

Investigating thermal critical points with tensor networks

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Scope

- **Tensor networks for classical thermal transitions**

- Need for an alternative to Monte Carlo?

- CTMRG for 3-state Potts model

- CTMRG for incommensurate melting

- **Thermal properties of quantum systems**

- Quantum purification

- Critical point of Shastry-Sutherland model and of $\text{SrCu}_2(\text{BO}_3)_2$ under pressure

- Ising transition of J1-J2 model on square lattice

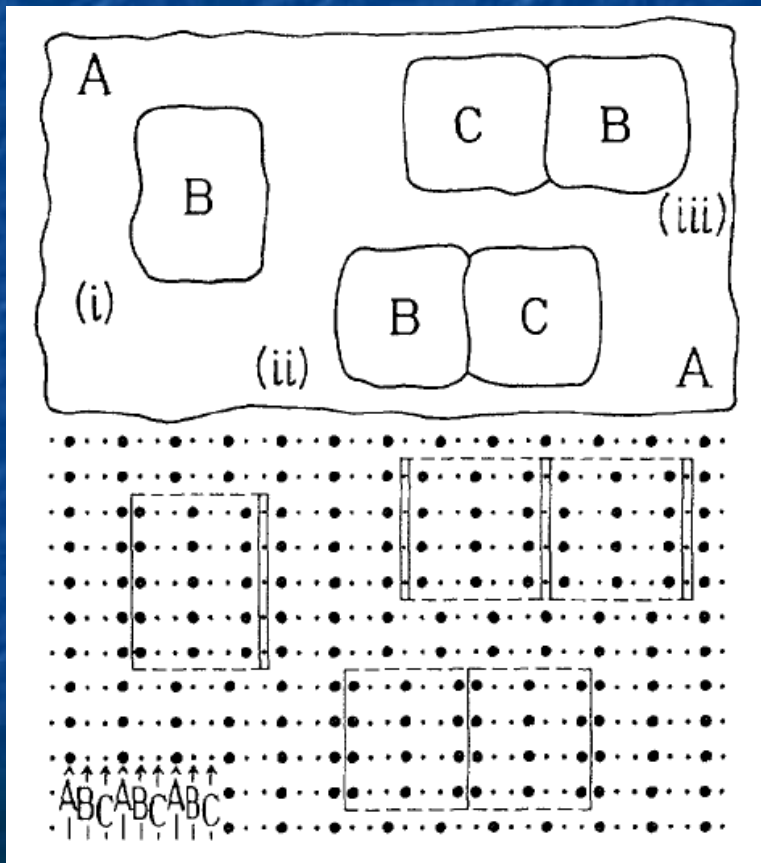
- **Conclusions**

Thermal transitions in classical 2D systems

- Exact results (Onsager, Baxter,...)
- Renormalization group
- Conformal field theory
 - Minimal models, universality classes
- Monte Carlo simulations (Binder,...)

Is there a need for new approaches?

Commensurate-Incommensurate transition in adsorbed layers



3 types of domains
→ 3-state Potts?

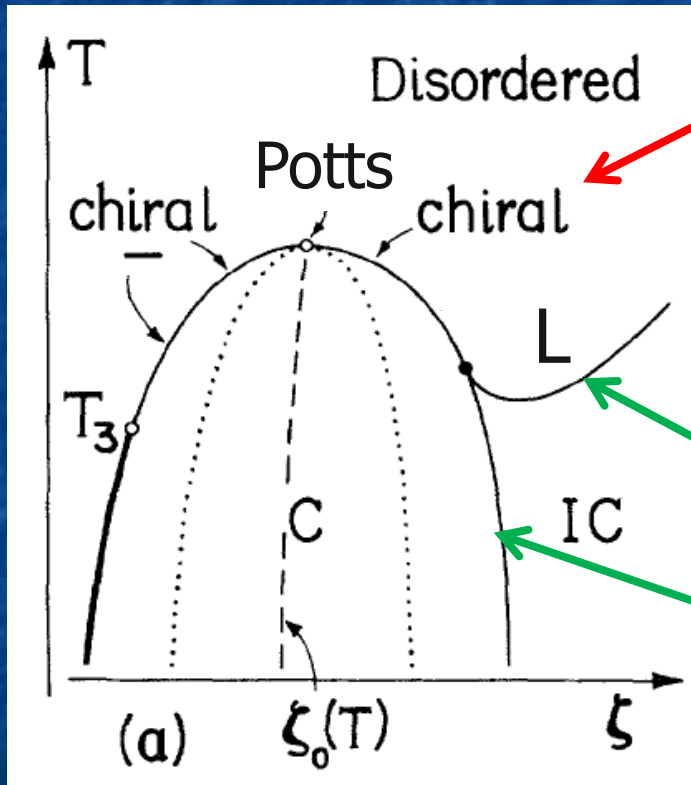
Not so simple!

$A B C \neq A C B$

Chiral perturbation

Huse-Fisher, 1982

Huse-Fisher phase diagram



Chiral: Anisotropic scaling
 $\rightarrow v_x \neq v_y$
 \rightarrow dynamical exponent $z > 1$

Kosterlitz-Thouless

Pokrovsky-Talapov

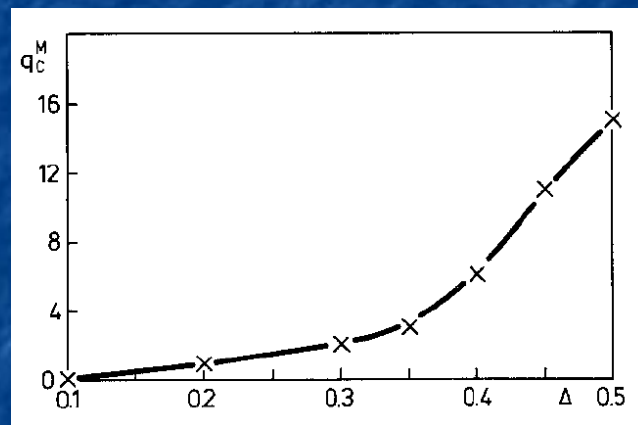
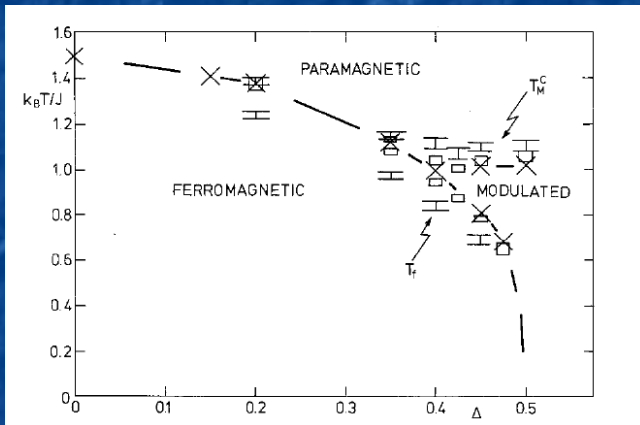
Huse and Fisher, 1982

Difference between the 3 cases

- Δq : distance to $2\pi/3$, vanishes with exponent $\bar{\beta}$
- ξ : correlation length in IC direction, diverges with exponent ν_x
- $\Delta q \xi \rightarrow 0$ for Potts ($\bar{\beta} > \nu_x$)
 - $\rightarrow \text{cst} > 0$ for chiral ($\bar{\beta} = \nu_x$)
 - $\rightarrow +\infty$ for KT transition
(ξ diverges before Δq vanishes)

MC simulations of chiral Potts model

$$\mathcal{H} = -J_x \sum_{\langle ij \rangle}^x \cos \left[\frac{2\pi}{3} (n_i - n_j + \Delta) \right] - J_y \sum_{\langle ij \rangle}^y \cos \left[\frac{2\pi}{3} (n_i - n_j) \right]$$



Selke and Yeomans, 1982

- Impossible to extract Δq with sufficient precision
- Many other investigations in the following years
- No consensus at the end of the eighties

Si (113) 3 x 1

D. L. Abernathy, S. Song, K. I. Blum, R. J. Birgeneau,
and S. G. J. Mochrie, PRB 1994

- Single transition with anisotropic scaling

$$\nu_x \simeq 0.65, \nu_y \simeq 1.06$$

$$\bar{\beta} \simeq 0.66 \quad (\text{exponent of } \Delta q)$$

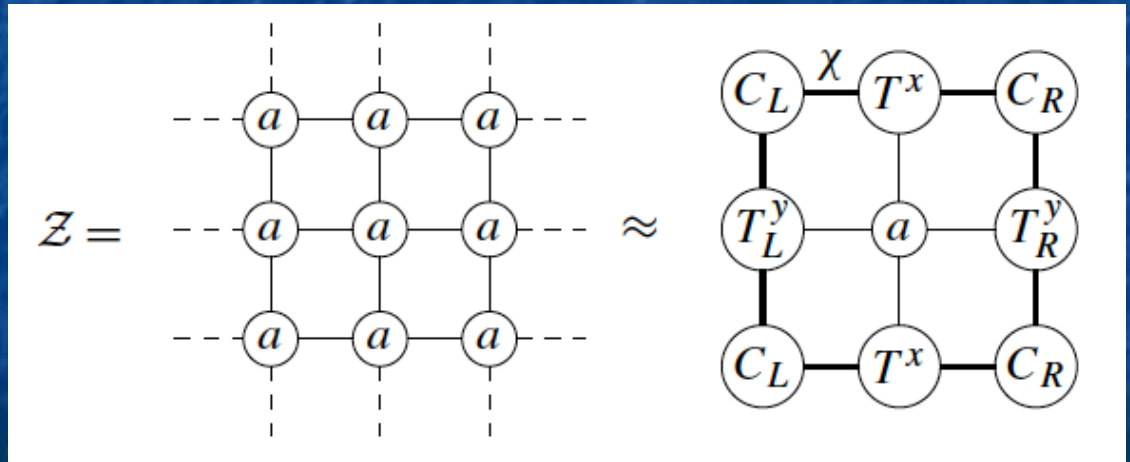
$$z \simeq 1.6$$

NB: $\bar{\beta} \simeq \nu_x \implies \Delta q \xi \rightarrow \text{Cst} \implies \text{Chiral transition}$

CTMRG for 2D classical systems

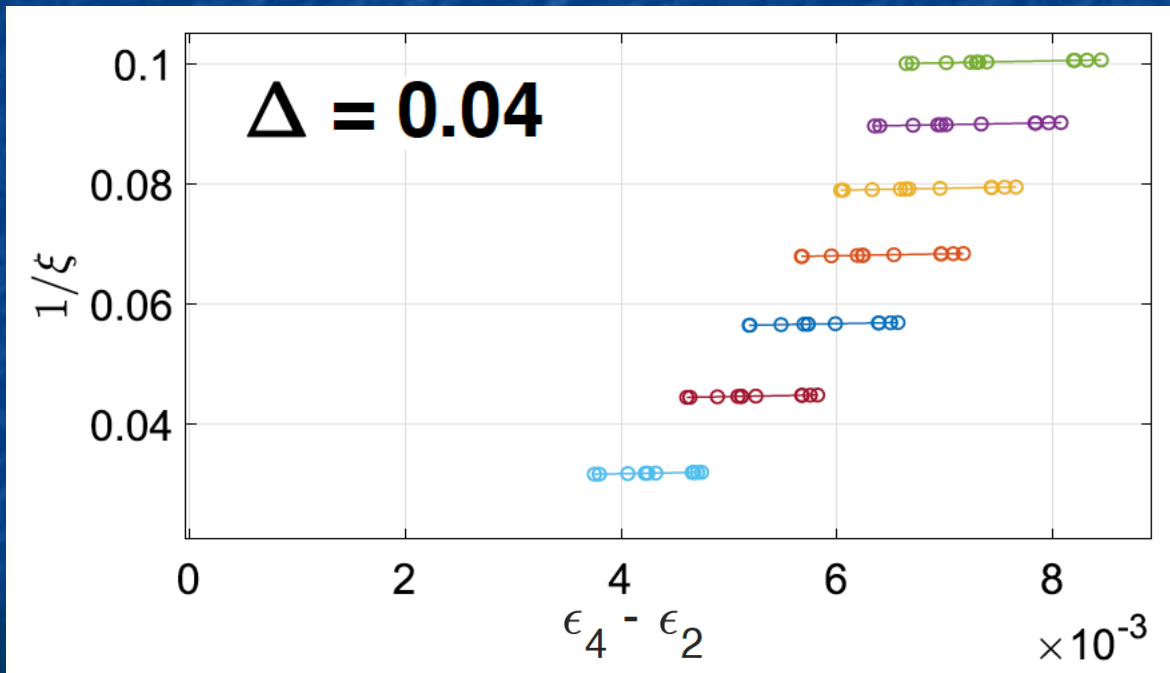
Corner Transfer Matrix Renormalization Group

Nishino, 1995; Nishino and Okunishi, 1996



Chiral 3-state Potts model

$$E = - \sum_{\vec{r}} \cos[2\pi/3(n_{\vec{r}+\vec{x}} - n_{\vec{r}} + \Delta)] - \sum_{\vec{r}} \cos[2\pi/3(n_{\vec{r}+\vec{y}} - n_{\vec{r}})]$$



$$\lambda_j = e^{-\epsilon_j - i\phi_j}$$

Benchmark: 3-state Potts model

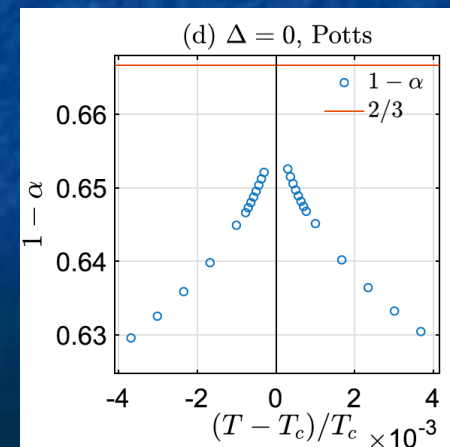
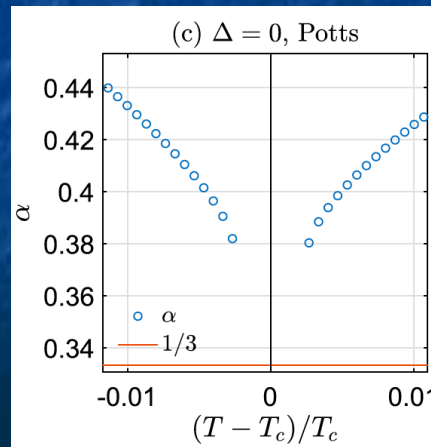
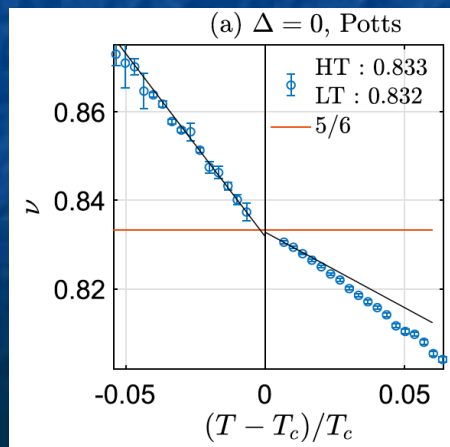
Effective exponents (instead of fit of finite window)

$$A \propto |t|^{-\theta}$$

$$\theta(|t|) = -\frac{d \ln A}{d \ln |t|}$$

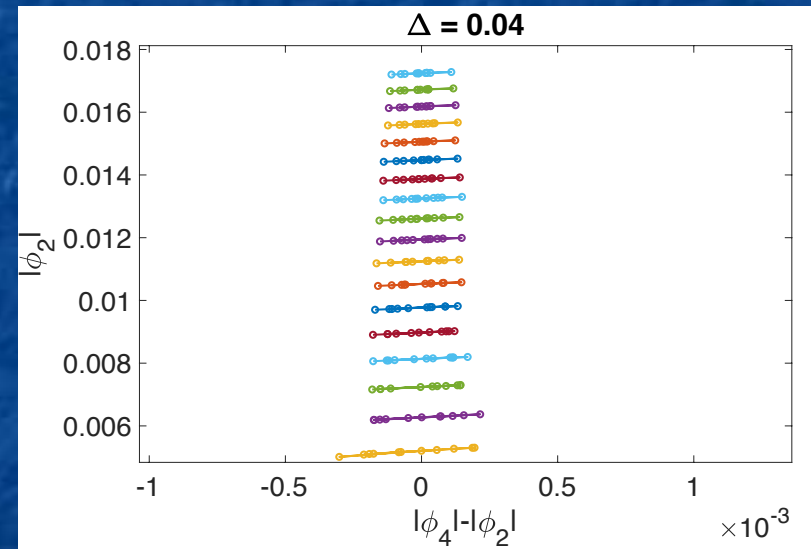
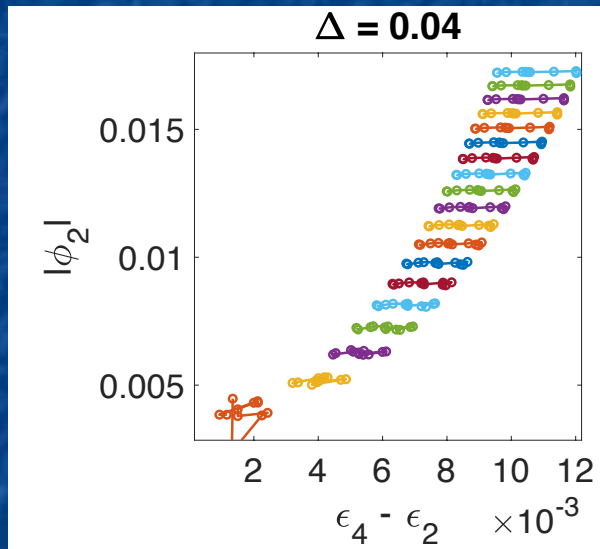
$$\theta = \lim_{|t| \rightarrow 0} \theta(|t|)$$

Possible thanks to high precision



Chiral 3-state Potts model

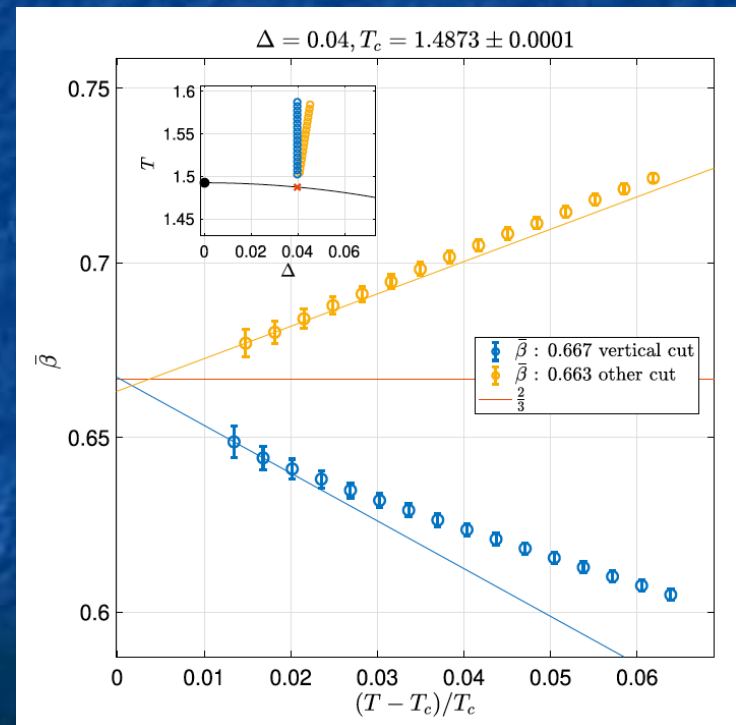
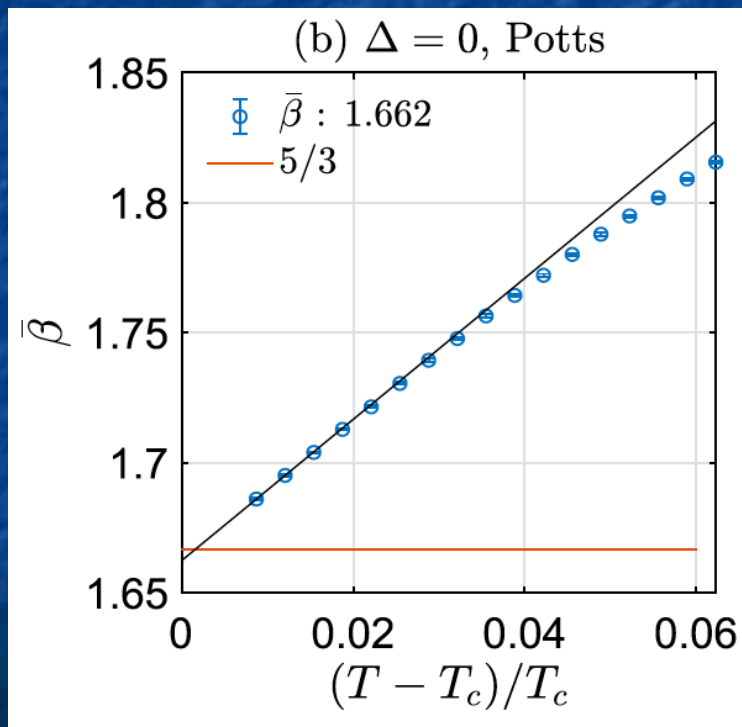
$$E = - \sum_{\vec{r}} \cos[2\pi/3(n_{\vec{r}+\vec{x}} - n_{\vec{r}} + \Delta)] - \sum_{\vec{r}} \cos[2\pi/3(n_{\vec{r}+\vec{y}} - n_{\vec{r}})]$$



S. Nyckees, J. Colbois, FM, Nuclear Phys B 2021

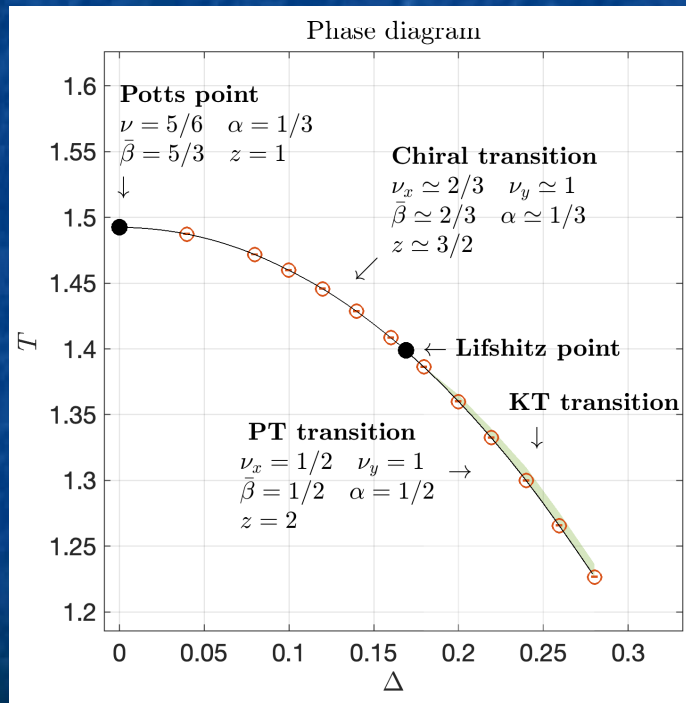
Scaling of Δq

$$\Delta q \propto (T/T_c - 1)^{\bar{\beta}}$$



CTMRG phase diagram

$$E = - \sum_{\vec{r}} \cos[2\pi/3(n_{\vec{r}+\vec{x}} - n_{\vec{r}} + \Delta)] - \sum_{\vec{r}} \cos[2\pi/3(n_{\vec{r}+\vec{y}} - n_{\vec{r}})]$$



- Exponents similar to those of a self-dual version of the model with complex Δ (Cardy, 1993)
- Consistent with the experimental results on Si(113) 3 x 1
- Reasonable agreement with recent field theory results (Whitsitt, Samajdar, Sachdev, 2018)

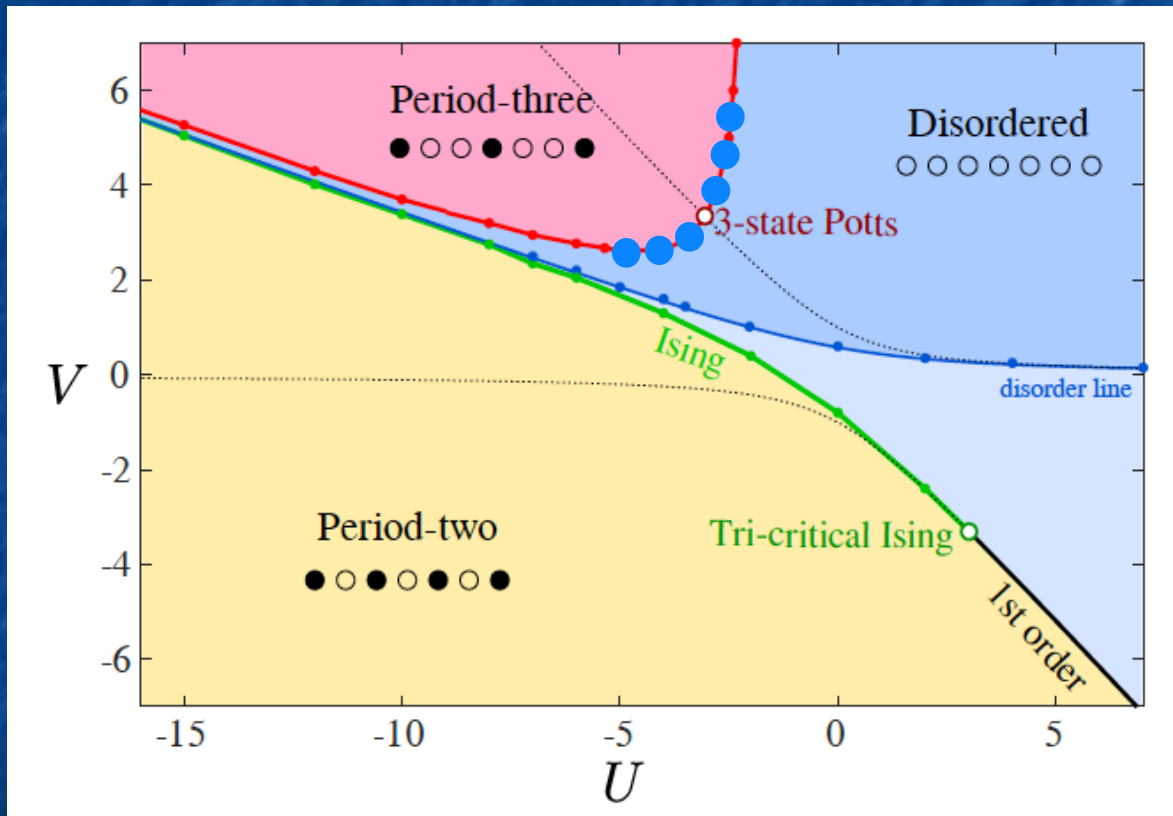
Quantum 1D version

$$H_{\text{HB}} = \sum_j \left[-w(d_j^\dagger + d_j) + U n_j + V n_{j-1} n_{j+1} \right]$$

- Two constraints $n_j(n_j - 1) = 0$ $n_j n_{j+1} = 0$
- Hilbert space: grows as Fibonacci number
- Toy model for Rydberg chains

Fendley, Sengupta, Sachdev 2004

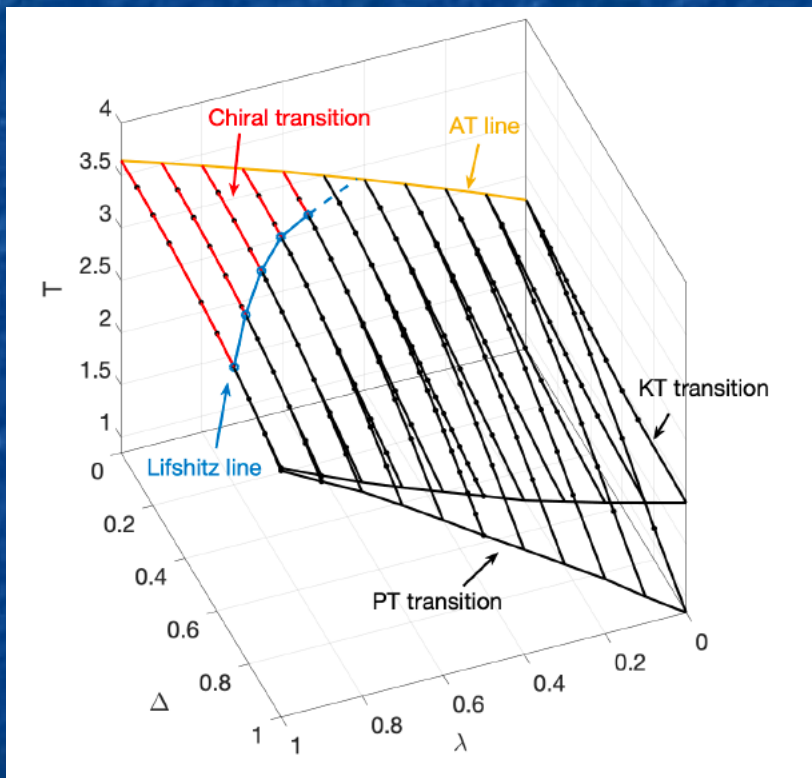
Hard-bosons: phase diagram



● Chiral transition

Chepiga and FM, PRL 2019

Period-4 case: Ashkin-Teller



$$H_0 = - \sum_{\langle i,j \rangle} \sigma_i \sigma_j + \tau_i \tau_j + \lambda \sigma_i \sigma_j \tau_i \tau_j$$

Chiral perturbation

$$\Delta \sum_{x,y} (\tau_{x+1,y} \sigma_{x,y} - \sigma_{x+1,y} \tau_{x,y})$$

S. Nyckees and FM, Phys Rev Research 2022

Thermal transitions in 2D quantum antiferromagnets

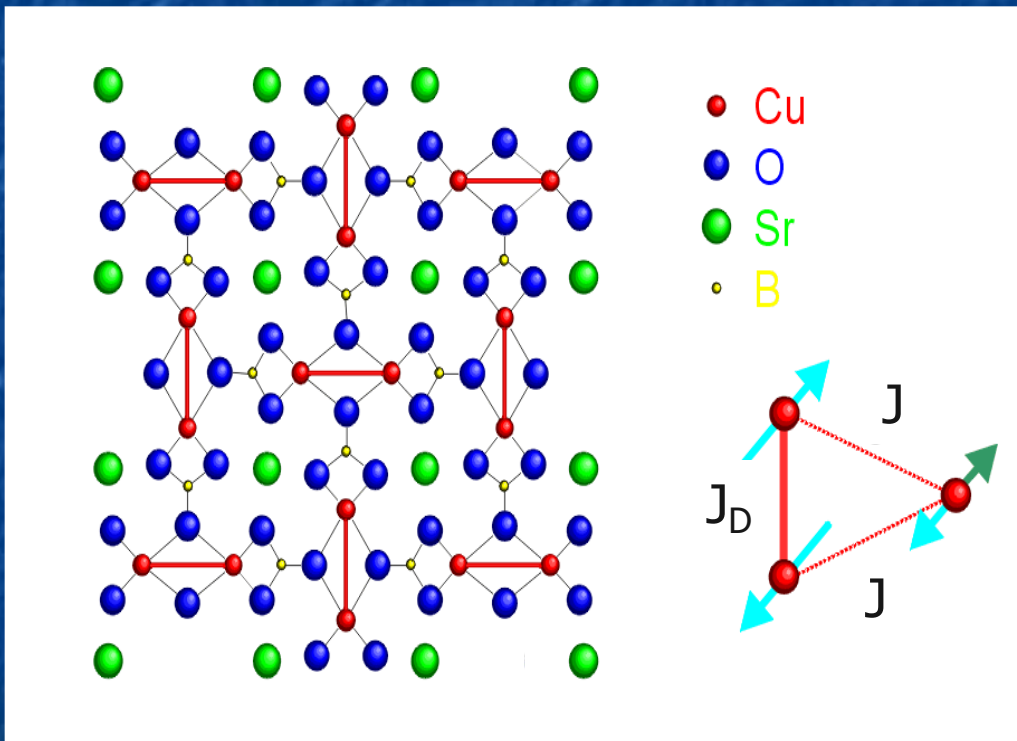
- **Mermin-Wagner theorem** → no long-range order at $T > 0$ for Heisenberg

No critical point, really? **Not quite!**

- **Frustrated quantum magnets**
 - First-order transition → **critical point**
 - Spontaneous breaking of spatial symmetry → **Ising transition**

SrCu₂(BO₃)₂

Smith and Keszler, JSSC 1991



Cu²⁺ -> Spin 1/2

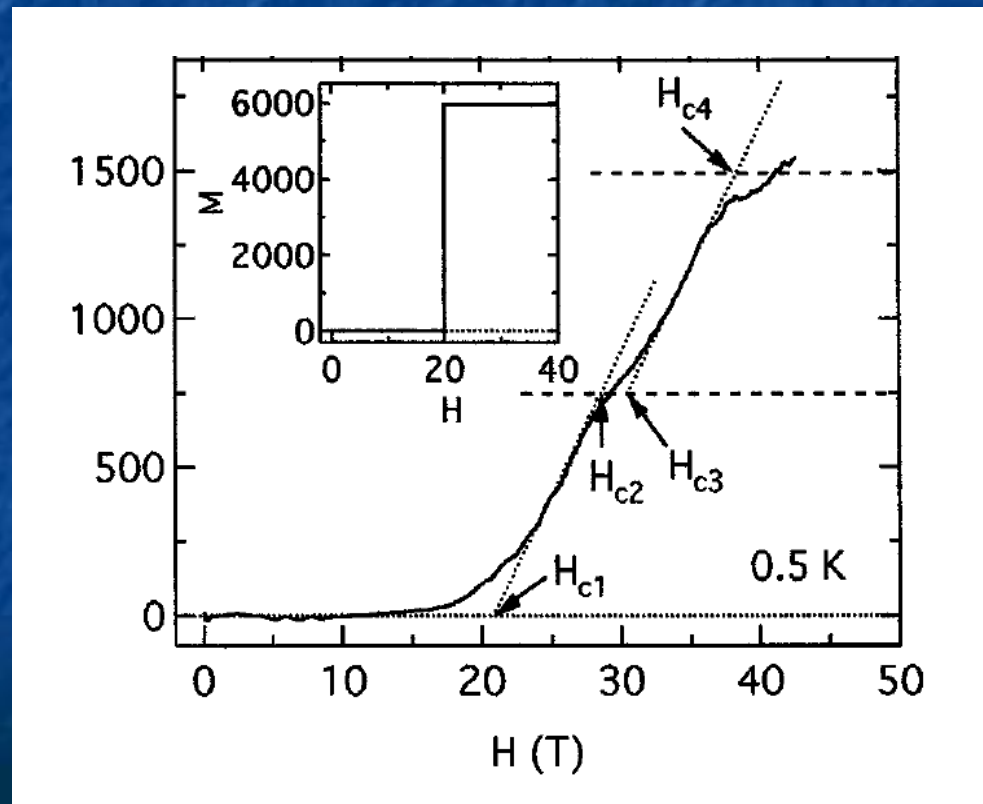
$J_D \approx 85 \text{ K}$

$J/J_D \approx 0.63$

Orthogonal dimer model

Exact Dimer Ground State and Quantized Magnetization Plateaus in the Two-Dimensional Spin System $\text{SrCu}_2(\text{BO}_3)_2$

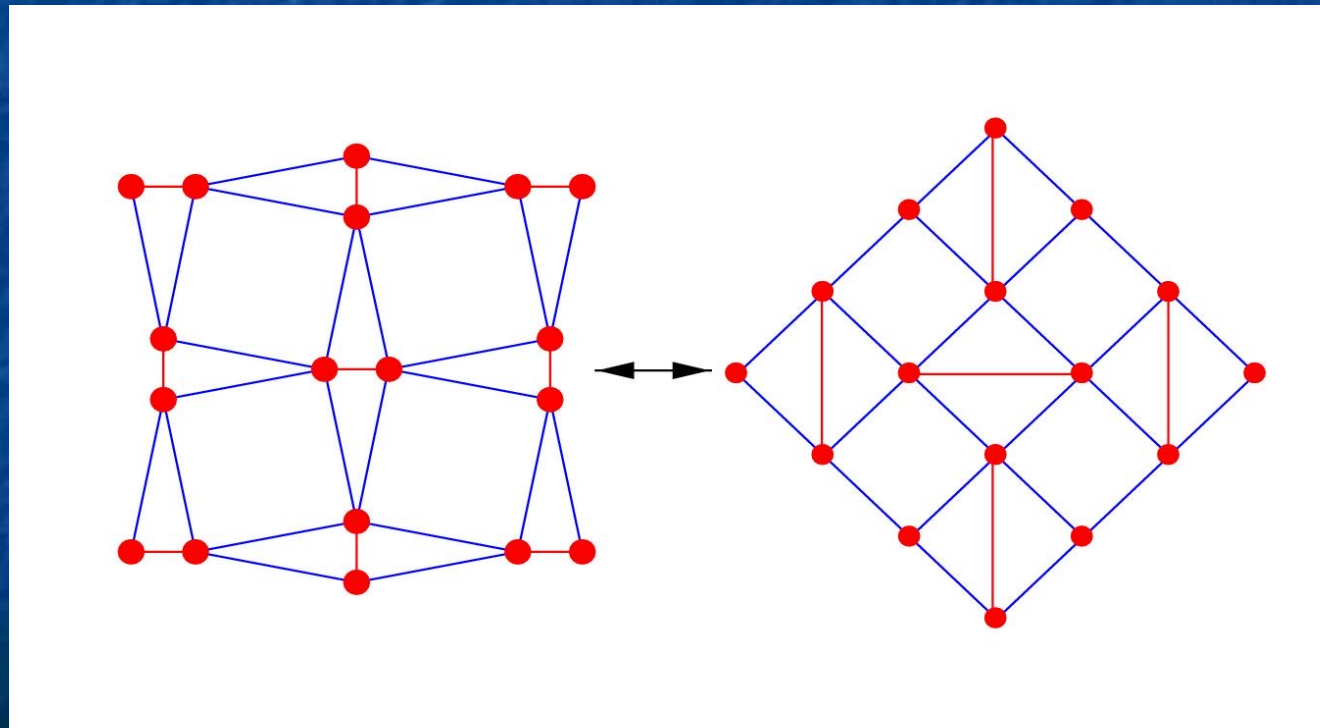
H. Kageyama,^{1,2,*} K. Yoshimura,^{1,3,†} R. Stern,³ N. V. Mushnikov,² K. Onizuka,² M. Kato,¹ K. Kosuge,¹
C. P. Slichter,³ T. Goto,² and Y. Ueda²



Anomalies

- $M=0$
 - $M=1/8$
 - $M=1/4$
- and many more

From orthogonal dimer to Shastry-Sutherland model



SrCu₂(BO₃)₂ under pressure

- Pressure: expected to **change J/J_D** and found to **increase it**
- NMR (Waki et al 2007): **intermediate phase** around 24 kbar, but 2 Cu sites
→ **NOT the expected plaquette phase!**
- Intermediate phase confirmed by **neutron scattering** (Zayed et al, 2017), **ESR** (Sakurai et al, 2018), and **specific heat** (Guo et al, 2020)

A Novel Ordered Phase in $\text{SrCu}_2(\text{BO}_3)_2$ under High Pressure

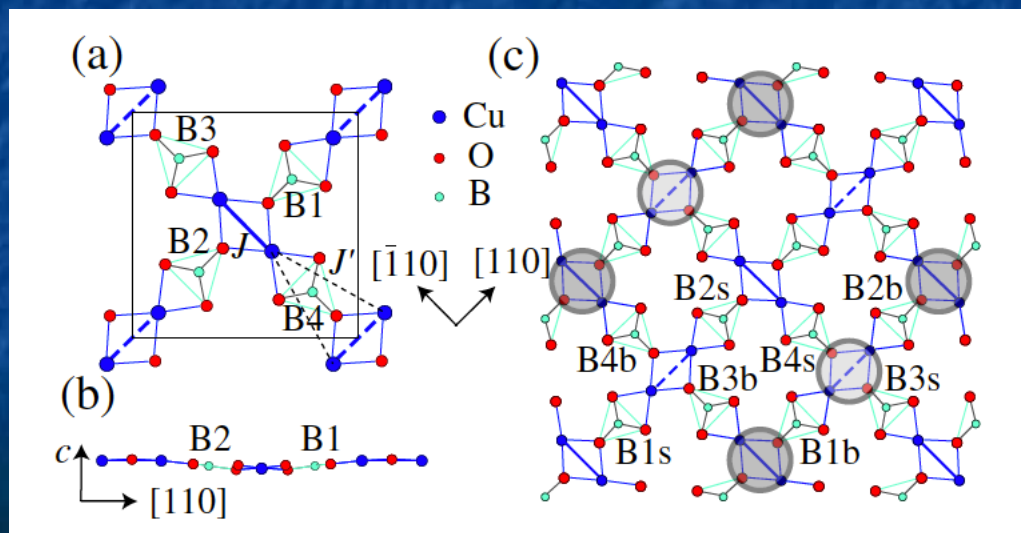
Takeshi WAKI^{1*}, Koichi ARAI^{1†}, Masashi TAKIGAWA^{1‡}, Yuta SAIGA^{1,2},
Yoshiya UWATOKO¹, Hiroshi KAGEYAMA³, and Yutaka UEDA¹

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³*Department of Chemistry, Graduate School of Science, Kyoto University, Kyoto 606-8502*

(Received May 2, 2007; accepted May 31, 2007; published July 10, 2007)



Intermediate phase
under pressure,
but **two types of
Cu sites**

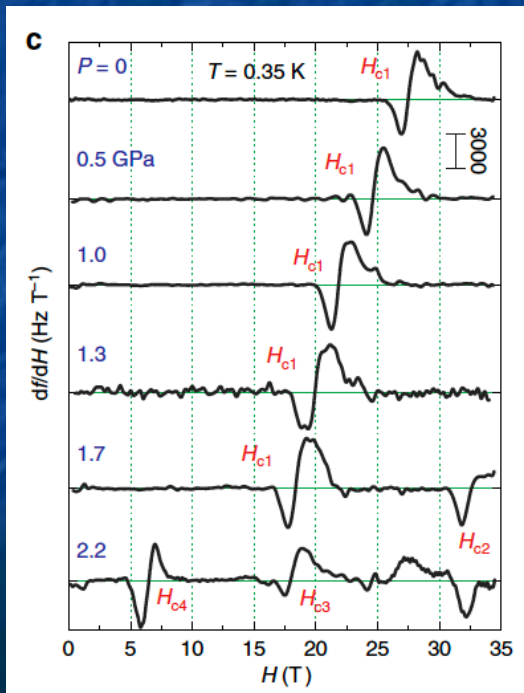


**NOT the empty
plaquette phase**

Crystallization of spin superlattices with pressure and field in the layered magnet $\text{SrCu}_2(\text{BO}_3)_2$

S. Haravifard^{1,2,3}, D. Graf⁴, A.E. Feiguin⁵, C.D. Batista^{6,7,8}, J.C. Lang³, D.M. Silevitch^{2,9}, G. Srajer³, B.D. Gaulin¹⁰, H.A. Dabkowska¹⁰ & T.F. Rosenbaum^{2,9}

Second derivative of magnetization



Magnetic field response
under pressure



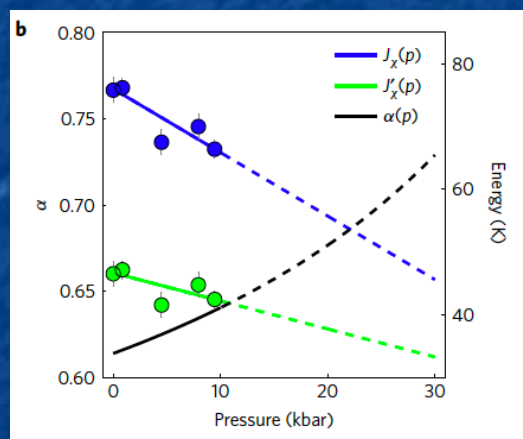
Confirmation of a phase
transition around 2GPa

4-spin plaquette singlet state in the Shastry–Sutherland compound $\text{SrCu}_2(\text{BO}_3)_2$

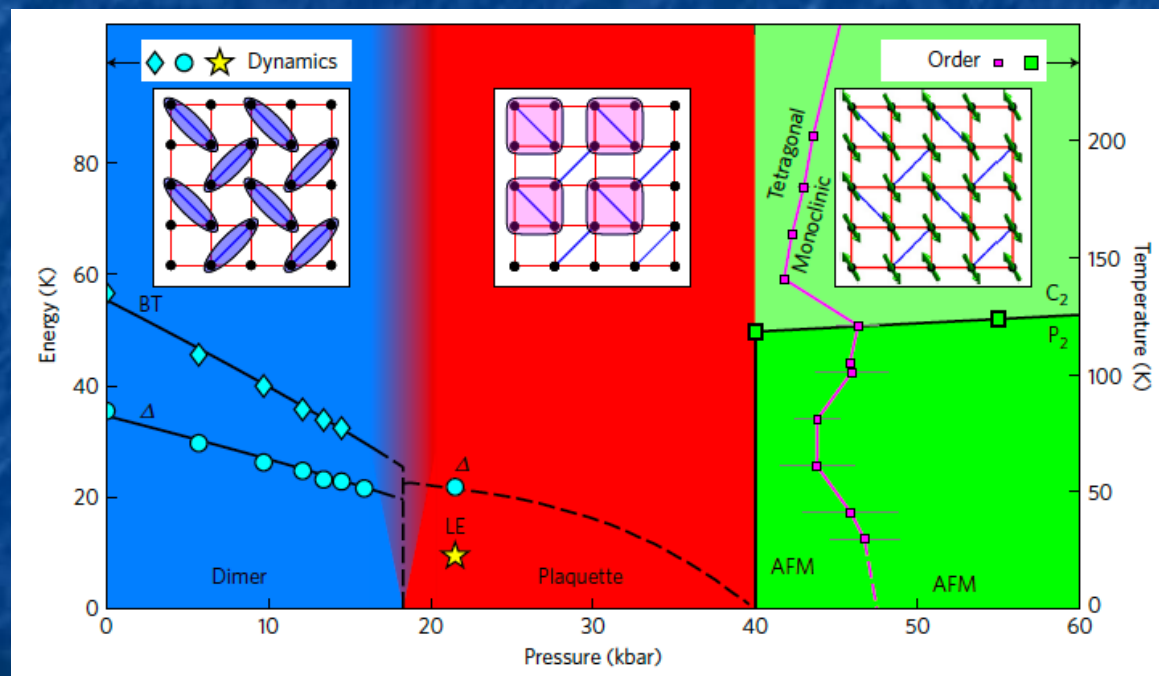
M. E. Zayed^{1,2,3*}, Ch. Rüegg^{2,4,5}, J. Larrea J.^{1,6}, A. M. Läuchli⁷, C. Panagopoulos^{8,9}, S. S. Saxena⁸, M. Ellerby⁵, D. F. McMorrow⁵, Th. Strässle², S. Klotz¹⁰, G. Hamel¹⁰, R. A. Sadykov^{11,12}, V. Pomjakushin², M. Boehm¹³, M. Jiménez-Ruiz¹³, A. Schneidewind¹⁴, E. Pomjakushina¹⁵, M. Stingaciu¹⁵, K. Conder¹⁵ and H. M. Rønnow¹

Neutron scattering

Susceptibility



J/J_D increases

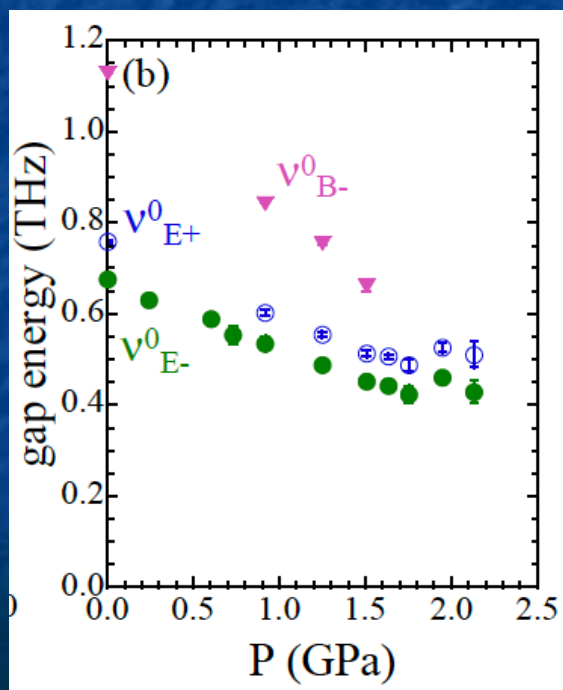


Full plaquette intermediate phase

Direct Observation of the Quantum Phase Transition of $\text{SrCu}_2(\text{BO}_3)_2$ by High-Pressure and Terahertz Electron Spin Resonance

Takahiro Sakurai^{1*}, Yuki Hirao², Keigo Hijii³, Susumu Okubo³, Hitoshi Ohta³, Yoshiya Uwatoko⁴, Kazutaka Kudo⁵, and Yoji Koike⁶

ESR



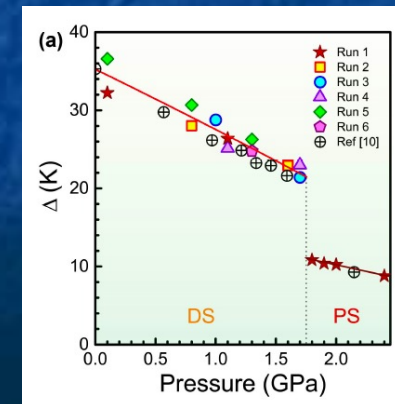
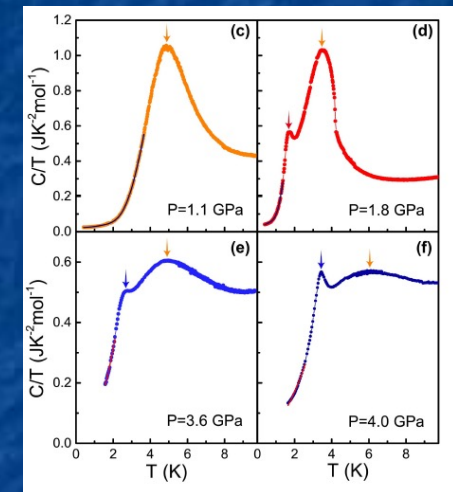
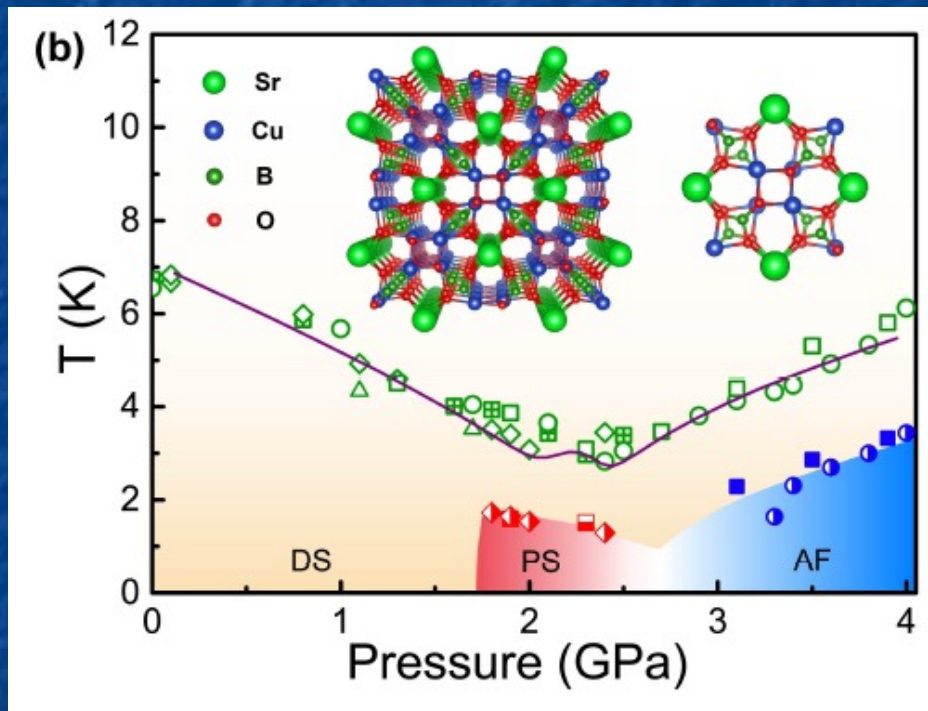
The gap levels off around 1.8 GPa



Confirmation of a phase transition around 1.8 GPa

Quantum Phases of $\text{SrCu}_2(\text{BO}_3)_2$ from High-Pressure Thermodynamics

Jing Guo¹, Guangyu Sun^{1,2}, Bowen Zhao³, Ling Wang^{4,5}, Wenshan Hong^{1,2}, Vladimir A. Sidorov⁶, Nvsen Ma¹, Qi Wu¹, Shiliang Li^{1,2,7}, Zi Yang Meng^{1,8,7,*}, Anders W. Sandvik^{3,1,†} and Liling Sun^{1,2,7,‡}



Intermediate phase with critical temperature around 2K

A quantum magnetic analogue to the critical point of water

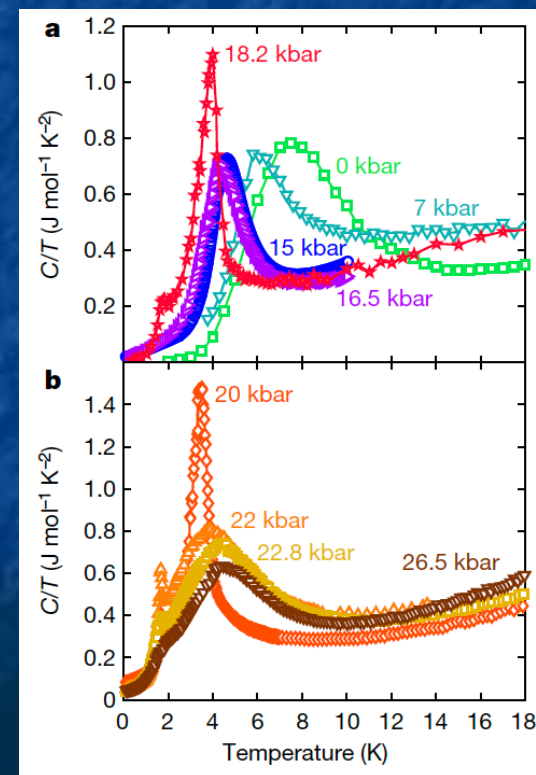
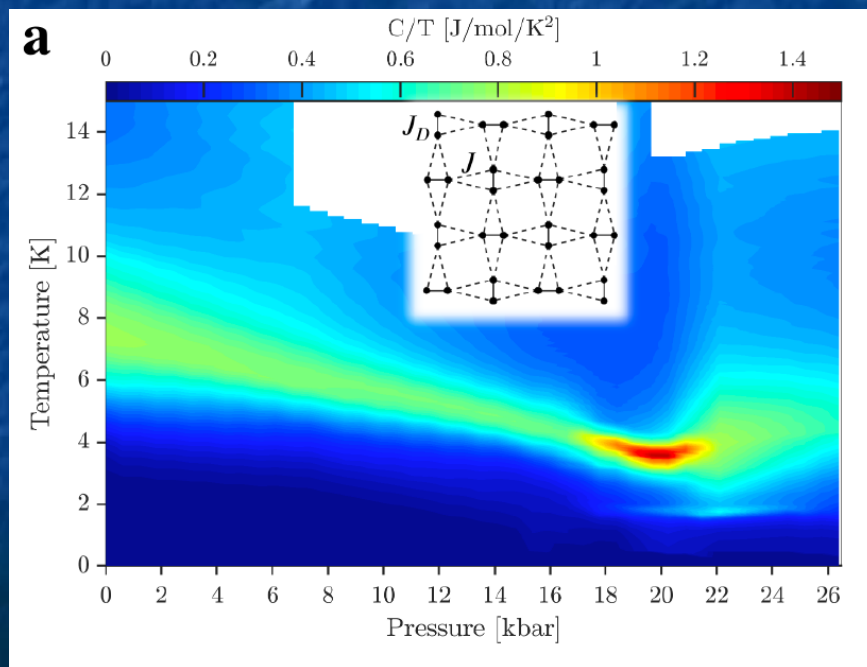
Nature | Vol 592 | 15 April 2021

<https://doi.org/10.1038/s41586-021-03411-8>

Received: 30 September 2020

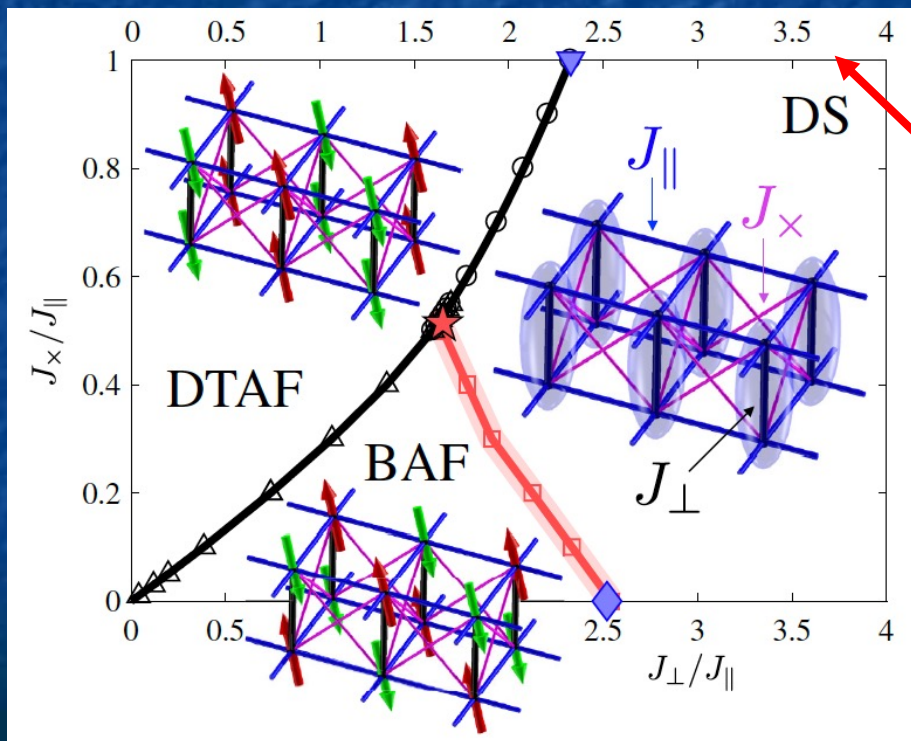
Accepted: 26 February 2021

J. Larrea Jiménez^{1,2}, S. P. G. Crone^{3,4}, E. Fogh², M. E. Zayed⁵, R. Lortz⁶, E. Pomjakushina⁷, K. Conder⁷, A. M. Läuchli⁸, L. Weber⁹, S. Wessel⁹, A. Honecker¹⁰, B. Normand^{2,11}, Ch. Rüegg^{2,11,12,13}, P. Corboz^{3,4}, H. M. Rønnow² & F. Mila²



Thermal Critical Points and Quantum Critical End Point in the Frustrated Bilayer Heisenberg Antiferromagnet

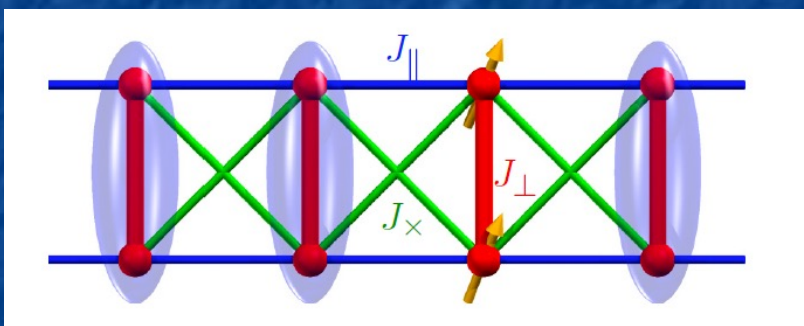
J. Stapmanns,¹ P. Corboz,² F. Mila,³ A. Honecker,⁴ B. Normand,⁵ and S. Wessel¹



Fully frustrated bilayer

Fully frustrated dimer models

- Example: fully-frustrated ladder



$$J_{\times} = J_{\parallel}$$

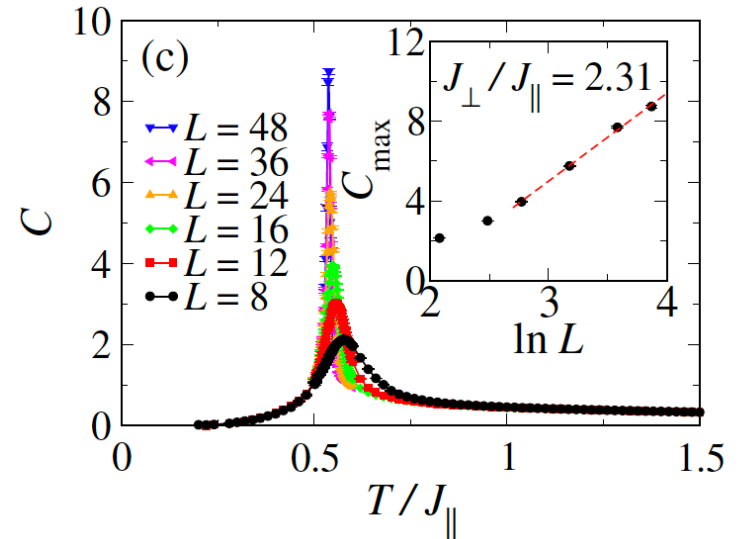
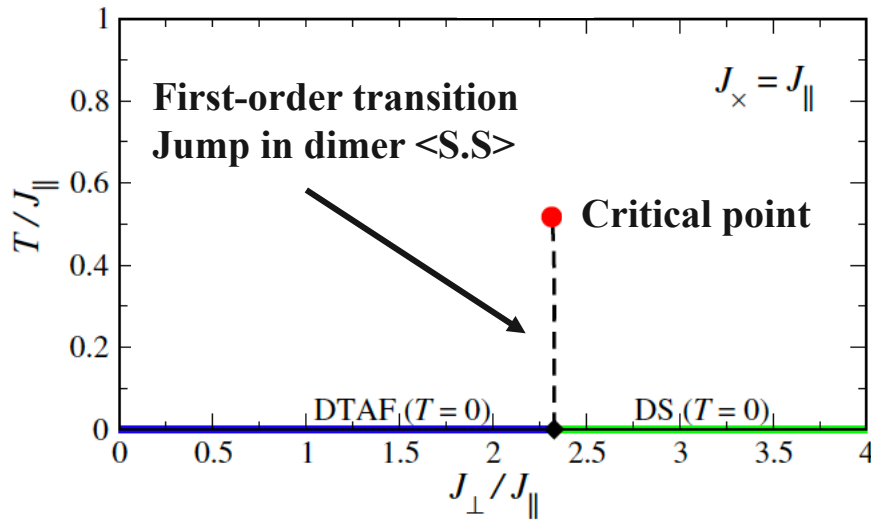
$$H = J_{\parallel} \sum_{i=1}^L \vec{T}_i \cdot \vec{T}_{i+1} + J_{\perp} \sum_{i=1}^L \left(\frac{1}{2} \vec{T}_i^2 - S(S+1) \right)$$

$\vec{T}_i = \vec{S}_i^1 + \vec{S}_i^2$ Total spin on a rung is a **good quantum number**

Hamiltonian in dimer basis

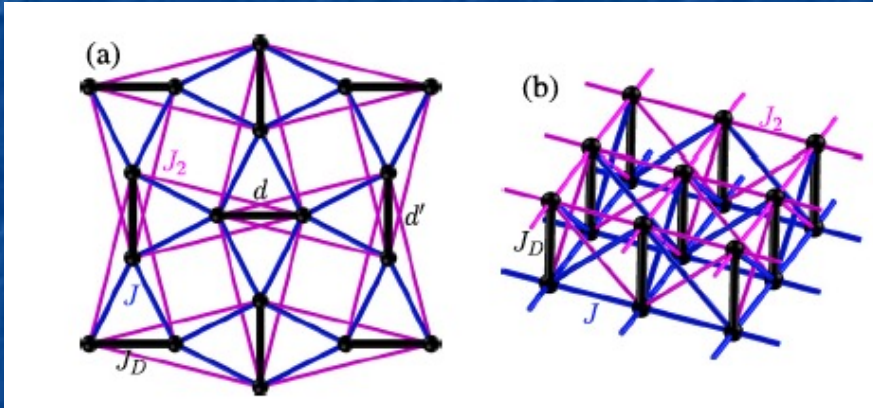
- In general, involves both **the sum and the difference of spins** on a dimer
 - If all exchange integrals between the spins of coupled dimers are equal (**maximal frustration**), the Hamiltonian can be written in terms of the **sum only**
- QMC possible if **bipartite lattice of dimers**

Ising critical point



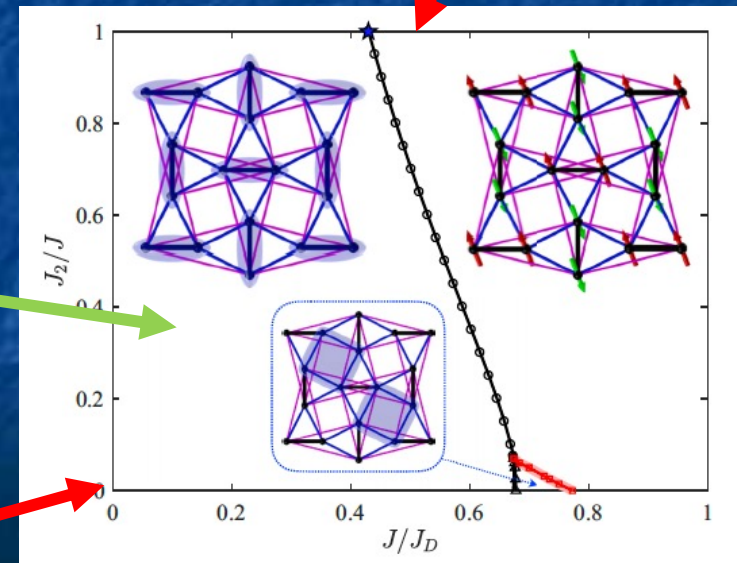
Ising 2D: $\alpha = 0$
 $C \propto \ln L$

From FFB to Shastry-Sutherland



Fully-frustrated bilayer

GS = product of dimers



Shastry-Sutherland model

Thermal properties of Shastry-Sutherland model

Hamiltonian : **cannot** be written in terms of sum of spins of dimers

$$\langle A \rangle = \frac{\sum_c W_c A_c}{\sum_c W_c} = \frac{\sum_c \text{sign}(W_c) |W_c| A_c}{\sum_c \text{sign}(W_c) |W_c|} = \frac{\langle \text{sign} A \rangle' }{\langle \text{sign} \rangle' }$$

■ Up to $J/J_D = 0.526\dots$

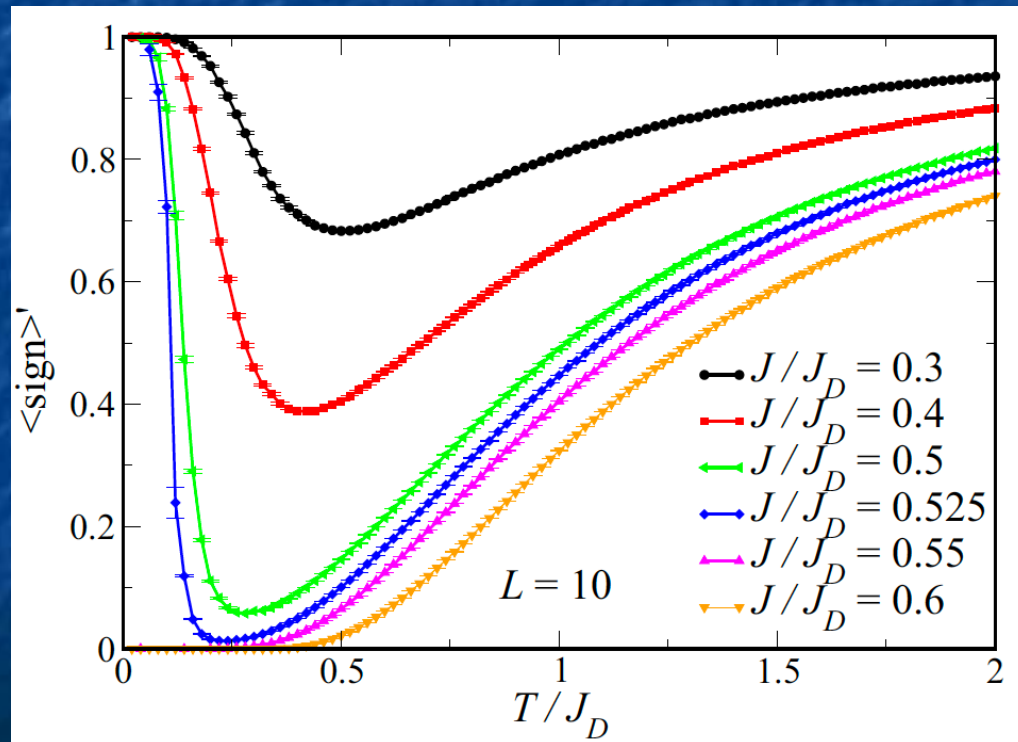
→ The model with all off-diagonal matrix elements put arbitrarily negative has the same GS

→ $\langle \text{sign} \rangle' \rightarrow 1$ as $T \rightarrow 0$

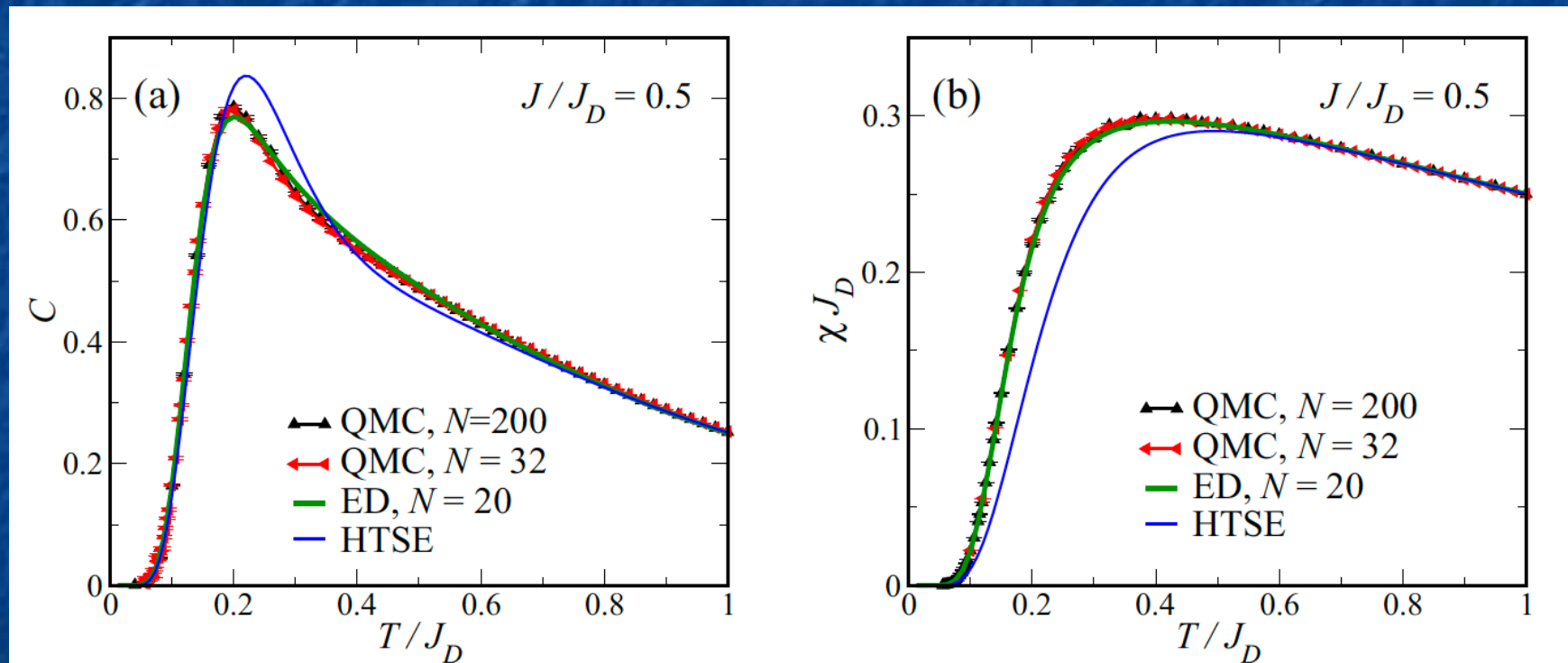
→ **QMC possible!**

Thermodynamic properties of the Shastry-Sutherland model from quantum Monte Carlo simulations

Stefan Wessel,¹ Ido Niesen,² Jonas Stapmanns,¹ B. Normand,³ Frédéric Mila,⁴ Philippe Corboz,² and Andreas Honecker⁵



Specific heat and susceptibility



And above $J/J_D = 0.526$?

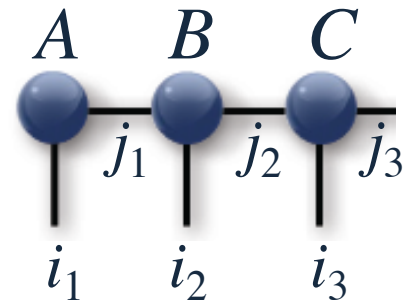
Tensor networks

$$|\psi\rangle = \sum_{i_1 \dots i_N} c_{i_1 \dots i_N} |i_1\rangle \otimes \dots \otimes |i_N\rangle$$

$c_{i_1 \dots i_N} \simeq$ trace over a product of tensors

Example: Matrix product state in 1D (DMRG)

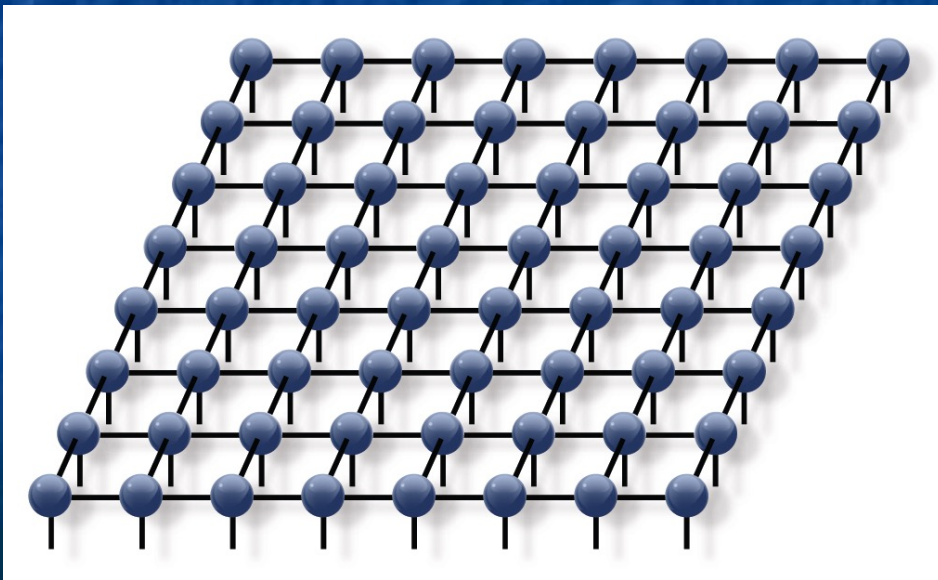
$$c_{i_1 i_2 i_3 \dots} \simeq \sum_{j_1 j_2 \dots} A_{i_1}^{j_1} B_{i_2}^{j_1 j_2} C_{i_3}^{j_2 j_3} \dots$$



Generalization to 2D

PEPS = product of entangled pair states

Verstraete and Cirac, 2004



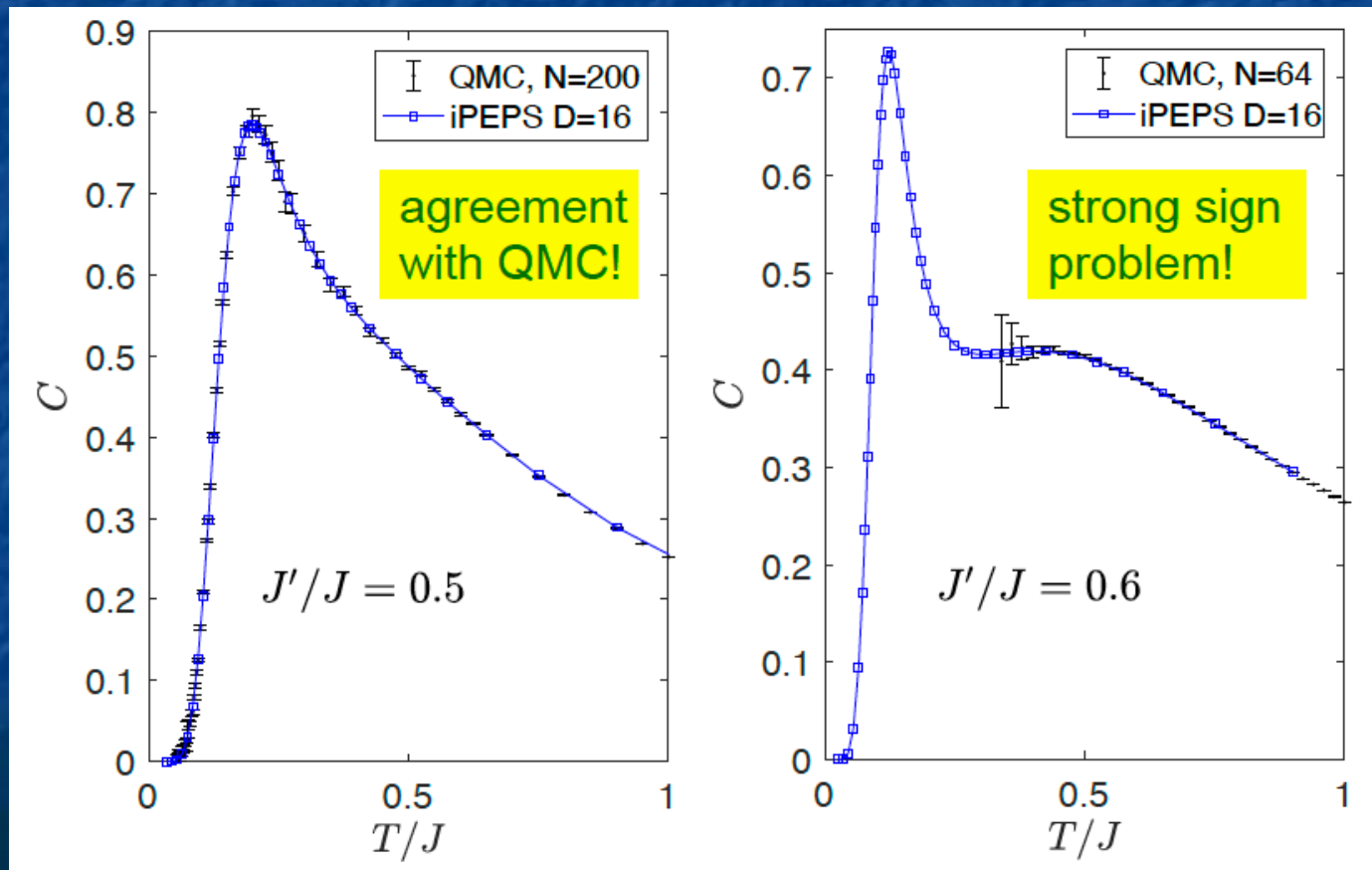
$$A_i^{j_1 j_2 j_3 j_4} = \text{rank-5 tensor}$$

$$j_1, j_2, j_3, j_4 = 1, \dots, D$$

Tensor network for $T > 0$

- **Purified state:** density matrix can be written as the partial trace of a quantum state in an enlarged Hilbert space (with extra "ancilla" degrees of freedom)
- **T infinite:** Singlets between physical and ancilla degrees of freedom
- **Finite T :** **imaginary-time evolution from T infinite**

F. Verstraete, J. J. Garcia-Ripoll, and J. I. Cirac, PRL 2004

Thermodynamic properties of the Shastry-Sutherland model throughout the dimer-product phaseAlexander Wietek^{1,2,*}, Philippe Corboz,³ Stefan Wessel,⁴ B. Normand,⁵ Frédéric Mila,⁶ and Andreas Honecker⁷

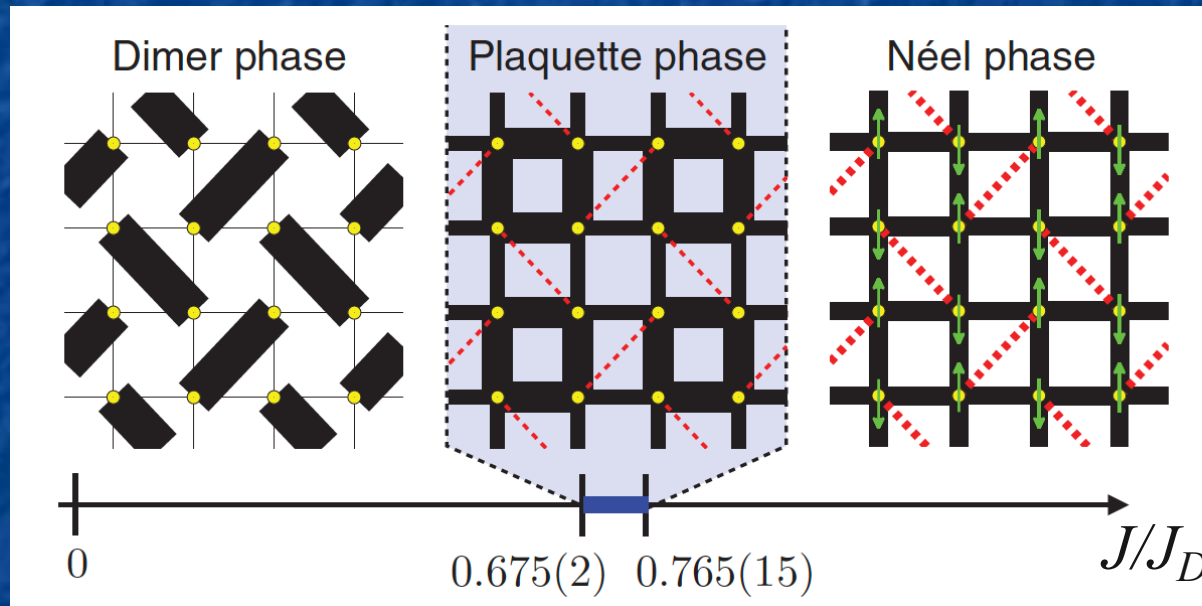
Tensor network study of the Shastry-Sutherland model in zero magnetic field

Philippe Corboz¹ and Frédéric Mila²

¹*Theoretische Physik, ETH Zürich, CH-8093 Zürich, Switzerland*

²*Institut de théorie des phénomènes physiques, École Polytechnique Fédérale de Lausanne (EPFL), CH-1015 Lausanne, Switzerland*

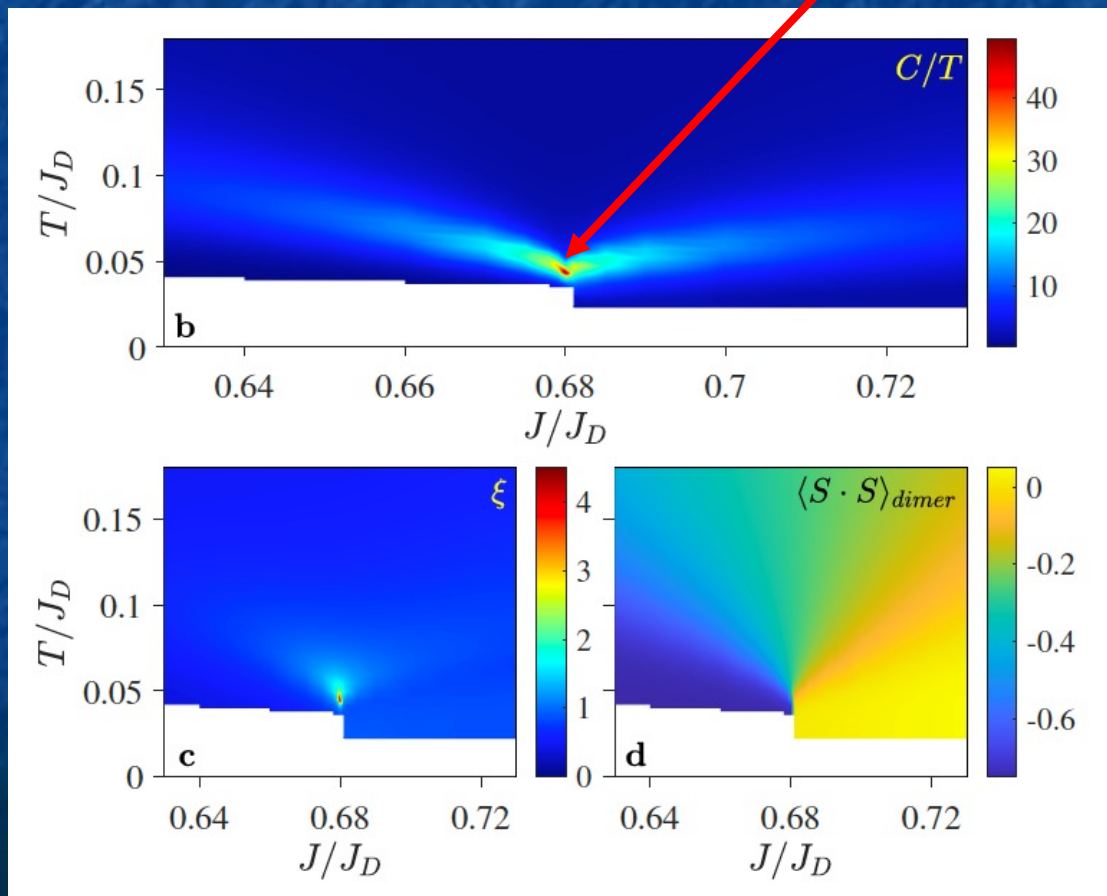
(Received 13 December 2012; revised manuscript received 27 February 2013; published 27 March 2013)



iPEPS with various setups and bond dimension up to 10

iPEPS for Shastry-Sutherland

Critical point

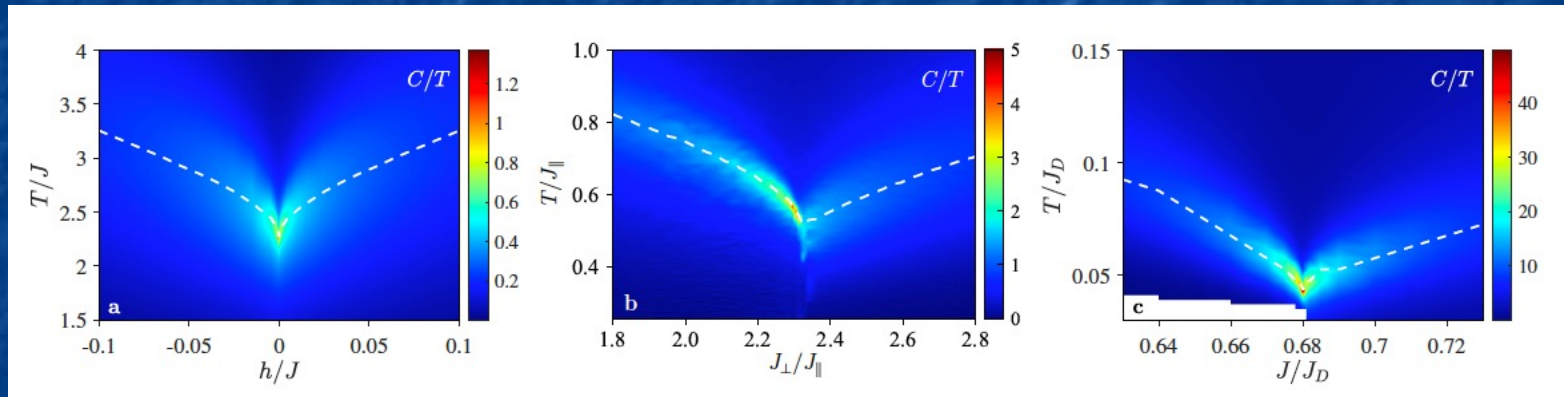


Critical point in various models...

Ising in a field

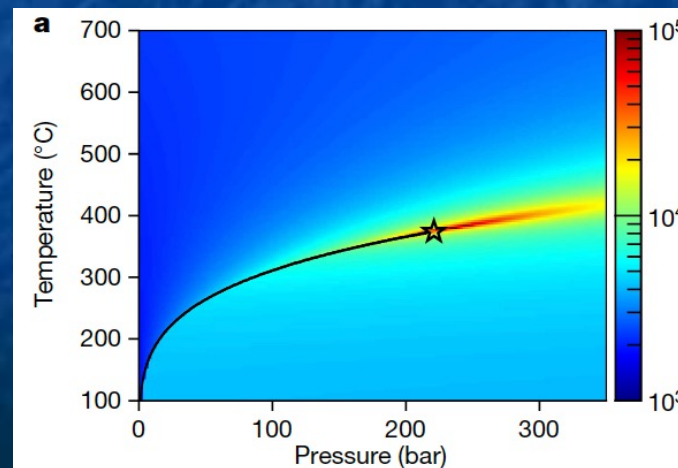
FFB

Shastry-Sutherland



... and in water

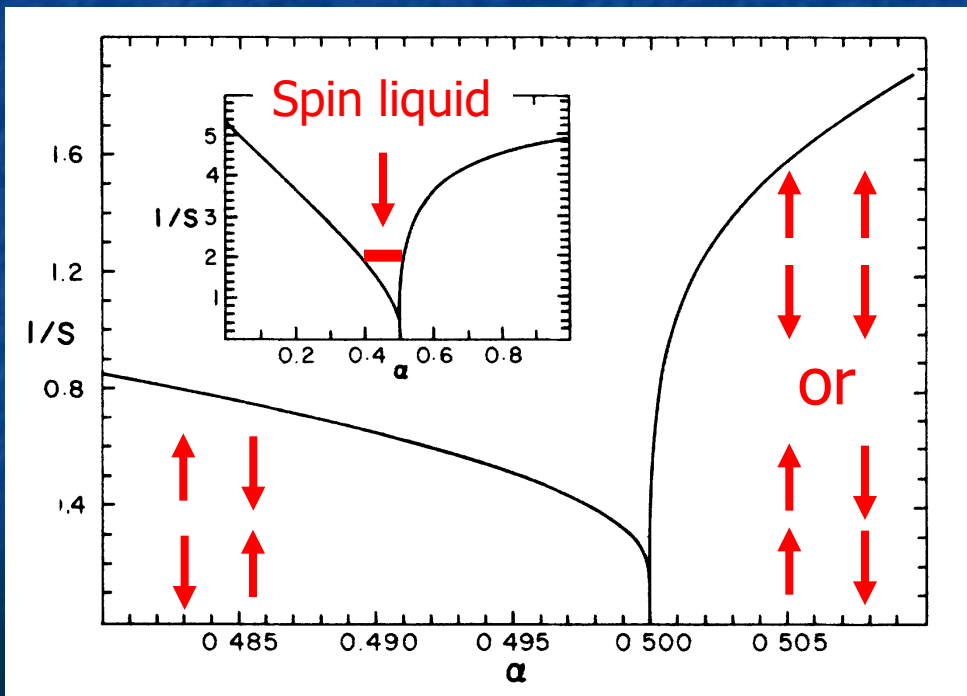
$T_c = 374^{\circ} \text{C}$
 $P_c = 218 \text{ bar}$



1822: Cagniard de la Tour

J_1 - J_2 model on square lattice

$$\mathcal{H} = J_1 \sum_{NN} \mathbf{S}_i \cdot \mathbf{S}_j + J_2 \sum_{NNN} \mathbf{S}_i \cdot \mathbf{S}_j$$



Chandra and Douçot,
PRB 1988

$$\alpha = J_2/J_1$$

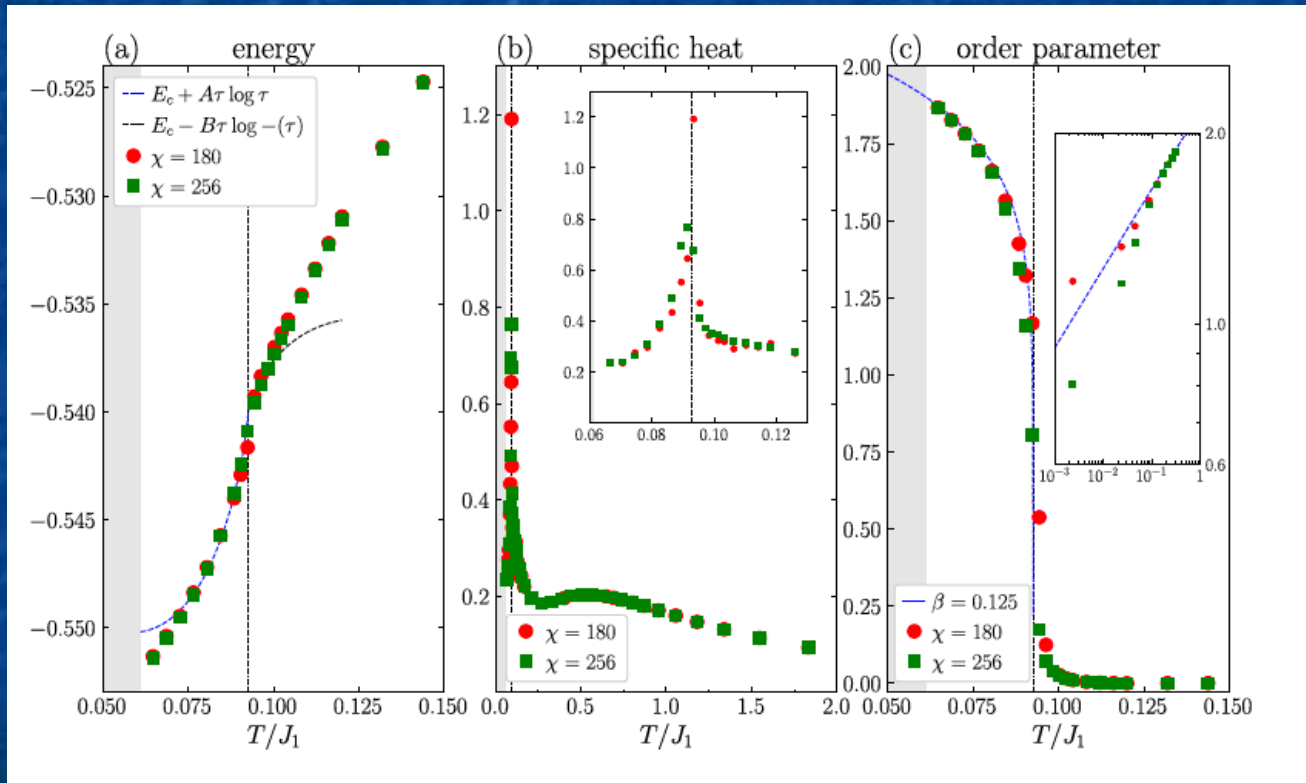
Ising transition in J_1 - J_2 model

- Two helical states in collinear phase at large J_2
 - Ising transition at finite temperature
Chandra, Coleman and Larkin, PRL 1990
- Numerical confirmation?
 - QMC: very severe minus sign problem
 - iPEPS: Yes if $SU(2)$ symmetry strictly enforced during imaginary time evolution



Thermal Ising Transition in the Spin-1/2 J_1 - J_2 Heisenberg Model

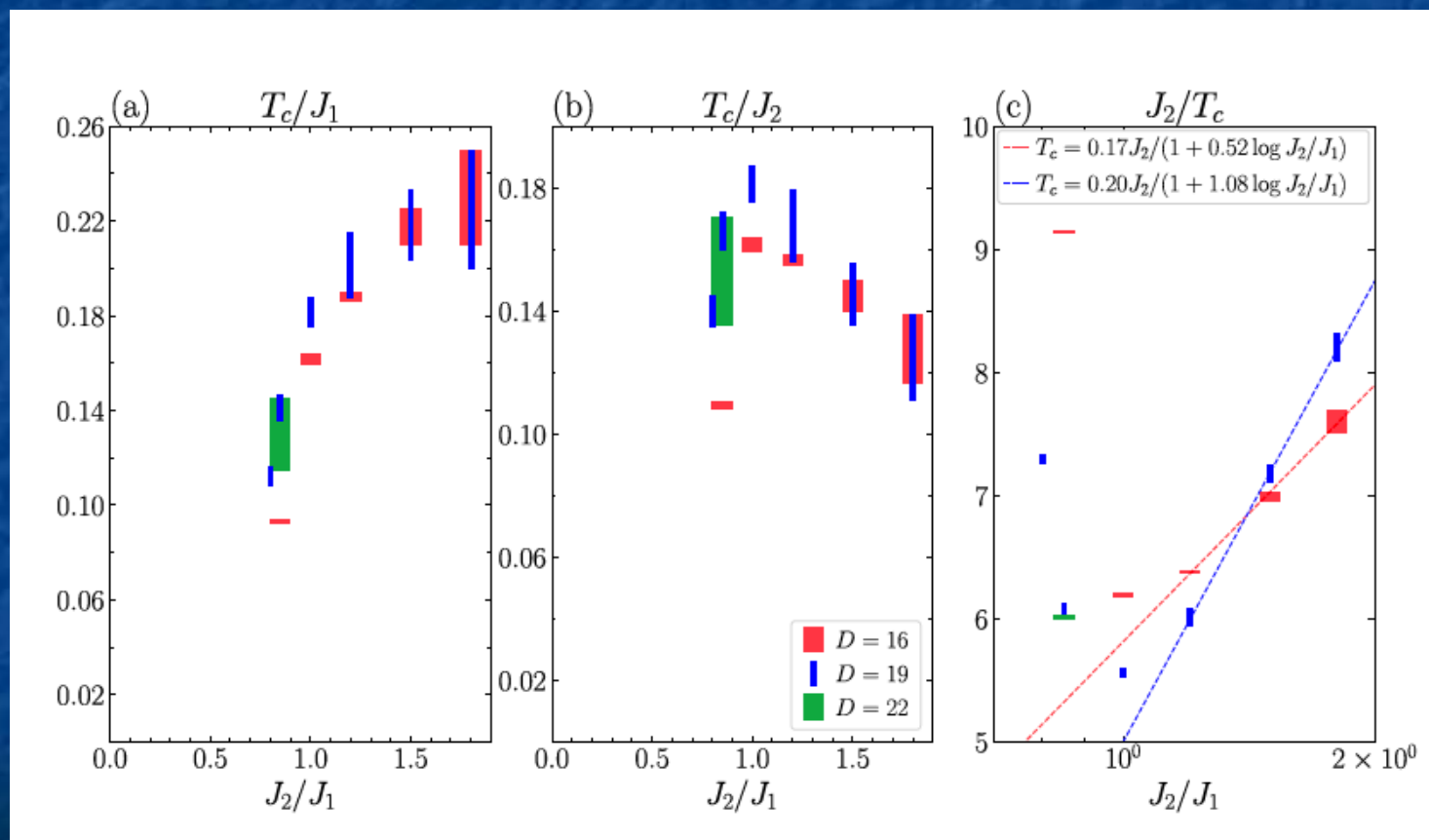
Olivier Gauthé^{*} and Frédéric Mila



$J_2/J_1 = 0.85$

Ising transition for J_2/J_1 large enough from finite T iPEPS

Phase diagram of J_1 - J_2 model



Conclusions

- **Tensor networks contracted with CTMRG**
 - Clearly outperforms Monte Carlo for certain 2D classical problems
- **Thermal properties of frustrated quantum magnets**
 - QMC: sometimes possible, e.g. in dimer basis
 - **Tensor networks with quantum purification**
 - Critical point of Shastry-Sutherland model
 - Ising transition of J_1 - J_2 model on square lattice