

# TENSOR NETWORKS FOR STEADY STATES

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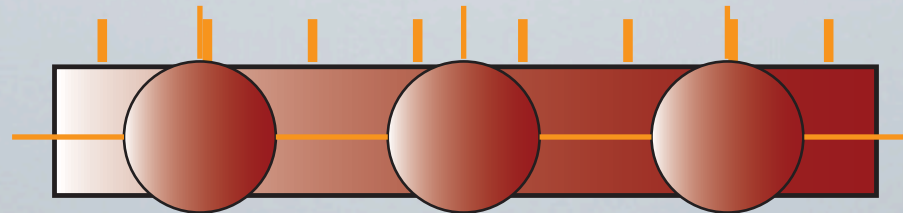
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(Garching b. München)

11.9.2015

# MPS



$$|\Psi\rangle = \sum_{i_1 \dots i_N} |\Psi\rangle = \text{tr} \left( A_1^{i_1} A_2^{i_2} \dots A_N^{i_N} \right) |i_1\rangle \dots |i_N\rangle$$

Two main algorithms:

variational minimization of energy

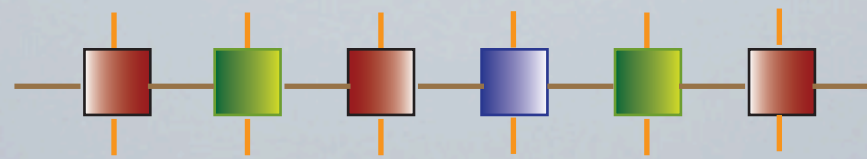
→ approximate ground state as TNS

apply local operators → simulate time evolution

imaginary time → ground state

# BASIC PROBLEMS

HAMILTONIAN



find ground states

produce an  
ansatz for the  
state

→ variational search

typically faster and  
more precise

→ imaginary time evolution

preserves  
symmetries

time-dependence → real time evolution

will work for  
short times



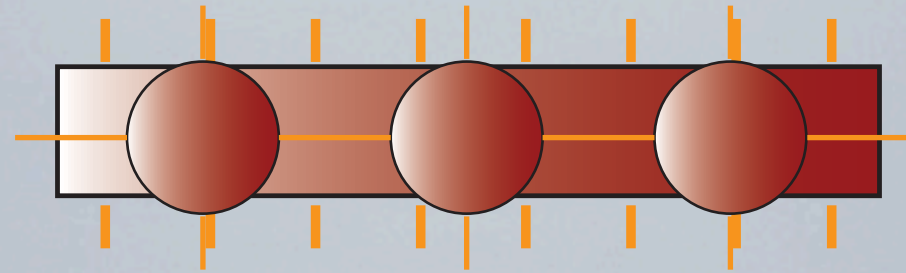
FOR MIXED STATES...



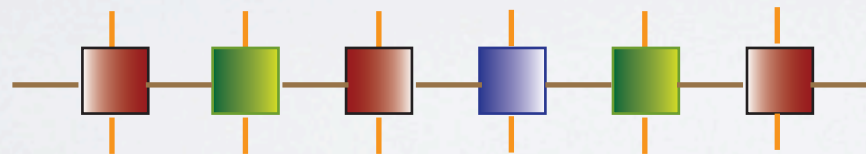
# MIXED STATES

- MPO = Matrix Product Operator

Same kind of  
ansatz for  
operators



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



Routinely used for  
 $H$  and  $U(t)$

Verstraete et al., PRL 2004

Pirvu et al., NJP 2010

# MIXED STATES

- MPDO = Matrix Product Density Operator

Use for density operators

$$\left( \text{---} \bigcirc_{j_1}^{i_1} \text{---} \bigcirc_{j_2}^{i_2} \text{---} \bigcirc_{j_3}^{i_3} \text{---} \right)^* \quad \text{need some properties}$$

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

can we impose them *locally*?

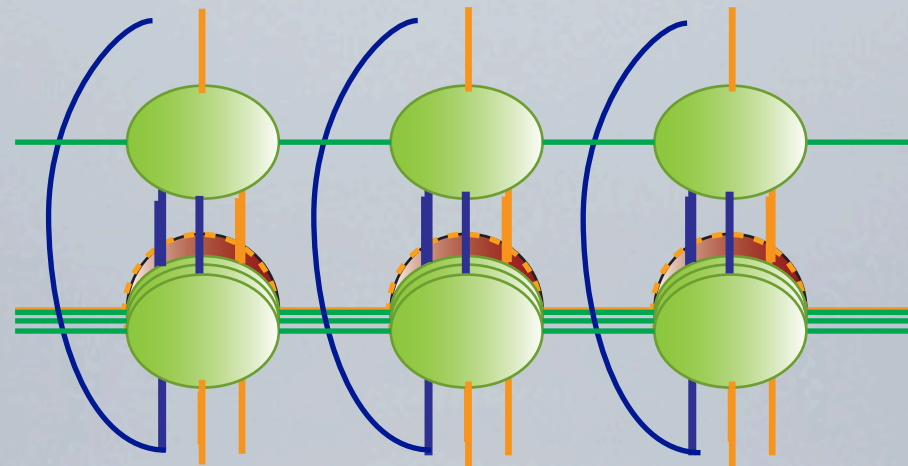
$$\begin{array}{ccc} \boxed{\rho = \rho^\dagger} & \boxed{\text{tr} \rho = 1} & \boxed{\rho \geq 0} \\ \checkmark & \checkmark & \times \\ \text{---} \bigcirc \text{---} = \left( \text{---} \bigcirc \text{---} \right)^* \text{---} \bigcirc \text{---} \bigcirc \text{---} \bigcirc \text{---} = 1 & & \end{array}$$



# MIXED STATES

- MPDO = Matrix Product Density Operator

purification



need some  
properties

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

can we impose them *locally*?

✓  $\rho = \rho^\dagger$

✓  $\text{tr} \rho = 1$

✗  $\rho \geq 0$   
in a way

$$\rho_S = \text{tr}_A |\Psi_{SA}\rangle \langle \Psi_{SA}|$$

see Werner et al., arXiv:1412.5746



# MIXED STATES

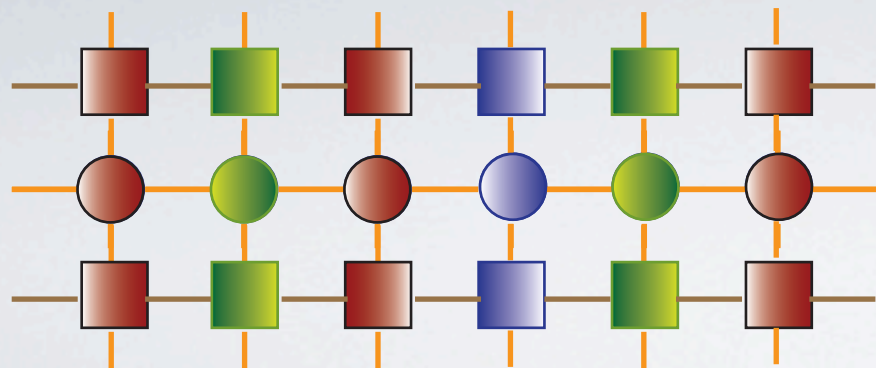
- MPO = Matrix Product Operator

Similar problems can be attacked

equilibrium  $\rightarrow$  thermal states

imaginary time evolution

time-dependent  $\rightarrow$  real time evolution



unitary  $\rho(t) = U(t)\rho(0)U(t)^\dagger$

non-unitary  $\frac{d\rho(t)}{dt} = \mathcal{L}(\rho)$

Verstraete et al., PRL 2004

Prosen, Znidaric et al., PRL 2008,...

# MIXED STATES

- MPO = Matrix Product Operator

Another possibility for open dynamics

Dissipative real-time dynamics  
produces a steady state

$$\frac{d\rho(t)}{dt} = \mathcal{L}(\rho) \longrightarrow \mathcal{L}(\rho_S) = 0 \quad \text{fixed point of Liouvillian map}$$

Approximate it as a MPO

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



# MIXED STATES

- MPO = Matrix Product Operator

Methods to find steady state simulating long  
time evolution

analogous to imaginary time evolution

Here: variational method for steady state  
MPO

analogous to DMRG

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



# VARIATIONAL STEADY STATES

## Applications:

interesting kind of models

dissipative QPT

collective effects

dissipative QC

entangled states

## Potential advantages of variational strategy:

faster convergence than time evolution

real time evolution needs to be followed

(operator) entanglement in the MPO?

# VARIATIONAL STEADY STATES

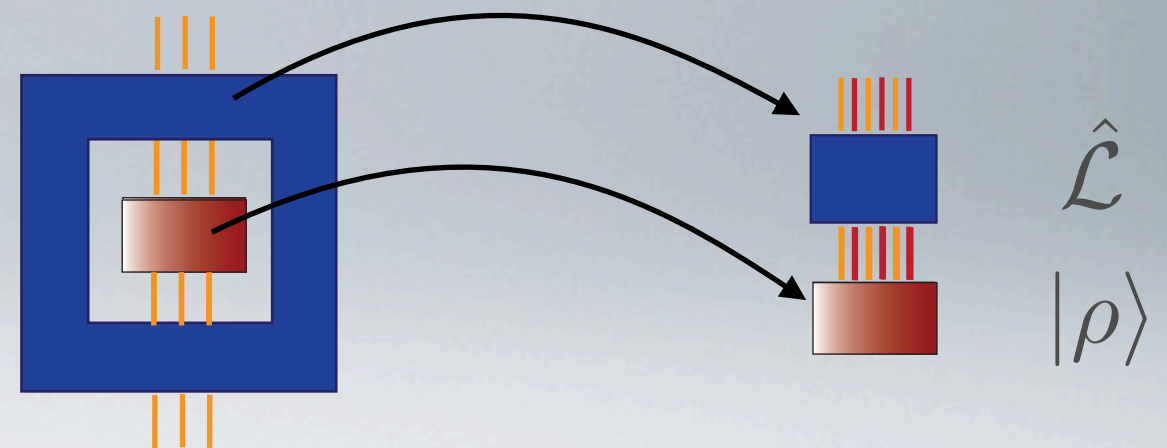
## METHOD

Dynamics determined by Liouvillian

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

vectorize  $|\rho\rangle$

superoperator  $\hat{\mathcal{L}}$



WANTED

fixed point of evolution

Search for the null vector

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

see also Mascarenhas et al., PRA92, 022116 (2015)



# VARIATIONAL STEADY STATES

## METHOD

Analogy to GS search

Hermitian  $H$

$$\min \lambda$$

$$|\Psi_{\text{GS}}\rangle$$

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

$$\lambda = 0$$

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

$$|\rho_S\rangle$$

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

lowest  
eigenvalue



# VARIATIONAL STEADY STATES

## METHOD

Master equation of Lindblad form

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

$\nearrow$   $\sim$ local (MPO)       $\nwarrow$  local

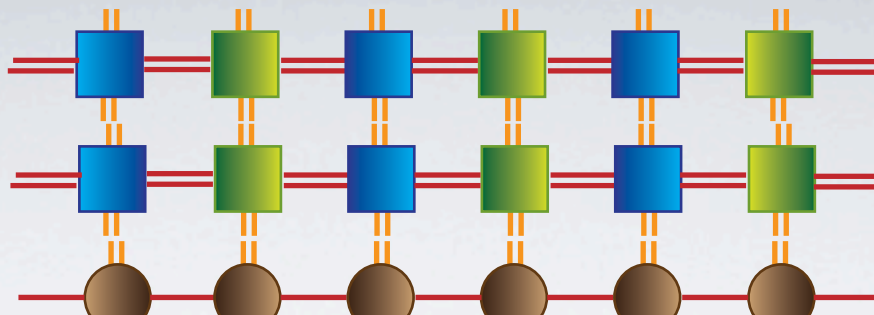
$\hat{\mathcal{L}}$  MPO  $\longrightarrow$   $\hat{\mathcal{L}}^\dagger \hat{\mathcal{L}}$

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

# VARIATIONAL STEADY STATES

## 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

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



# VARIATIONAL STEADY STATES

## POTENTIAL ISSUES

Positivity

fixed point of the evolution

Accuracy of MPO approximation

Degeneracies

maybe smaller gaps?  $\Rightarrow$  metastable states?

local effective Lindblad operator does not  
preserve any property  $\Rightarrow$  symmetries?

Prosen, Znidaric, 2009

Kastoryano, Eisert, 2013



# NUMERICAL RESULTS

# DICKE MODEL

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

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

$$S_x = \sum_{n=1}^N s_x$$

collective coupling

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

analytic solution conserved total spin

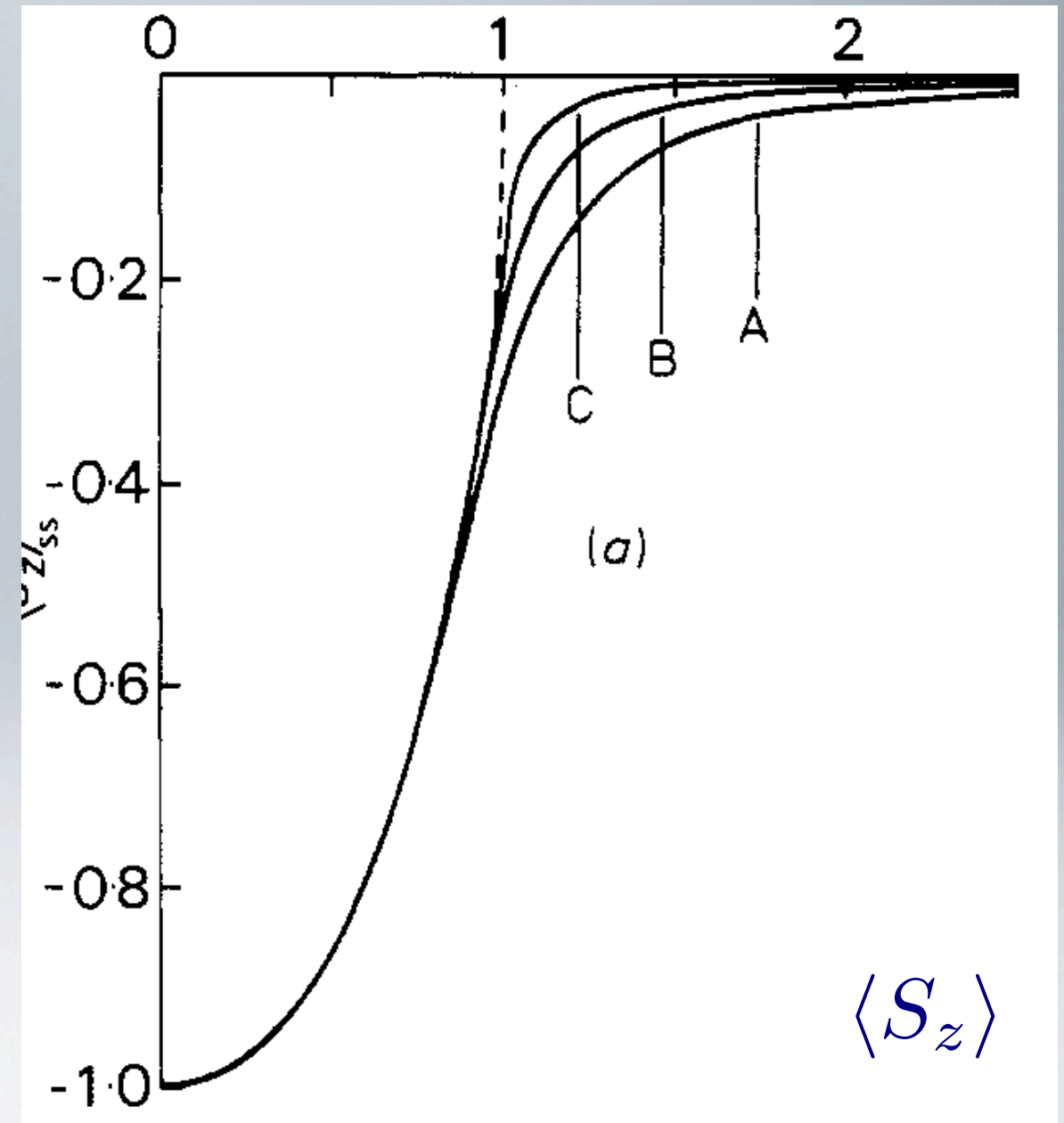
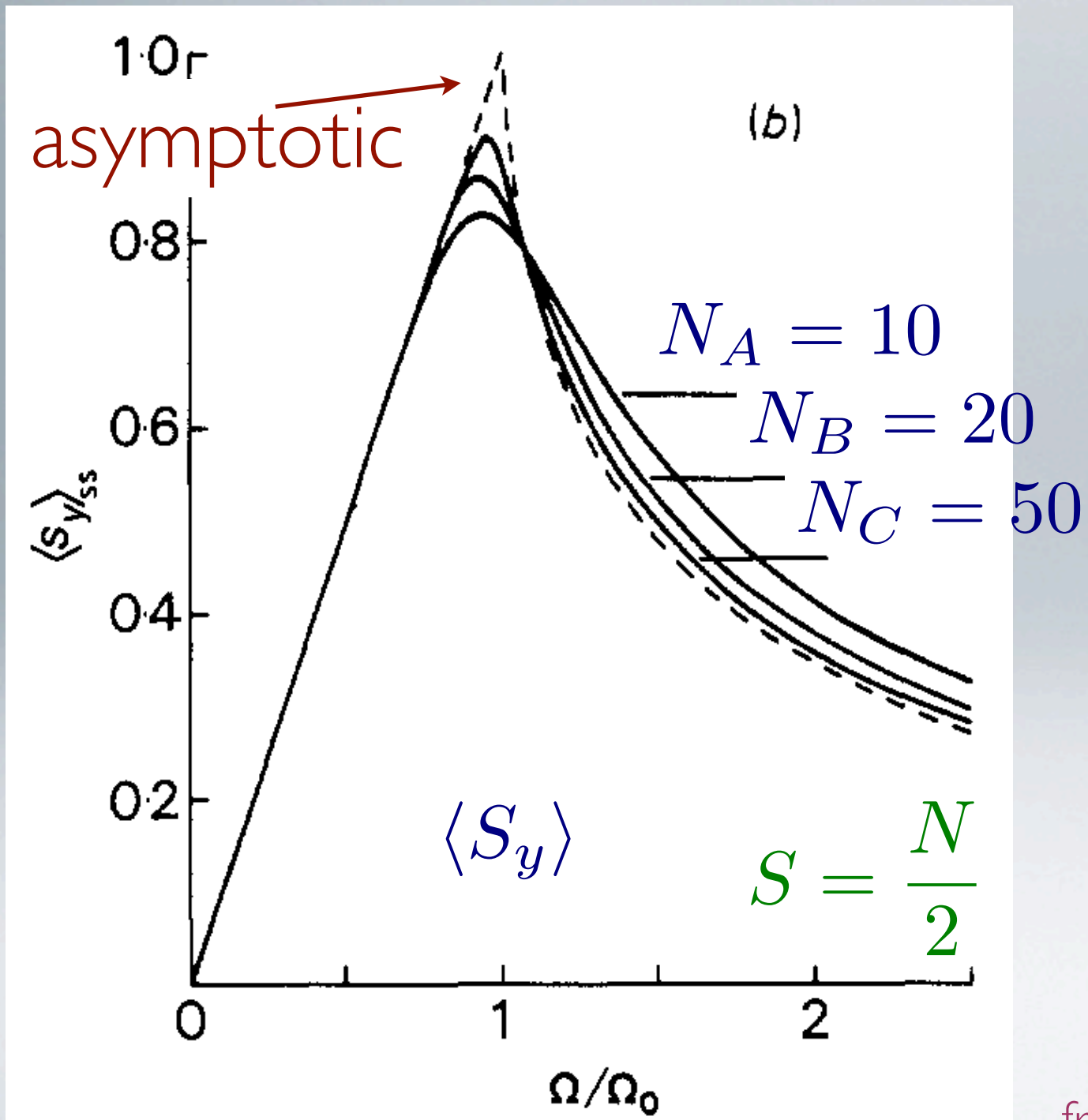
Dicke, 1954

Hepp, Lieb, 1973

Carmichael, 1980



# DICKE MODEL



from Carmichael, J Phys B 1980

# DICKE MODEL

is an interesting model...

phase transitions      dissipative

collective phenomena

entanglement

but experimentally difficult

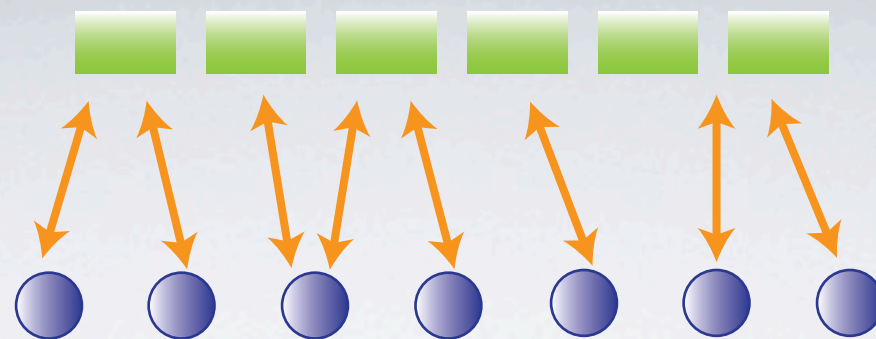
Baumann et al., 2010

Hamner et al., 2014

Baden et al., 2014



Do *simpler* models show similar  
phenomena?  
more local



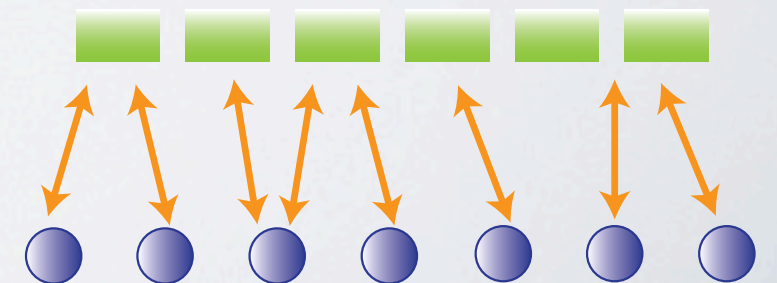
# A SIMPLER MODEL

Lower dimensional version of Dicke model

$N$  2-level systems with dissipation coupling NN

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

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





# LOW DIM DICKE MODEL

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

Approximate the steady state by a MPO

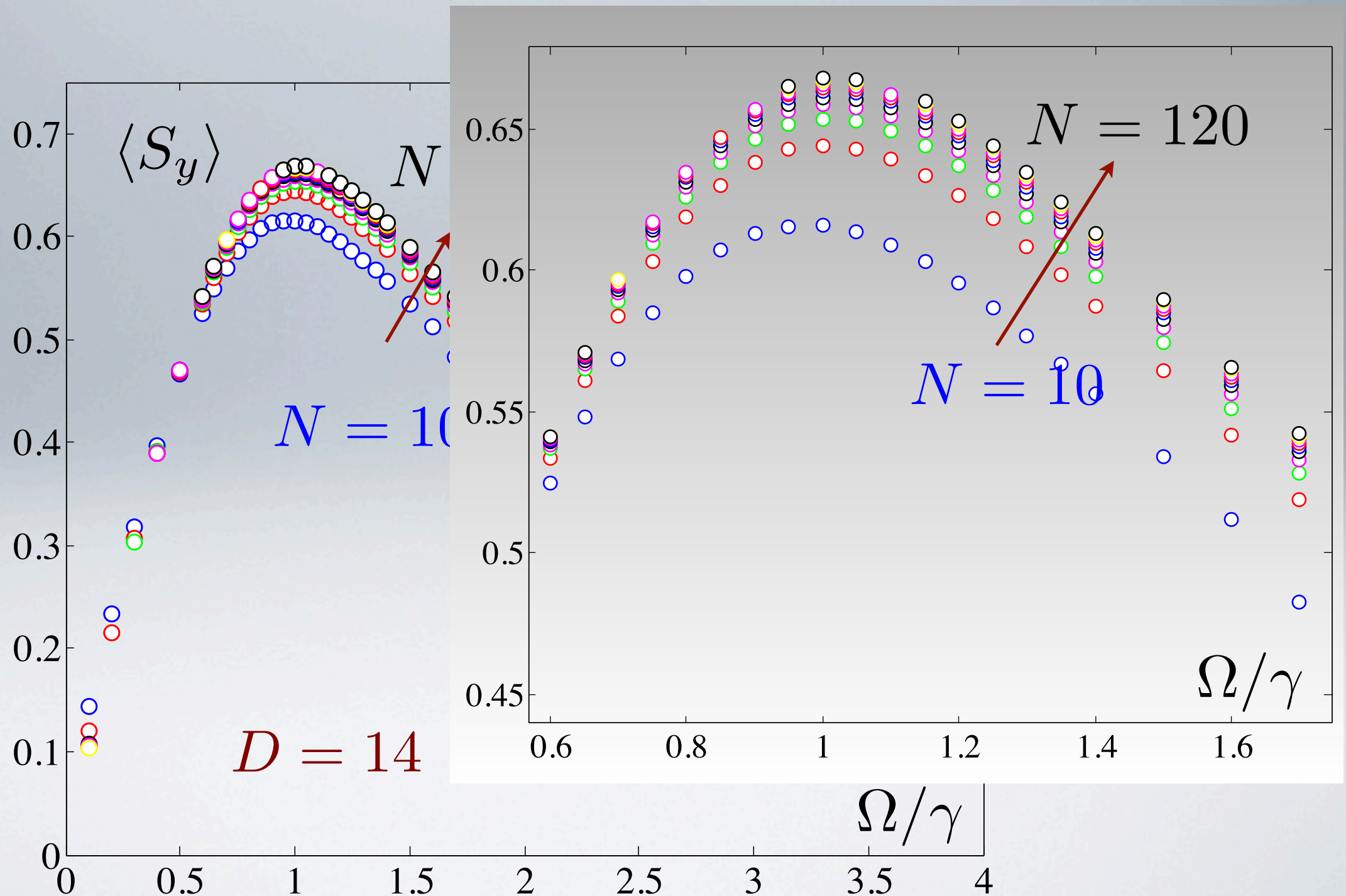
fixed  $D \rightarrow$  check convergence

no explicit positivity

no explicit Hermiticity

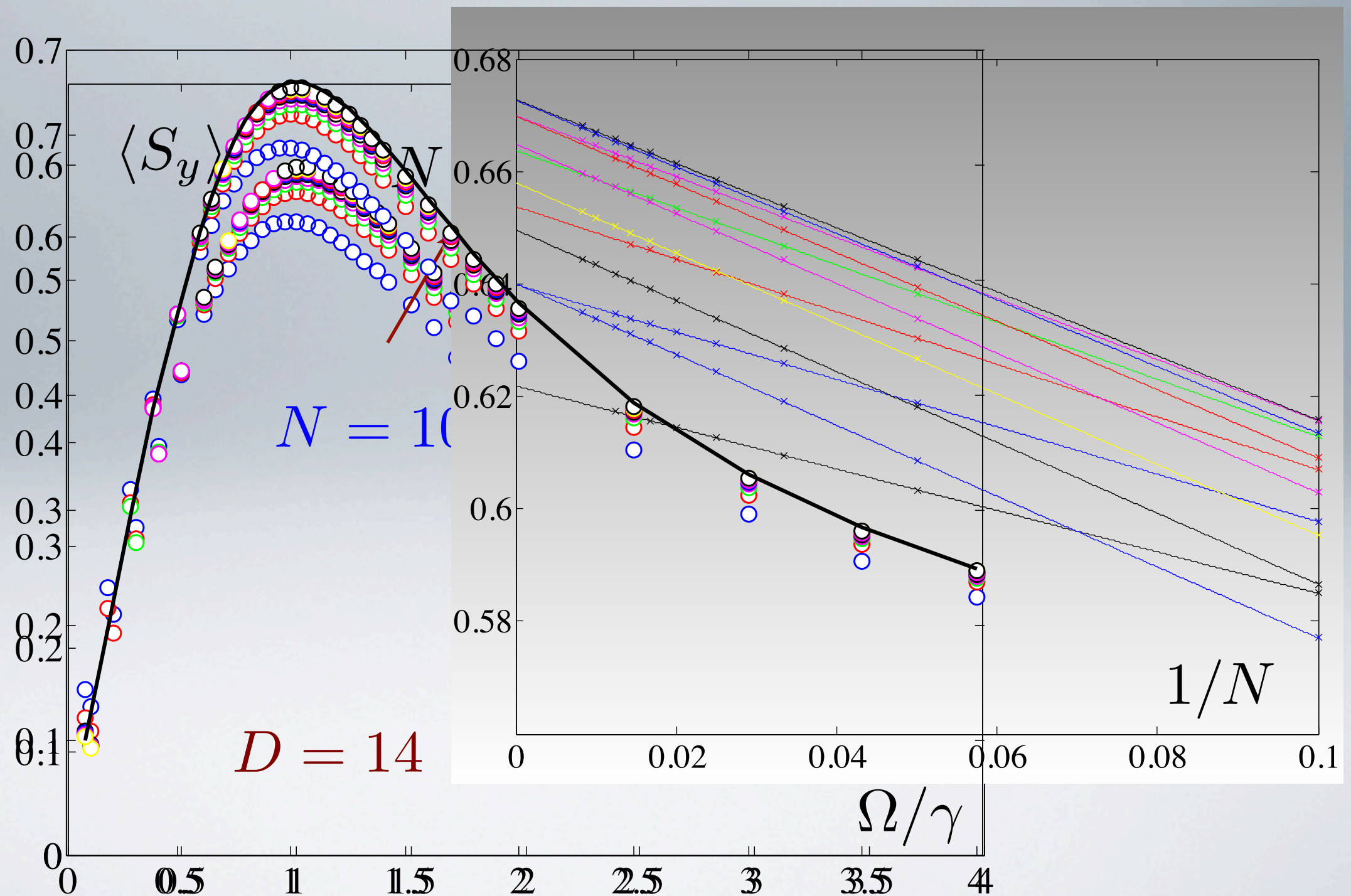
No special symmetry

# LOW DIM DICKE MODEL

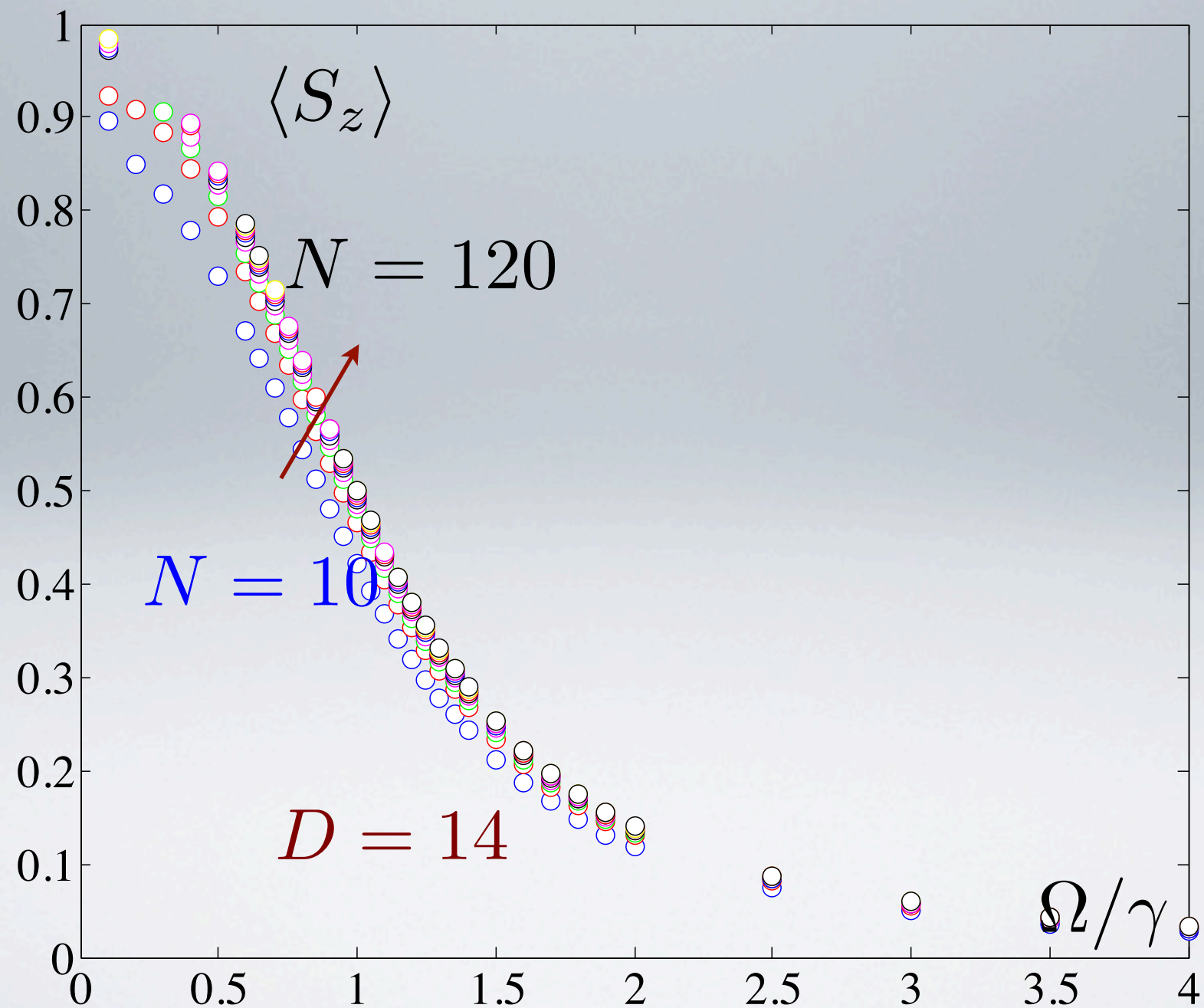




# LOW DIM DICKE MODEL

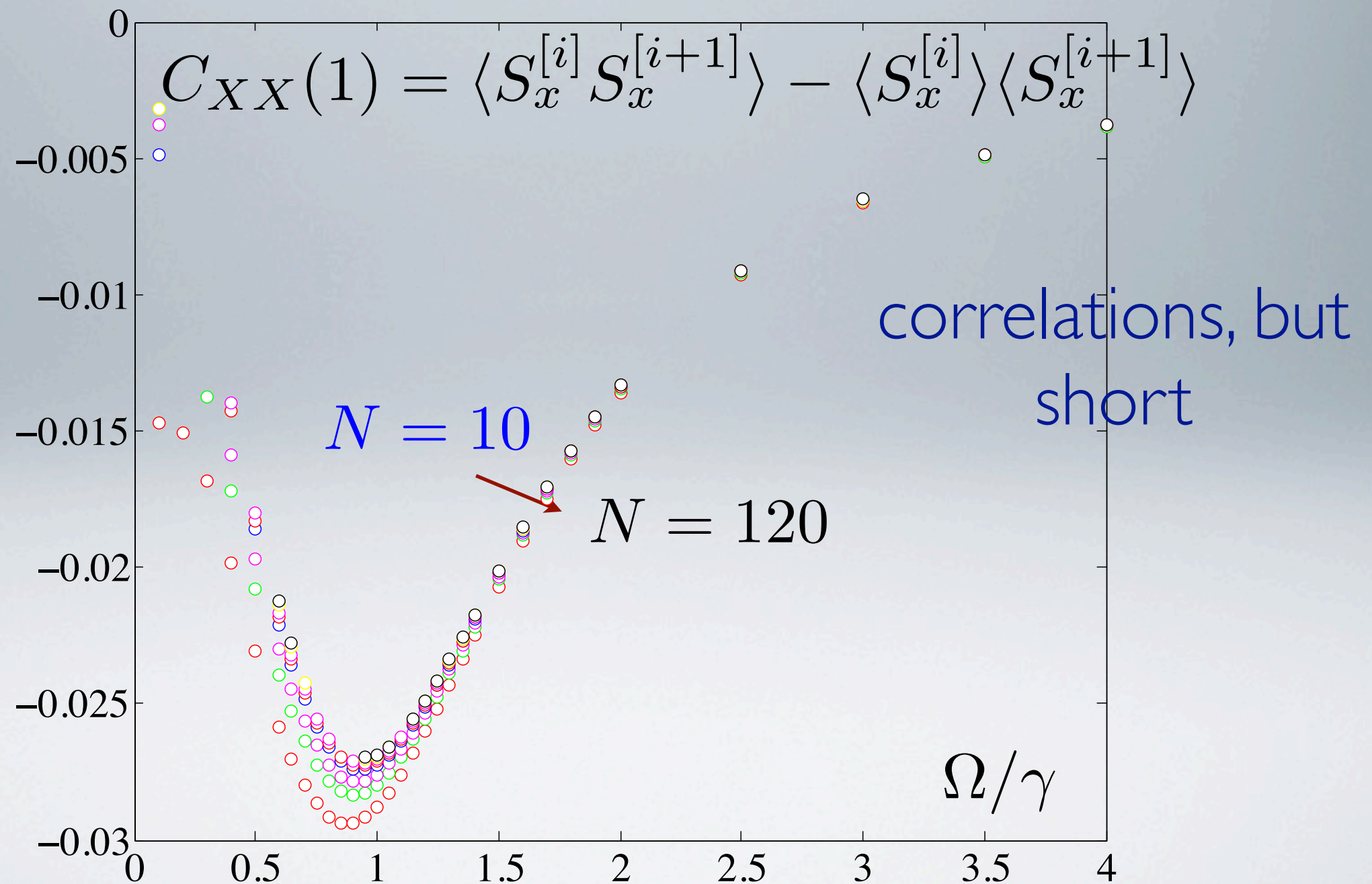


# LOW DIM DICKE MODEL

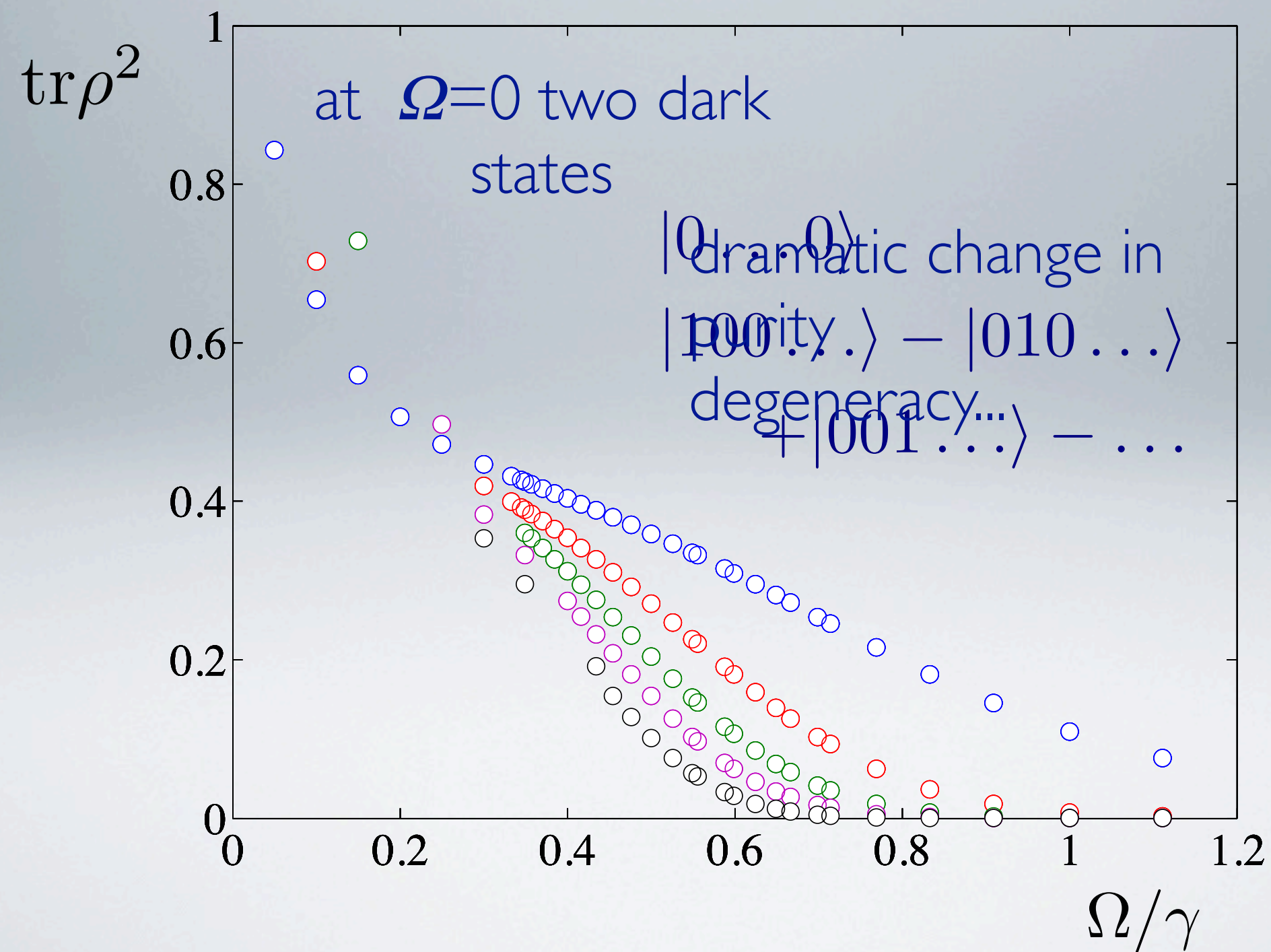




# LOW DIM DICKE MODEL



# LOW DIM DICKE MODEL





Other interesting models...

# DISSIPATIVE ISING CHAIN

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

local dissipation

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

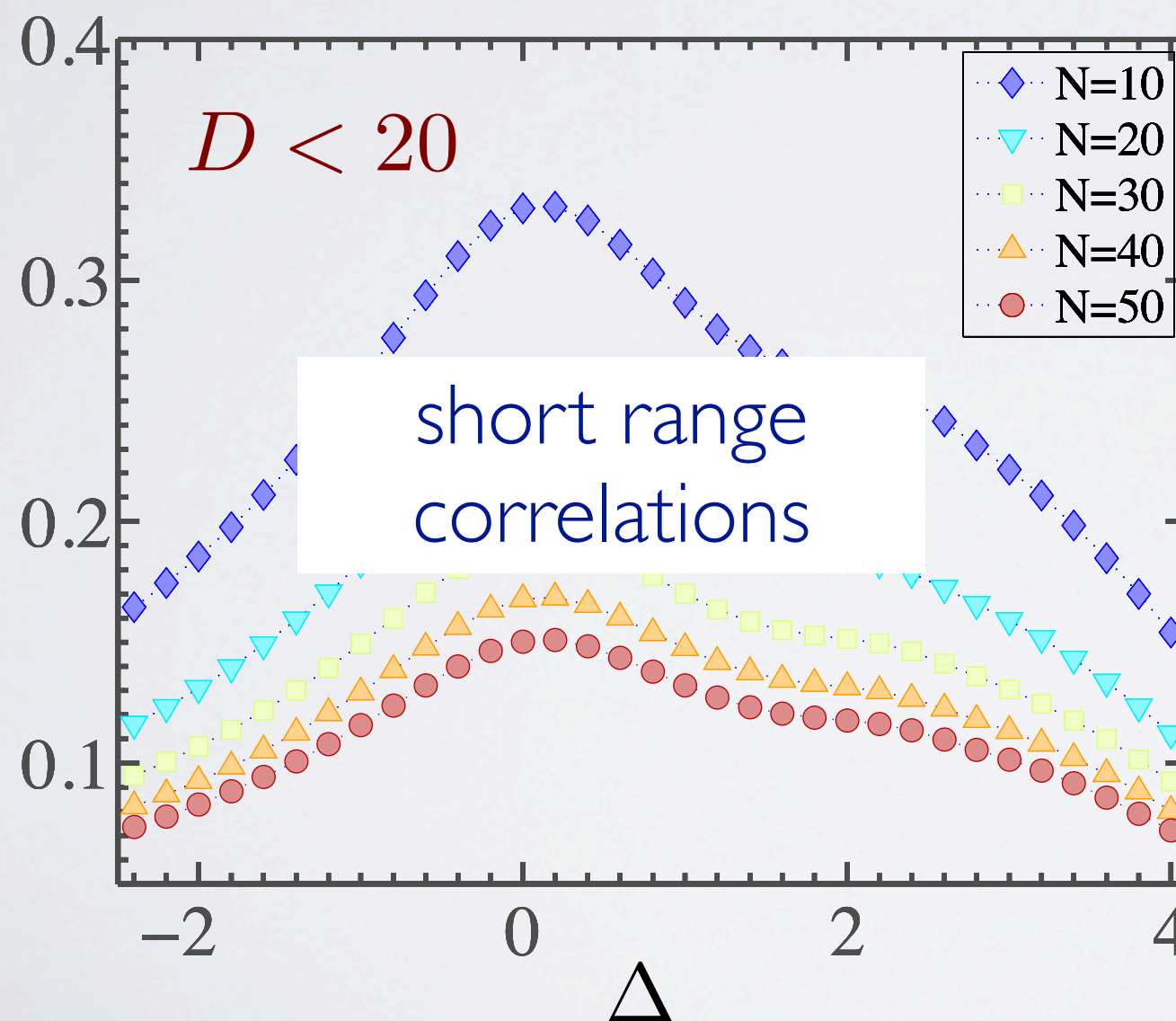
can be realized by Rydberg atoms

steady state can show AFM ordering



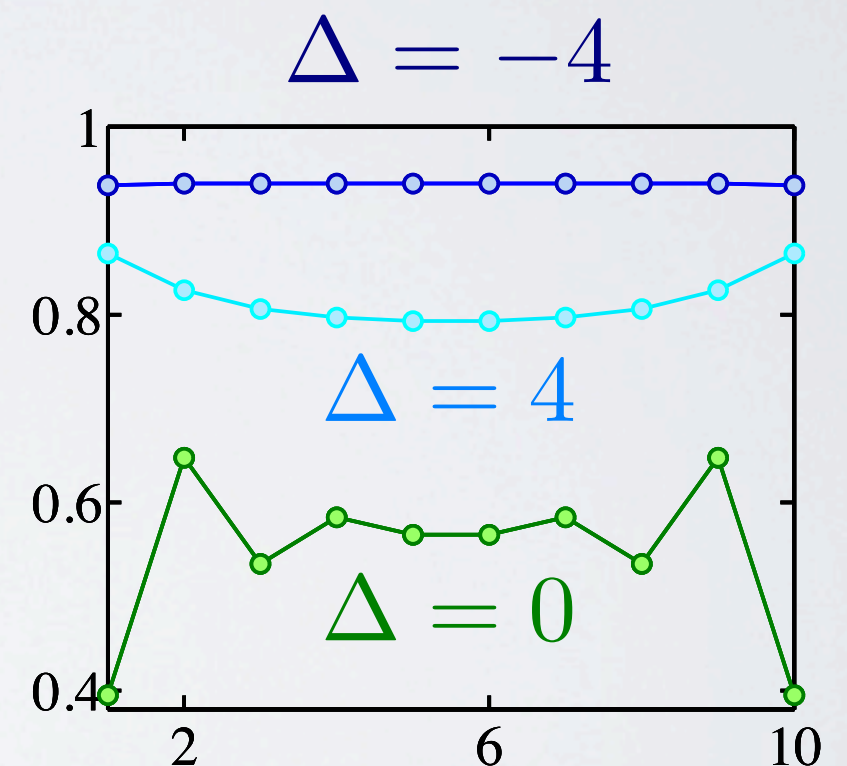
# DISSIPATIVE ISING CHAIN

AF order  
(staggered magnetization)



local polarization

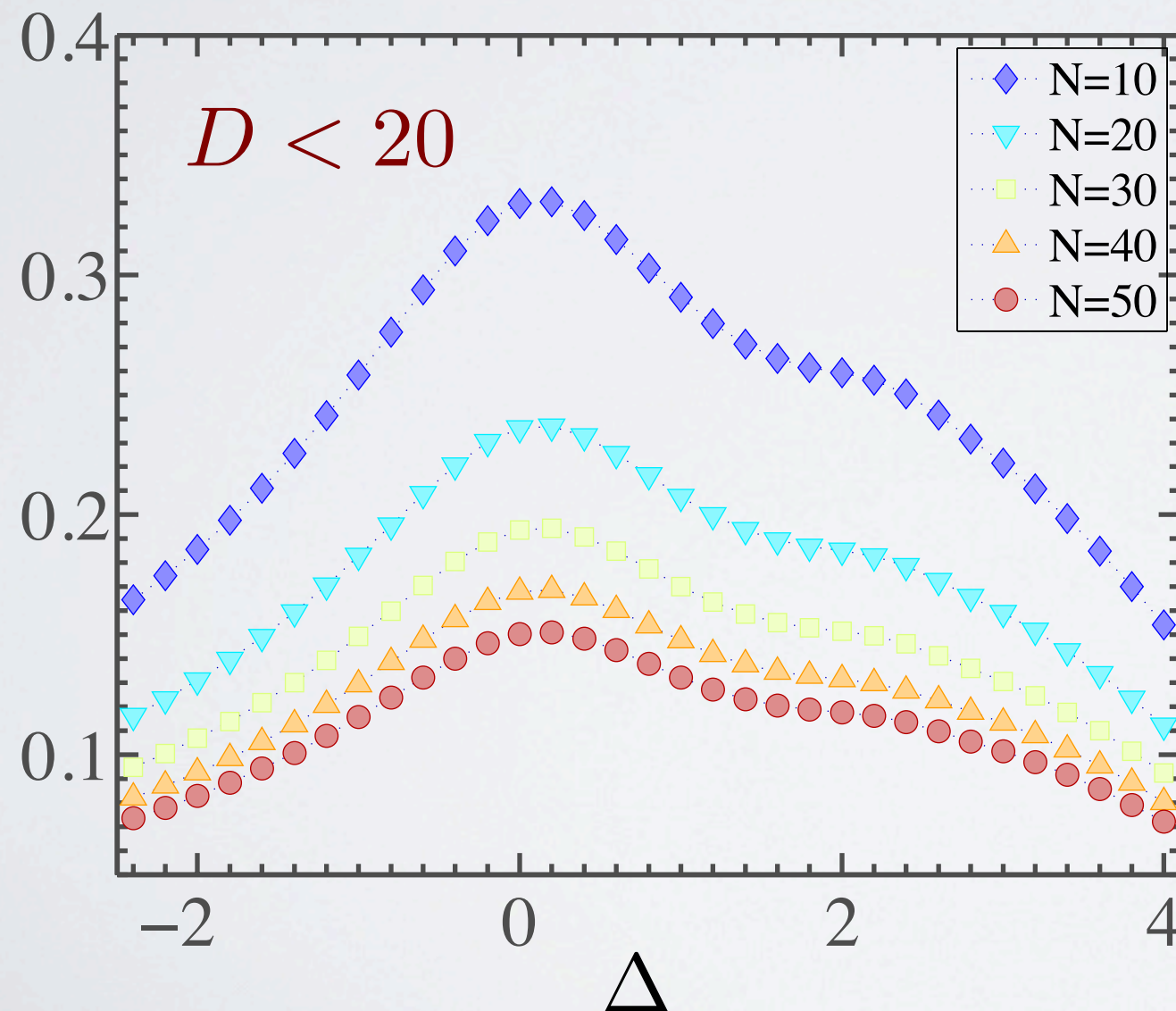
$$\langle \sigma_z^{[n]} \rangle$$



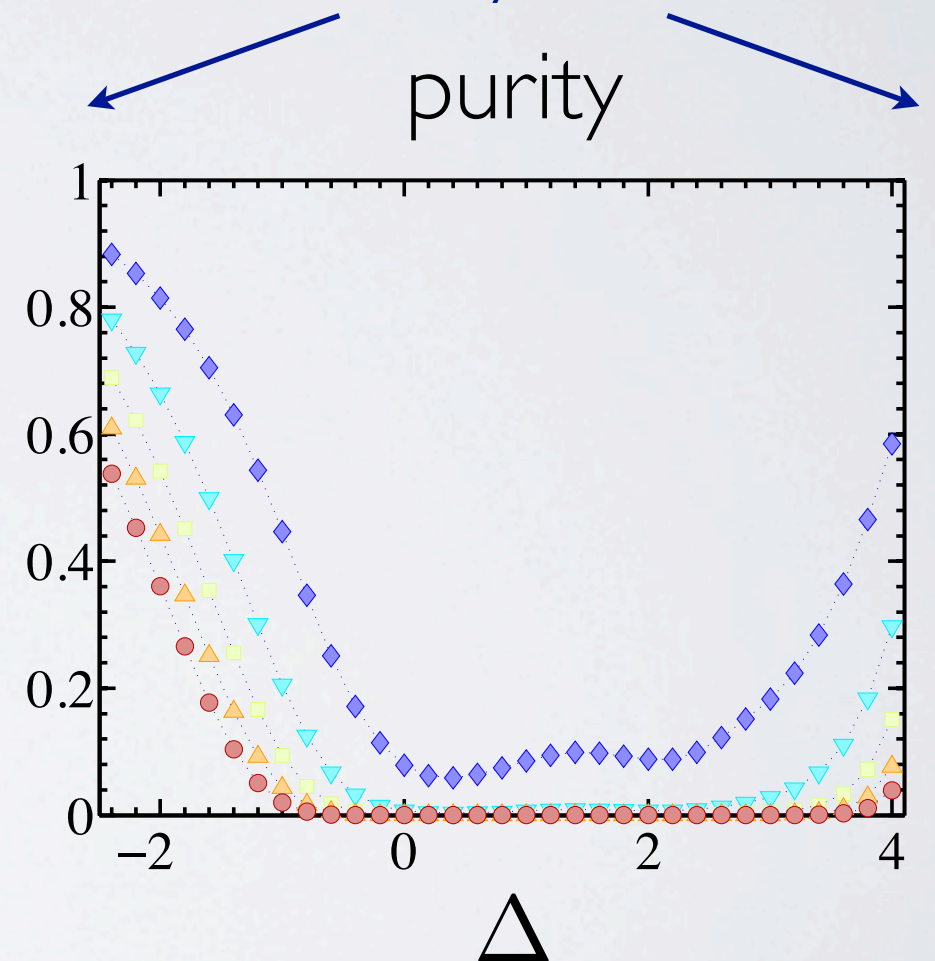
$$\gamma = 1, V = 5, \Omega = 1.5$$

# DISSIPATIVE ISING CHAIN

AF order  
(staggered magnetization)



$|\Delta| \rightarrow \infty$   
completely polarized  
steady state



$$\gamma = 1, V = 5, \Omega = 1.5$$



Interesting models...

# ISING + COHERENT DISSIPATION

$$H = \sum_n \sigma_z^{[n]} \sigma_z^{[n+1]} + \textcolor{red}{g} \sigma_x^{[n]}$$

coherent dissipation

$$L_n = \textcolor{red}{\mu} \sigma_n^+ - \textcolor{red}{\nu} \sigma_{n+1}^-$$

both Hamiltonian and dissipation can induce  
coherence

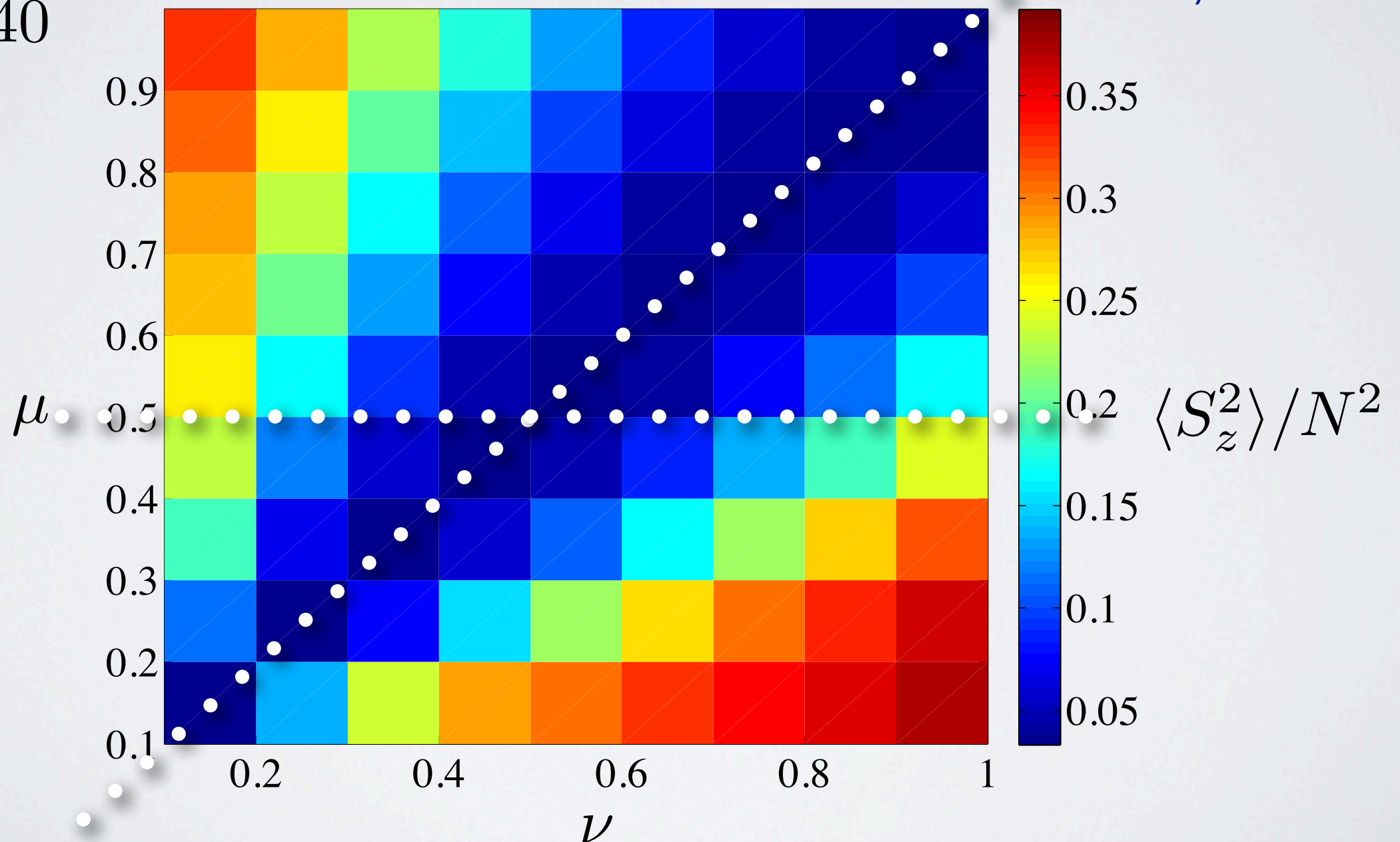


# ISING + COHERENT DISSIPATION

at  $\mu=\nu$  the identity is a steady state!

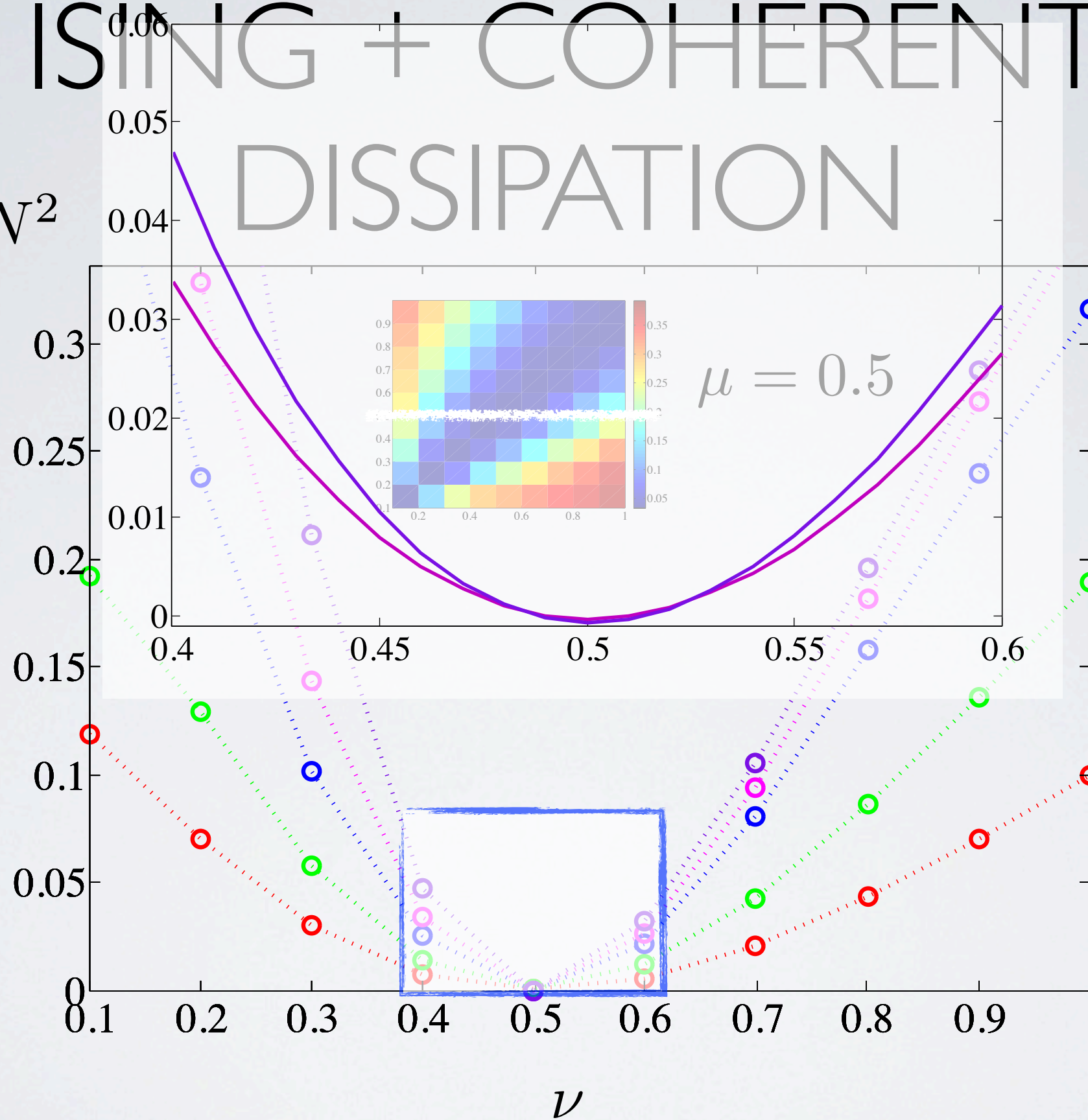
$$N = 40$$

$$g = 1$$



# ISING + COHERENT DISSIPATION

$$\langle S_z^2 \rangle / N^2$$



$$g = 0.5$$

$$g = 1.0$$

$$g = 1.5$$

$$g = 2.0$$

$$g = 10$$

# 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!

Future: symmetries, trace one, degeneracies...

much to understand about MPDOs  
representations

PRL 114, 220601 (2015)



# THANKS!



Max Planck Institut  
of Quantum Optics  
(Garching)



THANKS!