual finite-size effect

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FSS shows that it is continuous in the thermodynamic limit.

### $\sigma = 1.0$ : unusual finite-size effect

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Interpretation in terms of the **truncation** of the LR potential due to the finite lattice size:

- artificially enhances the rigidity of the spin array at small lattice sizes.
- "Pulls" the model towards the boundary line  $\sigma_c(q)$



### **Conclusion (part I)**

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights III. Spinodals Spinodals points Inverse-square interactions Unusual FSS IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion

- Spinodal points method offers a drastic refinement of the position of the boundary line an unprecedented range of q and  $\sigma$  values.
- **Detailed FSS analysis** at  $\sigma = 1.0$  lends support to Cardy's scenario (topological transitions along the whole line).
- Crossover SR/LR over a narrow window [1.0, 1.1]

#### **Outlook:**

- Single-spin update efficient to solve some controversies
- New questions arise regarding FSS
- Need for a large range of linear lattice sizes
- Hence the need to design a specific method (next part)

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights III. Spinodals Spinodals points Inverse-square interactions Unusual FSS IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion

### **IV. Breathing clusters**

### Single-spin updates vs. cluster updates

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#### Multicanonical single-spin update implementations suffer from:

in the case of LR models, an additional O(N<sup>2</sup>) complexity stemming from the (mandatory) computation of the energy at each MC step.

non-optimal dynamic exponents z.

## Why is it interesting to combine clusters and multicanonical?

Clusters: improved dynamic performance

• We will show: cuts down the algorithmic complexity

### **Breathing clusters: algorithm complexity**

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights **III.** Spinodals Spinodals points Inverse-square interactions Unusual FSS IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion

**Goals:** Cut down algorithm complexity from  $O(N^2)$  to  $O(N \log N)$  for Long-Ranged (LR) spin models.



### **Breathing clusters: algorithm complexity**

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights **III.** Spinodals Spinodals points Inverse-square interactions Unusual FSS IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion

**Goals:** Cut down algorithm complexity from  $O(N^2)$  to  $O(N \log N)$  for Long-Ranged (LR) spin models.



### **Breathing clusters: dynamic characteristics**

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Reduce dynamic exponents to their ideal value  $z \sim D$ .

#### **Tunneling times and dynamic exponents**



### **Collective updates in multicanonical ensemble: issues**

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## Main impediment to a combination of both algorithm:

- Clusters need (i) symmetries in H (ii) a temperature;
- Multicanonical weights lose track of both: w(E) = 1/n(E)

#### How do we meet the issue?

- Cluster construction driven by the microcanonical temperature
- Rewrite the multicanonical weight as  $w(E) = \phi(E)e^{-\beta(E)E}$
- Yet acceptance rate no longer equal to 1!

### Fortuin-Kasteleyn mapping for LR models

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 $----- b_{ij} = 1$ 

 $\cdots \cdots b_{ij} = 0$ 

Invoke the Fortuin-Kasteleyn representation and rewrite w(E) as

$$w(E) = \phi(E) \sum_{[b]} \prod_{i < j} p_{ij}(E) \delta_{\sigma_i, \sigma_j} \delta_{b_{ij}, 1} + \delta_{b_{ij}, 0}.$$

with 
$$p_{ij}(E) = e^{\beta(E)J(|i-j|)} - 1$$
.

### **Cluster construction**

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights **III.** Spinodals Spinodals points Inverse-square interactions Unusual FSS IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion

#### Algorithm

1. Activate a bond with probability

$$\pi_a(i,j) = 1 - e^{-\beta(E_a)J(|i-j|)}.$$

- 2. Identify clusters of connected spins, and draw a new spin value at random for each cluster
- 3. Accept the attempted cluster flips with probability

$$W_{flip}(a \to b) = \min\left(1, \frac{\phi(E_b)}{\phi(E_a)} \prod_{l>1} \left[\frac{p_l(E_b)}{p_l(E_a)}\right]^{B(l)}\right),$$

where B(l) =number of bonds of length l = |j - i|.

**Note:** there exists an efficient algorithm for building clusters in O(N) operations (Luijten-Blöte): still usable here !

### Acceptance rate

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights **III.** Spinodals Spinodals points Inverse-square interactions **Unusual FSS** IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion At first order in  $\epsilon = E_b - E_a$ , we have

 $1 - \langle W_{flip} \rangle (E_a) \sim |\beta'(E_a)|\epsilon$ 



### Efficient computation of the lattice energy

I. LR Potts model Modelling Open questions Addressed issues Results II. Multicanonical ensemble Markov chains Supercritical SD Multicanonical weights III. Spinodals Spinodals points Inverse-square interactions Unusual FSS IV. Breathing clusters Single-spin vs clusters Cluster construction FFT Accuracy 2D NN Potts Surface tension V. Conclusion • Computing  $E_b$  represents another  $O(N^2)$  burden

• This is reduced to  $O(N \ln N)$  using an FFT implementation of the convolution theorem

 $H = -\frac{1}{2N} \sum_{k=0}^{k=N-1} \tilde{J}(k) \vec{S}(k) \cdot \vec{S}(-k)$ 

With a cluster-update scheme, only O(N ln N) operations are needed to update the whole lattice (as against O(N<sup>2</sup>) for single-spin updates)

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## Lower statistical error on the computation of the density of states



### Numerical results for the 2D NN Potts model

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#### **Tunneling times and dynamic exponents**

q	$z_{loc}$	$z_{col}$	$z_{mubo}$
7	2.60(4)	1.82(2)	1.84
10	2.87(4)	2.23(1)	2.1

#### **Finite-size temperatures:**



### Numerical results for the LR Potts chain

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#### **Finite-size temperatures**



•  $T_c(C_v) = 1.68764(1)$ •  $T_c(\chi) = 1.68765(2)$ 

### **Numerical results for the LR Potts chain**

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 $\rightarrow$  we find  $\Delta F \propto L^{\alpha}$ , with  $\alpha(\sigma)$ . (reminder:  $\Delta F \propto L^{D-1}$  for SR models)

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### **V. Conclusion**

### Conclusion

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### Conclusion

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#### Method:

- Data analysis: spinodal method  $\rightarrow$  follow the position of spinodal points + select the appropriate quantity  $(T_2/T_c)$  which yields the highest accuracy.
- Breathing cluster:
  - 1. Dramatically extends the range of attainable lattice sizes
  - 2. Better statistical quality
  - 3. Versatile (short-range models, transition matrix)

### **Outlook and work underway**

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#### Model

- Long-range Random-field Ising model: first numerical study; controversy SR model (tricritical line).
- Fractal geometry of interface between phases

#### Method

Combination with Optimized Ensemble (disordered models)