# Tensor Networks for dissipative systems

Mari-Carmen Bañuls, with J. I. Cirac (MPQ), J. Cui (Ulm), I. de Vega (LMU) PRL 114, 220601 (2015) PRA 92, 052116 (2015)



Max-Planck-Institut für Quantenoptik (Garching b. München)

624.WE-Heraeus Seminar Bad Honnef 19.9.2016

#### Context: quantum many body systems

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 $\{|i\rangle\}_{i=0}^{d-1}$ N

Context: quantum many body systems interacting with each d-1 other

 $\{|i\rangle\}_{i=0}^{d-1}$ Sumo Sumo Sumo N

Context: quantum many body systems

 interacting with each other Goal: describe equilibrium states

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N



interacting with each other Goal: describe equilibrium states ground, thermal states

#### Context: quantum many body systems

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interacting with each other Goal: describe equilibrium states ground, thermal states interesting states?

A general state of the Nbody Hilbert space has exponentially many coefficients

$$|\Psi\rangle = \sum_{i_j} c_{i_1\dots i_N} |i_1\dots i_N\rangle$$

N



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 $d^N$ 

A general state of the Nbody Hilbert space has exponentially many coefficients

$$|\Psi\rangle = \sum_{i_j} c_{i_1...i_N} |i_1...i_N\rangle$$

$$N-legged$$
tensor

 $d^N$ 



ATNS has only a polynomial number of parameters



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

# ID SYSTEMS: MPS

• MPS = Matrix Product States



 $|\Psi\rangle = \sum \operatorname{tr}(A_1^{i_1}A_2^{i_2}\dots A_N^{i_N})|i_1\dots i_N\rangle$  $i_1 \dots i_N$ 

 $|\Psi\rangle = \sum_{i_1...i_N} \operatorname{tr}(A_1^{i_1}A_2^{i_2}...A_N^{i_N})|i_1...i_N\rangle$ 

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Area law by construction

 $|\Psi\rangle = \sum_{i_1...i_N} \operatorname{tr}(A_1^{i_1}A_2^{i_2}...A_N^{i_N})|i_1...i_N\rangle$ 

Area law by construction Bounded entanglement  $S(L/2) \le \log D$ 

MPS extremely successful tool



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#### 

MPS extremely successful tool

#### LOCAL HAMILTONIAN -

good approximation of ground states gapped finite range Hamiltonian ⇒ area law (ground state)

Verstraete, Cirac, PRB 2006 Hastings J. Stat. Phys 2007

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time evolution can be simulated too White, Feiguin, PRL 2003, PRL 2004 Daley et al., 2004 Haegeman et al., 2011

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time evolution can be simulated too v but entanglement can grow fast!

Vidal, PRL 2003, PRL 2007 White, Feiguin, PRL 2004 Daley et al., 2004 Haegeman et al., 2011

## FOR MIXED STATES...

Same kind of ansatz for operators

Same kind of ansatz for operators



Same kind of ansatz for operators



 $\hat{M} = \sum_{i_1, j_1, \dots, i_N, j_N} \operatorname{tr}(M_1^{i_1 j_1} M_2^{i_2 j_2} \dots M_N^{i_N j_N}) |i_1 \dots i_N\rangle \langle j_1 \dots j_N|$ 



Routinely used for H and U(t)

Verstraete, García-Ripoll, Cirac PRL 2004 Pirvu et al., NJP 2010

# MIXED STATES

• MPDO = Matrix Product Density Operator

density operators need some properties

 $\rho = \sum_{i_1, j_1, \dots, i_N, j_N} \operatorname{tr}(M_1^{i_1 j_1} M_2^{i_2 j_2} \dots M_N^{i_N j_N}) |i_1 \dots i_N\rangle \langle j_1 \dots j_N|$ 

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 $\rho = \rho^{\dagger} \qquad \qquad \text{tr}\rho = 1 \qquad \qquad \rho \ge 0$ 

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# MPO = Matrix Product Operator

Similar problems can be attacked

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equilibrium  $\rightarrow$  thermal states

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equilibrium → thermal states

imaginary time evolution

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Verstraete, García-Ripoll, Cirac PRL 2004 Prosen, Znidaric et al., PRL 2008,...

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In this talk...

#### **Variational method** to find **MPO** approximations for the **steady states** of Lindblad equations with J. Cui, J. I. Cirac PRL 114, 220601 (2015)

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#### **Variational method** to find **MPO** approximations for the **steady states** of Lindblad equations (some) with J. Cui, J. I. Cirac PRL 114, 220601 (2015)

Using MPS to describe whole system coupled to a thermal environment

with I. de Vega PRA 92, 052116 (2015)

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Real-time dynamics produces a steady state

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Real-time dynamics produces  $\frac{d\rho(t)}{dt} = \mathcal{L}(\rho) \longrightarrow \mathcal{L}(\rho_S) = 0 \quad \text{a steady state}$ fixed point of
Liouvillian map

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We can approximate it as a MPO

works by García-Ripoll et al., Zwolak, Prosen, ...

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Liouvillian map

fixed point of dissipative QC dissipative QPT

We can approximate it as a MPO

simulating long time evolution ~imaginary time evolution

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#### Dynamics determined by Liouvillian

$$\frac{d\rho}{dt} = \mathcal{L}(\rho)$$



vectorize  $|\rho\rangle$ 

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WANTED fixed point of evolution

#### METHOD

#### Dynamics determined by Liouvillian

 $\frac{d\rho}{dt} = \mathcal{L}(\rho)$ 



vectorize |
ho
angle superoperator  $\hat{\mathcal{L}}$ 

Search for the null vector

WANTED fixed point of evolution

 $\hat{\mathcal{L}}|\rho\rangle = 0$ 

Mascarenhas et al., PRA92, 022116 (2015)

#### METHOD

### METHOD Analogy to GS search

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H

#### METHOD

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H

min  $\lambda$ 

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 $|\Psi_{
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H

 $\hat{\mathcal{L}}$ 

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Analogy to GS search

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 $\hat{\mathcal{L}}$ 

min  $\lambda$ 

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Analogy to GS search

Η

 $\hat{\mathcal{L}}$ 

min  $\lambda$ 

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 $\lambda = 0 \\ e^{\hat{\mathcal{L}}} |\rho_S\rangle = |\rho_S\rangle$ 

#### METHOD Analogy to GS search $\hat{\mathcal{L}}$ H $\lambda = 0$ min $\lambda$ $e^{\hat{\mathcal{L}}}|\rho_S\rangle = |\rho_S\rangle$ $|\Psi_{\rm GS}\rangle$ $|\rho_{\rm S}\rangle$

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Analogy to GS search

Hermitian H

 $\hat{\mathcal{L}}$  non-Hermitian

 $\begin{array}{ll} \min \lambda & \lambda = 0 \\ & e^{\hat{\mathcal{L}}} |\rho_S \rangle = |\rho_S \rangle \\ |\Psi_{\rm GS} \rangle & & |\rho_S \rangle \end{array}$ 

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 $\hat{\mathcal{L}}^{\dagger}\hat{\mathcal{L}} > 0$ 

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Analogy to GS search

Hermitian H

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 $\begin{array}{ll} \min \lambda & \lambda = 0 \\ & e^{\hat{\mathcal{L}}} |\rho_S \rangle = |\rho_S \rangle \\ |\Psi_{\rm GS} \rangle & & |\rho_S \rangle \end{array}$ 

 $\hat{\mathcal{L}}^{\dagger}\hat{\mathcal{L}}|\rho_S\rangle = 0$ 

lowest eigenvalue

#### METHOD

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Master equation of Lindblad form

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$$\frac{d\rho}{dt} = -i[H,\rho] + \sum_{k} \gamma_k \left( L_k \rho L_k^{\dagger} - \frac{1}{2} \rho L_k^{\dagger} L_k - \frac{1}{2} L_k^{\dagger} L_k \rho \right)$$
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#### METHOD

#### Master equation of Lindblad form

$$\frac{d|\rho\rangle}{dt} = \left[-i(H\otimes I - I\otimes H^T) + \sum_k \gamma_k \left(L_k \otimes L_k^* - \frac{1}{2}I \otimes L_k^T L_k^* - \frac{1}{2}L_k^\dagger L_k \otimes I\right)\right]|\rho\rangle$$



lowest eigenvalue

#### Variational minimization of energy

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local



#### Variational minimization of energy

*local* Hamiltonian



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Variational principle

$$\min_{\{A\}} \frac{\langle \Psi | H | \Psi \rangle}{\langle \Psi | \Psi \rangle}$$

#### Variational minimization of energy

*local* Hamiltonian

 $H = - \mathbf{H} - \mathbf$ 

Variational principle

$$\min_{\{A\}} \frac{\langle \Psi | H | \Psi \rangle}{\langle \Psi | \Psi \rangle} \longrightarrow \min_{A} \frac{\bar{A} H_{\text{eff}} A}{\bar{A} N_{\text{eff}} A}$$

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sweep back and forth over tensors

#### POTENTIAL ISSUES

de las Cuevas, 2013

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Positivity

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maybe smaller gaps?  $\Rightarrow$  metastable states?

#### POTENTIAL ISSUES

Positivity<br/>fixed point of the evolutionno need to use<br/>purification<br/>de las Cuevas, 2013Accuracy of MPO approximationno need to use<br/>purification<br/>de las Cuevas, 2013Degeneracies<br/>maybe smaller gaps? ⇒ metastable states?<br/>local effective Lindblad operator does not<br/>preserve any property ⇒ symmetries?

### Some examples...

#### N 2-level atoms coupled to same EM mode



Dicke, 1954 Hepp, Lieb, 1973 Carmichael, 1980

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experimentally difficult

Baumann et al., 2010 Hamner et al., 2014 Baden et al., 2014

#### Do simpler models show similar phenomena? more local



Lower dimensional version of Dicke model

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N 2-level systems with dissipation coupling NN

Lower dimensional version of Dicke model

N 2-level systems with dissipation coupling NN

$$\frac{d\rho}{dt} = -i\Omega[S_x,\rho] + \Gamma \sum_n \left( S_n^-{}_{n+1}\rho S_n^+{}_{n+1} - \frac{1}{2}\rho S_n^+{}_{n+1}S_n^-{}_{n+1} - \frac{1}{2}S_n^+{}_{n+1}S_n^-{}_{n+1}\rho \right)$$
### A SIMPLER MODEL

Lower dimensional version of Dicke model

N 2-level systems with dissipation coupling NN

$$\frac{d\rho}{dt} = -i\Omega[S_x,\rho] + \Gamma \sum_n \left( S_n^-{}_{n+1}\rho S_n^+{}_{n+1} - \frac{1}{2}\rho S_n^+{}_{n+1}S_n^-{}_{n+1} - \frac{1}{2}S_n^+{}_{n+1}S_n^-{}_{n+1}\rho \right)$$

$$S_{n\ n+1}^+ = \sigma_{n+1}^+ \otimes I + I \otimes \sigma_{n+1}^+$$



































$$H = \sum_{n} \sigma_z^{[n]} \sigma_z^{[n+1]} + g \sigma_x^{[n]}$$

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local dissipation

 $L_n = \sqrt{\gamma}\sigma_n^+$ 

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#### can be realized by Rydberg atoms

$$H = \sum_{n} \left[ \frac{V}{2} \sigma_z^{[n]} \sigma_z^{[n+1]} + \frac{\Omega}{2} \sigma_x^{[n]} + \frac{\Delta - V}{2} \sigma_z^{[n]} \right]$$

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local dissipation

$$L_n = \sqrt{\gamma} \sigma_n^+$$

can be realized by Rydberg atoms steady state can show AFM ordering











local polarization  $\langle \sigma_z^{[n]} \rangle$ 





local polarization  $\langle \sigma_z^{[n]} \rangle$ 





local polarization  $\langle \sigma_z^{[n]} \rangle$ 



AF order (staggered magnetization) 0.4N=10 < 20D N=20 N=30 N=400.3 N=50 short range correlations 0.2 0.1 -22 4 PRL 114, 220601 (2015)

local polarization  $\langle \sigma_z^{[n]} \rangle$ 







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#### PRL 114, 220601 (2015)

### SUMMARY

NESS can be found variationally

Very good convergence (varying models, parameters) Very small bond dimension required Stability can be delicate Warm-up phase needed! Symmetries can be included, trace one, degeneracies... things to be understood about MPDOs representations

PRL 114, 220601 (2015)

#### Other scenarios for MPO/MPS...

#### Master equation may not be enough

Master equation may not be enough strong system-environment coupling correlations between system and environment similar time scales for both

Master equation may not be enough strong system-environment coupling correlations between system and environment similar time scales for both Alternative: solving the whole dynamics large number of degrees of freedom involved typically a truncation in environment dof required



discretized environment

star geometry



 $H = H_S + \sum_{\lambda} \omega_{\lambda} a_{\lambda}^{\dagger} a_{\lambda} + \sum_{\lambda} g_{\lambda} (a_{\lambda}^{\dagger} L + L^{\dagger} a_{\lambda})$ 

discretized environment

chain geometry



#### tight-binding model

discretized environment

chain geometry



#### tight-binding model

NRG approach: exponentially decaying couplings Krishnamurthy et al., 1980 Guo et al, 2009

discretized environment

chain geometry



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Continuous environment mapped to semiinfinite chain Prior et al., PRL 2010 Chin et al., J Math Phys 2010



Bulla et al RMP 2008; Hughes et al J Chem Phys 2009 Prior et al., PRL 2010 Chin et al., J Math Phys 2010



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#### 

#### State of system and bath represented as MPS $|\Psi(0)\rangle = |\psi_0\rangle_S \otimes |0_E\rangle \stackrel{T=0}{\underset{\text{to vacuum}}{}}$

Bulla et al RMP 2008; Hughes et al J Chem Phys 2009 Prior et al., PRL 2010 Chin et al., J Math Phys 2010

# 

State of system and bath represented as MPS  $|\Psi(0)\rangle = |\psi_0\rangle_S \otimes |0_E\rangle \xrightarrow[to vacuum]{T=0}$  bath corresponds to vacuum

Dynamics can be applied using MPO-MPS (t-DMRG)

$$H = H_S + \beta_0 \left( b_0^{\dagger} L + L^{\dagger} b_0 \right) + \sum_{n=0}^{\infty} \alpha_n b_n^{\dagger} b_n + \sum_{n=0}^{\infty} \beta_{n+1} (b_{n+1}^{\dagger} b_n + h.c.)$$
Bulla et al RMP 2008:

Hughes et al J Chem Phys 2009 Prior et al., PRL 2010 Chin et al., J Math Phys 2010

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#### 

#### Can also be used for T>0 environment



Can also be used for T>0 environment MPO approximation to thermal state



Can also be used for *T*>0 environment MPO approximation to thermal state mixed state description



Can also be used for T>0 environment MPO approximation to thermal state mixed state description could even be positive



Can also be used for T>0 environment MPO approximation to thermal state mixed state description could even be positive computational overhead approximation already involved at t=0



#### An alternative to deal with T>0 also with pure MPS

Takahasi 1975



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introduce auxiliary decoupled environment

Takahasi 1975



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An alternative to deal with T>0 also with pure MPS

introduce auxiliary decoupled environment thermal Bogoliubov transformation Takahasi 1975 thermal vacuum  $|\Omega\rangle \propto e^{-\beta H_B/2} \sum_{n} |E_n\rangle_b |E_n\rangle_c$  $\rho_B(\beta) = \operatorname{tr}_c(|\Omega\rangle\langle\Omega|)$ 



An alternative to deal with T>0 also with pure MPS

introduce auxiliary decoupled environment thermal Bogoliubov transformation Takahasi 1975 thermal vacuum  $|O\rangle \propto e^{-\beta H_B/2} \sum |E\rangle |E\rangle$ 

$$\begin{split} |\Omega\rangle \propto e^{-\beta H_B/2} \sum_{n} |E_n\rangle_b |E_n\rangle_c \\ \rho_B(\beta) = \mathrm{tr}_c(|\Omega\rangle\langle\Omega|) \\ \langle\Omega|b_k^{\dagger}b_k|\Omega\rangle = n_k \\ \mathrm{I.\,de\,Vega,\,MCB,\,PRA\,92,\,052116} \end{split}$$

(20|5)



 $\hat{H} = H - \sum_{k} \omega_k c_k^{\dagger} c_k$ 

Thermal state mapped to two environments at T=0 initially no excitations in the environment

#### 

Thermal state mapped to two environments at T=0initially no excitations in the environment

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Thermal state mapped to two environments at T=0Double chain mapping Pure MPS methods can be applied

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> Pure MPS methods can be applied Population imbalance between chains gives deviation of bath from thermal distribution

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Thermal state mapped to two environments at T=0initially no excitations in the environment

> Pure MPS methods can be applied Population imbalance between chains gives deviation of bath from thermal distribution Applies to bosonic and fermionic systems I. de Vega, MCB, PRA 92, 052116 (2015)

#### EXAMPLE

spin in a bosonic bath

 $J(\omega) = \eta \omega^s e^{-\omega/\omega_c}$ Caldeira-Legget model

exact solution for  $H_S \propto \sigma_z$ 

 $L \propto \sigma_z$ 





#### EXAMPLE

spin in a bosonic bath

 $J(\omega) = \eta \omega^s e^{-\omega/\omega_c}$  Caldeira-Legget model

not exactly solvable for  $~H_S \propto \sigma_z$ 

 $L \propto \sigma_x$ 

can only compare to master equation


#### THERMOFIELD APPROACH



Generally speaking, out of equilibrium dynamics is hard for TNS/MPS, but...

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non-equilibrium steady states of QMB systems

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modelling system-bath interactions beyond master equation

#### THANKS

Generally speaking, out of equilibrium dynamics is hard for TNS/MPS, but...

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Applications of MPS/MPO to non-equilibrium non-equilibrium steady states of QMB systems

modelling system-bath interactions beyond master equation





Max Planck Institut of Quantum Optics MPQ (Garching)

N 2-level atoms coupled to same EM mode

#### N 2-level atoms coupled to same EM mode



N 2-level atoms coupled to same EM mode

N 2-level atoms coupled to same EM mode  $\frac{d\rho}{dt} = -i\Omega[S_x,\rho] + \Gamma\left(S^-\rho S^+ - \frac{1}{2}\rho S^+S^- - \frac{1}{2}S^+S^-\rho\right)$ 

N 2-level atoms coupled to same EM mode

$$\frac{d\rho}{dt} = -i\Omega[S_x,\rho] + \Gamma\left(S^-\rho S^+ - \frac{1}{2}\rho S^+S^- - \frac{1}{2}S^+S^-\rho\right)$$

collective coupling

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$$S_x = \sum_{n=1}^N s_x \qquad \text{collective coupling}$$

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phase transition to superradiant phase  $\frac{\Omega}{\Gamma} = \frac{N}{2}$ analytic solution

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$$S_x = \sum_{n=1}^N s_x \qquad \text{collective coupling}$$

phase transition to superradiant phase  $\frac{\Omega}{\Gamma} = \frac{N}{2}$ 

analytic solution conserved total spin















is an interesting model...

is an interesting model... phase transitions

dissipative

is an interesting model... phase transitions dissipative collective phenomena

is an interesting model... phase transitions dissipative collective phenomena entanglement

is an interesting model... phase transitions dissipative collective phenomena entanglement

but experimentally difficult

Baumann et al., 2010 Hamner et al., 2014 Baden et al., 2014

# Do simpler models show similar phenomena?

#### Do simpler models show similar phenomena? more local



#### A SIMPLER MODEL
Lower dimensional version of Dicke model

Lower dimensional version of Dicke model

N 2-level systems with dissipation coupling NN

Lower dimensional version of Dicke model

N 2-level systems with dissipation coupling NN

$$\frac{d\rho}{dt} = -i\Omega[S_x,\rho] + \Gamma \sum_n \left( S_n^-{}_{n+1}\rho S_n^+{}_{n+1} - \frac{1}{2}\rho S_n^+{}_{n+1}S_n^-{}_{n+1} - \frac{1}{2}S_n^+{}_{n+1}S_n^-{}_{n+1}\rho \right)$$

Lower dimensional version of Dicke model

N 2-level systems with dissipation coupling NN

$$\frac{d\rho}{dt} = -i\Omega[S_x,\rho] + \Gamma \sum_n \left( S_n^-{}_{n+1}\rho S_n^+{}_{n+1} - \frac{1}{2}\rho S_n^+{}_{n+1}S_n^-{}_{n+1} - \frac{1}{2}S_n^+{}_{n+1}S_n^-{}_{n+1}\rho \right)$$

$$S_{n\ n+1}^+ = \sigma_{n+1}^+ \otimes I + I \otimes \sigma_{n+1}^+$$



Liouvillian can be expressed as a small MPO of

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Approximate the steady state by a MPO

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Approximate the steady state by a MPO fixed D  $\rightarrow$  check convergence

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Liouvillian can be expressed as a small MPO of  $\chi = 5$ 

Approximate the steady state by a MPO fixed D → check convergence no explicit positivity no explicit Hermiticity

No special symmetry





















$$-0.005 = \langle S_x^{[i]} S_x^{[i+1]} \rangle - \langle S_x^{[i]} \rangle \langle S_x^{[i+1]} \rangle$$

$$-0.005 = 0.015 = N = 10$$

$$-0.015 = N = 10$$

$$-0.025 = 0.025 = 0.025$$

$$-0.025 = 0.025 = 0.05 = 1 - 1.5 = 2 - 2.5 = 3 - 3.5 = 4$$



















#### Other interesting models...

#### Interesting models...

#### SUMMARY

#### PRL 114, 220601 (2015)
NESS can be found variationally

PRL 114, 220601 (2015)

NESS can be found variationally Very good convergence (varying models, parameters) Very small bond dimension required



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#### PRL 114, 220601 (2015)

NESS can be found variationally

Very good convergence (varying models, parameters) Very small bond dimension required Stability can be delicate Warm-up phase needed! Future: symmetries, trace one, degeneracies... much to understand about MPDOs representations

PRL 114, 220601 (2015)