

Simulations of Spin Glasses and Related Systems

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A. Tarancon, L. A. Fernandez, S. Gaviro, H. Bokil, C. Wengel, M. Körner

Talk for the RAHMAN PRIZE at APS March Meeting, Pittsburgh, March 19, 2009.

Overview

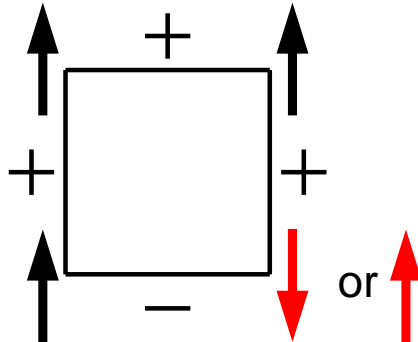


- Basic Introduction
 - What is a spin glass? Why are they important?
 - Why are Monte Carlo simulations for spin glasses hard?
- Try to answer three important questions concerning phase transitions in spin glasses:
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 - Is there a phase transition in an isotropic Heisenberg spin glass?
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What is a spin glass?



A system with **disorder** and **frustration**.



Most theory uses the simplest model with these ingredients: the **Edwards-Anderson Model**:

$$\mathcal{H} = - \sum_{\langle i,j \rangle} J_{ij} \mathbf{S}_i \cdot \mathbf{S}_j - \sum_i \mathbf{h}_i \cdot \mathbf{S}_i .$$

Interactions are **quenched** and are random (have either sign).

Take a **Gaussian** distribution: $[J_{ij}]_{\text{av}} = 0$; $[J_{ij}^2]_{\text{av}}^{1/2} = J (= 1)$

Spins, \mathbf{S}_i , **fluctuate** and have m -components:

$m = 1$ (Ising)

$m = 2$ (XY)

$m = 3$ (Heisenberg).

Spin Glass Systems



- **Metals:**

Diluted magnetic atoms, e.g. Mn, in non-magnetic metal, e.g. Cu.
RKKY interaction:

$$J_{ij} \sim \frac{\cos(2k_F R_{ij})}{R_{ij}^3}$$

Random in magnitude and **sign**, which gives **frustration**.

Note: Mn (S-state ion) has little anisotropy; → **Heisenberg spin glass**.

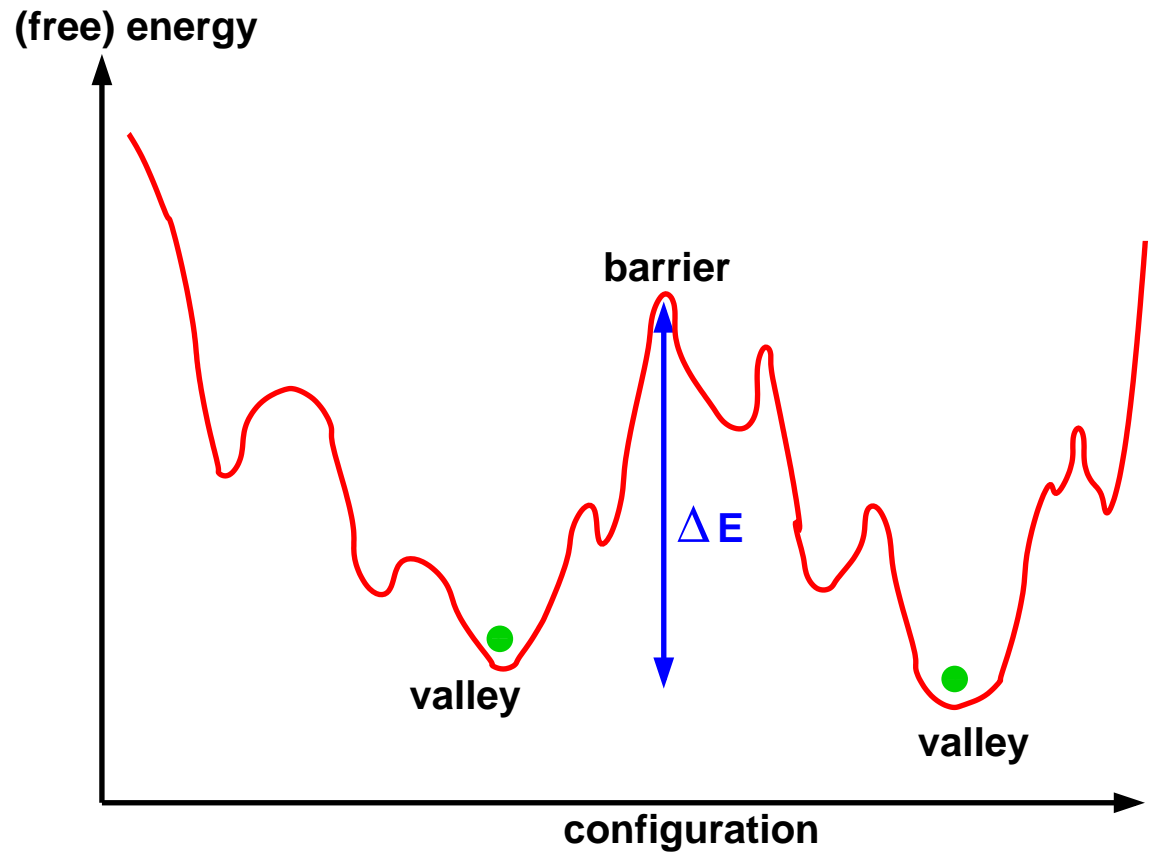
- **Important because relevant to other systems:**

- “Vortex glass” transition in superconductors
- Optimization problems in computer science
(including solving optimization problems on a **quantum computer**)
- Protein folding
- Error correcting codes

Slow Dynamics



Slow dynamics The dynamics is very slow at low T . System not in equilibrium due to complicated energy landscape: system trapped in one “valley” for long times.



Spin Glass Phase Transition



Phase transition at $T = T_{SG}$.

For $T < T_{SG}$ the spin freeze in some random-looking orientation.

As $T \rightarrow T_{SG}^+$, the correlation length ξ_{SG} diverges.

The correlation $\langle \mathbf{S}_i \cdot \mathbf{S}_j \rangle$ becomes significant for $R_{ij} < \xi_{SG}$, though the sign is random. A quantity which diverges is the spin glass susceptibility

$$\chi_{SG} = \frac{1}{N} \sum_{i,j} [\langle \mathbf{S}_i \cdot \mathbf{S}_j \rangle^2]_{av},$$

(notice the square) which is accessible in simulations. It is also essentially the same as the non-linear susceptibility, χ_{nl} , defined by

$$m = \chi h - \chi_{nl} h^3 + \dots$$

(m is magnetization, h is field), which can be measured experimentally.

For the EA model $T^3 \chi_{nl} = \chi_{SG} - \frac{2}{3}$.

Theory



- **Mean Field Theory** (Edwards-Anderson, Sherrington-Kirkpatrick, Parisi).

Exact solution of an **infinite range** (SK) model. Finite T_{SG} .

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- **Short-range (EA) models**. Simulations on **Ising** systems also indicate a finite T_{SG} (see later) in $d = 3$. **Vector** spin glasses? (See later.)
- **Equilibrium state below T_{SG} . Two main scenarios:**
 - “**Replica Symmetry Breaking**” (RSB), (Parisi).
 - “**Droplet picture**” (DP) (Fisher and Huse, Bray and Moore, McMillan).



Assume short-range is similar to infinite-range. There is an **AT line**.



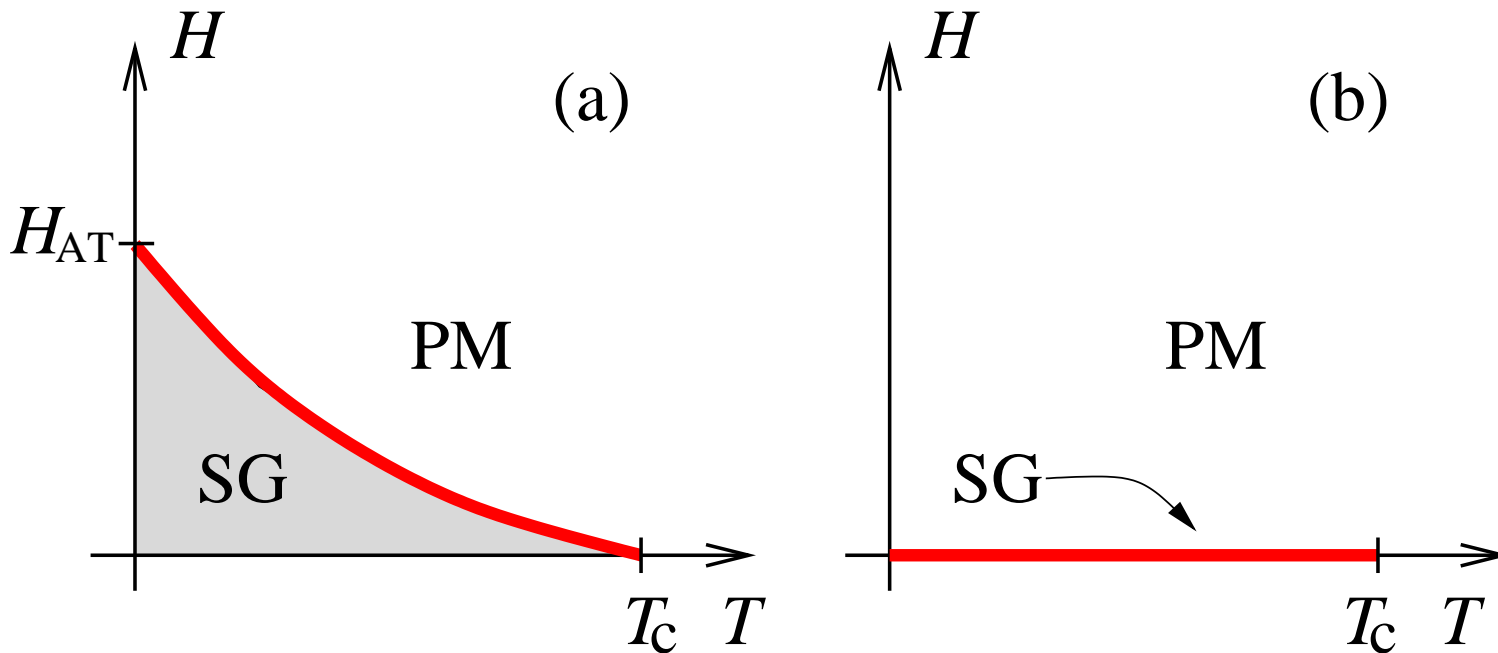
Focus on the geometrical aspects of the low-energy excitations. **No AT line** in **any d** .

Is there an AT line? (Ising)



In MFT there's a transition in a field for an Ising spin glass, the Almeida Thouless (AT) line, from a spin glass (divergent relaxation times, RSB) to a paramagnetic (finite relaxation times, "replica symmetric") phase.

The AT line is a ergodic-non ergodic transition with no symmetry change.



Does an AT line occur in short range systems?

- RSB: yes (see (a)) DP: no (see (b))
- Experiments (dynamics) (Uppsala group): no
- Theory: conflicting claims.

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Why is Monte Carlo Hard?



- Dynamics is very slow.

System is trapped in valley separated by barriers.

- Have to repeat the simulations for very many samples.

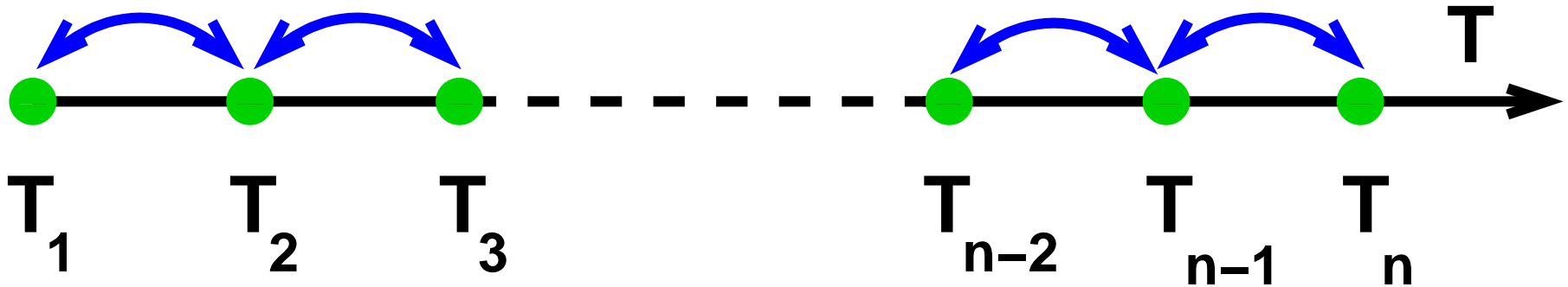
But is trivially parallelizable.

Parallel Tempering



Problem: Very slow Monte Carlo dynamics at low- T ;

System trapped in a valley. Needs more energy to overcome barriers. This is achieved by **parallel tempering** (Hukushima and Nemoto): simulate copies at many different temperatures:



Lowest T : system would be trapped:

Highest T : system has enough energy to fluctuate quickly over barriers.

Perform global moves in which spin configurations at neighboring temperatures are swapped.

Result: temperature of each copy performs a **random walk** between T_1 and T_n .

Advantage: Speeds up equilibration at low- T .

Equilibration



Equilibration test (for Gaussian distribution) e.g. for Ising

$$[q_l - 1]_{\text{av}} = \frac{2}{z} T [U]_{\text{av}},$$

where $U = -\frac{1}{N} \sum_{\langle i,j \rangle} J_{ij} \langle S_i S_j \rangle$ (energy)

$$q_l = \frac{1}{N_b} \sum_{\langle i,j \rangle} \langle S_i S_j \rangle^2 \quad \text{“link overlap”,} \quad N_b = Nz/2.$$

z is the no. of neighbors, and $J = 1$.

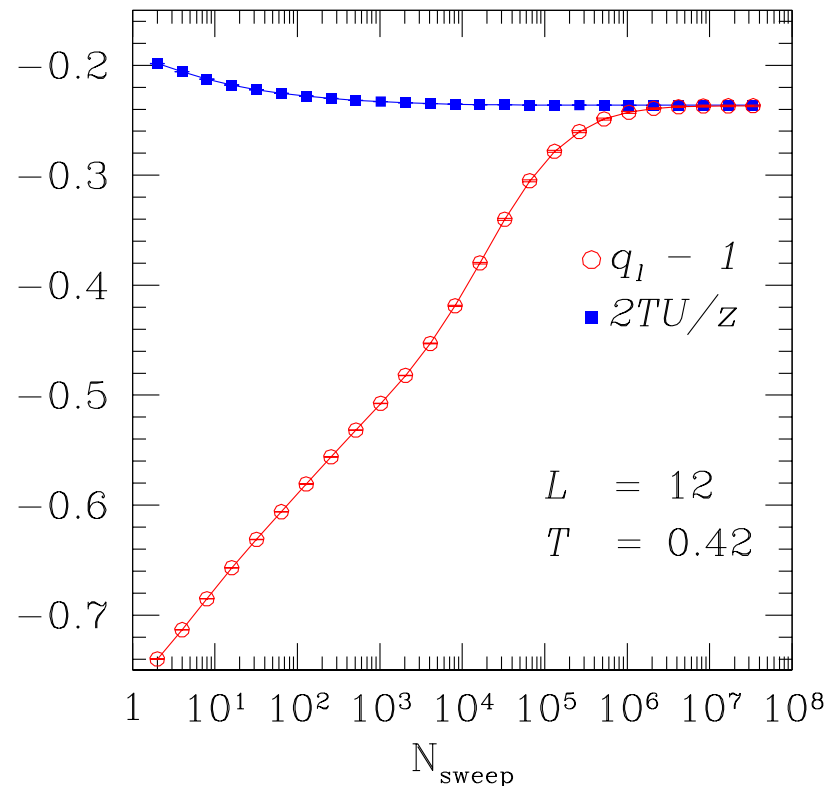
$[\dots]_{\text{av}}$ is an average over samples.

Data for Ising spin glass (H. Katzgraber)

$[q_l - 1]_{\text{av}}$ and $(2/z)T[U]_{\text{av}}$

approach a common value from opposite directions,

and, once they agree with each other, the results don't change if N_{sweep} is increased further.



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- A possible model is the **gauge glass**:

$$\mathcal{H}_{\text{GG}} = - \sum_{\langle i,j \rangle} \cos [\phi_i - \phi_j - A_{ij}] ,$$

where the A_{ij} are **quenched** and uniformly distributed between 0 and 2π . The phases ϕ_i **fluctuate** between 0 and 2π .

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- Numerics: \implies the gauge glass **has a vortex glass transition**.
- Real superconductors have **screening** of the vortex-vortex interaction. “**Relevant**” **only very close to T_c** (FFH).
- Investigated role of screening with H. Bokil (1995) and C. Wengel (1996). Added fluctuating vector potential. (Vortex representation).

Region where relevant much larger than in experiments.

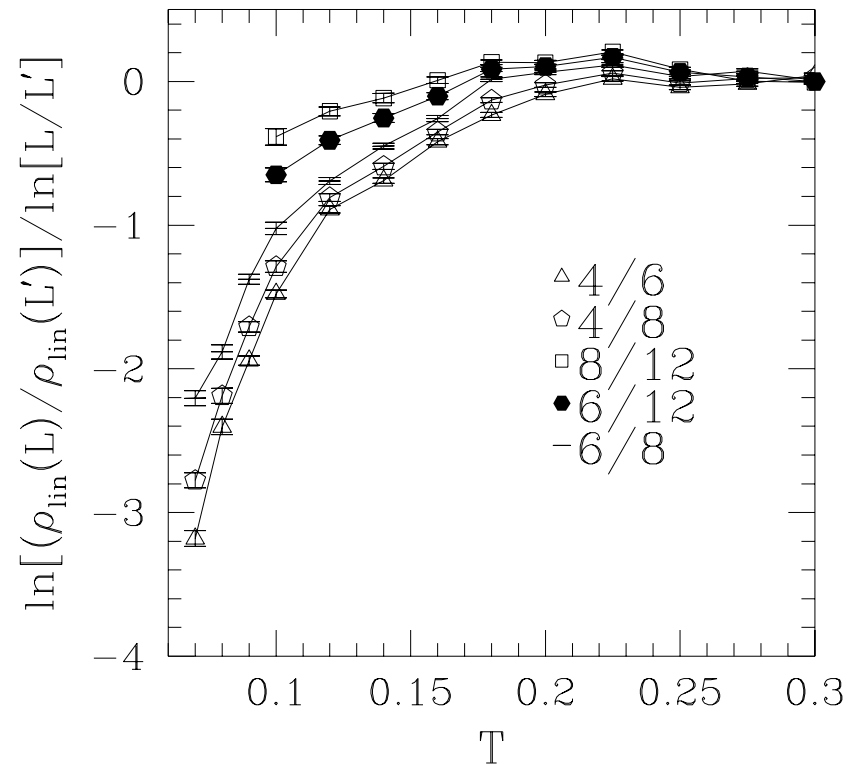
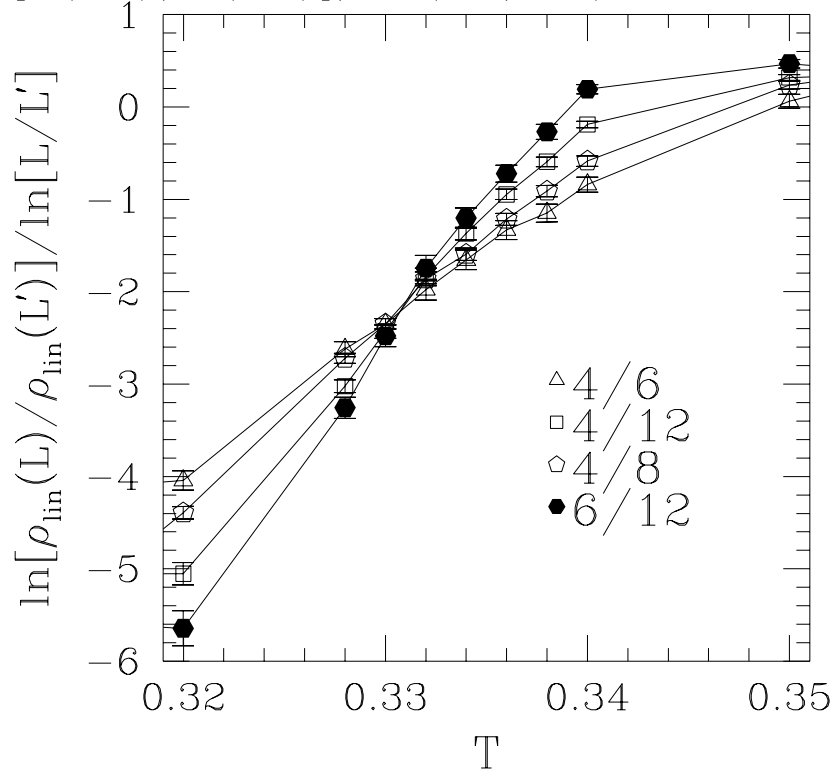
Screening: Results



At T_c , ρ_{lin} varies as a power of system size L , $\rho_{\text{lin}} \propto L^{-\lambda}$. Hence

$\ln[\rho(L_1)/\rho(L_2)] = -\lambda \ln(L_1/L_2)$, so **look for intersections** of

$\ln[\rho(L_1)/\rho(L_2)]/\ln(L_1/L_2)$ against T (Wengel, APY (1996)):



Left: Pure system (quenched $A_{ij} = 0$). Has the **Meissner transition**.

Right: Random system. Has **no transition**.

The vortex glass transition is rounded out very close to the putative T_c .

May have been seen: Strachan, Sullivan and Lobb, cond-mat/0206120.

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Finite size scaling



Assumption: size dependence comes from the ratio L/ξ_{bulk} where

$$\xi_{\text{bulk}} \sim (T - T_{SG})^{-\nu}$$

is the **bulk** correlation length.

In particular, the **finite-size** correlation length **varies as**

$$\frac{\xi_L}{L} = X \left(L^{1/\nu} (T - T_{SG}) \right),$$

since ξ_L/L is **dimensionless** (and so has no power of L multiplying the scaling function X).

Hence data for ξ_L/L for different sizes should

intersect at T_{SG} and splay out below T_{SG} .

Let's first see how this works for the **Ising SG** ...

Results: Ising



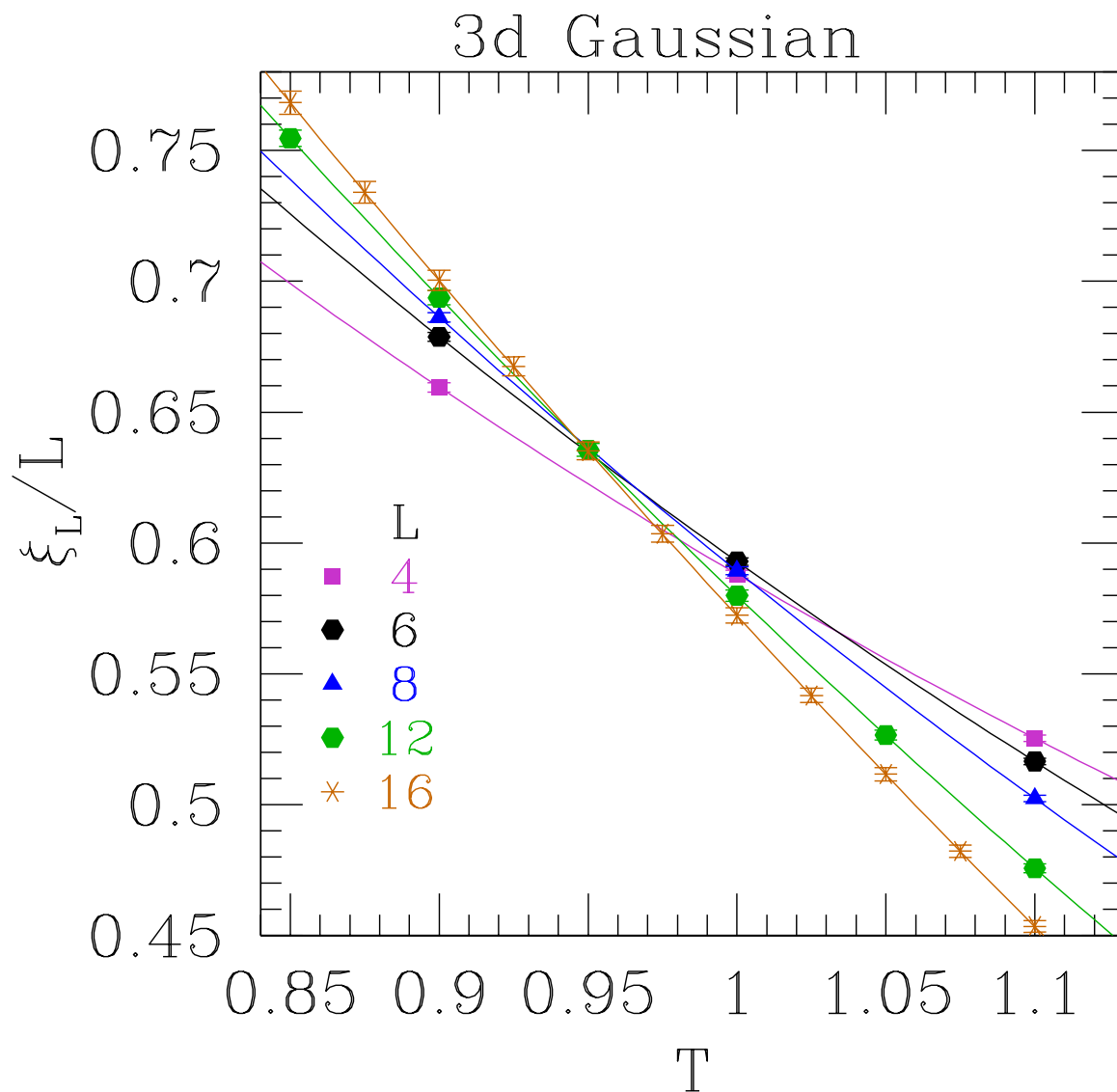
FSS of the correlation length for the Ising spin glass. (from Katzgraber, Körner and APY Phys. Rev. B 73, 224432 (2006).)

Method first used for SG by Ballesteros et al. but for the $\pm J$ distribution.

The clean intersections (corrections to FSS visible for $L = 4$) imply

$$T_{SG} \simeq 0.96.$$

Previously Marinari et al. found $T_{SG} = 0.95 \pm 0.04$ using a different analysis



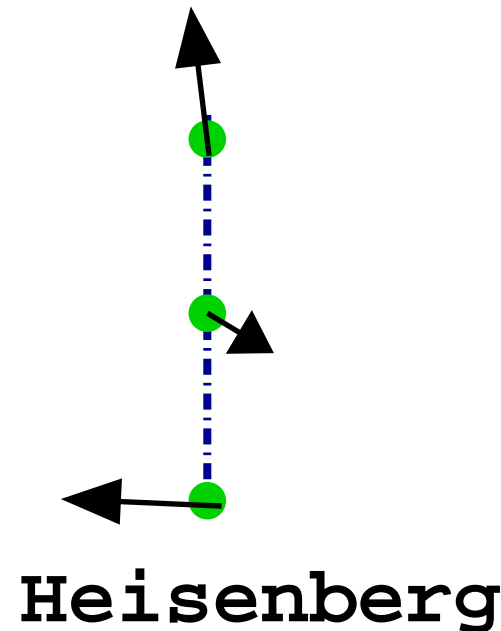
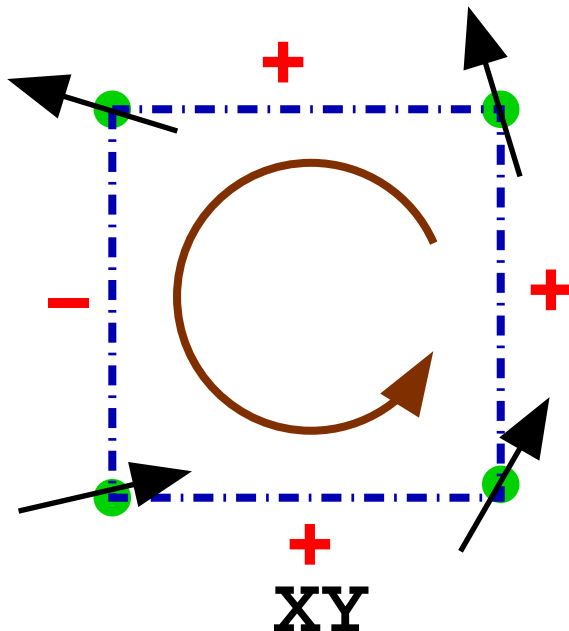
Chirality



- **Unfrustrated:** Thermally activated chiralities (vortices) drive the Kosterlitz-Thouless-Berezinskii transition in the 2d XY ferromagnet.
- **Frustrated:** Chiralities are **quenched in** by the disorder at low-T because the ground state is **non-collinear**.

Define chirality by: (Kawamura)

$$\kappa_i^\mu = \begin{cases} \frac{1}{2\sqrt{2}} \sum'_{\langle l,m \rangle} \text{sgn}(J_{lm}) \sin(\theta_l - \theta_m), & \text{XY } (\mu \perp \text{square}) \\ \mathbf{S}_{i+\hat{\mu}} \cdot \mathbf{S}_i \times \mathbf{S}_{i-\hat{\mu}}, & \text{Heisenberg} \end{cases}$$



Motivation for vector model

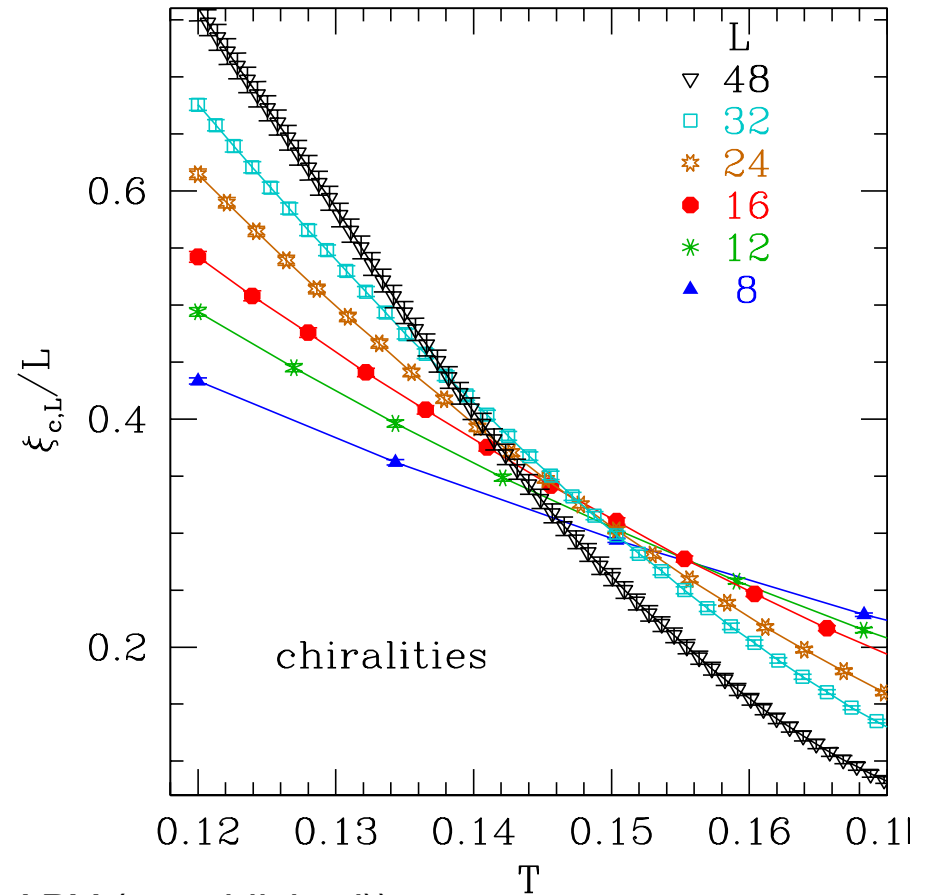
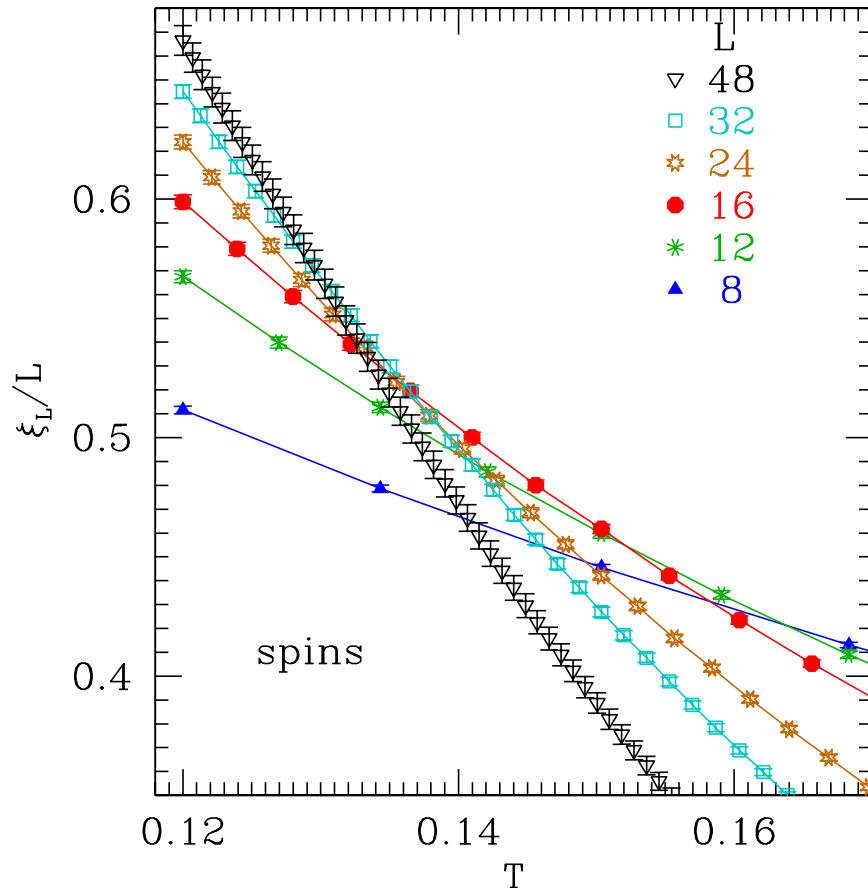


- Old Monte Carlo for Heisenberg: T_{SG} , if any, seems very low, probably zero.
- Kawamura: $T_{SG} = 0$ but transition in the “chiralities”, $T_{CG} > 0$. This implies **spin–chirality decoupling**. Subsequently Kawamura suggests that $T_{SG} > 0$ but $T_{SG} < T_{CG}$.
- But: Alternative possibility of a single transition proposed by Nakamura and Endoh, Lee and APY, Campos et al, Pixley and APY.

Here: describe recent work on **FSS of the correlation lengths** of *both* spins and chiralities for the **Heisenberg** spin glass. Useful since

- this was the most successful approach for the Ising spin glass.
- treat spins and chiralities on equal footing.

Heisenberg Spin Glass



(Martin-Mayor, Tarancon, Fernandez, Gavira and APY (unpublished)).

Note: much larger sizes than for Ising (barriers smaller). Took 7.5 megahours of CPU time!

Spins and chiralities behave **very similarly** (but not identically) for this range of sizes.

Are there two very close but distinct transitions? Viet and Kawamura, $L \leq 32$, claim

$T_{CG} = 0.145$, $T_{SG} = 0.120$. From our data, the difference seems less than this or zero. The apparent small difference in transition temperatures may be due to corrections to scaling.

Overview



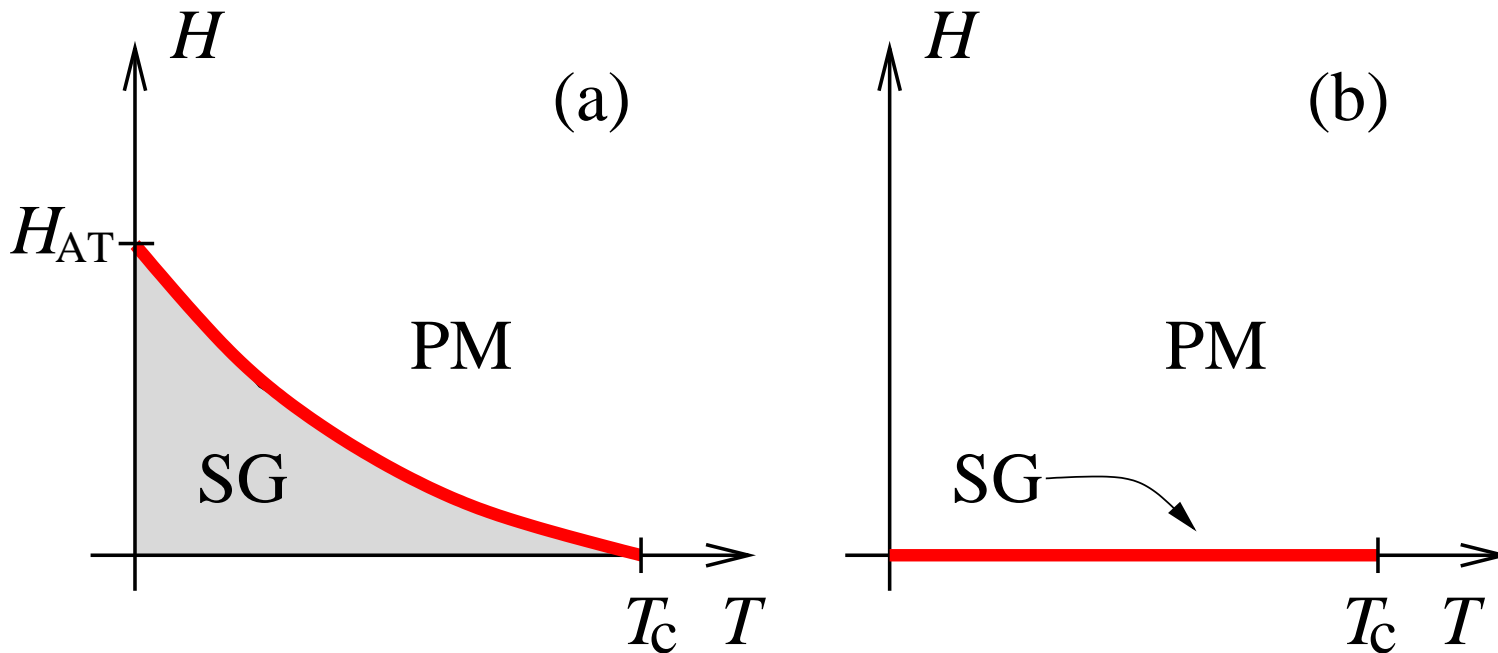
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Is there an AT Line? (ii)



Experiments:, no static divergent quantity; (χ_{nl} doesn't diverge in a field).

Simulations: According to RSB, χ_{SG} diverges in a field, where now

$$\chi_{SG}(\mathbf{k}) = \frac{1}{N} \sum_{i,j} [(\langle S_i S_j \rangle - \langle S_i \rangle \langle S_j \rangle)^2]_{\text{av}} e^{i\mathbf{k} \cdot (\mathbf{R}_i - \mathbf{R}_j)}.$$

Hence can use FSS of ξ_L/L in the simulations to see if there is an AT line

ξ_L behaves as for the zero field case; so **we look for intersections.**

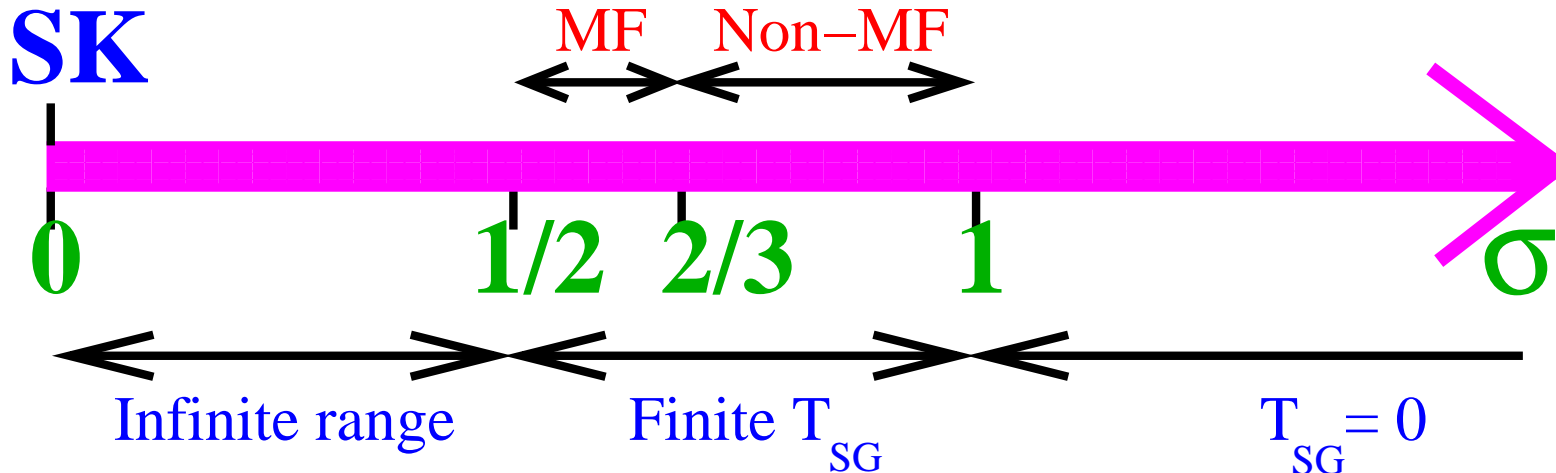
Long-Range model in $d = 1$



$$[J_{ij}^2]_{av} \propto \frac{1}{r_{ij}^{2\sigma}},$$

Use diluted (**diluted**) version: Leuzzi et al (2008). The **probability** of a non-zero bond **falls off like $1/r_{ij}^{2\sigma}$** , but the **strength** bond **does not fall off**. Analogy between short-range model in d -dimensions and the $1-d$ long-range model

d (SR)	σ [$1-d$ (LR)]
∞	$1/2$
$6 (= d_u)$	$2/3$
$2.5 (= d_l)$	1



Results: AT-line (i)



FSS of the correlation length for the Ising spin glass in a (Gaussian random) field of $H_r = 0.1$ with $\sigma = 0.75$

(non mean field region).

Lack of intersections implies **no AT line** down to this value of H_r .

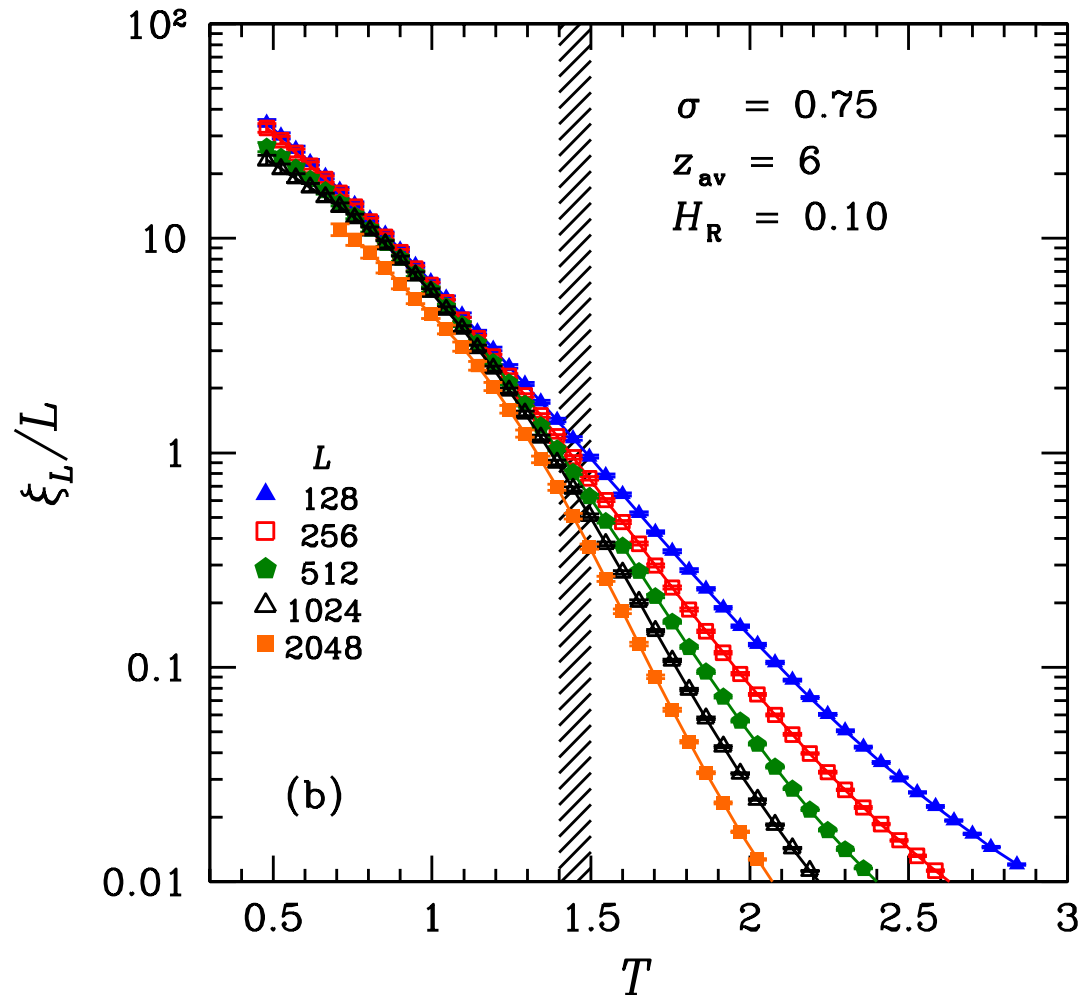
(If there is an AT line, it **only occurs for extremely small fields.**)

Katzgraber, Larson and APY

Talk A29.00002, arXiv:0812.0421

Hence expect **no AT line** in the non mean field region, i.e. $d < 6$.

However, for the same model, with same σ and H_r , (but with ± 1 bonds), Parisi et al., [arXiv:0811.3435](https://arxiv.org/abs/0811.3435), find intersections and hence **claim an AT line.**



Results: AT-line (ii)



FSS of the correlation length for the Ising spin glass in a (Gaussian random) field of $H_r = 0.1$ with $\sigma = 0.60$

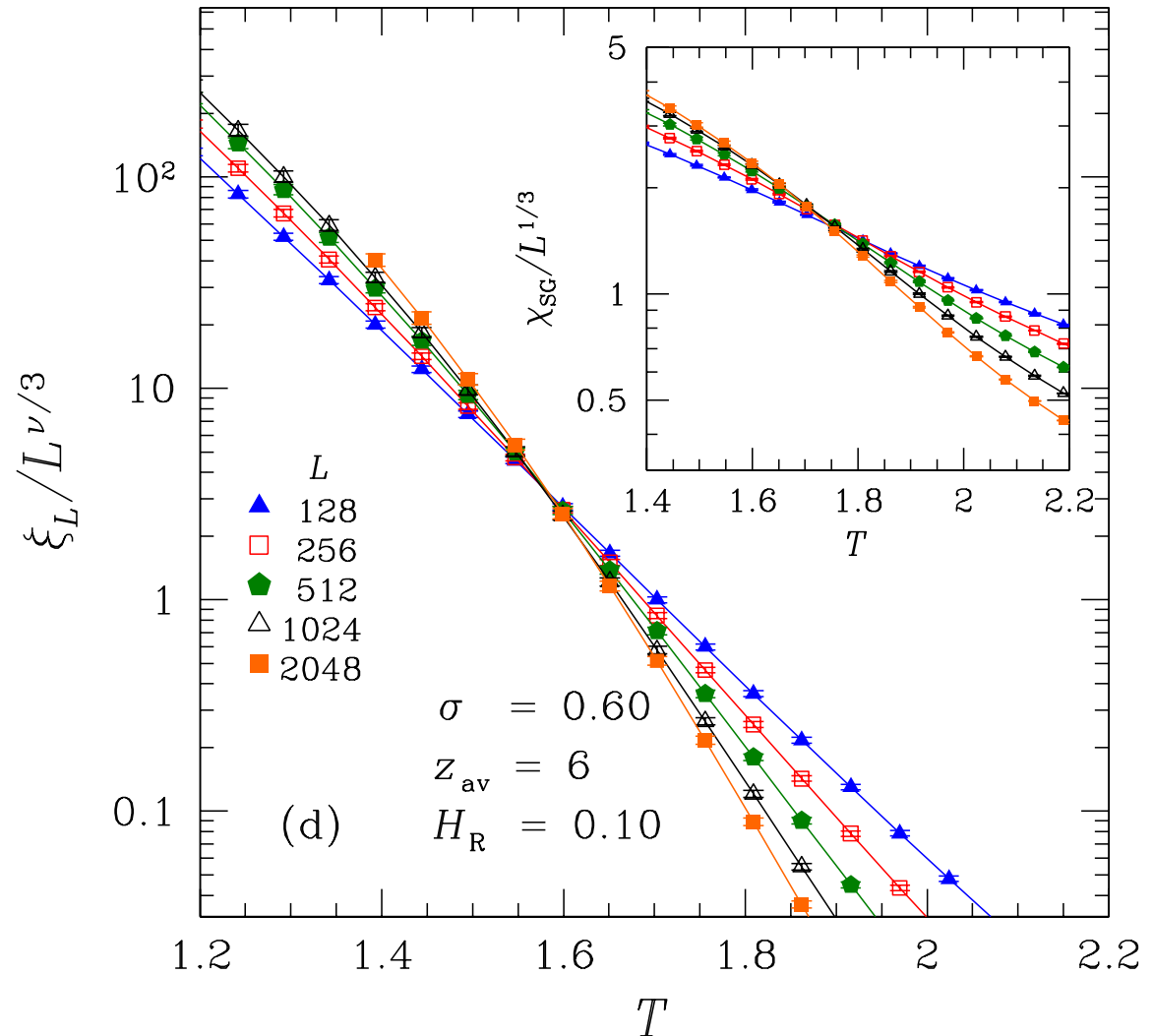
(mean field region).

(Katzgraber, Larson and APY).

The intersection implies

there is an AT line

in the mean field region



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Thank You