

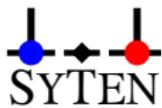
# Error estimates for extrapolations of observables with matrix-product states

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DMRG as ground-state solver

Usefulness of extrapolations

Alternative to 2DMRG truncation error: variance  $v$

Two-site variance

Comparison

Conclusions

# DMRG as ground-state solver

## 2DMRG

- ▶ “original” system/environment
- ▶ well-established, widely used
- ▶ typically converges, esp. with additional noise terms
- ▶  $O(m^3d^2w + m^3d^3 + m^2d^2w^2)$
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## 1DMRG

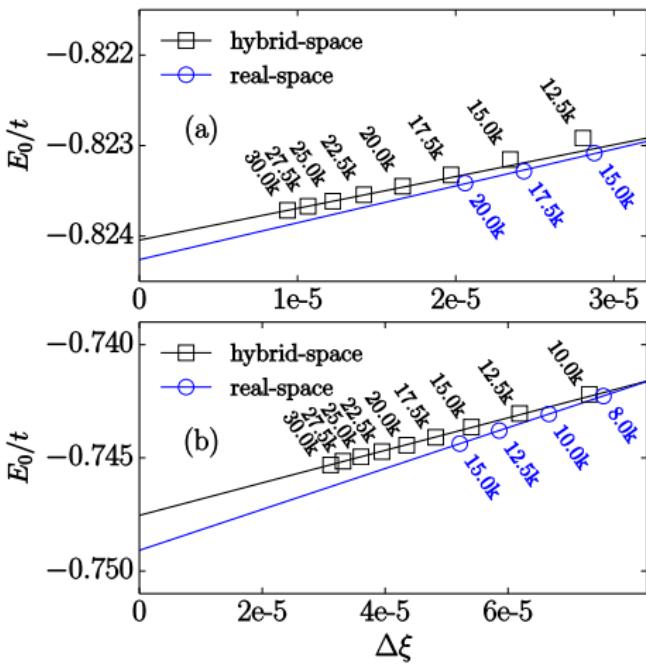
- ▶ easy to implement
- ▶ “natural” variant for MPS
- ▶ converges with subspace expansion
- ▶  $O(m^3dw + m^2d^2w^2)$
- ▶ speedup: 3-4 (spins/electrons), large (bosons)
- ▶ same factor in memory savings
- ▶ no error measure

# Usefulness of extrapolations

- ▶  $m \approx 5'000$  to  $m \approx 100'000$  upper limit (large-scale)
- ▶  $m \approx 1'000$  much nicer
- ▶ not always sufficient to evaluate observables to desired precision
- ▶ extrapolation in 2DMRG truncation error lowers error in observable by approx. order of magnitude
- ▶ extrapolation in  $m$  directly not possible
- ▶ applications: DMRG on 2D cylinders, critical 1D systems, DMET(?)

# 2DMRG Example

G. Ehlers, S. R. White, R. M. Noack, PRB 95, 125125



## Alternative to 2DMRG truncation error: variance $v$

- ▶  $v = \langle \psi | (\hat{H} - E)^2 | \psi \rangle = \| \hat{H} | \psi \rangle - E | \psi \rangle \|_2^2$ : squared norm of residual
- ▶ if  $|\psi\rangle$  is “mostly ground state”,  $v$  measures error
- ▶ extrapolation of energy in  $v$  possible
- ▶  $v(\hat{H}, |\psi\rangle)$ , not  $v(\hat{H})$ , DMRG method, sweeping procedure, #sweeps)

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- ▶  $v(\hat{H}, |\psi\rangle)$ , not  $v(\hat{H}, \text{DMRG method, sweeping procedure, } \#\text{sweeps})$
- ▶  $O(m^3 dw^2 + \dots)$  or  $O(m^3 d(2w))$

## $n$ -site variation spaces on a MPS $|\psi\rangle$

- ▶  $\mathcal{W}_0 = \text{span}(|\psi\rangle)$
- ▶  $\mathcal{W}_1$ : single-site variations of  $|\psi\rangle$  orthogonal to  $|\psi\rangle$
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- ▶ ...
- ▶  $\mathcal{H} = \bigoplus_{k=0}^L \mathcal{W}_k$

# Left- and right-complement MPS tensors

- ▶  $A_i : \mathcal{H}_L \otimes \mathcal{H}_p \mapsto \mathcal{H}_R$        $B_i : \mathcal{H}_R \otimes \mathcal{H}_p \mapsto \mathcal{H}_L$

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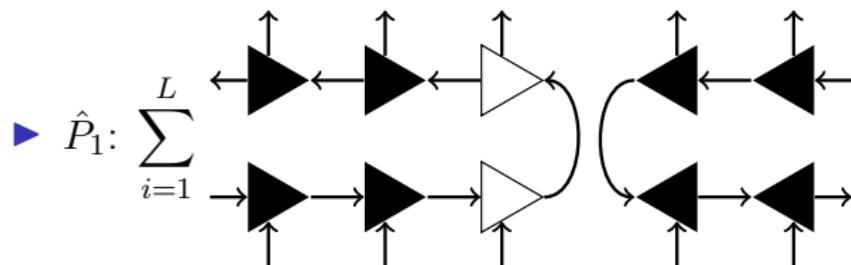
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- ▶  $\sum_{m_i, \sigma_i} F_{i; m'_{i+1}}^{\sigma_i m_i} F_{i; \sigma_i m_i}^{\dagger \tilde{m}'_{i+1}} = \mathbf{1}_{m'_{i+1}}^{\tilde{m}'_{i+1}}$
- ▶  $\sum_{m_i, \sigma_i} F_{i; m'_{i+1}}^{\sigma_i m_i} A_{i; \sigma_i m_i}^{\dagger \tilde{m}_{i+1}} = 0$

## $n$ -site variation projectors on a MPS $|\psi\rangle$

- $\hat{P}_0 = |\psi\rangle\langle\psi|$

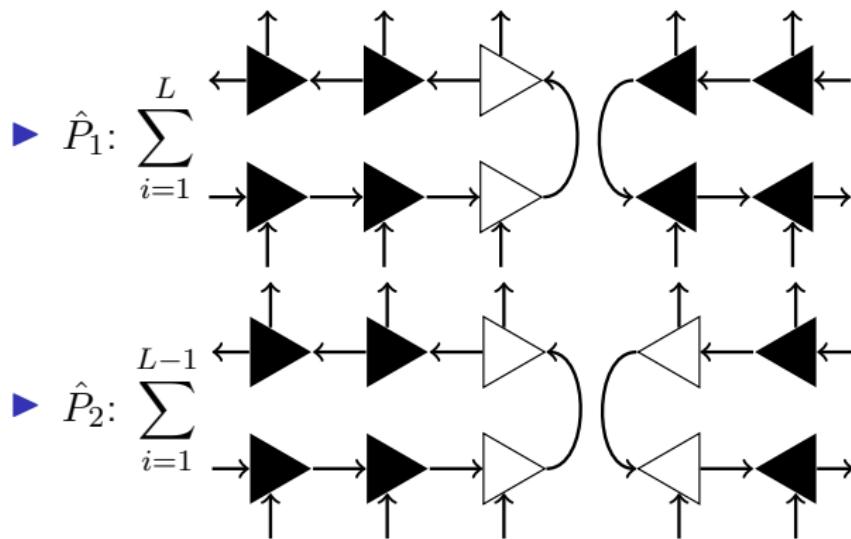
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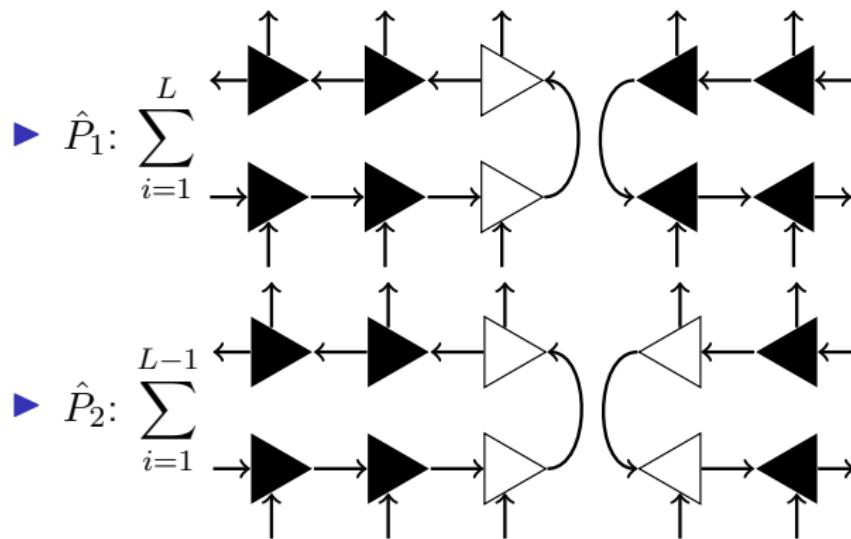
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►  $\hat{\mathbf{1}} = \sum_{k=0}^L \hat{P}_k$

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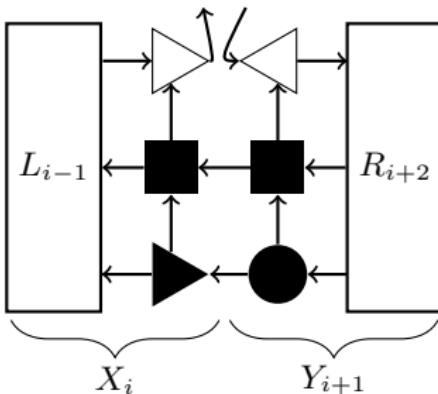
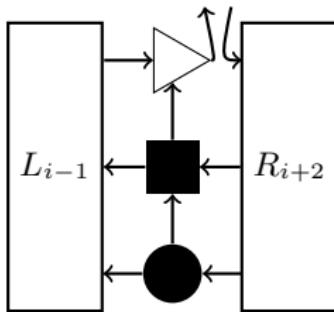
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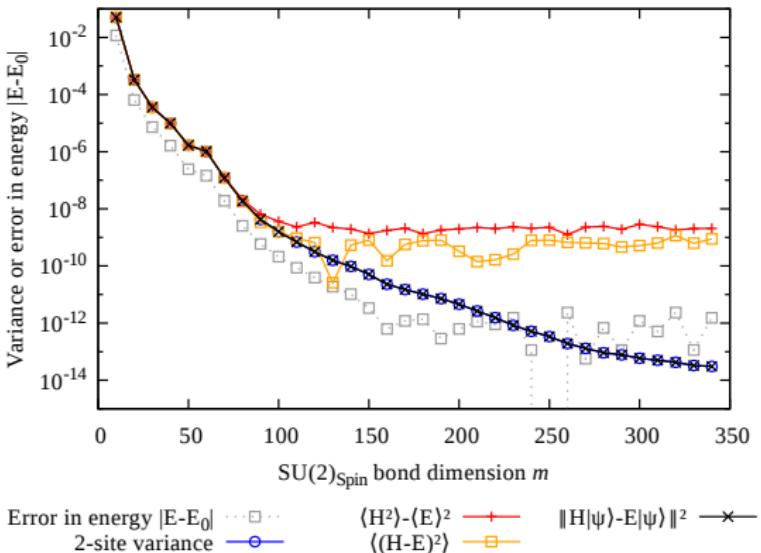
$$v \approx \langle \psi | \hat{H} \left( \hat{P}_1 + \hat{P}_2 \right) \hat{H} | \psi \rangle$$

- ▶ exact if  $\hat{H} = \sum_{i=1}^{L-1} \hat{h}_{i,i+1}$
- ▶ only small, positive terms to sum
- ▶ relatively fast:  $O(m^3 dw + m^3 d^2 w)$
- ▶ easy to parallelise costly part by  $2L - 1$  workers

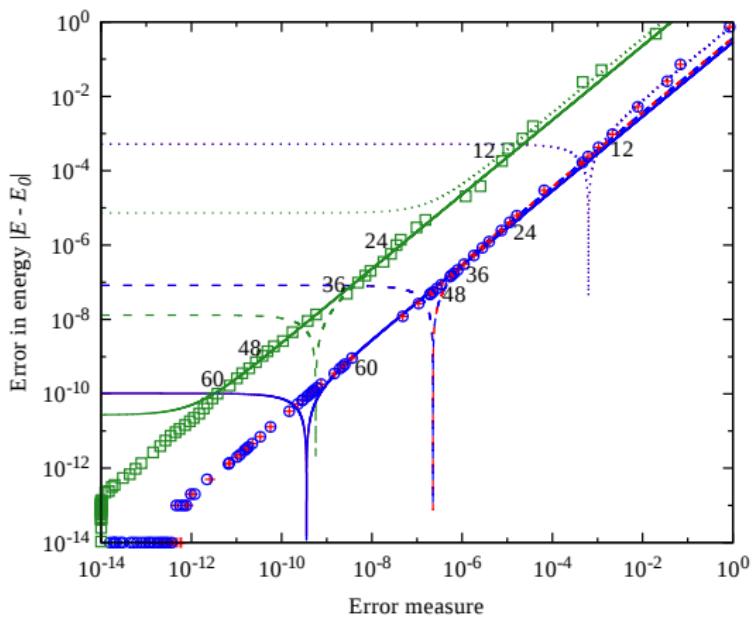
# Individual terms



# Accuracy: $L = 200, S = 1$ Heisenberg model

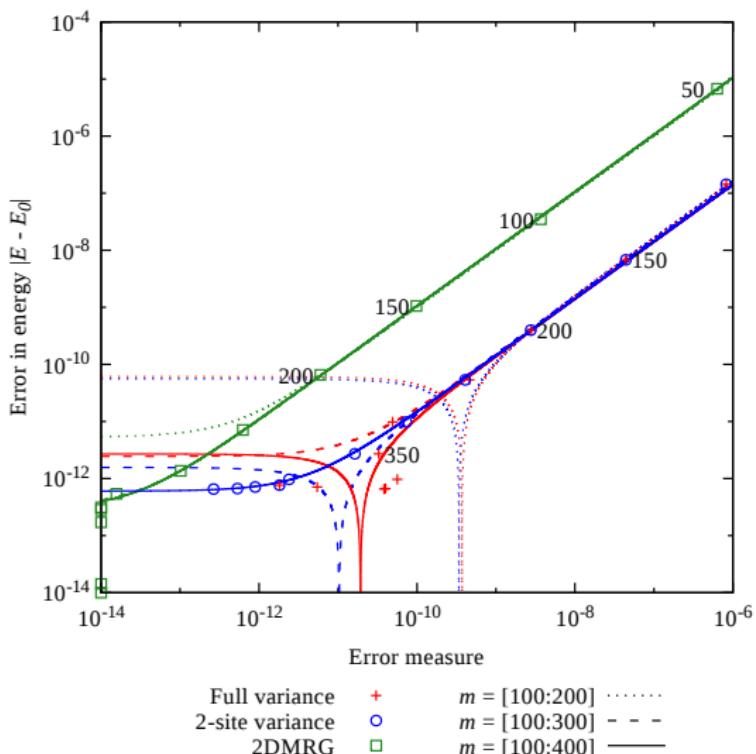


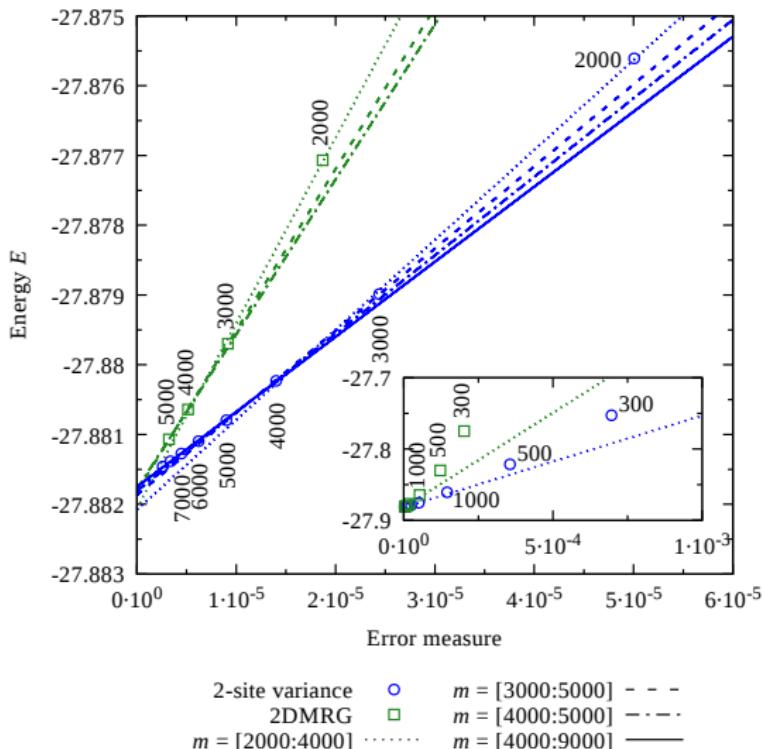
# Extrapolation: $L = 30, S = 1/2$ Heisenberg model



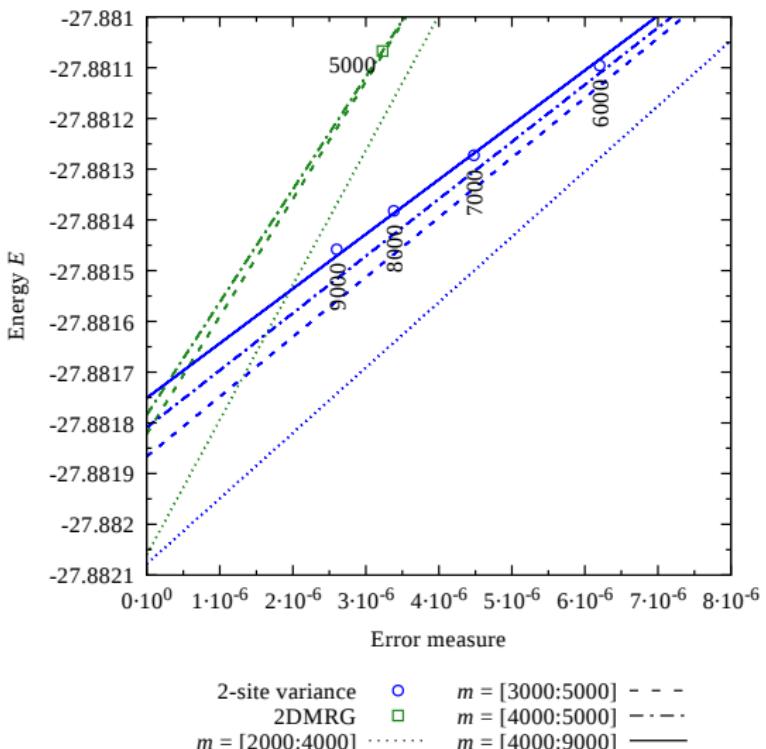
Full variance	+	$m = [2:12]$	.....
2-site variance	o	$m = [14:36]$	- - -
2DMRG	□	$m = [14:60]$	—

# Extrapolation: $L = 20$ Hubbard, Coulomb-like interactions



Extrapolation:  $10 \times 4$  Hubbard,  $U = 8$ ,  $n = 0.9$ 

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# Summary

- ▶ extrapolations lower error in energy by approx. one order of magnitude
- ▶ 2-site variance/full variance work as well as 2DMRG truncation error
- ▶ 2-site variance much faster than full variance
- ▶ 2-site variance also reliable for long-range  $\hat{H}$ , extensible to n-site
- ▶ 1DMRG + 2-site variance faster than 2DMRG for same energies, much larger bond dimensions possible
- ▶ *variational property of DMRG lost when extrapolating*