Lectures on I: Introduction to iPEPS 2: Advanced iPEPS techniques

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Outline of today's lecture

- iPEPS at finite temperature
 - Imaginary time evolution of density operator (or purification)
- Finite correlation length scaling
 - Study of critical phenomena and order parameter extrapolations in gapless systems
- Spiral iPEPS
 - efficient simulation of incommensurate spin spiral phases

Excitations & spectral functions

Excitation ansatz & real-time evolution

Extensions to 3D

- iPEPS for 3D quantum systems
- iPEPS for layered systems in 3D

iPEPS at finite temperature

Finite temperature simulations with iPEPS

Methodological developments (2D):

Li et al. PRL 106 (2011); Czarnik et al. PRB 86 (2012); Czarnik & Dziarmaga PRB 90 (2014); Czarnik & Dziarmaga PRB 92 (2015); Czarnik et al. PRB 94 (2016); Dai et al PRB 95 (2017); Kshetrimayum, Rizzi, Eisert, Orus, PRL 122 (2019), P. Czarnik, J. Dziarmaga, PC, PRB 99 (2019), ...



 $\hat{
ho}(eta) = \hat{
ho}^{\dagger}(eta)$ by construction



Other (equivalent) formulation using purification:



Imaginary time evolution

- Czarnik, Dziarmaga & PC, PRB 99 (2019)
- Start at infinite temperature: $\ \hat{\rho}(\beta=0)=\mathbb{I}$
- Initial state:
 Initial
- Evolve in imaginary time: $\hat{\rho}(\beta) = e^{-\beta \hat{H}/2} \hat{\rho}(0) e^{-\beta \hat{H}/2}$



- Truncate after each step using e.g. simple / full update
- Evolve up to target $\beta/2$

The Shastry-Sutherland model and SrCu₂(BO₃)₂



Shastry & Sutherland, Physica B+C 108 (1981)

Kageyama et al. PRL 82 (1999)

The Shastry-Sutherland model and SrCu₂(BO₃)₂



Finite temperature simulation examples

Wietek, PC, Wessel, Normand, Mila, and Honecker, PRR 1 (2019)

- Benchmarks in the dimer phase of the Shastry-Sutherland model
- Comparison between ED, TPQ, QMC, iPEPS



SrCu₂(BO₃)₂ under pressure



Bettler, et al., Phys. Rev. Research 2, 012010 (2020)

Specific heat data (group of H. M. Rønnow)



Wessel, Honecker, Normand, Rüegg, PC, Rønnow & Mila, Nature 592, 370 (2021); see also Wang et al, PRL 131 (2023)

Correlation length & jump in <S · S> on dimer



Clear evidence of a first order line with a critical point compatible with the 2D Ising universality class

also confirmed with MPS: Wang, Li, Xi, Gao, Yan, Li, Su, PRL 131, 116702 (2023)



Other examples		PHYSICAL REVIEW B 100, 165147 (2019)
PHYSICAL REVIEW B 103, 075113 (2021)	Tensor network simulation of the Kitaev-Heisenberg model at finite temperature Piotr Czarnik [®] , ¹ Anna Francuz, ² and Jacok Dziarmaga ²	
	⁴ Institute of Nuclear Physics, Polish Academy of Sciences, Radzikowskiego 152, PL-31342 Kraków, Poland ⁹ Marian Smoluchowski Institute of Physics, Jagiellonian University, alitsa Prof. S. Łojasiewicza 11, PL-30-348 Kraków, Poland	
Tensor network study of the $m = \frac{1}{2}$ magnetization plateau in the Shamodel at finite temperature	astry-Sutherland	
Piotr Czarnik, ¹ Marek M. Rams ¹ , ² Philippe Corboz, ³ and Jacek Dziarmaga ² ¹ Theoretical Division, Los Alamos National Laboratory, Los Alamos, New Mexico 87545, USA ² Institute of Theoretical Physics, Jagiellonian University, Lojasiewicza 11, PL-30348 Kraków, Poland ³ Institute for Theoretical Physics, Delta Institute for Theoretical Physics, University of Amsterdam, Science Park 904, 1098 XH Amsterdam, The Netherlands PHYSICAL REVIEW LETTERS 128, 227202 (2022)		Finite-temperature symmetric tensor network
		Didier Pollblanc ¹ *, Matthieu Mambrini ¹ and Fabien Alet ¹
Thermal Ising Transition in the Spin-1/2 J ₁ -J ₂ Heisenberg Model Olivier Gauthé® [°] and Frédéric Mila [®] Institute of Physics, Ecole Polytechnique Fédérale de Lausanne (EPFL), CH-1015 Lausanne, Switzerland		PHYSICAL REVIEW B 106, 195105 (2022)
		e-temperature tensor network study of the Hubbard model on an infinite square lattic
PHYSICAL REVIEW B 111, 014428 (2025)		Aritra Sinha ^{®, 1} Marek M. Rams ^{®, 1} Pietr Czarnik, ^{1,2} and Jacok Dziarmaga ¹ ¹ Jagiellonian University, Institute of Theoretical Physics, ulica Lojasiewicza 11, 36 348 Kraków, Poland ² Theoretical Division, Los Alamos National Laboratory, Los Alames, New Mexico 87545, USA
Weakly first-order melting of the 1/3 plateau in the Shastry-	-Sutherland model	Forestalled Phase Separation as the Precursor to Stripe Order
Samuel Nyckees [®] , ¹ Philippe Corboz, ² and Frédéric Mila ^{®1} ¹ Institute of Physics, Ecole Polytechnique Fédérale de Lausanne (EPFL), CII-1015 Lausanne, Switzerland ² Institute for Theoretical Physics and Delta Institute for Theoretical Physics, University of Amsterdam, Science Park 904, 1098 XH Amsterdam, The Netherlands		Aritra Sinha ¹ and Alexander Wietek ¹ ¹ Max Planck Institute for the Physics of Complex Systems, Nöthnitzer Strasse 38, Dresden 01187, Germany (Dated: November 26, 2024)

Obtaining accurate results at low-T challenging! Room for improvement!

Finite correlation length scaling: "finite size scaling" with iPEPS

 $L \to \xi_D$

Motivation: study of quantum phase transitions



- Strong finite size effects in the vicinity of the critical point
- Powerful approach: finite size scaling: $m(g,L) = L^{-\beta/\nu} \mathcal{F}(gL^{1/\nu})$

Motivation: study of quantum phase transitions





- Strong finite size effects in the vicinity of the critical point
- Powerful approach: finite size scaling: $m(g,L) = L^{-\beta/\nu} \mathcal{F}(gL^{1/\nu})$
- Can we do something similar with iPEPS?

Finite correlation length scaling in ID (iMPS)

- iMPS with finite D can only represent states with a finite correlation length
- Correlation length at the critical point: ξ_D
- ξ_D acts as a cut-off on the diverging correlation length, similarly to a finite L

$$m(g,L) = L^{-\beta/\nu} \mathcal{F}(gL^{1/\nu}) \quad \cdot$$

Finite size scaling ansatz



$$m(g,D) = \xi_D^{-\beta/\nu} \mathcal{M}(g\xi_D^{1/\nu})$$

Finite correlation length scaling ansatz

Tagliacozzo, de Oliveira, Iblisdir & Latorre, PRB 78 (2008) Pollmann, Mukerjee, Turner & Moore, PRL 102 (2009) Pirvu, Vidal, Verstraete & Tagliacozzo, PRB 86 (2012)

• Similar idea for 2D tensor networks for 2D classical partition functions

Nishino, Okunishi, Kikuchi, Phys. Lett. A 213 (1996)

$$m(g,\chi) = \xi_{\chi}^{-\beta/\nu} \mathcal{M}(g\xi_{\chi}^{1/\nu})$$

 $\chi : \mathit{bond}\ \mathit{dimension}\ \mathit{for}\ \mathit{contraction}$

How about in (2+1)D with iPEPS?

PC, P. Czarnik, G. Kapteijns, L. Tagliacozzo, PRX 8 (2018); M. Rader and A. M. Läuchli, PRX 8 (2018)

• iPEPS: There exist critical states with a finite D

see e.g. Kraus et al. PRA 81 (2010), Verstraete et al. PRL 96 (2006)

 However, these are 2D classical states or ground states of generalized Rokhsar-Kivelson Hamiltonians at the critical point which can effectively be described by a (2+0)D CFT

see e.g. Henley, JPCM 16 (2004); Ardonne, Fendley & Fradkin, Ann. Phys. 310 (2004); Castelnovo, Chamon, Mudry & Pujol, Ann. Phys. 318 (2005); Isakov, et al. PRB 83 (2011)

• For Lorentz-invariant critical points (2+1D): no example of a critical iPEPS is known

Dynamical critical exponent: z = 1 $\xi_{time} \sim \xi_{space}^z \sim \xi_{space}$

- All simulations suggest: $D
 ightarrow \xi_D$ despite that these states obey an area law!
- Example of a state with an area law which cannot be represented with finite D

 \star We can apply finite correlation length scaling also in 2D!

Finite correlation length scaling with iPEPS

PC, P. Czarnik, G. Kapteijns, L. Tagliacozzo, PRX 8 (2018); M. Rader and A. M. Läuchli, PRX 8 (2018)

• Complication: there are two bond dimensions:

Bond dimension of the TN ansatz:

Boundary dimension in contraction:

$$D \to \xi_D \qquad \qquad \chi \to \xi_\chi$$

- Scaling ansatz: $m(g, D, \chi) = \xi_D^{-\beta/\nu} \mathcal{M}(g\xi_D^{1/\nu}, \xi_D/\xi_\chi)$
- Simplify: eliminate $\,\chi\,\, {\rm dependence}$ by taking $\,\,\chi \to \infty\,\,$ limit
- Now same as in MPS (ID) case:

$$m(g,D) = \xi_D^{-\beta/\nu} \mathcal{M}(g\xi_D^{1/\nu})$$

Computing the correlation length with CTM

Nishino, Okunishi, Kikuchi, Physics Lett. A 213, 69 (1996)



★ Accurate $\chi \rightarrow \infty$ extrapolation technique: Rams, Czarnik & Cincio, PRX 8, 041033 (2018)

Ist and 2nd lowest eigenvalue of M

Application examples

PC, P. Czarnik, G. Kapteijns, L. Tagliacozzo, PRX 8 (2018)



- TF Ising & XY model
- J₁-J₂ Heisenberg model
- *t*-V model at finite T
- Kagome HM
- Anisotropic triangular HM

M. Rader and A. M. Läuchli, PRX 8 (2018) Hasik, Poilblanc, Becca, SciPost Physics 10 (2021) Czarnik, PC, PRB 99 (2019) Ferrari, et. al, SciPost Phys. 14, 139 (2023) Hasik, PC, PRL 133, 176502 (2024)

1.5

The Shastry-Sutherland model revisited



Benchmark comparison of variational energies



 \star iPEPS yields lowest variational energy in the thermodynamic limit

Plaquette - "AF" phase transition at finite D

PC, Zhang, Ponsioen & Mila, arXiv:2502.14091

Plaquette order

AF order (at finite D)



★ Phase transition between 0.78 and 0.79 for large D

P - "AF" transition using constrained iPEPS

PC, Zhang, Ponsioen & Mila, arXiv:2502.14091



* Phase transition between 0.78 and 0.79 for large and infinite D

Finite correlation length scaling



0.675(2) 0.785(5) 0.82(1) J'/J

Study of incommensurate spin spiral phases: spiral iPEPS





Juraj Hasik



J. Hasik, PC, PRL 133, 176502 (2024)

Anisotropic triangular lattice Heisenberg model



- Mean-field theory: Spin spiral order between [0.5, 1] with $\mathbf{q} = (\pi, \pi) \dots (2\pi/3, 2\pi/3)$
- Spin-wave theory: 0-flux quantum spin liquid (QSL) for [0.77, 0.88] Hauke et al, NJP 13 (2011)
- Schwinger boson theory: nematic QSL between [0.6, 0.9] Gonzales et al, PRB 102 (2020)
- Series expansion: dimerized state between [0.7, 0.9] Weihon@et al, PRB 59 (1999)
- DMRG: weak spatial symmetry breaking? Weichselbaum & White, PRB 84 (2011)
- VMC: competing QSL and spiral phase between [0.7, 0.8] Ghorbani et al, PRB 93 (2016)

Numerical study of spin spiral phases

- **Challenge:** system size needs to be commensurate with the wavelength of the spin spiral
- VMC: only specific wave vectors can be realized → **bias**
- iPEPS: large unit cells are in principle possible... ... but rather cumbersome/expensive
- **Spiral iPEPS:** single-tensor ansatz with position dependent local unitaries





rotates the spin in the x-z plane, turning the spiral into a (correlated) ferromagnet, with wavevector **q** as variational parameter

Similar approach used for MPS in ID: Ueda & Maruyama, PRB 86 (2012)

Optimal \boldsymbol{q} as a function of J_{II}



• m suppressed around [0.7, 0.8]

• Optimal $q = (\pi, \pi)$ up to $J_{11} \sim 0.75$

Extrapolated order parameter



• Quantum spin liquid for $J_{11} \in [0.73(1), 0.80(2)]$

Unbiased simulation of spiral order is crucial for resolving the competition with QSL !

Excitations with iPEPS



Haegeman, Pirvu, Weir, Cirac, Osborne, Verschelde, and Verstraete, PRB 85, 100408(R) (2012).
Haegeman, Michalakis, Nachtergaele, Osborne, Schuch, and Verstraete, PRL 111, 080401 (2013).
Haegeman, Osborne, and Verstraete, PRB 88, 075133 (2013).
Zauner, Draxler, Vanderstraeten, Degroote, Haegeman, Rams, Stojevic, Schuch, and Verstraete, New J. Phys. 17, 053002 (2015).
Vanderstraeten, Marien, Verstraete, and Haegeman, PRB 92, 201111 (2015)
Vanderstraeten, Haegeman, and Verstraete, PRB 99, 165121 (2019)

iPEPS excitation ansatz: the challenge

Excitation on top of ground state with momentum k



Ansatz consists of an infinite sum!

• Minimizing: $\langle \Phi_{\vec{k}}(B) | \hat{H} | \Phi_{\vec{k}}(B) \rangle$

• Use systematic summation:

Triple infinite sum!

Translational invariance \rightarrow Double infinite sum



Boris Ponsioen

Channel environments Vanderstraeten, Haegeman, and Verstraete, PRB 99 (2019) CTM approach Ponsioen and PC, PRB 101, 195109 (2020) Ponsioen, Assaad, PC, SciPost Physics, 12, 006 (2022) CTM + AD approach Ponsioen, Hasik, PC, PRB 108 (2023) Generating function

Vanderstraeten, Marien, Verstraete, and Haegeman, PRB 92 (2015)

Tu, Vanderstraeten, Schuch, Lee, Kawashima, Chen, PRX Quantum '24

Systematic summation using CTM





Energy

Norm



Energ

Energy + excitation

Left move examples:



Ponsioen & PC, PRB 101 (2020)

Excitation

Simpler: use AD to avoid the summation of energy terms

Ponsioen, Assaad, PC, SciPost Physics, 12, 006 (2022) Ponsioen, Hasik, PC, PRB 108 (2023) Tu, Vanderstraeten, Schuch, Lee, Kawashima, Chen, PRX Quantum '24

Benchmark: 2D Heisenberg model



Ponsioen and PC, PRB 101, 195109 (2020)

similar results in: Vanderstraeten, Haegeman, Verstraete, PRB 99, 165121 (2019)

Charge gap in the half-filled Hubbard model

Ponsioen, Assaad, PC, SciPost Physics, 12, 006 (2022)



 ★ Systematic improvement with D, approaching QMC for U/t=4 and U/t=8 ★ QMC: extracting gap at large
 U/t is exponentially hard,
 in contrast to iPEPS

Spectral function A(ω , k) for U/t=8 (half fi.....

Ponsioen, Assaad, PC, SciPost Physics, 12, 006 (2022)

 $=\sum_{\sigma} dt e$

 $\Phi_0[\hat{c}_{\sigma,k}^\dagger(0)]$

dt $e^{-i\omega t}e^{-iE_0t}$ ($\psi_0|\hat{c}|$



Already a powerful tool, but computationally rather expensive. Further improvements desirable!

Spectral function via real-time evolution

$$S(\mathbf{k},\omega) = \int dt e^{i\omega t} \sum_{\mathbf{r}} e^{-i\mathbf{k}\mathbf{r}} \langle O_{\mathbf{r}}(t)O_{0} \rangle$$
$$\downarrow$$
$$e^{iE_{0}t} \langle \Psi_{0} | O_{\mathbf{r}}e^{-i\hat{H}t}O_{0} | \Psi_{0} \rangle$$



Real time evolution of iPEPS with O applied

Approach:

Arias Espinoza, PC, PRB 110 (2024)

- Start from uniform GS (I-site unit cell)
- Extend unit cell size to L x L
- Apply operator O in the center of unit cell
- ullet Time evolve $O_0 |\Psi_0
 angle$ up to t_f with FU

Czarnik, Dziarmaga, Corboz, PRB 99 (2019)

- Compute overlaps with $\langle \Psi_0 | O_{f r}
 ightharpoonup$ for all r and t
- Compute spatial FT and then temporal FT (convoluted with Gaussian)





Dynamical structure factor via real-time evolution



$$\hat{H} = -\sum_{\langle i,j \rangle} \hat{\sigma}_i^z \hat{\sigma}_j^z - \lambda \sum_i \hat{\sigma}_i^x$$



Finite D, L effects and maximal time (λ =2.5)



Dynamical structure factor via real-time evolution



- Overall good agreement with results from excitation ansatz
- Reaching long times is challenging: increasing cell size required to avoid interaction effects between nearby cells

Extensions to 3D

Tensor network methods for 3D quantum systems

- Main challenge: how to contract it??
- Several works in the context of 3D classical or 2+1D:

+ 3D HOTRG:

Xie, Chen, Qin, Zhu, Yang, Xiang, PRB 86 (2012)

Corner-transfer matrix (CTM) in 3D:

Nishino and Okunishi, J. Phys. Soc. Jpn. 67, 3066 (1998) Orús, PRB 85, 205117 (2012)

Approaches based on a boundary iPEPS:

Nishino, et al, Nucl. Phys. B 575 (2000); Nishino, et al, Prog. Theor. Phys. 105 (2001) Gendiar, Nishino, PRE 65, 046702 (2002); Gendiar and Nishino, PRB 71 (2005) Gendiar, Maeshima, and Nishino, Prog. Theor. Phys. 110 (2003) Vanderstraeten, Vanhecke, and Verstraete, PRE 98, 042145 (2018)

+ Other approaches:

Ran, Piga, Peng, Su, and Lewenstein, PRB 96, (2017) Jahromi and Orús, PRB 99 (2019); Sci. Rep. 10 (2020) Tepaske and Luitz, PRR 3 (2021); Magnifico, et al, Nat. Comm. 12 (2021) Gray, Chan, PRX 14 (2014)



Overview

Cluster contractions:

- Contract finite clusters instead of full network
- cheap & simple
- Not very accurate, but useful for quick results



Vlaar & PC, PRB 103 (2021); PRL 130 (2023)



Patrick Vlaar

Full 3D contraction: the SU + CTM approach

- Boundary iPEPS approach
- Combination of simple update (SU) truncation
 - + CTM method
- Good accuracy & convergence & tractable cost

Contraction of layered systems: LCTM

- Decouple layers away from the center
 - \rightarrow use CTM to contract 2D layers
- ✦ Good accuracy for anisotropic systems
- Substantially lower cost than full 3D algorithm





Full 3D contraction: SU + CTM approach



 $\mathcal{O}(\chi_c^3\chi_b^4D^4+\chi_c^2\chi_b^6D^6+\chi_c^2\chi_b^4D^9)$

Convergence in χ_c and χ_b (3D Heisenberg model)



\star Systematic convergence in χ_c and χ_b

Comparison with 3D HOTRG

Xie, Chen, Qin, Zhu, Yang, Xiang, PRB 86, 045139 (2012)



★ Very irregular convergence with HOTRG, in contrast to SU+CTM

Benchmark results in 3D

Vlaar & PC, PRB 103 (2021)



★ SU+CTM: promising approach for 3D problems

Layered systems (anisotropic 3D)



Cuprates

Barišić, et al., PNAS 110, 12235 (2013)



Herbertsmithite



Khuntia et al., Nature Physics 16, 469 (2020)

SrCu₂(BO₃)₂



Radtke et al., PNAS 112 (2015)

iPEPS for layered systems

Vlaar, PC, arxiv:2208.06423



Ansatz:

- 3D tensor network ansatz (coupled iPEPSs)
- $D_{xy} > D_z$ for weak interlayer coupling
- $D_z = I \rightarrow \text{product state of iPEPSs}$

Contraction:

- D_z = I : contract individual layers (2D)
- D_z > I : perform effective decoupling away from center using full update
 → 2D contraction
- Interlayer correlations beyond meanfield level are included by the D_z > I bonds in the center
- Layered corner transfer matrix (LCTM) method



Benchmarks for 3D anisotropic Heisenberg model

Vlaar, PC, PRL 130 (2023)



- Substantial improvement from $D_z = 1$ to $D_z = 2$
- Values close to the extrapolated QMC result
- In agreement with more expensive full 3D contraction

Vlaar & PC, PRB 103, 205137 (2021)

Limitations of the Shastry-Sutherland model

• Extent of the plaquette phase is smaller in experiments than in theory



 A interlayer coupling reduces the extent of the plaquette phase



iPEPS phase diagram of 3D Shastry-Sutherland model

Vlaar, PC, SciPost Physics 15, 126 (2023)



Estimate for the strength of interlayer coupling: $J''/J \approx 0.03$

LCTM: useful tool to study layered systems in 3D

Conclusion

\checkmark iPEPS: powerful & versatile tool

- \star Finite temperature simulations
- * Study of gapless systems using finite correlation length scaling
- * Spiral iPEPS: simple and efficient ansatz to represent spin spiral states
- ★ Excitations & spectral functions
- ★ Extensions to 3D and layered systems
- ✓ Still room for improvement & extensions & new applications!

Thank you for your attention!

Acknowledgements:

P.Vlaar, J. Hasik, B. Ponsioen, S. Crone, J.D. Arias Espinoza, S. Kleijweg, E. Cortes Estay, Y. Zhang, Q. Yang, N. Kamar, P. Czarnik, J. Dziarmaga, L. Tagliacozzo, F. Mila, F. F. Assaad



Established by the European Commission