

Title: Quantum Many-body Dynamics with Matrix Product States

Date: Feb 24, 2014 11:00 AM

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Abstract: The talk is divided into two parts: in the first, I will talk about dynamics of far-from equilibrium initial states in different lattice models. I will present results of quench dynamics of the XXZ-Heisenberg magnet, where interesting physics emerges after quenching the system. Then I will present results for scattering of solitonic objects in different integrable and non-integrable lattice models. In the second part, I will talk about dynamics of impurity systems. There I will talk about how impurity spectral functions can be calculated using the Chebyshev technique, and how MPS can serve as a high resolution impurity solver for Dynamical Mean-Field Theory. Finally, I will show some results for steady-state currents through a quantum dot device.

Outline

- **Methods:** Matrix Product States and Operators
 - Definitions, Basics, Approximations
 - Dynamics with MPS
- **Applications I:** Many-body dynamics
 - Quenches in the XXZ Heisenberg model
 - Solitonic excitations in lattice models
- **Applications II:** Dynamical correlation functions
 - Single Impurity Anderson Model
 - DMFT
- **Applications III:** I-V characteristics of the SIAM

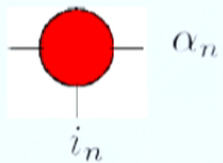
Matrix Product States (MPS)

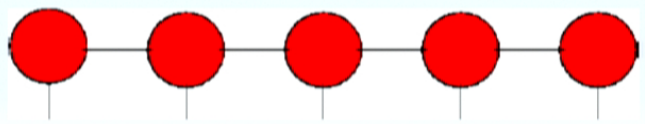
- Consider 1-d systems
- Wave function representation with matrix products:

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

$$c_{i_1 \dots i_N} = \vec{A}^{i_1} A^{i_2} \dots A^{i_{N-1}} \vec{A}^{i_N}$$

- A^{i_n} : site-dependent $\chi \times \chi$ matrices,
 $|i_n\rangle$: local d -dimensional basis at site

Graphically: $A_{\alpha_{n-1} \alpha_n}^{i_n} =$ 

$c_{i_1 \dots i_N} =$ 

Matrix Product Operators (MPO)

- Similar representation for operators, e.g. Hamiltonian:

$$\hat{O} = \sum_{i_1 \dots i_N} M^{i_1 i'_1} \dots M^{i_N i'_N} |i_1\rangle \langle i'_1| \dots |i_N\rangle \langle i'_N|$$

$$M_{\beta_{n-1} \beta_n}^{i_n i'_n} = \beta_n \begin{array}{c} | \\ \text{---} \text{[red square]} \text{---} \\ i_n \end{array} \beta_{n-1}$$

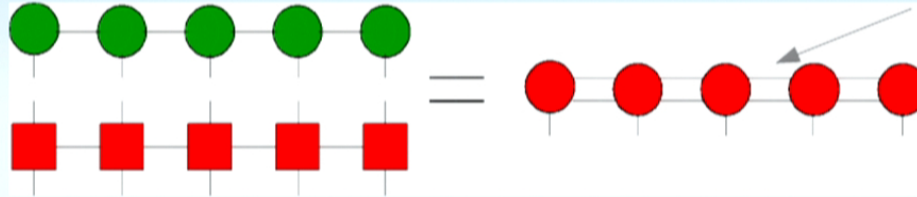


Operations on MPS

- Addition: $a|\psi\rangle + b|\phi\rangle$
- Operator application: $\hat{O}|\psi\rangle$

} Increase of matrix dimension $\chi!$

$$\chi' = D \times \chi$$



- **Compress** MPS to original bond dimension by minimizing distance

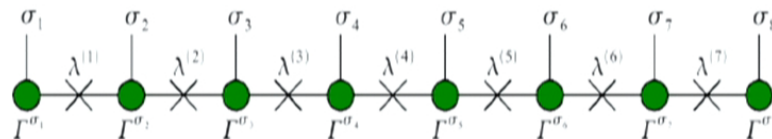
$$\| |\tilde{\phi}\rangle - |\phi\rangle \|$$

- **Applications:** Krylov-based methods for solving large sparse eigenvalue problems:
 - Lanczos (Dargel et. al. 2011, 2012)
 - Chebyshev expansion (Holzner et. al. 2011) → [this talk](#)

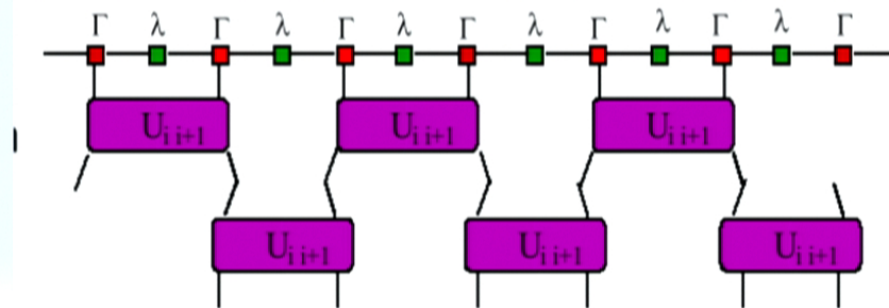
Dynamics I: time evolution

- Full Diagonalization for small systems
- TEBD, tDMRG for large systems:
 - Express states as **Canonical Matrix Product State**

$$|\psi\rangle = \sum_{\{\sigma\}} \Gamma^{\sigma_1} \lambda^{(1)} \Gamma^{\sigma_2} \lambda^{(2)} \Gamma^{\sigma_3} \dots \Gamma^{\sigma_{L-2}} \lambda^{(L-2)} \Gamma^{\sigma_{L-1}} \lambda^{(L-1)} \Gamma^{\sigma_L} |\sigma_1 \dots \sigma_L\rangle$$



- Very good approximation in 1d (basis for DMRG). Exact for sufficiently large matrices
- Time evolution by Trotter expansion of $U = \exp(-it H)$



Quenches in the XXZ Heisenberg spin 1/2 chain

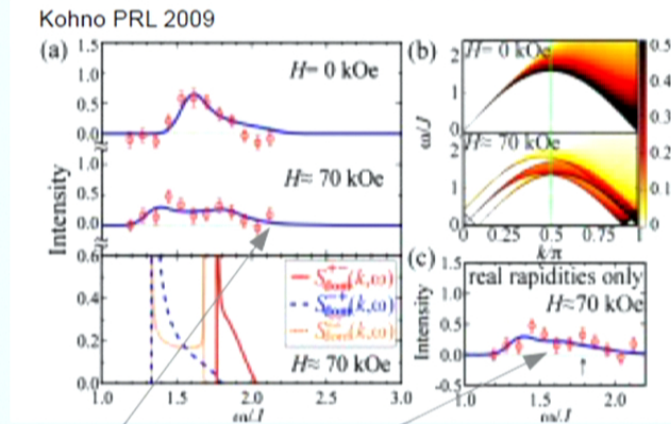
- XXZ Heisenberg chain = hardcore bosons (\sim spinless fermions)

$$H = \sum_i \frac{J_{xy}}{2} (S_i^+ S_{i+1}^- + S_i^- S_{i+1}^+) + J_z S_i^z S_{i+1}^z, \quad \Delta = \frac{J_z}{J_{xy}}$$

- Integrable, solved by Bethe ansatz
- Spectrum contains **Bound States** ("M-strings")

Difficult to see in standard condensed matter experiments (few %)

- Quenches?

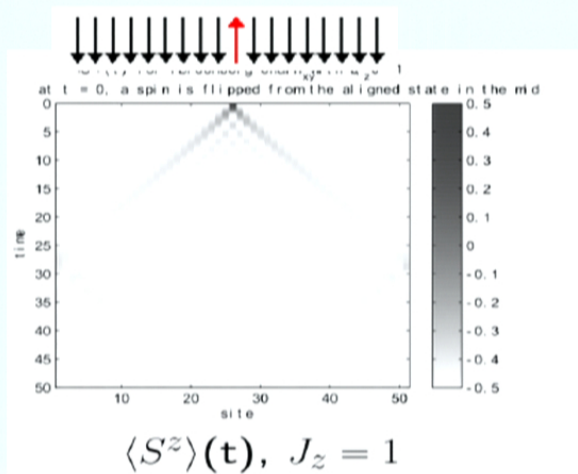


Spectra with and without bound state contributions

Caux et al J Stat.Mech 2005
 Pereira, White, Affleck PRL 2008, PRB 2009
 Sashi et al, PRB 2011

Quantum quenches: non-equilibrium time evolution

- Global Quenches:
 - Thermalization? Steady State? Generalized Gibbs Ensemble?
- Local quenches: Prepare system in ground state, at $t=0$, change H or act with S_i^+
 - investigate time evolution
 - Has almost exclusively been studied with *single site* quenches
- **Example: single spin flip in FM**



⇒ "linear" propagation

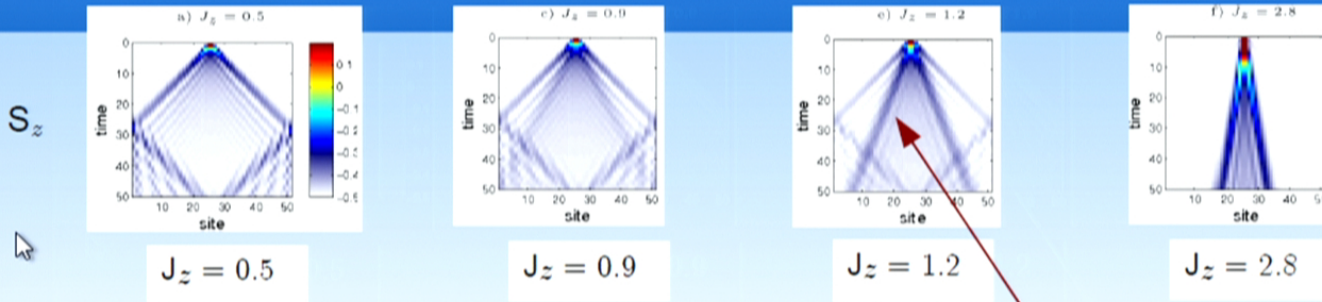
↔ Lieb Robinson bound

Lieb, Robinson Comm. Math. Phys 1972

Sims, Nachtergaele arXiv:1102.0835

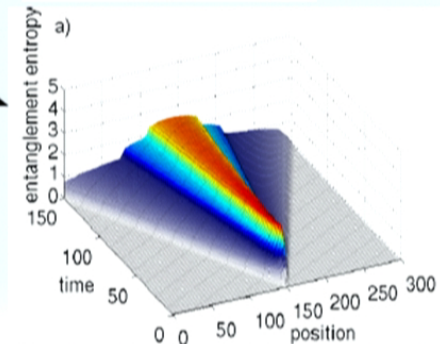
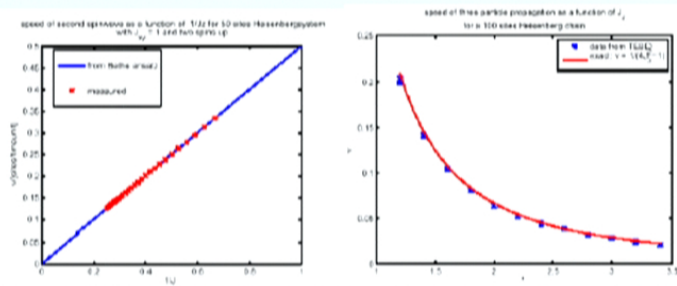
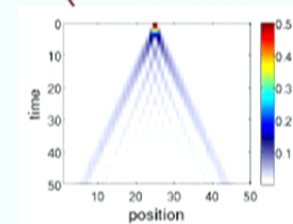
Gobert et al. PRE 2005; Langer et al. PRB 2009;
Ren, Zhu PRA 2010; Santos, Mitra PRE 2011; Langer et al 1107.4136;
Santos, Dykman PRB 2003; Petrosyan et al PRA 2007; Boness et al.
PRE 2010; Steinigeweg PRL 2011; Pereira et al. PRL 2008; Calabrese,
Cardy J Stat Mech 2007; Stephan, Dubail 1105.4846.

Two-spin excitation in FM



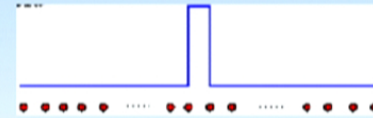
- Two distinct propagation branches beyond $J_z = 0.7$
- **New lower branch is bound state**
- **It dominates at large J_z** with decreasing velocity
- Low entanglement entropy, **step-like structure**

$P(\uparrow\uparrow)$



Local quench in the AF groundstate at non-zero magnetization

- Prepare ground state with a local infinite magnetic field, then switch field off



- AF at nonzero magnetization is in the Luttinger liquid phase *for any J_z*
- Highly entangled state, “spinon” excitations
- Do bound “string-states” remain visible ?
- Accessible in cold atom experiments (Fukuhara et al. Nature 502, 76 (2013))
- Related to “x-ray edge” problem

Evolution from AF groundstate at $J_z=1.2$, finite magnetization, 2 spins fixed up



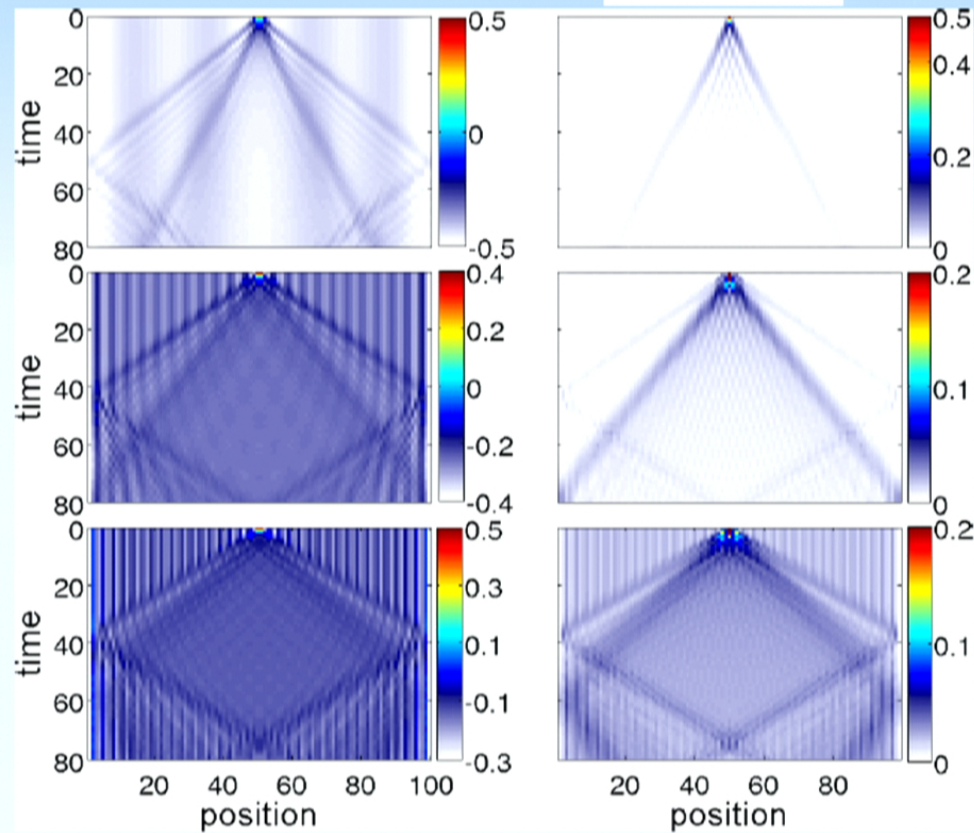
$$\langle S^z \rangle(x, t)$$

$$\mathcal{P}_{\uparrow\uparrow}(x, t)$$

- Low filling 6% (=large magnetization): like magnons and bound magnons

- Larger filling 24%
Larger velocity

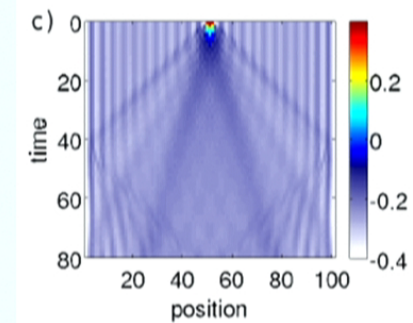
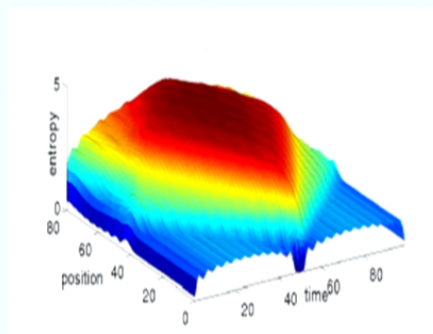
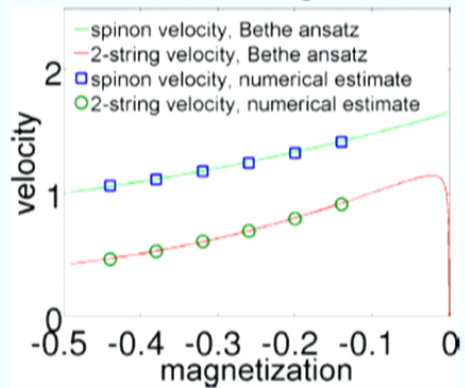
- Filling 36%:
fewer momenta contribute to bound state
→ washed out



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Bound states in the AF

- Bound states remain clearly visible
- Velocities agree precisely with Bethe ansatz:
- At zero magnetization no bound states
- Different entanglement structure, still steplike

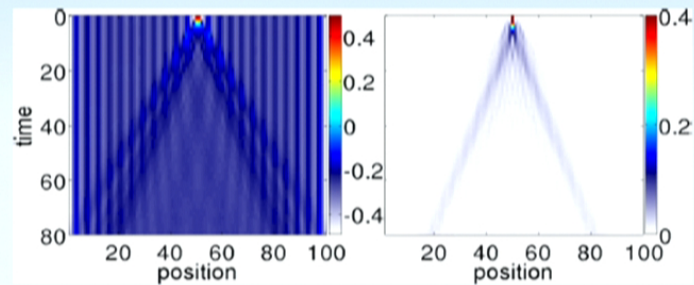


- Three-strings: agree with Bethe ansatz:

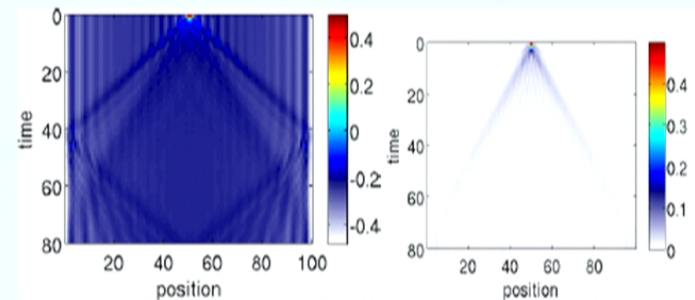
Non-integrable models

- Experiments (e.g. cold atoms) may not precisely reproduce the XXZ model
- **Bound states remain visible in nonintegrable models !**

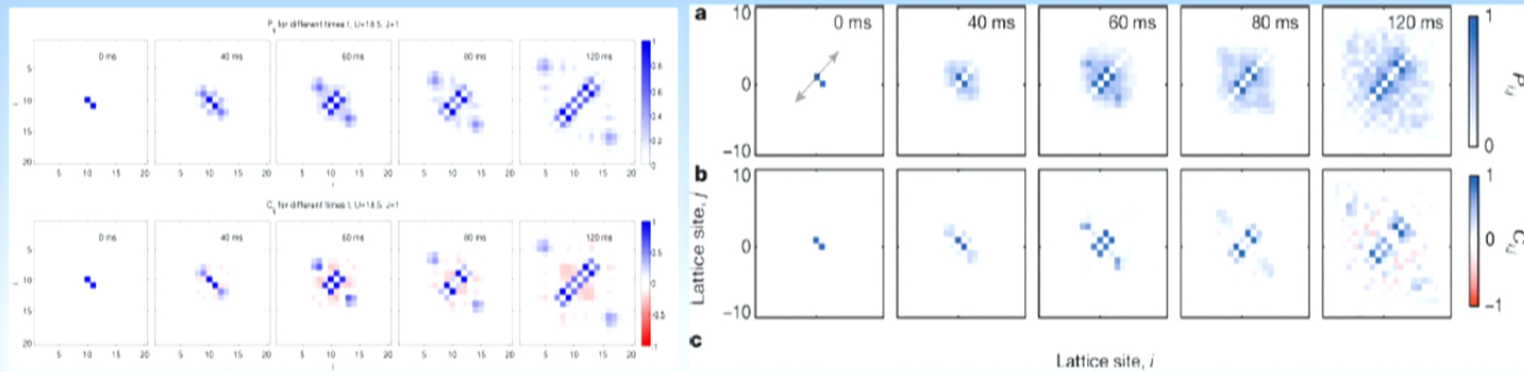
- Next-nearest neighbor coupling $J/10$



- Chain in parabolic field (“optical trap”)



Realization with cold atoms

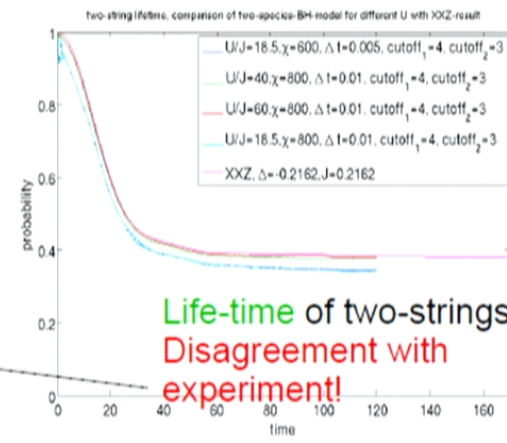
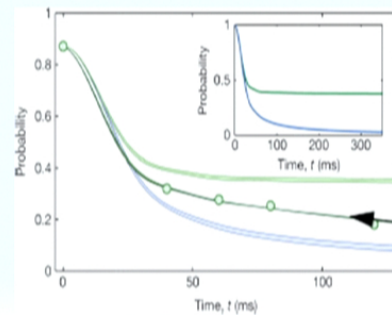


TEBD

Experiment Fukuhara et al. Nature 502, 76

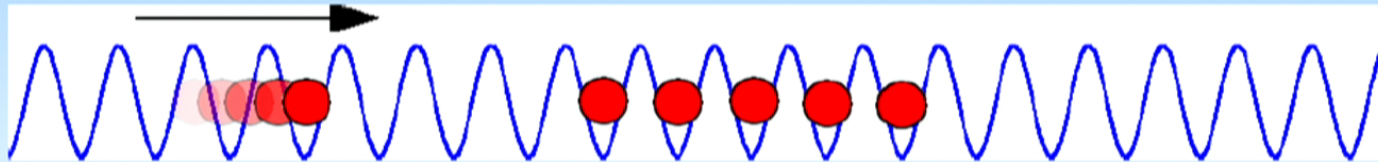
Experiment: two species bose hubbard model (two hyperfine states of Rb)

P_{ij} : probability of finding two spins simultaneously at sites i, j
 $C_{ij} = P_{ij} - P_i P_j$

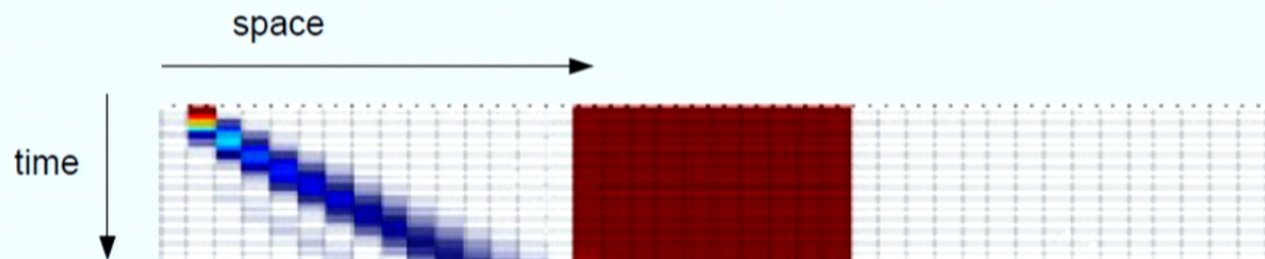


Life-time of two-strings:
 Disagreement with experiment!

Solitonic excitations in lattice models



- “Stable” cluster hit by a single particle:
- Spinless fermions, integrable and non-integrable version
- Bose-Hubbard model
- Fermi Hubbard model



Stable clusters for spinless fermions and Bose-Hubbard

Spinless fermions:

$$H_{tV} = t \sum_i \left(c_i^\dagger c_{i+1} + c_{i+1}^\dagger c_i \right) + V \sum_i \left(n_i - \frac{1}{2} \right) \left(n_{i+1} - \frac{1}{2} \right)$$

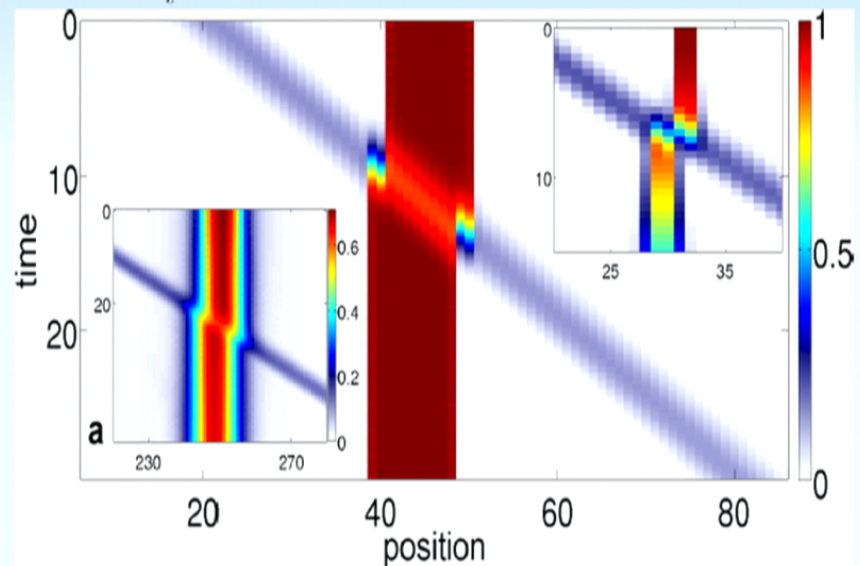
Localized particle hits a “stable” wall of bound particles

No backward scattering

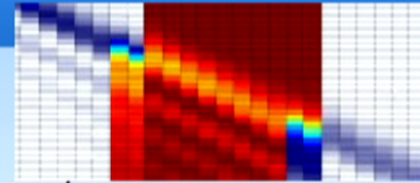
A hole moves through the wall!
Particle-hole transmutation

Wall moves against the direction of motion by *two lattice sites*

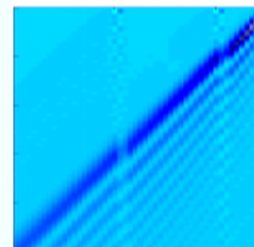
Resembles a fermionic *Quantum Newtons Cradle*. Also like *Klein tunneling*: particle-hole creation



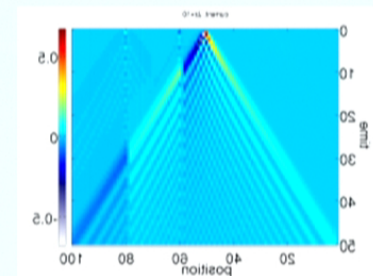
Conservation laws



- Local interaction: cannot reach through thick wall
- Conserved quantities: *energy current, energy, particle number, ...*
- **Energy current conservation:**
need movement through wall: only a *hole* possible;
carries same energy current as particle. Magnetic current is not conserved
- **Energy conservation:**
Hole already carries same *energy* as particle
=> *no reflected particle*
- **Particle number conservation:**
=> *Two* particles must stick to the wall when a particle-hole pair is created
- **Open question:** *is full integrability needed, or just energy current conservation ?*



energy current



magnetic current

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Breaking Integrability

- Bipartite entanglement: **classical picture!**
- **Jump of the signal by two sites!**
- Integrability breaking perturbation

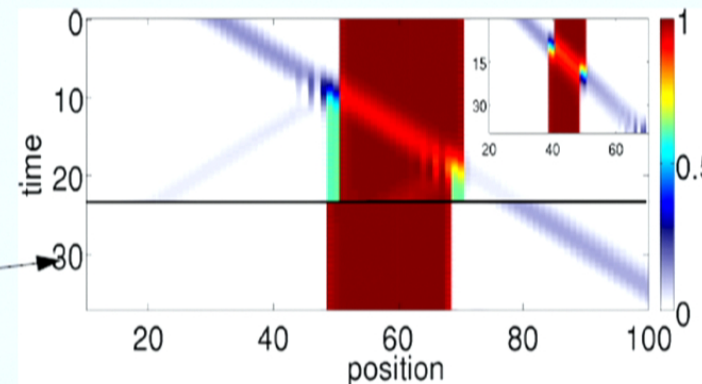
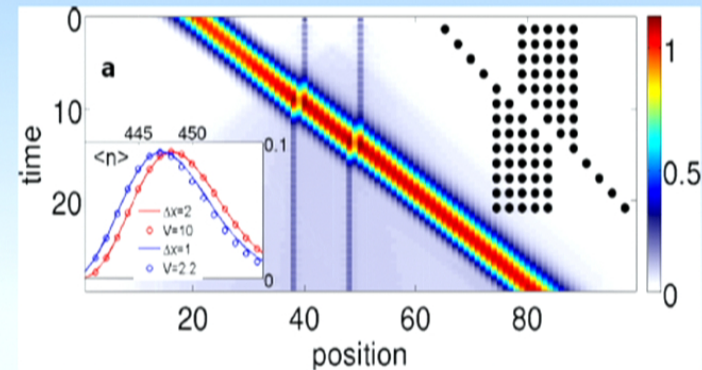
$$V_2 \sum_i n_i n_{i+2}$$

- **Partial backscattering**

- Simple final state:

$$|\Psi\rangle = |T\rangle + |R\rangle$$

- Projection onto probability of having transmission
- Inset: integrabel model with next nearest neighbor hopping: full transmission



Bose and Fermi Hubbard model

Fermi Hubbard model:

Cluster: doubly occupied sites

clusters do not bind \rightarrow large interaction $U/t=50$

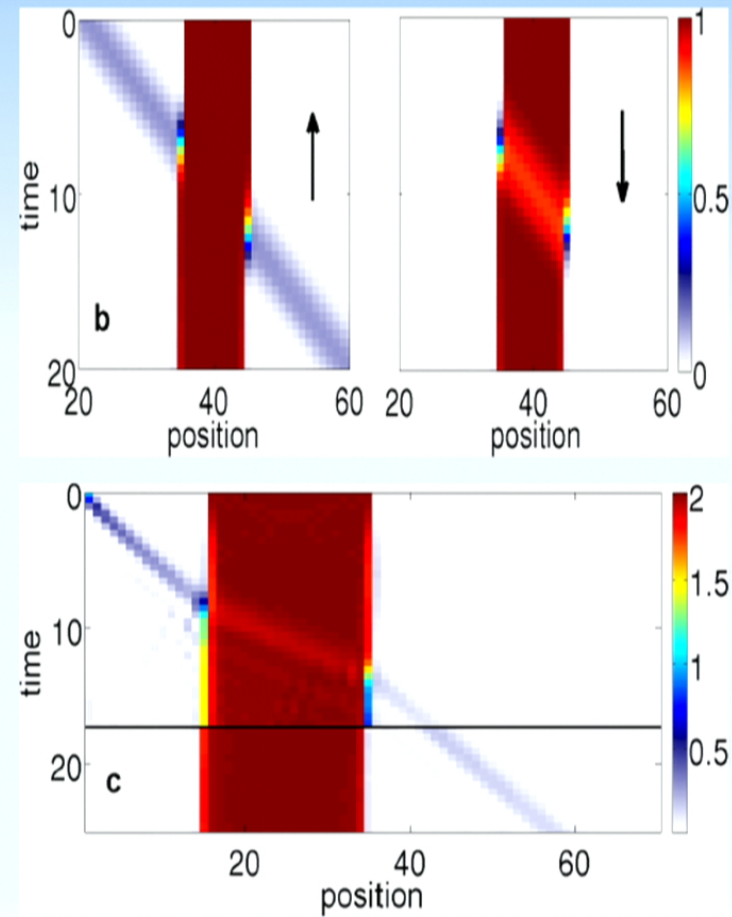
Shift by one site = two particles

Spin flip of the signal

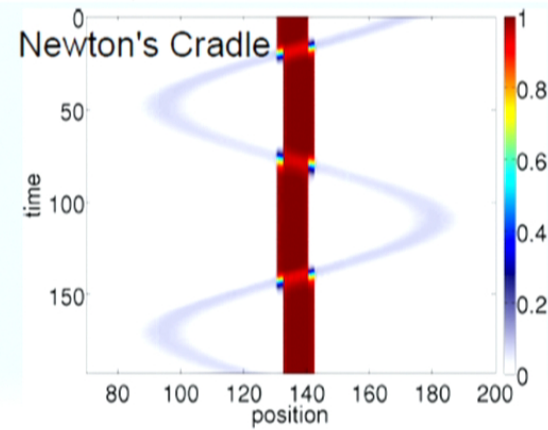
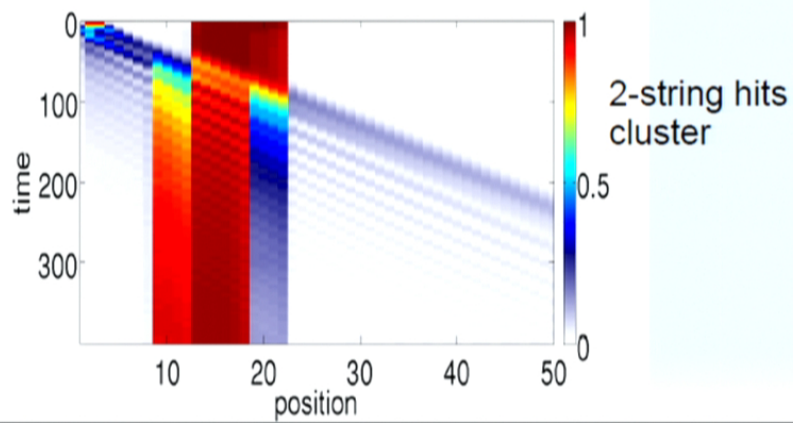
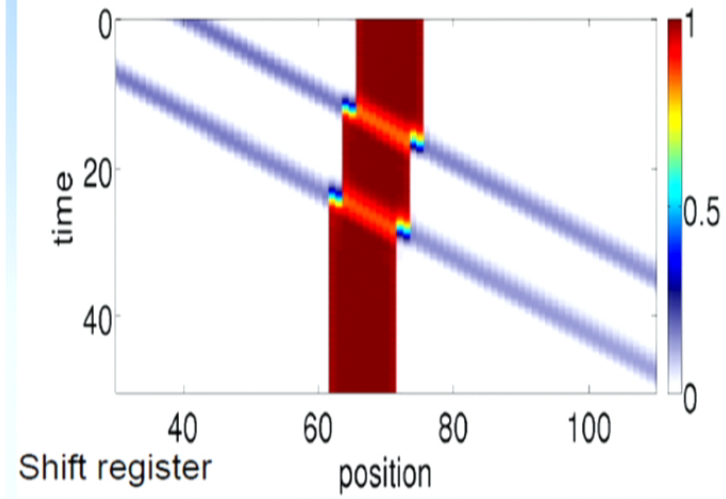
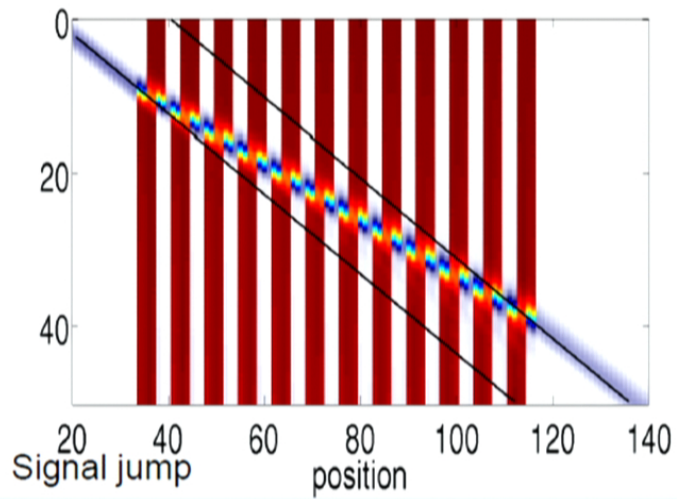
Bose Hubbard: non-integrable

Cluster of doubly occupied sites

Hole travels faster by factor of 2



Toy application



Dynamics II: Spectral functions with the Chebyshev technique

- **Spectral function** $A(\omega) = \langle 0|c \delta(\omega - H) c^\dagger |0\rangle$
- Chebyshev orthogonal polynomials: $T_n(\omega) = \cos(n \arccos(\omega))$
- Use $\delta(\hat{H} - \omega) = \frac{1}{\sqrt{1-\omega^2}} \left(1 + \sum_{n=1}^{\infty} T_n(\hat{H})T_n(\omega) \right)$

$$\rightarrow A(\omega) = \frac{1}{\sqrt{1-\omega^2}} \left(\langle 0|cc^\dagger|0\rangle + \sum_{n=1}^{\infty} \underbrace{\langle 0|cT_n(\hat{H})c^\dagger|0\rangle}_{\mu_n} T_n(\omega) \right)$$

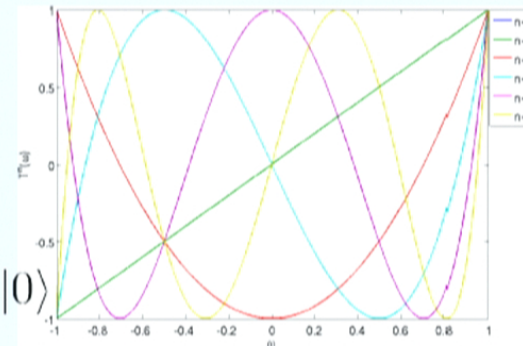
- Recursion:

$$T_0(\hat{H}) = \mathbb{1},$$

$$T_1(\hat{H}) = \hat{H}$$

$$T_{n+1}(\hat{H}) = 2\hat{H}T_n(\hat{H}) - T_{n-1}(\hat{H})$$

- Use MPS to compute $\mu_n = \langle 0|cT_n(\hat{H})c^\dagger|0\rangle$
- $|0\rangle$ from DMRG run



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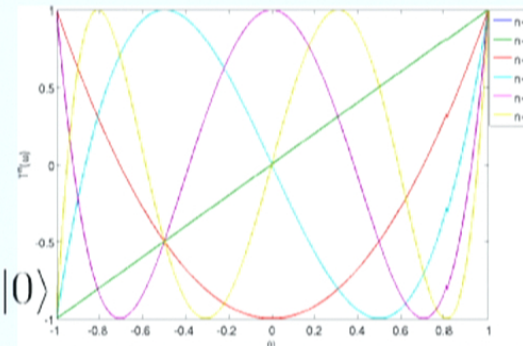
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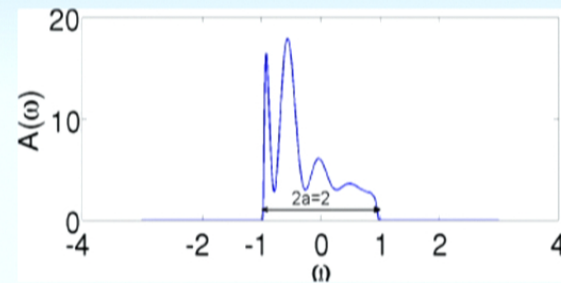
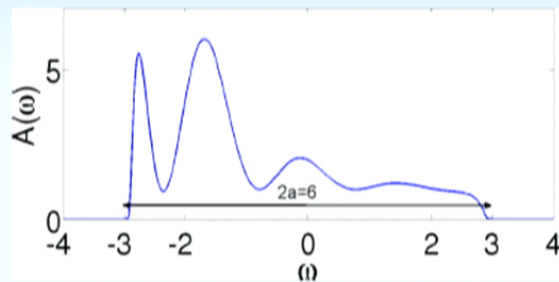
Chebyshev expansion of spectral functions

- Chebyshev expansion diverges outside of $[-1,1]$:

Need to rescale Hamiltonian:

single particle excitation spectrum is then contained in $[-1,1]$

$$H \rightarrow \tilde{H} = \frac{H - E_0}{a}$$



- Calculation of Chebyshev moments μ_n from recursion:

$$\left. \begin{aligned} |t_0\rangle &= c^\dagger |0\rangle & |t_1\rangle &= \tilde{H} |t_0\rangle \\ |t_n\rangle &= 2\tilde{H} |t_{n-1}\rangle - |t_{n-2}\rangle \end{aligned} \right\} \mu_n = \langle t_0 | t_n \rangle$$

- Groundstate $|0\rangle$ from DMRG run
- *All steps can be done using MPS*

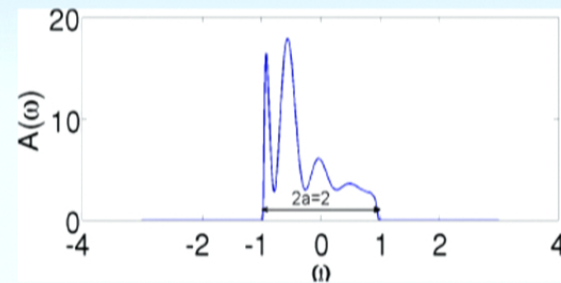
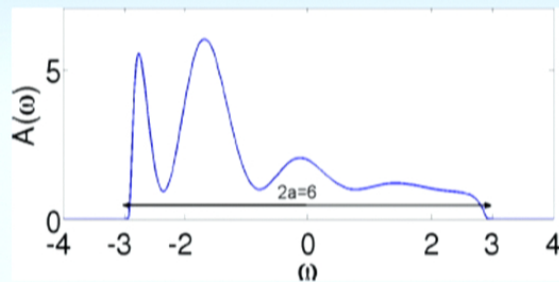
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Goals

- **Calculate spectral functions** of 1-d systems at $T=0$
- **Impurity solver for DMFT**
 - Existing techniques:
 - *ED*: only small systems
 - *NRG*: fast, high resolution at $\omega \approx 0$,
bad resolution at high ω ;
hard for multiorbital
 - *DDMRG*: very accurate, very expensive
 - *QMC*: often used, also for multiorbital, but only
imaginary frequencies, and only $T>0$

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Chebyshev expansion of spectral functions

Difficulties:

- With **finite expansion order** N
 - **Get finite resolution** $\propto 1/N$
 - **Gibbs oscillations** from hard cutoff (similar to Fourier series):
 - Usually: use damping: $\mu_n \rightarrow \hat{\mu}_n = g_n \mu_n$
 - e.g. Lorentz damping $g_n^L = \frac{\sinh(\lambda(1 - n/N))}{\sinh(\lambda)}$
- **Energy truncation:**
 - Numerical inaccuracies/compression of matrix dimension
→ **diverging recursion series**
 - Existing approach: At every site, build Krylov-subspace of effective DMRG-hamiltonian, diagonalize it and cut off high energies: **Slow; can introduce systematic error**

Example with damping: exactly solvable Resonating Level Model

- Non-interacting orbital, coupled to non-interacting (finite) bath:

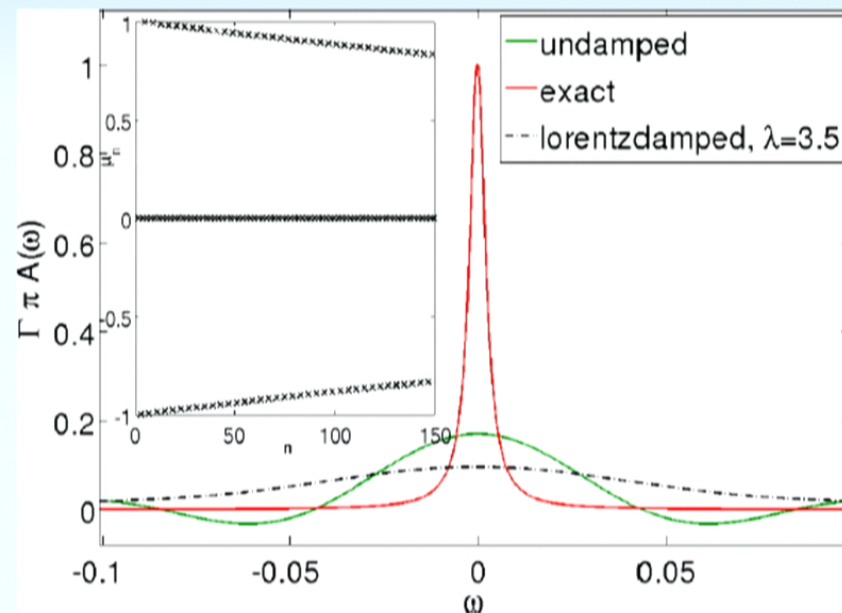
$$H = \epsilon_f n_0 + \sum_k \epsilon_k n_k + V \sum_k (c_0^\dagger c_k + h.c.)$$

- Rectangular hybridization

$$\Gamma = \pi V^2 \rho_0(0) = 0.005$$

→ spectrum has narrow peak

- Lorentz damping ($\lambda = 3.5$) removes oscillations, but **resolution !**



Improving resolution: linear prediction

- For analytic functions $A(\omega)$, moments μ_n *decay exponentially fast*, usually with damped oscillations

Idea: Use linear prediction method to estimate additional moments

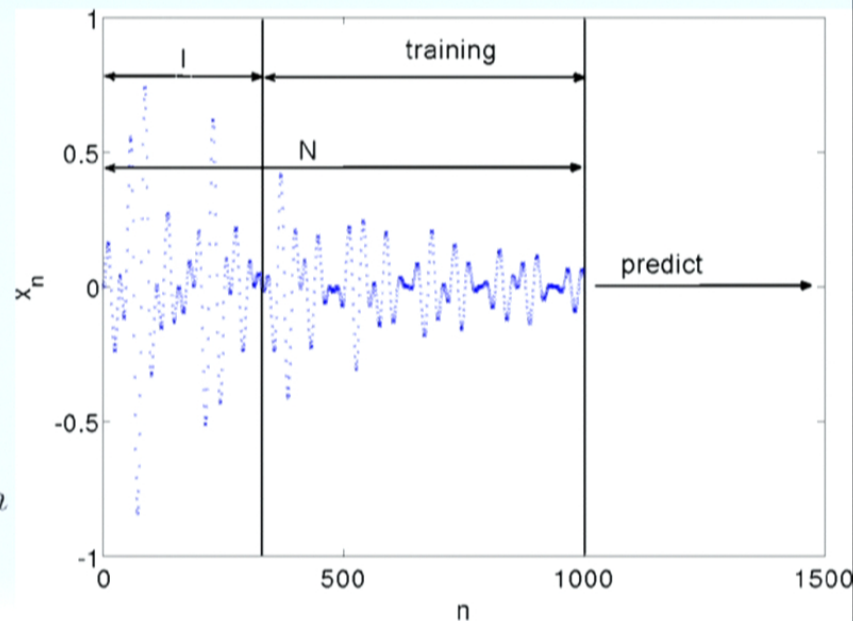
- Given time series $\{x_n\}, n = \{1, 2, \dots, N\}$ make ansatz for x_{N+1} using l previous data points:

$$x_{N+1} = - \sum_{n=0}^{l-1} a_n x_{N-n}$$

- Optimize ansatz on **training** given data points:

$$\min_{a_n} \sum_{n=l}^N (\tilde{x}_n - x_n)^2 \rightarrow a_n$$

$$\tilde{x}_n = - \sum_{i=0}^{l-1} a_i x_{n-i}$$



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- For analytic functions $A(\omega)$, moments μ_n *decay exponentially fast*, usually with damped oscillations

Idea: Use linear prediction method to estimate additional moments

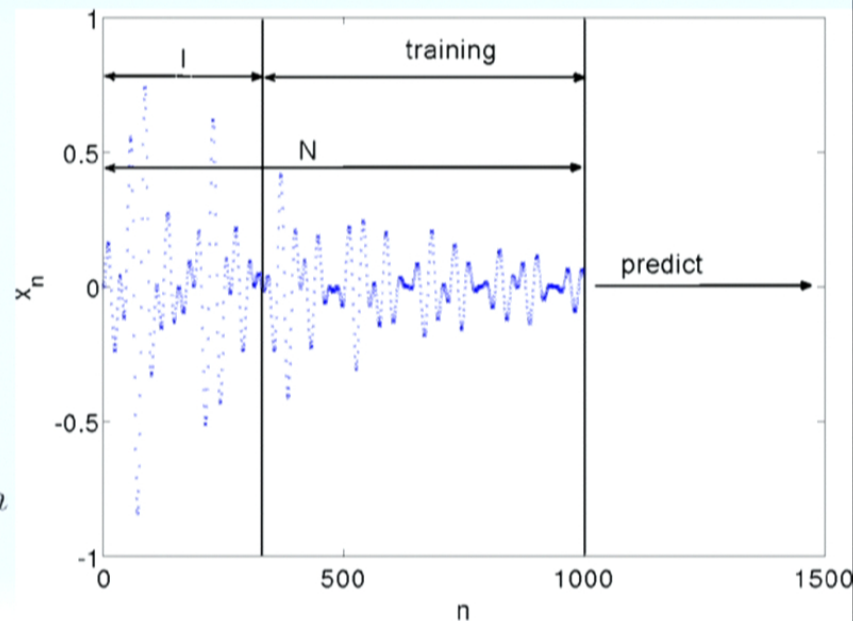
- Given time series $\{x_n\}, n = \{1, 2, \dots, N\}$ make ansatz for x_{N+1} using l previous data points:

$$x_{N+1} = - \sum_{n=0}^{l-1} a_n x_{N-n}$$

- Optimize ansatz on **training** given data points:

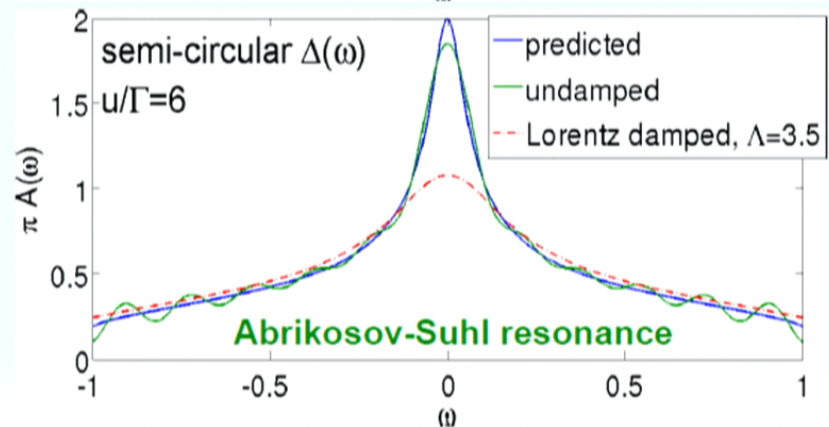
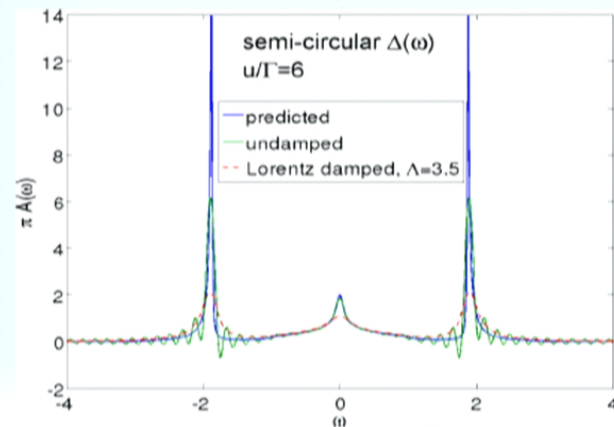
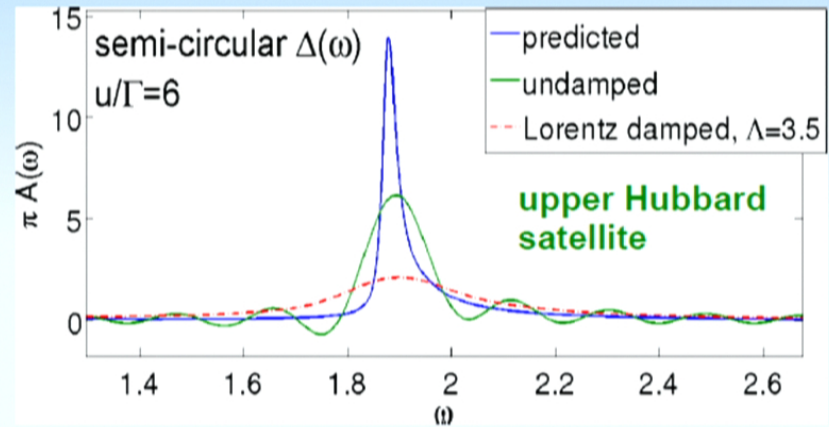
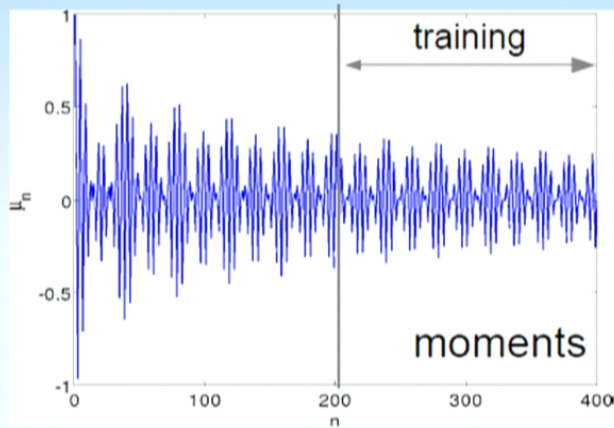
$$\min_{a_n} \sum_{n=l}^N (\tilde{x}_n - x_n)^2 \rightarrow a_n$$

$$\tilde{x}_n = - \sum_{i=0}^{l-1} a_i x_{n-i}$$



Results for the interacting model: SIAM

$\Gamma = \pi V^2 \rho_0(0) = 0.5$, $U = 3$, Chainlength=120 sites, $\chi = 200$,
 $a = 12$, $N_{train} = 200$, 8000 predicted moments, semicircular $\Delta(\omega)$



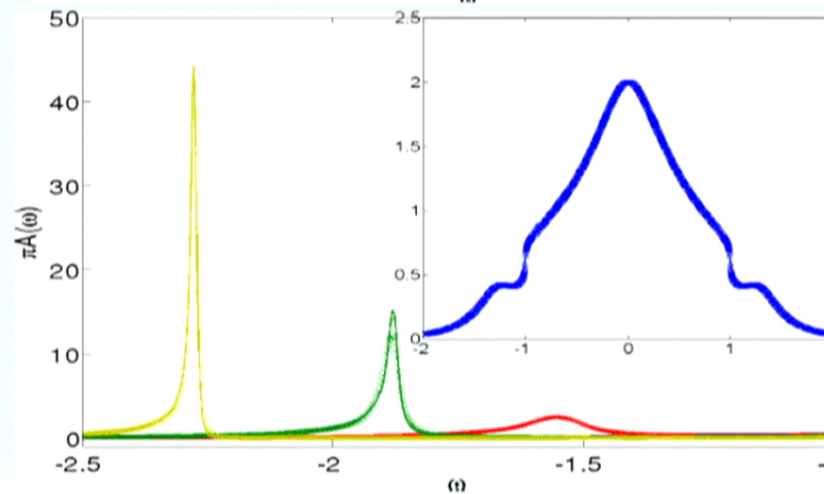
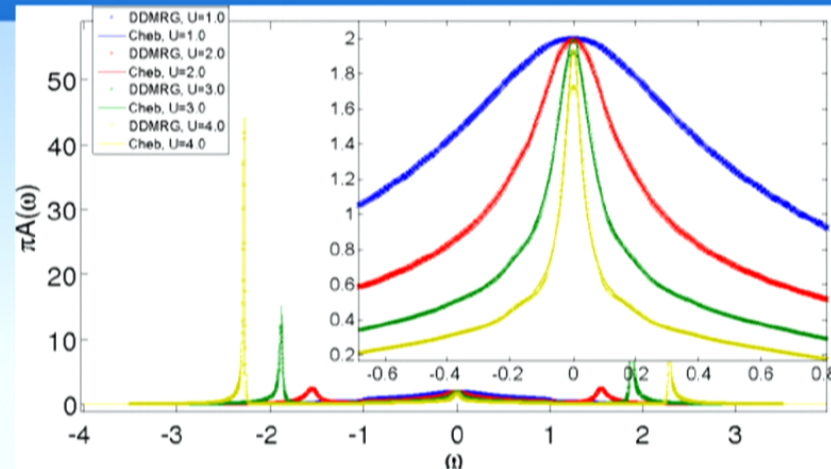
Test of precision for interacting model: Chebyshev-MPS vs DDMRG

$$\Gamma = \pi V^2 \rho_0(0) = 0.5$$

$$U/\Gamma = 2, 4, 6, 8$$

Friedel sum rule better than in DDMRG

Raas, Uhrig, Anders, PRB 69, 041102(R), ('04),
Raas, Uhrig, EPJ B 45 (3), 293 ('05)

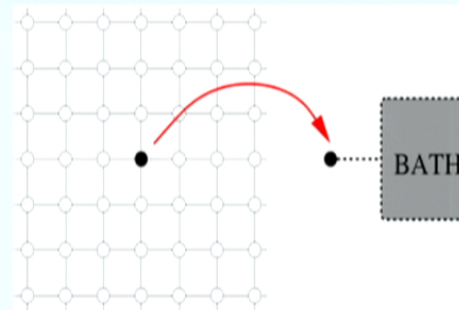


Dynamical Mean-Field theory

- **Goal:** local spectral density $A(\omega)$ of interacting, d-dimensional lattice model
- How? Emulate interacting lattice-influence by suitable, free lattice \rightarrow map to an impurity problem

$$\Delta(\omega) = \sum_{\nu} \frac{|V_{\nu}|^2}{\omega + i\eta - \epsilon_{\nu}}$$

Variational parameters:
hybridization and bath-dispersion



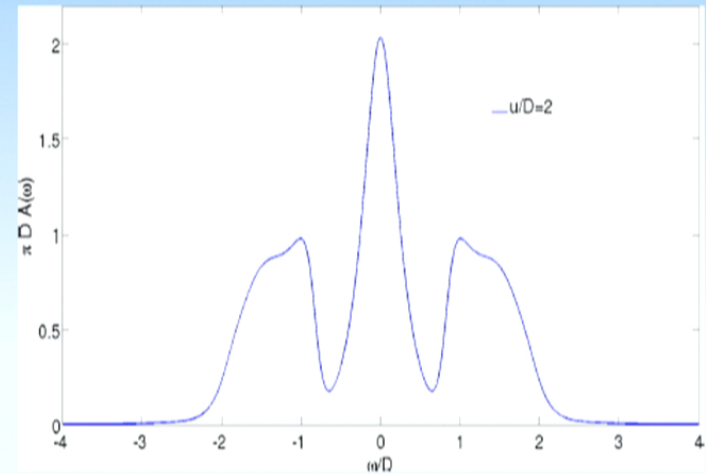
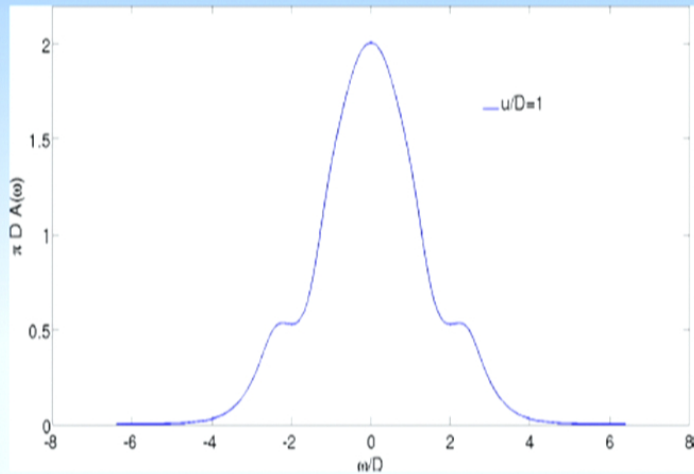
Self-consistency equation

$$G^{lat}(\omega) = \int d\epsilon \frac{\rho(\epsilon)}{\Delta(\omega) + |G^{imp}(\omega)|^{-1} - \epsilon} \stackrel{!}{=} G^{imp}(\omega)$$

DOS of the original, non-interacting lattice

Impurity Greens function

DMFT for **Hubbard model** on Bethe lattice



$\rho(\epsilon)$: semicircular with bandwidth D

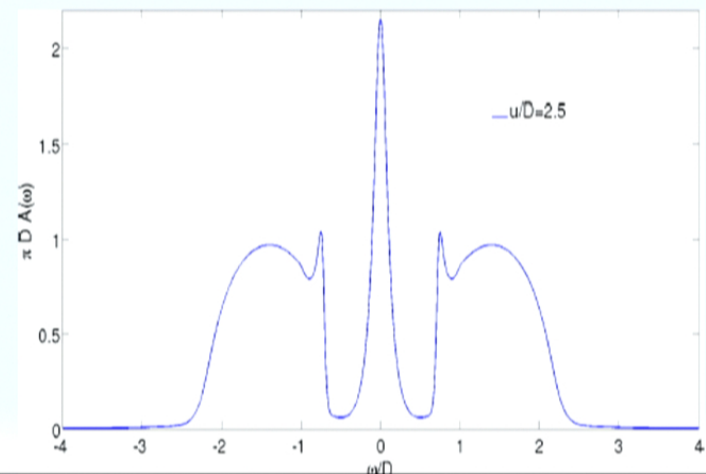
Exact results!

Formation of **quasiparticle peak**

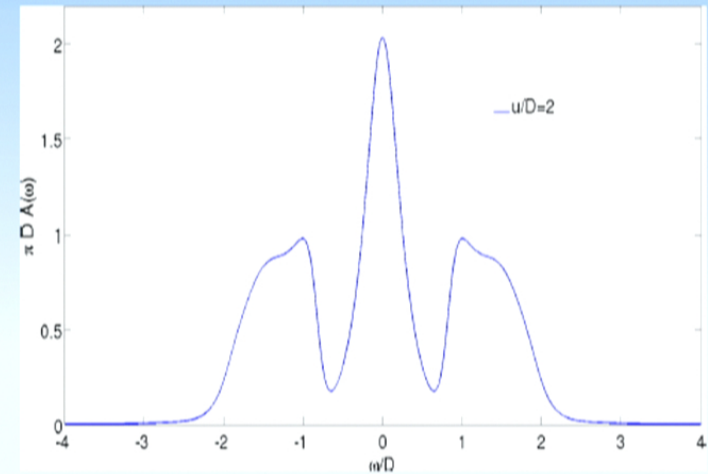
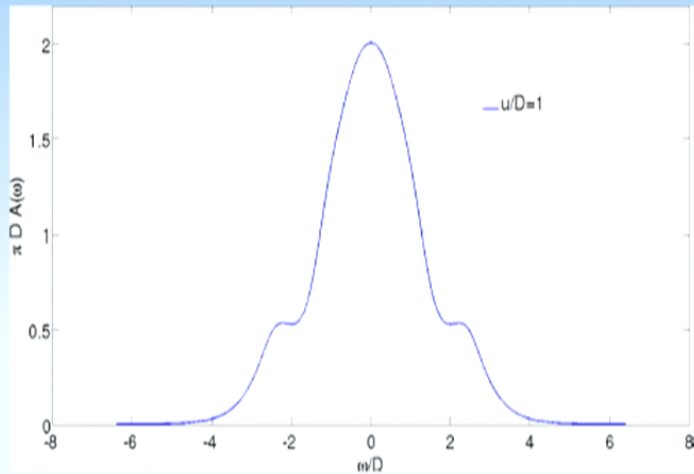
Hubbard satellites

Special feature at inner edges of Hubbard satellites

$U/D=2.8$ **hard to stabilize**



DMFT for **Hubbard model** on Bethe lattice



$\rho(\epsilon)$: semicircular with bandwidth D

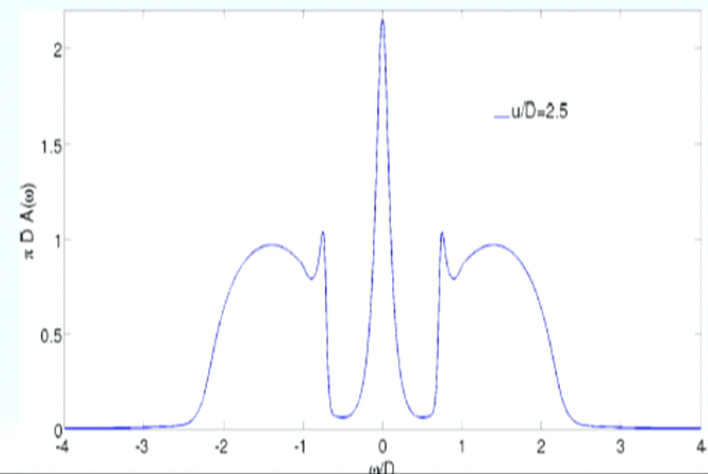
Exact results!

Formation of **quasiparticle peak**

Hubbard satellites

Special feature at inner edges of Hubbard satellites

$U/D=2.8$ **hard to stabilize**



Chebyshev expansion without energy truncation

- **Idea: Use better rescaling function**

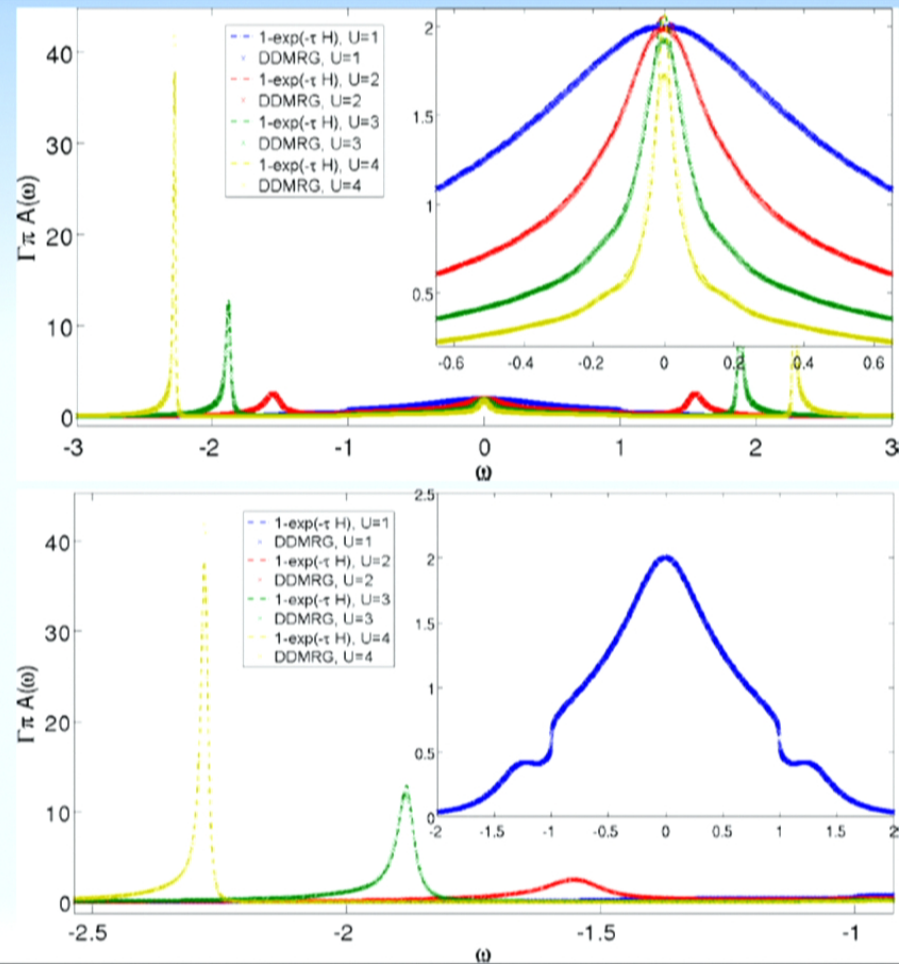
$$\frac{H}{a} \rightarrow \mathbb{1} - \exp(-\tau H)$$

- **Spectrum of $\mathbb{1} - \exp(-\tau H)$ is contained in $[0,1]$**
→ **No energy truncation needed**
- $\exp(-\tau H)$ can be trotterized
→ efficient algorithms available (tDMRG,TEBD,tMPS)
- **Similar resolution**

$\mathbb{1} - \exp(-\tau H)$ Chebyshev vs. DDMRG

$$\Gamma = \pi V^2 \rho_0(0) = 0.5$$

$$U/\Gamma = 2, 4, 6, 8$$



TEBD as DMFT solver

- **Spectral function** in real time:

$$A(t) = \frac{1}{2\pi} (G^>(t) + G^<(t))$$

•

compute $G^<(t) \equiv \langle 0 | c^\dagger e^{iHt} c | 0 \rangle$ $G^>(t) \equiv \langle 0 | c e^{-iHt} c^\dagger | 0 \rangle$

$$G^>(t) = (G^<(t))^* = G^<(-t)$$

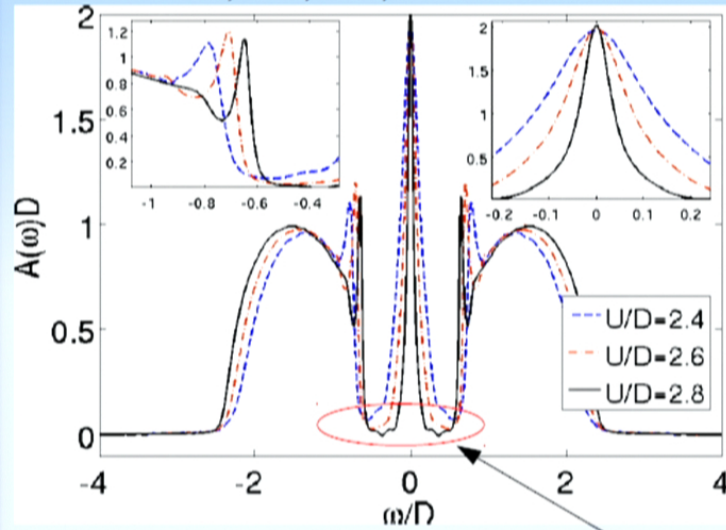
particle-hole symmetry: hermiticity

Fourier-transform $\rightarrow A(\omega)$

Use **linear prediction** to improve resolution

TEBD as DMFT solver

U/D=2.4,2.6,2.8, N=150 sites

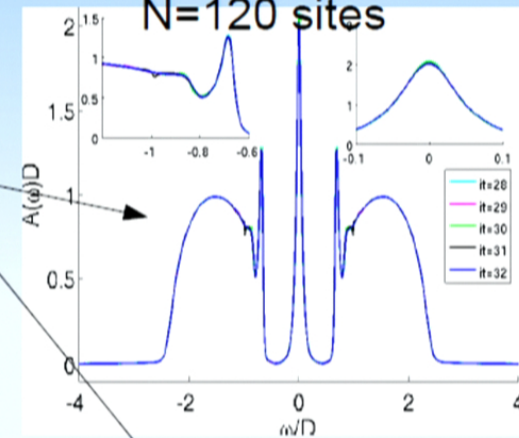


Very fast! Single spectrum $\sim \frac{1}{2} h$

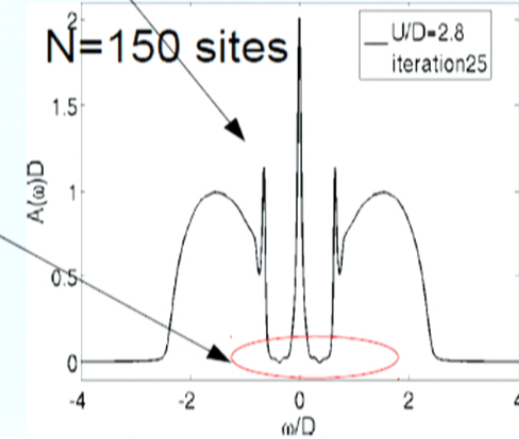
Wiggles: artifacts!

U/D=2.8

N=120 sites



N=150 sites



Conclusions

- Dynamics of many-body quantum systems with Matrix Product States
- Quenches in the XXZ model:
 - Spinon propagation, 2 and 3 string propagation
 - Robust against perturbations
 - Realized in experiment (Nature 502, 76-79 (2013))
- Solitonic excitations in lattice models:
 - New, unexpected physics
 - Role of integrability
 - Cold atoms?
- Greens functions using Chebyshev expansions:
 - Promising alternative to DDMRG
 - Extensions: linear prediction
 - Alternative expansion using exponentials
 - Real time methods are promising impurity solvers!
- Quantum transport through interacting quantum dot