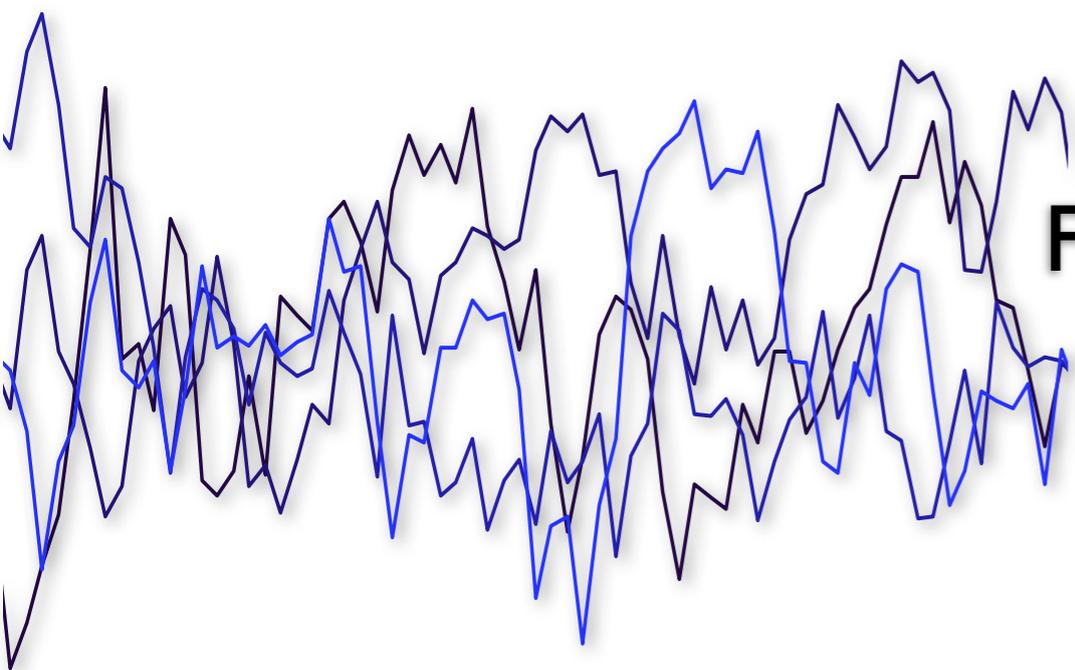


# **Gaussian Quantum Monte Carlo Method for Fermions with symmetry projection**



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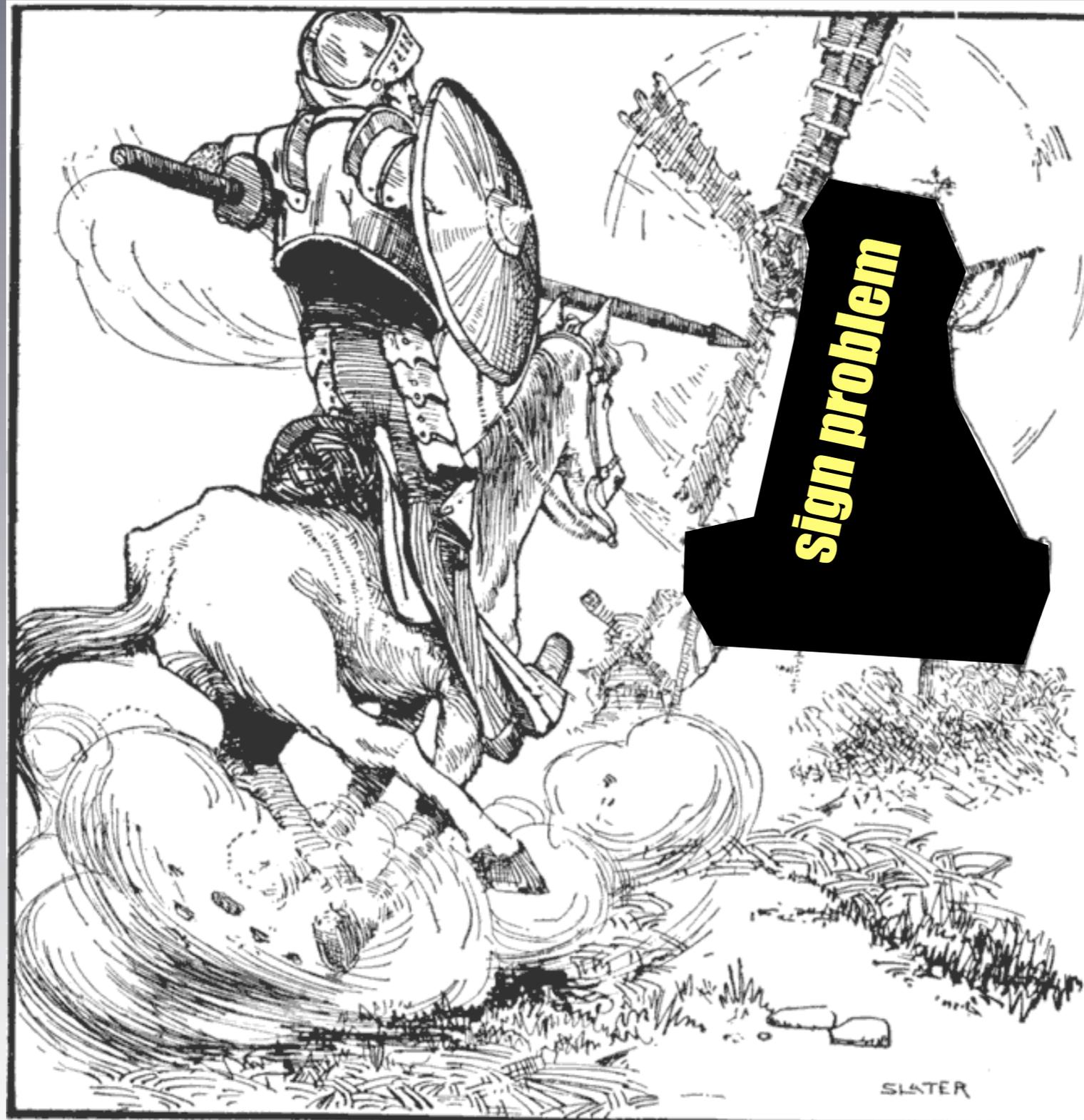
**Adrian Kleine**, RWTH Aachen, Germany

**Matthias Troyer**, ITP, ETH Zurich, Switzerland

**Joel Corney and Peter Drummond**, PRL 93, 260401 (2004)

**F.F. Assaad et al.**, PRB 72, 224518 (2005)

# Attack the sign problem



# Outline

- The idea of GQMC in short
- The Gaussian basis
- Derivation of stochastic differential equations (SDEs)
- Systematic errors: source and possible solutions
- Symmetry projection scheme
- Application: Hubbard ladders
- Conclusion

# GQMC: A stochastic phase space method

Expansion of the density operator in a Gaussian operator basis:

$$\hat{\rho}(\tau) = \int d\underline{\lambda} P(\underline{\lambda}, \tau) \hat{\Lambda}(\underline{\lambda})$$

Inverse temperature  $\tau$  (green arrow pointing to  $\tau$ )  
Phase space variables  $\underline{\lambda}$  (green arrow pointing to  $\underline{\lambda}$ )  
Density operator  $\hat{\rho}$  (red arrow pointing to  $\hat{\rho}$ )  
Probability distribution  $P$  (green arrow pointing to  $P$ )  
Gaussian operator basis  $\hat{\Lambda}$  (red arrow pointing to  $\hat{\Lambda}$ )

**SDE**  
integration

Stochastic  
Differential  
Equations

Trajectories  $\underline{\lambda}(\tau)$  in phase space with positive weights

**Observables:** Functions of phase space variables  $F(\underline{\lambda})$

**Expectation values:** Weighted averages over trajectories

# Gaussian operator basis

**Basis:**  $\hat{\Lambda}(\mathbf{n}) = \det(\mathbf{1} - \mathbf{n}) : e^{-\hat{c}^\dagger (\mathbf{2} + (\mathbf{n}^T - \mathbf{1})^{-1}) \hat{c}} :$

$\mathbf{n}$  is a  $N \times N$  matrix of phase space variables  
 $N$ : number of sites

**Trace:**  $\text{Tr} \left[ \hat{c}_x^\dagger \hat{c}_y \hat{\Lambda}(\mathbf{n}) \right] = n_{x,y}$

$\mathbf{n}$  correspond to the equal time Green functions

**Expansion:**  $\hat{\rho}(\tau) = \sum_i P_i(\tau) \hat{\Lambda}(\mathbf{n}_i), \quad P_i \geq 0$

Positive expansion exists  
Basis is overcomplete!

**Introducing weight:**  $\hat{\Lambda}(\underline{\lambda}) = \Omega \hat{\Lambda}(\mathbf{n}), \quad \underline{\lambda} = (\Omega, \mathbf{n})$

**Integral form:**  $\hat{\rho}(\tau) = \int d\underline{\lambda} P(\underline{\lambda}, \tau) \hat{\Lambda}(\underline{\lambda})$

# Derivation of the SDEs

$$\frac{d}{d\tau} \hat{\rho}(\tau) = -\frac{1}{2} \left[ \hat{H}, \hat{\rho}(\tau) \right]_+$$

Introduce expansion

Differential properties  
 $\hat{c}^{\dagger T} \hat{c}^T \hat{\Lambda} = \mathbf{n} \hat{\Lambda} + (1 - \mathbf{n}) \frac{\partial \hat{\Lambda}}{\partial \mathbf{n}} \mathbf{n}$

$$\frac{d}{d\tau} \int d\underline{\lambda} P(\underline{\lambda}, \tau) \hat{\Lambda}(\underline{\lambda}) = -\frac{1}{2} \int d\underline{\lambda} P(\underline{\lambda}, \tau) \left( \hat{H} \hat{\Lambda}(\underline{\lambda}) + \hat{\Lambda}(\underline{\lambda}) \hat{H} \right)$$

$$\int d\underline{\lambda} \frac{d}{d\tau} P(\underline{\lambda}, \tau) \hat{\Lambda}(\underline{\lambda}) = \int d\underline{\lambda} P(\underline{\lambda}, \tau) L[\hat{\Lambda}(\underline{\lambda})]$$

Contains first and second order derivatives.

Partial integration

$$\int d\underline{\lambda} \frac{d}{d\tau} P(\underline{\lambda}, \tau) \hat{\Lambda}(\underline{\lambda}) = \int d\underline{\lambda} L'[P(\underline{\lambda}, \tau)] \hat{\Lambda}(\underline{\lambda})$$

Assume no boundary terms!

Compare both integrands

$$\frac{d}{d\tau} P(\underline{\lambda}, \tau) = L'[P(\underline{\lambda}, \tau)] \rightarrow \text{Fokker-Planck equation}$$

# Derivation of the SDEs

Fokker-Planck eq:  $\frac{d}{d\tau} P(\underline{\lambda}, \tau) = L' [P(\underline{\lambda}, \tau)]$

$$L' = - \sum_{\alpha} \frac{\partial}{\partial \lambda_{\alpha}} A_{\alpha} + \frac{1}{2} \sum_{\alpha \beta z} \frac{\partial}{\partial \lambda_{\alpha}} B_{\alpha}^z \frac{\partial}{\partial \lambda_{\beta}} B_{\beta}^z$$

**SDE:**  $d\lambda_{\alpha}(\tau) = A_{\alpha}(\underline{\lambda})d\tau + \sum_k B_{\alpha}^k(\underline{\lambda})dW_k(\tau)$   
 (Stratonovich)

Drift term
Diffusion term

Noise terms (Wiener increments) drawn from normal distribution

$$\langle dW_k(\tau) dW_{k'}(\tau') \rangle = d\tau \delta_{kk'} \delta_{\tau\tau'}$$

$$\langle dW_k(\tau) \rangle = 0$$

Integration: Forward Euler, (semi-) implicit, higher order schemes

SDEs are not unique! There are several “gauge” choices.

- $\hat{n}_{i\sigma}^2 - \hat{n}_{i\sigma} = 0$
- Does not change the Hamiltonian. But changes the SDE!
  - Crucial trick for Hubbard model to get positive weights!

**➔ No explicit manifestation of the negative sign problem!**

# Example: Hubbard model

$$\hat{H}_{\text{Hub}} = -t \sum_{\langle i,j \rangle, \sigma} \hat{n}_{ij\sigma} + U \sum_i \hat{n}_{ii\uparrow} \hat{n}_{ii\downarrow} - \mu \sum_{i,\sigma} \hat{n}_{ii\sigma}$$



Final form of the SDEs:  $2N^2+1$  coupled equations:

$$\frac{d\mathbf{n}_\sigma}{d\tau} = \frac{1}{2} \{ (\mathbf{I} - \mathbf{n}_\sigma) \Delta_\sigma^{(1)} \mathbf{n}_\sigma + \mathbf{n}_\sigma \Delta_\sigma^{(2)} (\mathbf{I} - \mathbf{n}_\sigma) \}$$

$$\Delta_\sigma^{(r)}{}_{ij\sigma} = t_{ij} - \delta_{ij} \{ U n_{jj-\sigma} - \mu + f \xi_j^{(r)} \}$$

full matrix-matrix multiplication

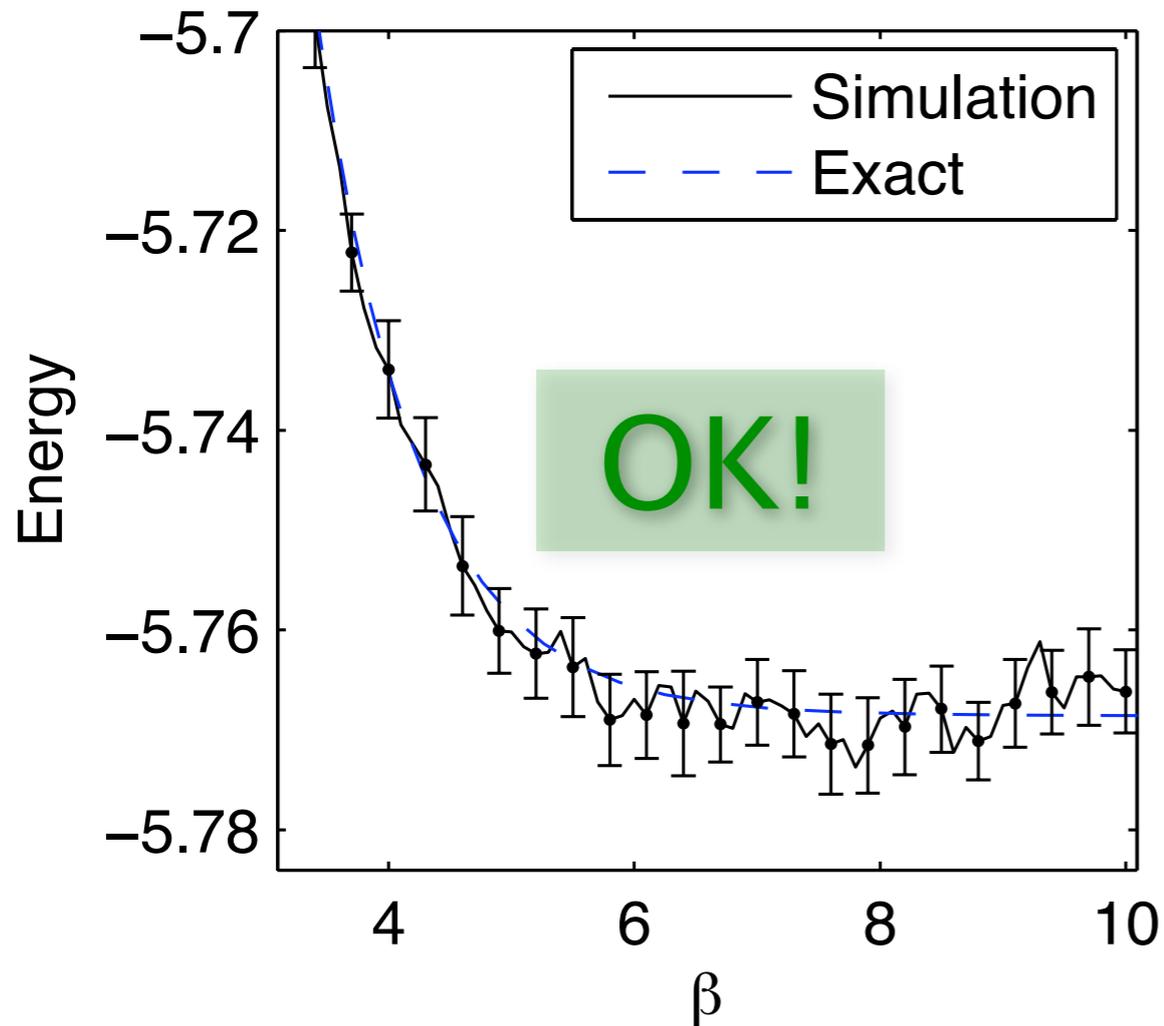
$$f = -\text{sign}(U) \text{ for } \sigma = \downarrow$$

$$\frac{d\Omega}{d\tau} = -\Omega H(\mathbf{n}_\uparrow, \mathbf{n}_\downarrow)$$

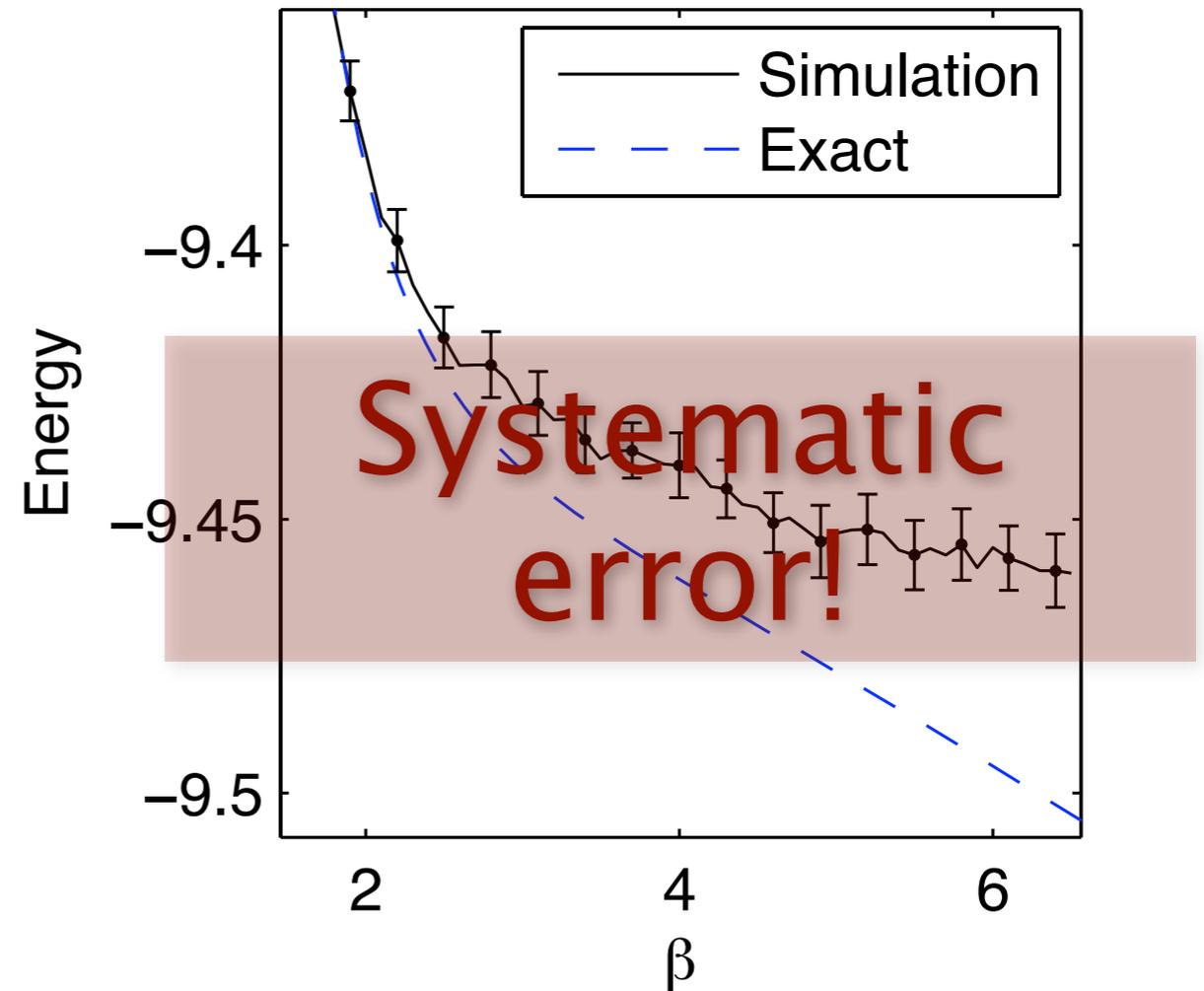
$$\langle \xi_j^{(r)}(\tau) \xi_{j'}^{(r')}(\tau') \rangle = 2|U| \delta(\tau - \tau') \delta_{jj'} \delta_{rr'}$$

Weight grows exponentially,  
but remains positive

# Results for Hubbard model



2x2 system,  $U=1$ ,  $t=1$ ,  $\langle n \rangle = 0.5$ ,  
40'000 trajectories



2x2 system,  $U=4$ ,  $t=1$ ,  
 $\langle n \rangle = 0.875$ , 480000 trajectories

Use higher order  
integrator

Use different  
quantization axis

additional noise

Change integration  
timestep

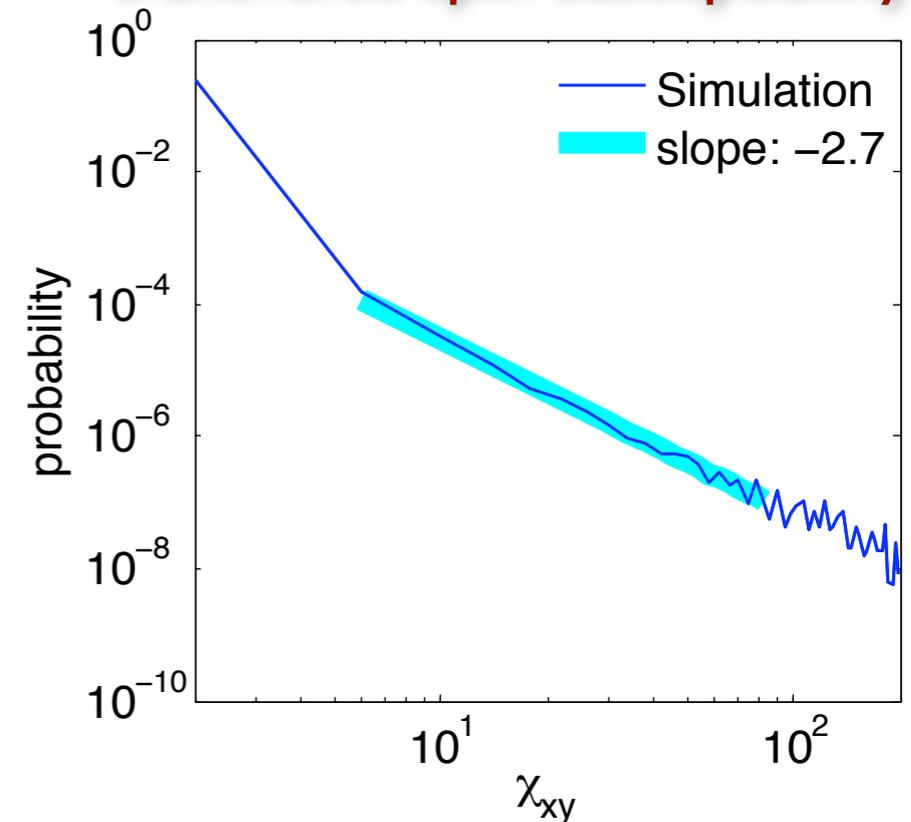
more trajectories

# Fat tailed distributions

Some Monte Carlo measurements seem to be ill defined (diverging error bars).

➔ Fat tailed distributions can become a problem in derivation of SDE's: **Boundary Terms!**

Diverging variance of the transverse spin susceptibility



**Go back to derivation:** **Fat power law tails!**

$$\int d\underline{\lambda} \frac{d}{d\tau} P(\underline{\lambda}, \tau) \hat{\Lambda}(\underline{\lambda}) = \int d\underline{\lambda} P(\underline{\lambda}, \tau) L[\hat{\Lambda}(\underline{\lambda})]$$

Partial integration

$$\int d\underline{\lambda} \frac{d}{d\tau} P(\underline{\lambda}, \tau) \hat{\Lambda}(\underline{\lambda}) = \int d\underline{\lambda} L'[P(\underline{\lambda}, \tau)] \hat{\Lambda}(\underline{\lambda})$$

**+ boundary terms**

➔ **Assumption is wrong!**  
➔ **SDE's are no longer valid!!!!**

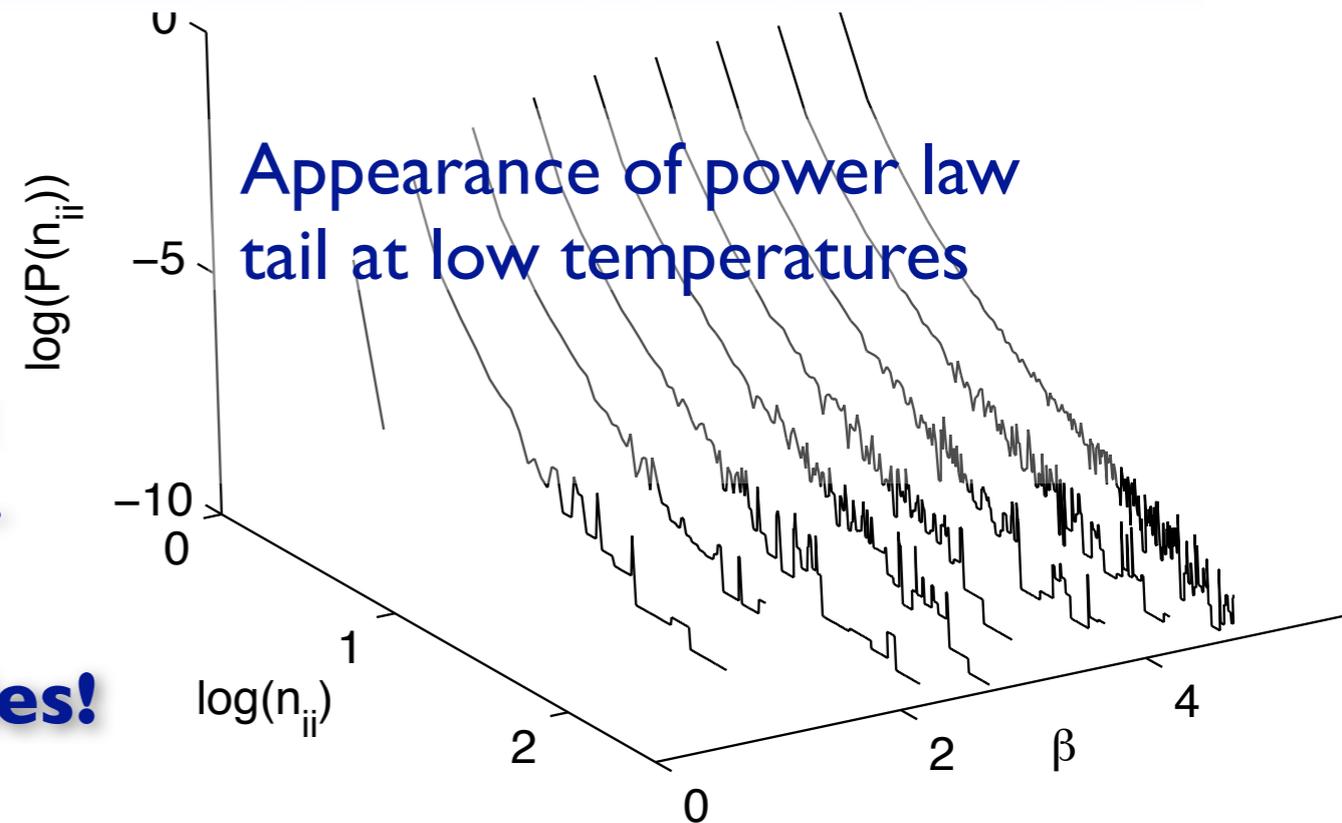
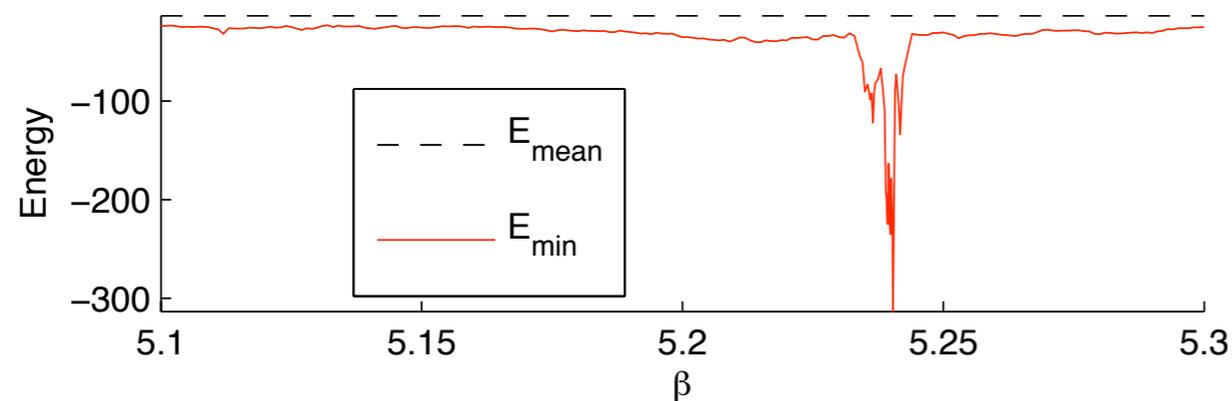
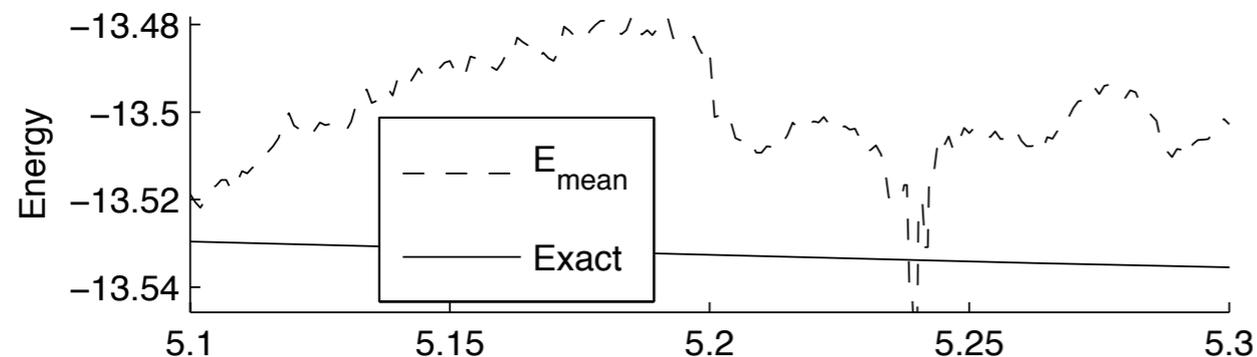
# Boundary terms

This is a known problem!

Gilchrist, Gardiner and Drummond,  
PRA, 55(4), 3014, 1997:

Boundary terms found in some examples:  
single-mode laser, anharmonic oscillator, ...

Another indicator: **spiking trajectories!**



- ➡ presence of nearly singular trajectories
- ➡ indicator, when boundary terms become non-negligible
- ➡ **Consistency**: systematic errors appear only after a certain  $\beta$ .

# Possible solutions

- The SDE's are not unique: Use gauges to change distribution P!
  - ▶ “Fermi” gauges (like  $\hat{n}_{ii\sigma}^2 - \hat{n}_{ii\sigma} = 0$ )
  - ▶ Additional noise terms (diffusion gauge)
  - ▶ Arbitrary drift functions (drift gauges)

$$d\lambda_\alpha(\tau) = A_\alpha d\tau + \sum_k B_\alpha^k [dW_k(\tau) - g_k d\tau]$$

$$d\Omega(\tau) = A_0 d\tau + \Omega g_k dW_k(\tau)$$

BUT AT THE SAME TIME  
WEIGHTS HAVE TO  
REMAIN POSITIVE!!!

- ▶ Change basis

➔ **work in progress**

- In case of small systematic errors, use a **symmetry projection** scheme to calculate ground state properties

Assaad et al., PRB 72, 224518 (2005)

# Symmetry breaking

- The SU(2) spin symmetry is not preserved in the cases with systematic errors

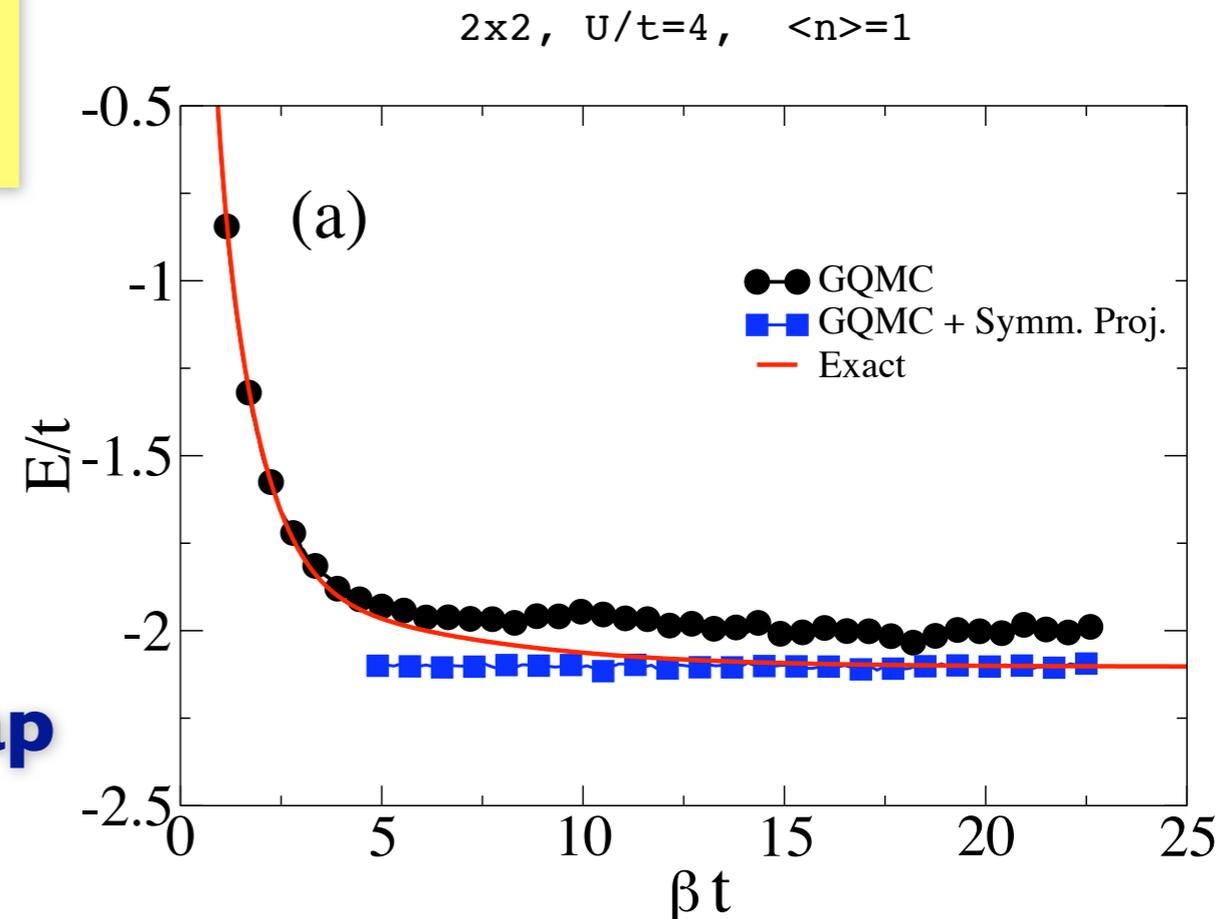
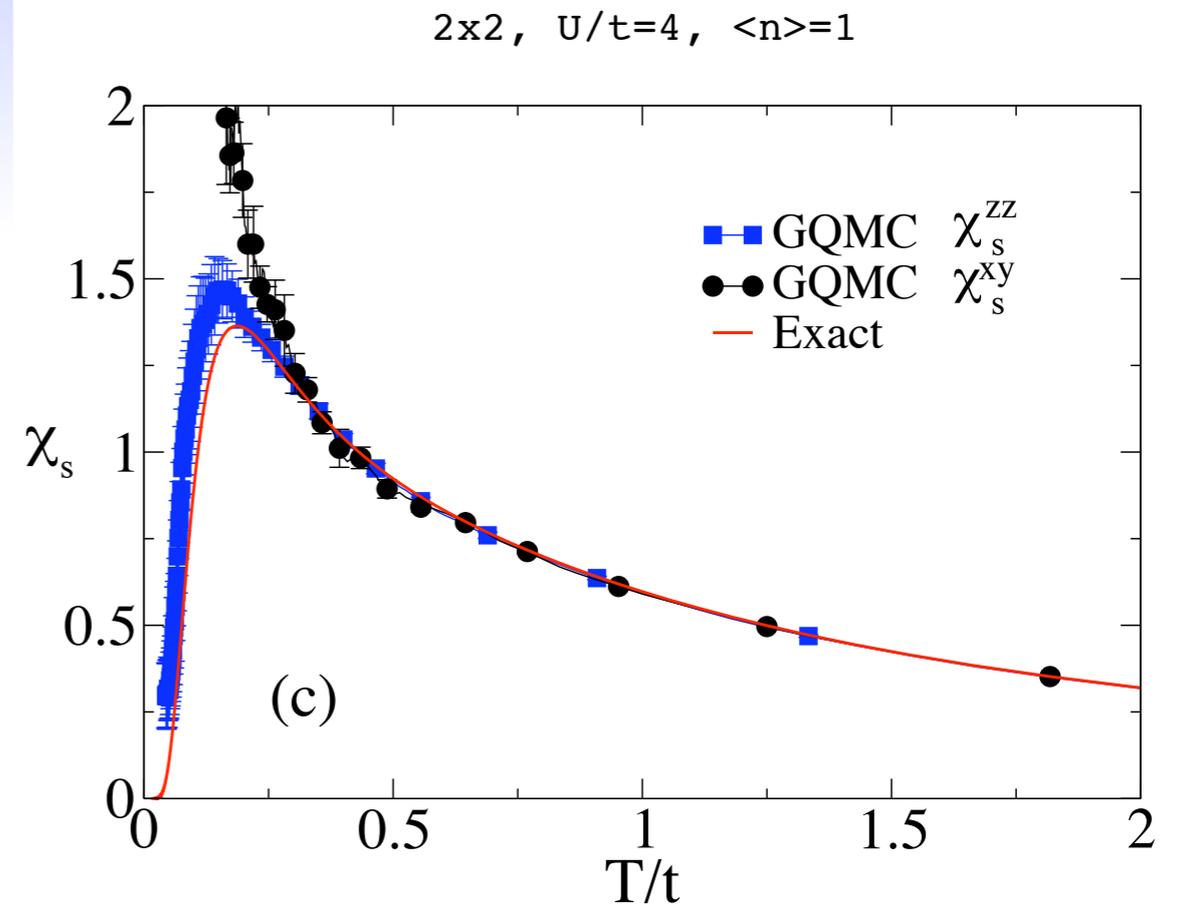
**Idea:** Take density matrix from simulation and project it onto the ground state symmetry sector.

Mizusaki, Imada, Phys. Rev. B 69, 125110 (2004)

PGQMC

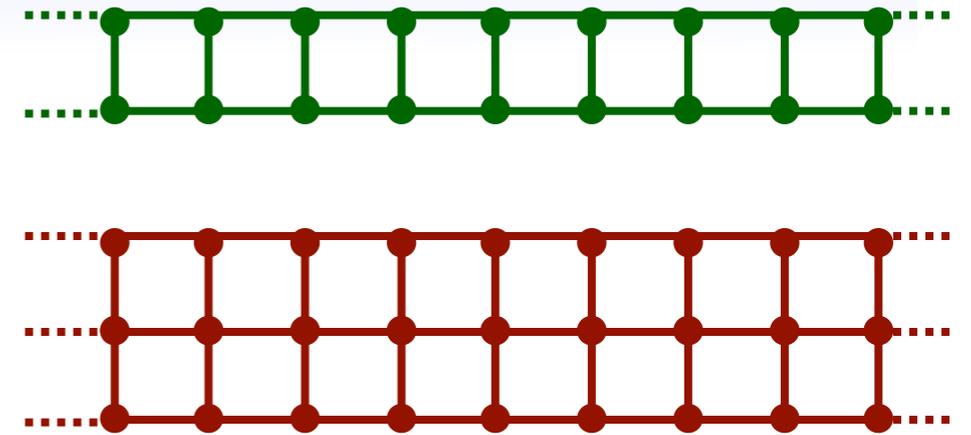
$$\hat{\rho}_{Pr} = \hat{P} \hat{\rho}_{sim} \hat{P}^\dagger$$

- ▶ Ground state properties (not finite temperature)
- ▶ Projection is done a posteriori
- ▶ Good agreement in many cases
- ▶  $Tr \hat{\rho}_{Pr} / Tr \hat{\rho}_{sim}$  measures the **overlap** between density matrix and ground state sector

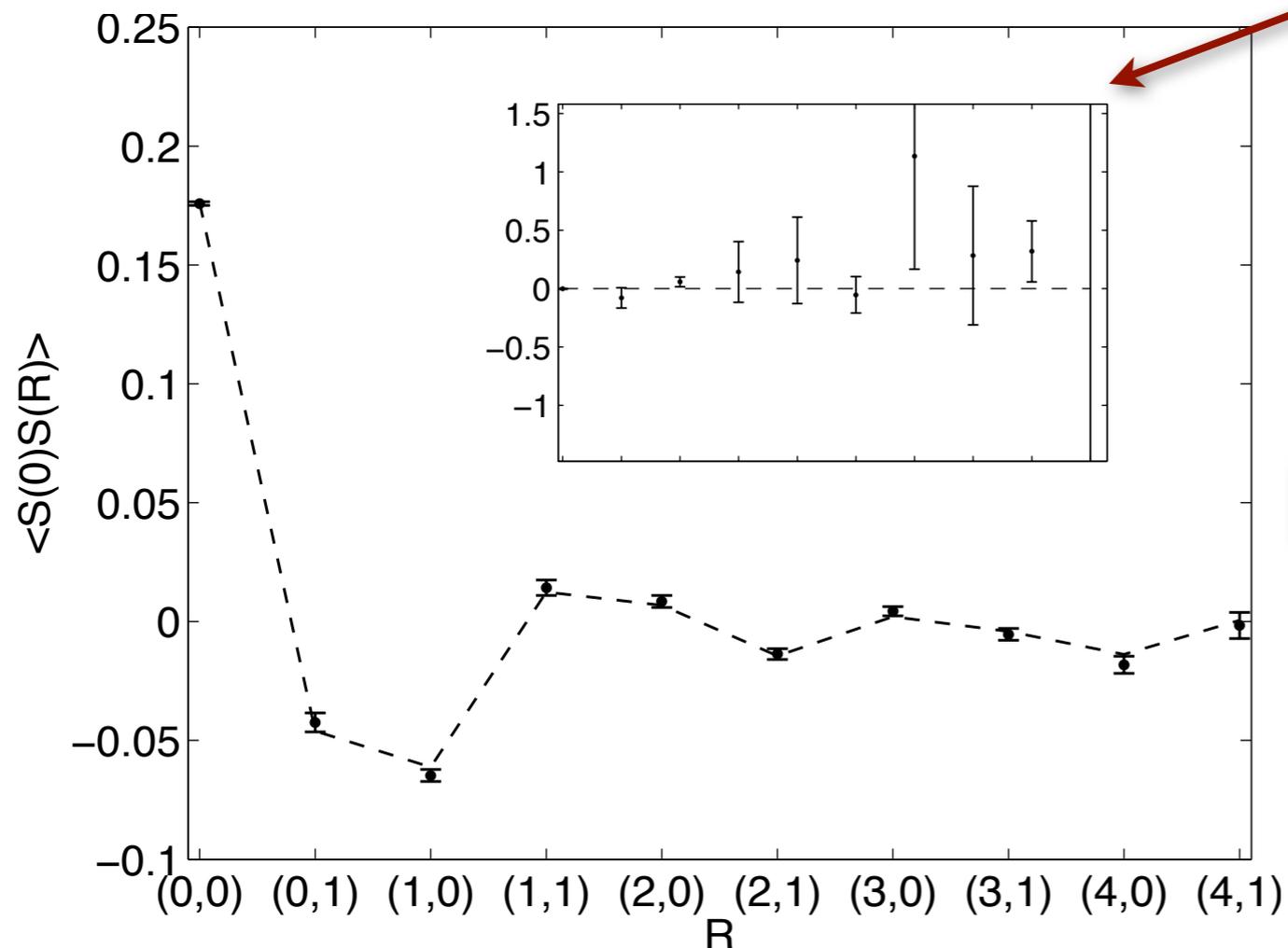


# Results: Hubbard ladders

- Simulation of 2xL and 3xL Hubbard ladders with different fillings  $n$ , interaction  $U$
- Comparison of GQMC and PGQMC to Density Matrix Renormalization Group (DMRG) results (high precision)



8x2,  $U/t=4$ ,  $n_{\text{tot}}=14$ , PGQMC



Inset: Relative errors  
One standard deviation ( $\sigma$ )  
error bars. Exact result  
should be within  $2\sigma$

**Results agree  
with DMRG**

# Conclusion

- Once more: the sign problem is **not solved** (yet).
- GQMC is an elegant finite temperature method for fermions. Further application examples are needed!
- Systematic errors in GQMC in SOME cases. But we have **indicators** for their presence: fat tailed distributions, spiking trajectories, broken symmetries...
- Fat tails may disappear with appropriate choice of **gauges**.
- Symmetry projection allows to obtain ground state properties. In many cases it corrects the systematic errors of GQMC. There are examples, where we could go beyond auxiliary field QMC!

# Outlook: Recent news

- Projection method can be incorporated into the sampling.  
Aimi and Imada, cond-mat/0704.3792
- Importance sampling (Metropolis algorithm) which favors the ground state symmetry sector
- Better results than with projection a posteriori. Promising!
- Projected weights can become negative. Sign problem? For doped systems with large  $U$  ( $>8$ ).
- Work in progress!