Infinite projected entangled-pair states: ground states, finite temperature, excitations and extensions to 3D

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Outline

- Introduction to iPEPS & corner transfer matrix (CTM) method & imaginary time evolution (simple & full update)
- Ground state simulations with iPEPS: the Shastry-Sutherland model (SrCu₂(BO₃)₂)

iPEPS at finite temperature

P. Czarnik & PC, PRB 99, 245107 (2019)
Wietek, PC, Wessel, Normand, Mila, and Honecker, PRR 1 (2019)
J. L. Jiménez, S. P. G. Crone, E. Fogh, M. E. Zayed, R. Lortz,
E. Pomjakushina, K. Conder, A. M. Läuchli, L. Weber, S. Wessel, A. Honecker,
B. Normand, C. Rüegg, PC, H. M. Rønnow & F. Mila, Nature 592, 370 (2021)

iPEPS for 3D & layered systems

P. Vlaar & PC, PRB 103, 205137 (2021); arxiv:2208.06423; arxiv:2302.07894

Excitations with iPEPS

B. Ponsioen and PC, PRB 101, 195109 (2020)

B. Ponsioen, F. F. Assaad, PC, SciPost Physics, 12, 006 (2022)



MPS & PEPS

MPS

Matrix-product state

2D

Snake MPS (2D DMRG)

Dond C

Physical indices (lattices sites)

S. R. White, PRL 69, 2863 (1992) Fannes et al., CMP 144, 443 (1992) Östlund, Rommer, PRL 75, 3537 (1995)



Computational cost:

 $\propto \exp(L)$

MPS & PEPS

MPS

Matrix-product state



PEPS (TPS)

projected entangled-pair state (tensor product state)



Physical indices (lattices sites)

S. R. White, PRL 69, 2863 (1992) Fannes et al., CMP 144, 443 (1992) Östlund, Rommer, PRL 75, 3537 (1995) F. Verstraete, J. I. Cirac, cond-mat/0407066 Nishio, Maeshima, Gendiar, Nishino, cond-mat/0401115

Computational cost:

 $\propto poly(L,D)$

Infinite PEPS (iPEPS)

D iMPS

infinite matrix-product state





iPEPS

infinite projected entangled-pair state



Jordan, Orus, Vidal, Verstraete, Cirac, PRL (2008)

Work directly in the thermodynamic limit:
 No finite size and boundary effects!

Infinite PEPS (iPEPS)

D iMPS

infinite matrix-product state



2D

iPEPS

infinite projected entangled-pair state



Jordan, Orus, Vidal, Verstraete, Cirac, PRL (2008)

Work directly in the thermodynamic limit:
 No finite size and boundary effects!

iPEPS with arbitrary unit cells

ID iMPS

infinite matrix-product state



2D

iPEPS

with arbitrary unit cell of tensors



here: 4x2 unit cell

PC, White, Vidal, Troyer, PRB 84 (2011)

★ Run simulations with different unit cell sizes and compare variational energies

Contracting the iPEPS using the corner transfer matrix method

Nishino, Okunishi, JPSJ65 (1996)



- Environment tensors account for infinite system around a bulk site
- CTM: Compute environment in an iterative way
- Accuracy can be systematically controlled with X

Contracting the iPEPS using the corner transfer matrix method

Nishino, Okunishi, JPSJ65 (1996) Orus, Vidal, PRB 80 (2009)



- ★ Let the system grow in all directions.
- Repeat until convergence is reached
- The boundary tensors form the environment
- ★ Can be generalized to arbitrary unit cell sizes
 PC, et al., PRB 84 (2011)
 PC, et al., PRL 113 (2014)

Optimization via imaginary time evolution



• At each step: apply a two-site operator to a bond and truncate bond back to D



infinite Time Evolving Block Decimation (iTEBD)

Optimization via imaginary time evolution

• 2D: same idea: apply

to a bond and truncate bond back to D

- <u>и и и и и и и и и</u> <u>и и и и и и и</u> <u>и и и и и и и</u>
- However, SVD update is not optimal (because of loops in PEPS)!

 $\exp(-\tau H_b)$

simple update (SU)

Jiang et al, PRL 101 (2008)

- ★ "local" update like in TEBD
- Cheap, but not optimal (e.g. overestimates magnetization in S=1/2 Heisenberg model)

full update (FU)

Jordan et al, PRL 101 (2008)

- ★ Take the full wave function into account for truncation
- \star optimal, but more expensive
- ★ Fast-full update [Phien et al, PRB 92 (2015)]

Cluster update

Wang, Verstraete, arXiv:1110.4362 (2011)

iPEPS ground state simulations

• Many applications to challenging problems, including frustrated spin, SU(N), bosonic systems, t-J / Hubbard models, and more, see e.g.:

- P. Corboz and F. Mila, PRB 87 (2013); PRL 112 (2014)
- Z.-C. Gu, H.-C. Jiang, D. N. Sheng, H. Yao, L. Balents and X.-G. Wen, PRB 88 (2013)
- J. Osorio Iregui, P. Corboz and M. Troyer, PRB 90 (2014)
- P. Corboz, T. Rice and M. Troyer, PRL 113 (2014)
- T. Picot and D. Poilblanc, PRB 91 (2015)
- T. Picot, M. Ziegler, R. Orús and D. Poilblanc, PRB 93 (2016)
- P. Nataf, M. Lajkó, P. Corboz, A. M. Läuchli, K. Penc and F. Mila, PRB 93 (2016)
- H. Liao, Z. Xie, J. Chen, Z. Liu, H. Xie, R. Huang, B. Normand and T. Xiang, PRL 118 (2017)
- B.-X. Zheng, et al., Science 358, 1155 (2017)
- I. Niesen and P. Corboz, PRB 95 (2017); SciPost Physics 3, 030 (2017); Rev. B 97, 245146 (2018)
- R. Haghshenas, W.-W. Lan, S.-S. Gong, and D. N. Sheng, PRB 97 (2018)
- J.-Y. Chen, L. Vanderstraeten, S. Capponi, and D. Poilblanc, PRB 98 (2018)
- S. S. Jahromi and R. Orús, PRB 98 (2018)
- H.-Y. Lee and N. Kawashima, PRB 97 (2018)
- H. Yamaguchi, Y. Sasaki, T. Okubo, et al., PRB 98, 094402 (2018)
- R. Haghshenas, S.-S. Gong, and D. N. Sheng, PRB 99, 174423 (2019)
- S. S. Chung and P. Corboz, PRB 100 (2019)
- B. Ponsioen, S. S. Chung, and P. Corboz, PRB 100 (2019)
- C. Boos, S. P. G. Crone, I. A. Niesen, P. Corboz, K. P. Schmidt, and F. Mila, PRB 100 (2019)
- Z. Shi, et al, Nature Communications 10, 2439 (2019)
- A. Kshetrimayum, C. Balz, B. Lake, and J. Eisert, ArXiv:1904.00028 (2019)
- H.-Y. Lee, R. Kaneko, T. Okubo, and N. Kawashima, PRL 123, 087203 (2019)
- O. Gauthé, S. Capponi, M. Mambrini, and D. Poilblanc, PRB 101, 205144 (2020)
- H.-Y. Lee, R. Kaneko, L. E. Chern, T. Okubo, Y. Yamaji, N. Kawashima, and Y. B. Kim, Nature Communications 11 (2020)
- W.-Y. Liu, S.-S. Gong, Y.-B. Li, D. Poilblanc, W.-Q. Chen, and Z.-C. Gu, ArXiv:2009.01821 (2020)
- J.-Y. Chen, S. Capponi, A. Wietek, M. Mambrini, N. Schuch, and D. Poilblanc, PRL 125, 017201 (2020)
- J. Hasik, D. Poilblanc, and F. Becca, SciPost Physics 10, 012 (2021)
- ... and many more ...

S. Dusuel, M. Kamfor, R. Orús, K. P. Schmidt, and J. Vidal, PRL 106, 107203 (2011)

P. Corboz, A. M. Läuchli, K. Penc, M. Troyer and F. Mila, PRL 107 (2011)

H. H. Zhao, C. Xu, Q. N. Chen, Z. C. Wei, M. P. Qin, G. M. Zhang and T. Xiang, PRB 85 (2012)

P. Corboz, M. Lajkó, A. M. Läuchli, K. Penc and F. Mila, PRX 2 (2012)

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



The Shastry-Sutherland model and SrCu₂(BO₃)₂



Magnetization plateaus

 $SrCu_2(BO_3)_2$ in a magnetic field exhibits several magnetization plateaus



Onizuka, et al., JPSJ 69 (2000)

Magnetization plateaus below the 1/4 plateau



★ Crystals of triplet-bound states PC, F. Mila, PRL 112 (2014)

Many experimental / theoretical studies

Kageyama et al, PRL 82 (1999) Onizuka et al, JPSJ 69 (2000) Kageyama et al, PRL **84** (2000) Kodama et al, Science **298** (2002) Takigawa et al, Physica 27 (2004) Levy et al, EPL 81 (2008) Sebastian et al, PNAS 105 (2008) Isaev et al, PRL 103 (2009) Jaime et al, PNAS **109** (2012) Takigawa et al, PRL **110** (2013) Matsuda et al, PRL 111 (2013) Miyahara and K. Ueda, PRL 82 (1999) Momoi and Totsuka, PRB 61 (2000) Momoi and Totsuka, PRB 62 (2000) Fukumoto and Oguchi, JPSJ 69 (2000) Fukumoto, JPSJ 70 (2001) Miyahara and Ueda, JPCM 15 (2003) Miyahara, Becca and Mila, PRB 68 (2003) Dorier, Schmidt, and Mila, PRL 101 (2008) Abendschein & Capponi, PRL 101 (2008) Takigawa et al, JPSJ 79 (2010) Nemec et al, PRB 86 (2012) Matsuda et al., PRL 111 (2013)

SrCu₂(BO₃)₂ under pressure



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

• • •

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



A quantum magnetic analogue to the critical point of water



Can we reproduce this with iPEPS?

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

- 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 simple update (SU) or full update (FU))
- Evolve up to target $\beta/2$

Finite temperature simulations with iPEPS

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



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



A quantum magnetic analogue to the critical point of water



Can we reproduce this with iPEPS?

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



Correlation length



Jump in $<S \cdot S >$ on dimer



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





Finite T iPEPS study of the m=1/2 plateau in SCBO

P. Czarnik, M. M. Rams, PC, and J. Dziarmaga, PRB 103, 075113 (2021)



SrCu₂(BO₃)₂ under pressure in a magnetic field

Shi, Dissanayake, PC, William Steinhardt, Graf, Silevitch, Dabkowska, Rosenbaum, Mila, Haravifard, Nat Commun 13, 1 (2022)



Limitations of the Shastry-Sutherland model

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



Tensor networks 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, 045139 (2012)

Corner-transfer matrix (CTM) in 3D:

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



Approaches based on a boundary iPEPS:

Nishino, Okunishi, Hieida, Maeshima, and Akutsu, Nucl. Phys. B 575, 504 (2000) Nishino, Hieida, Okunishi, Maeshima, Akutsu, Gendiar, Prog. Theor. Phys. 105 (2001) Gendiar, Nishino, Phys. Rev. E 65, 046702 (2002) Gendiar, Maeshima, and Nishino, Prog. Theor. Phys. 110, 691 (2003) Gendiar and Nishino, Phys. Rev. B 71, 024404 (2005) Vanderstraeten, Vanhecke, and Verstraete, Phys. Rev. E 98, 042145 (2018)

+ Other approaches:

Ran, Piga, Peng, Su, and Lewenstein, Phys. Rev. B 96, 155120 (2017) Jahromi and Orús, Phys. Rev. B 99, 195105 (2019); Sci. Rep. 10, 19051 (2020) Tepaske and Luitz, arXiv:2005.13592 Magnifico, Felser, Silvi, and Montangero, arXiv:2011.10658

Overview

Vlaar & PC, PRB 103, 205137 (2021); arxiv:2208.06423

Cluster contractions:

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





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
- 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 (3D Heisenberg model)



 \star Systematic convergence in χ_c

Convergence in χ_b (3D Heisenberg model)



- \star Systematic convergence in χ_b
- \star Small clusters inaccurate
- ★ Good accuracy for 3x3x4
- **\star** Rough estimate for 2x2x2

Comparison with HOTRG

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



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

3D Heisenberg model: finite correlation length scaling

• Idea: extrapolate in effective correlation length ξ_D

Tagliacozzo, et al (2008); Pollmann et al (2009); Pirvu et al (2012) PC, Czarnik, Kapteijns & Tagliacozzo, PRX 8 (2018); Rader & Läuchli, PRX 8 (2018)



★ Energy in agreement
 ★ Magnetization 2% off (→ SU optimization)

3D Bose-Hubbard model



- ★ D=2: improvement over MF result
- ★ D=3: close to QMC
 result, better than
 B-DMFT
- ★ 2x2x2 close to
 SU+CTM → useful
 to get quick results

iPEPS for 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 (anisotropic 3D)

Vlaar, PC, arxiv:2208.06423



Ansatz:

- 3D tensor network ansatz (coupled iPEPS)
- $D_{xy} > D_z$ 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 $\rightarrow 2D$ 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, arxiv:2208.06423



- 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)

Shastry-Sutherland model with interlayer coupling

Vlaar, PC, arxiv:2302.07894



Estimate for the strength of interlayer coupling: J"/J

LCTM: Powerful approach also for other layered systems

Excitations with iPEPS

iPEPS excitation ansatz



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
→ Double infinite sum



Boris Ponsioen

Channel environmentsVanderstraeten, Marien, Verstraete, and Haegeman, PRB 92 (2015)
Vanderstraeten, Haegeman, and Verstraete, PRB 99 (2019)CTM approachPonsioen and PC, PRB 101, 195109 (2020)CTM+AD approachPonsioen, Assaad, PC, SciPost Physics, 12, 006 (2022)

Benchmark: square lattice Heisenberg model



Ponsioen and PC, PRB 101, 195109 (2020)

similar results in: Vanderstraeten, Haegeman, Verstraete, PRB 99 (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 $A(\omega, k)$ for U/t=8





 $= \sum_{\sigma} \int dt \, e^{-i\omega t} \langle \Psi_0 | \hat{c}_{\sigma,k}^{\dagger}(0) \hat{e}_{\sigma}^{\dagger} \\ = \sum_{\sigma} \int dt \, e^{-i\omega t} e^{-iE_0 t} \langle \Psi_0 | \hat{c}_{\sigma}^{\dagger} \end{cases}$

Summary

- ✓ iPEPS: powerful and versatile tool for strongly correlated systems
- ✓ Various applications & new methodological developments:
 - \star 2D ground state calculations
 - \star Extension to finite temperature
 - ★ iPEPS for 3D and layered systems
 - \star iPEPS excitation ansatz
- \checkmark Still room for improvement

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Thank you for your attention!

