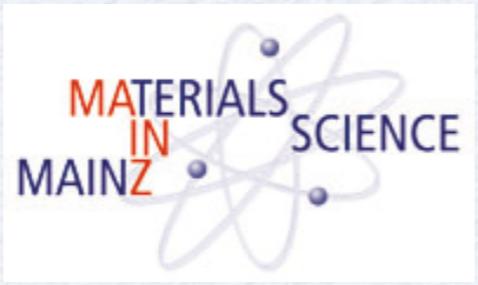


JOHANNES GUTENBERG
UNIVERSITÄT MAINZ



Quantum interacting particles on a ring: binary Tree Tensor Networks studies

Matteo Rizzi

Johannes Gutenberg-Universität Mainz

Benasque - 19.02.2016

OUTLINE

- Motivation: why periodic boundaries?
- Tree Tensor Networks & adaptive gauge picture
- Some benchmark data
- Disordered Bose-Hubbard model
- Summary & Future perspectives

Periodic Boundaries: numerical tool

- generally easier for analytical treatments
(Fourier transform & co.)

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- avoid undesired edge effects in observables
(e.g., better and longer reliable correlations)
- faster and cleaner scaling to thermodynamic limit
(useful to study phase transitions) Fisher, Barber, PRL **28**, 1516 (1972)

Periodic Boundaries: numerical tool

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(Fourier transform & co.)
- avoid undesired edge effects in observables
(e.g., better and longer reliable correlations)
- faster and cleaner scaling to thermodynamic limit
(useful to study phase transitions) Fisher, Barber, PRL **28**, 1516 (1972)
- access phase stiffnesses and topological invariants
via twisting the boundaries $\Psi(0) = e^{i\phi}\Psi(L)$

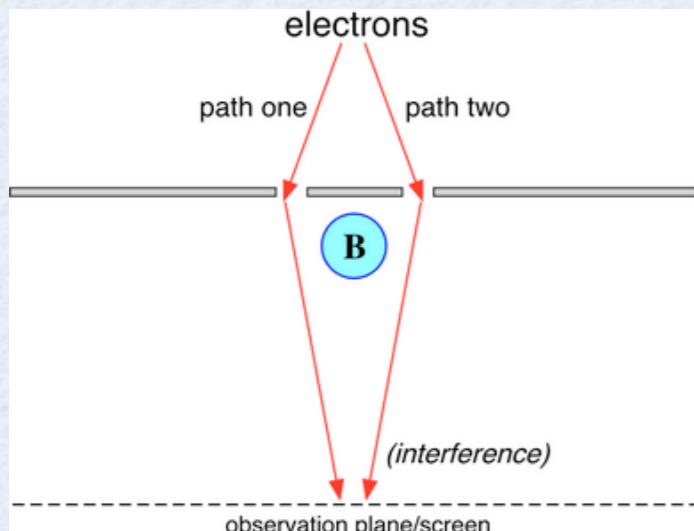
$$I \propto \partial E / \partial \phi \quad \rho_s \propto \partial^2 E / \partial \phi^2 \quad \phi_{\text{Zak}} = \int_{-\pi}^{\pi} \langle \Psi | \partial_\phi | \Psi \rangle$$

Periodic Boundaries: physical consequences

- In a doubly-connected system, pierced by a flux Φ , all quantities are periodic in the flux by a period $\Phi_0 = h/q$ (q = effective particle charge)

Byers, Yang, PRL 7, 46 (1961)

- AHARANOV-BOHM EFFECT



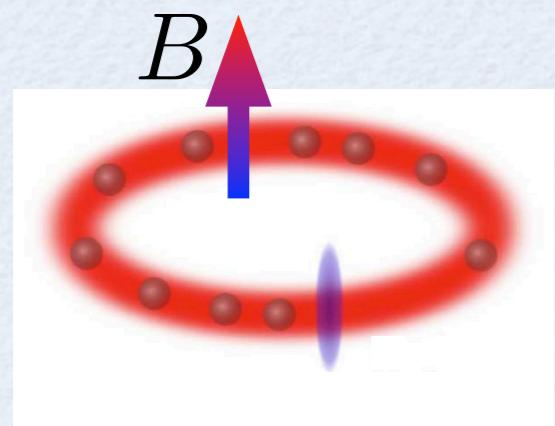
$$\vec{\nabla} \times \vec{A} = \vec{B} \quad \Phi = \oint \vec{A} \cdot d\vec{l}$$
$$\vec{p} \longrightarrow \vec{p} - q\vec{A} \quad \rightarrow \quad \phi_{L/R} = \int_{L/R} \frac{q\vec{A}}{\hbar} \cdot d\vec{l}$$
$$\boxed{\phi = \phi_L - \phi_R = 2\pi\Phi/\Phi_0}$$

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- PERSISTENT CURRENTS



$$\frac{dF}{dt} = IV \quad V = -\frac{\partial \Phi}{\partial t}$$
$$\frac{dF}{dt} = \frac{\partial F}{\partial \Phi} \frac{\partial \Phi}{\partial t}$$



Bloch, PRB 2, 109 (1970)

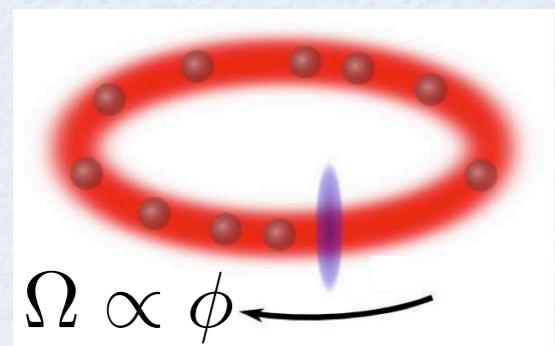
$$I(\phi) = -\frac{q}{\hbar} \frac{\partial F(\phi)}{\partial \phi}$$

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Periodic Boundaries: physical systems

- bulk superconductors

B. S. Deaver and W. M. Fairbank, *PRL* 7, 43 (1961)

N. Byers and C. N. Yang, *PRL* 7, 46 (1961)

L. Onsager, *PRL* 7, 50 (1961)

- normal metallic rings

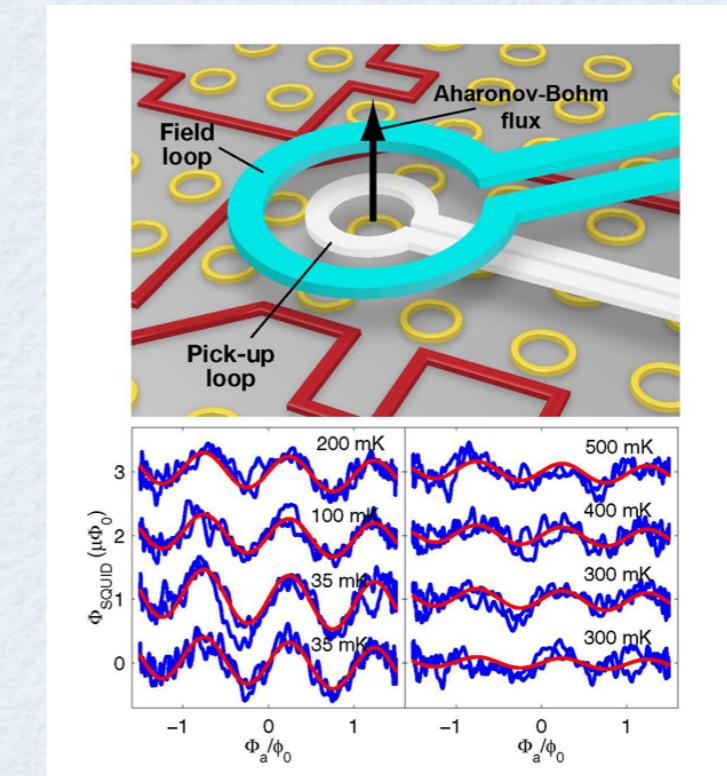
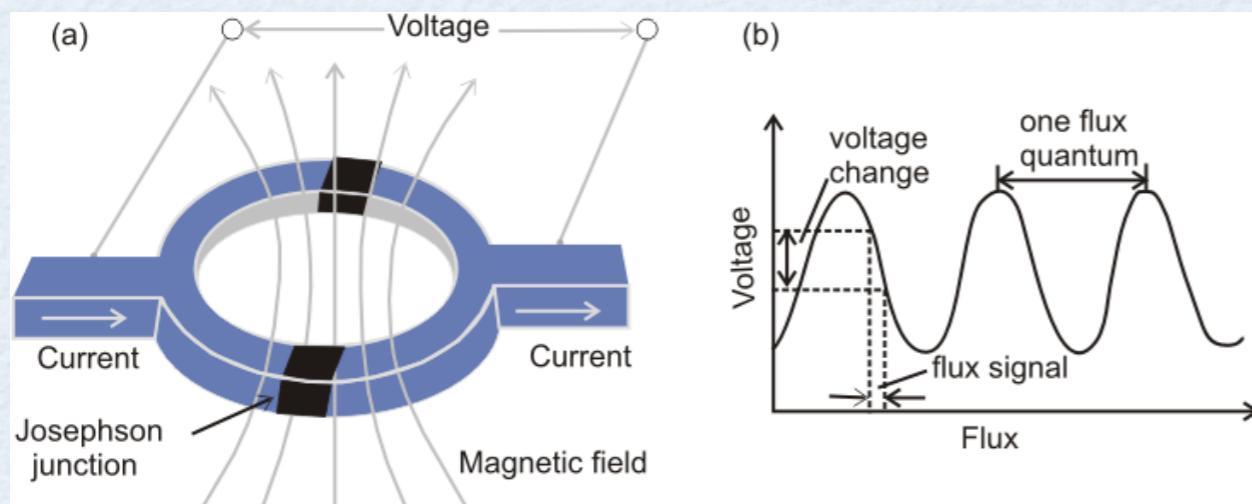
L. P. Levy, et al., *PRL* 64, 2074 (1990)

D. Mailly, et al., *PRL* 70, 2020 (1993)

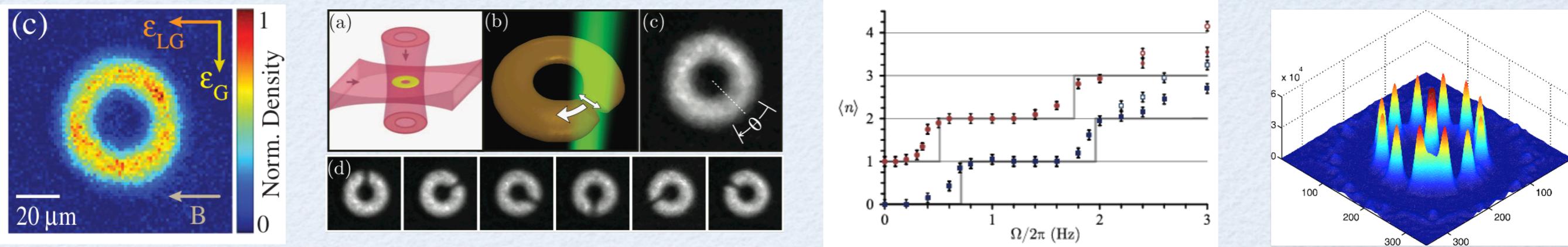
H. Bluhm et al., *PRL* 102, 136802 (2009)

A. C. Bleszynski-Jayich, et al., *Science* 326, 272 (2009)

- SQUID = superconducting quantum interference device



Periodic Boundaries: physical systems

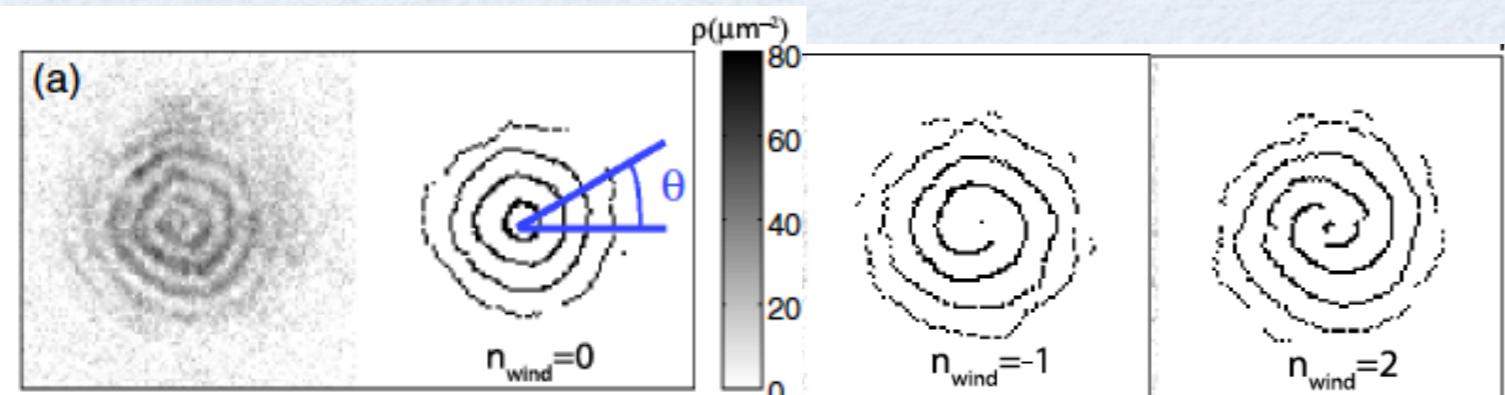


Ramanathan et al., PRL 106, 130401 (2011); Wright et al., PRL 110, 025302 (2013);
 Moulder et al., PRA 86, 013629 (2012); Beattie, et al., PRL 110, 025301 (2013);
 C. Ryu, et al., PRL 111, 205301 (2013); and many more

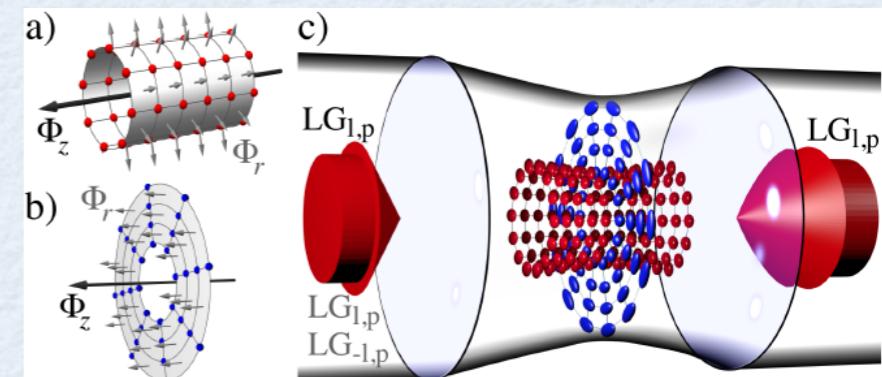
Amico et al.,
 Sci. Rep. 4, 4298 (2014)

- persistent currents flowing > 2 mins !
- diverse starting & measuring protocols
- multi-species setups (i.e., spin currents)

- ★ long coherence qubits
- ★ precise interferometry
- ★ fractional QHE states

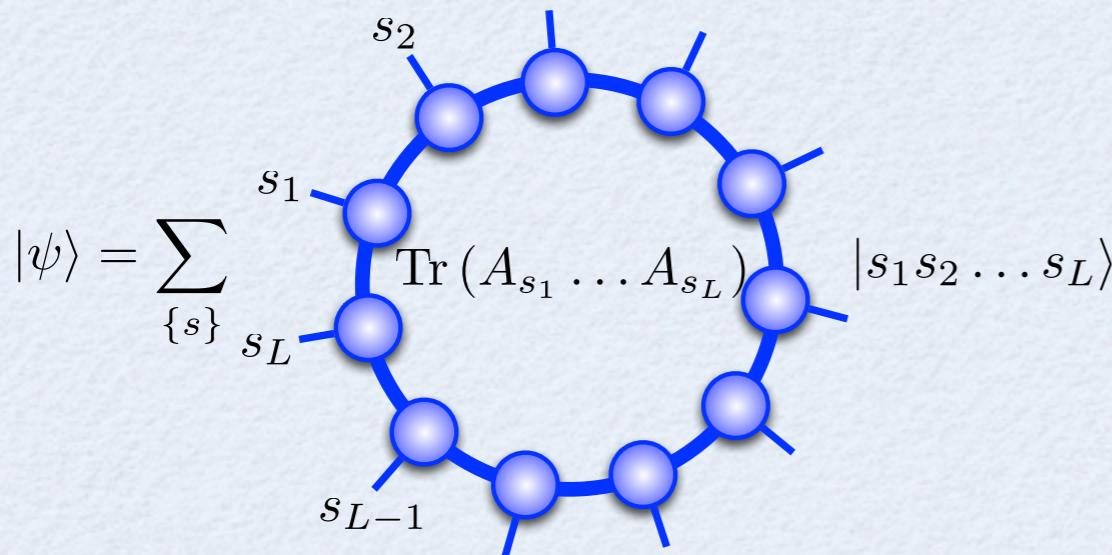


L. Corman, et al., PRL 113, 135302 (2014)



M. Łącki, et al., arXiv:1507.00030

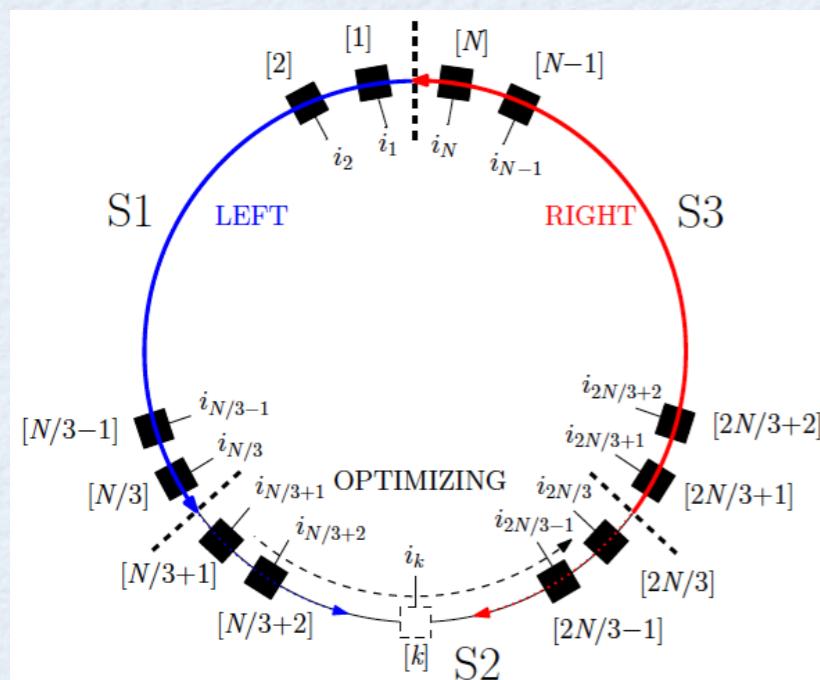
Periodic Boundaries: tensor networks



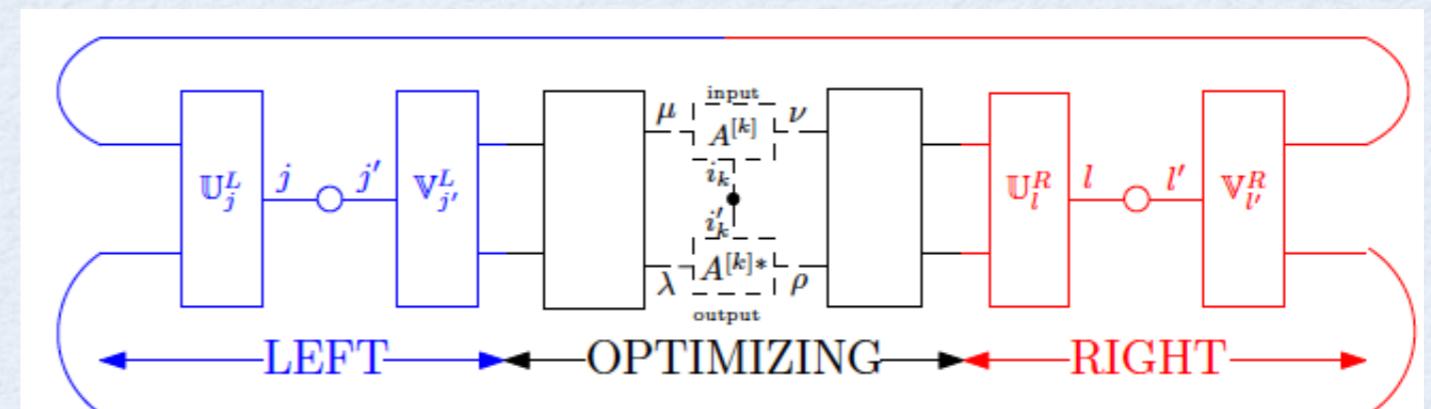
$s_j \in \{0, \dots, n_j^{\max}\}$
 $\alpha, \beta = 1 \dots m$

Verstraete, et al.,
PRL 93, 227205 (2004);
Pippal, et al.
PRB 81, 081103(R) (2010);
Pirvu, et al.,
PRB 83, 125104 (2011)
Weyrauch, et al.,
arXiv:1303.1333

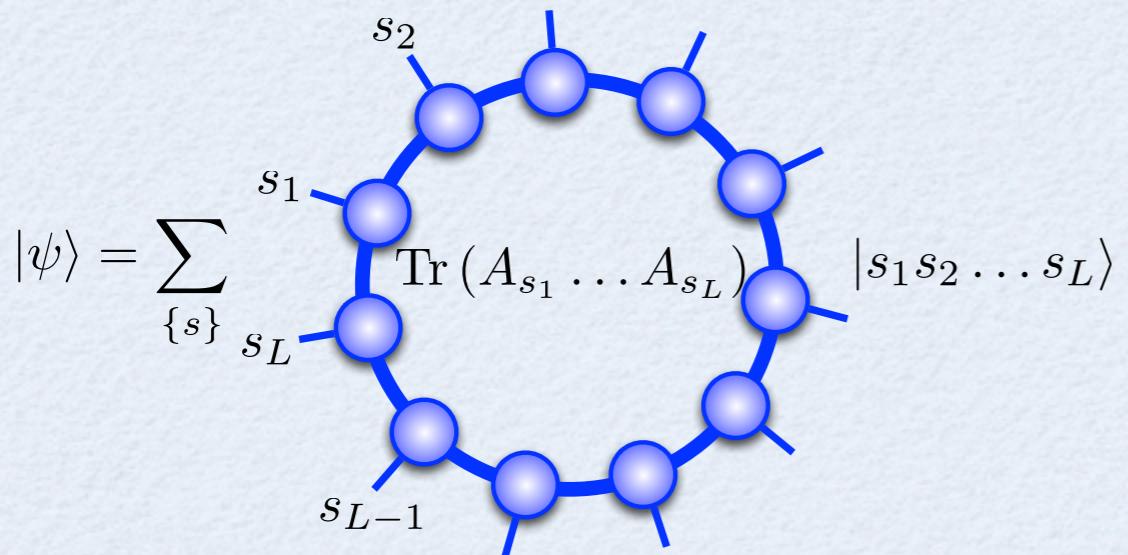
- Periodic MPS suffer from:
 - higher contraction costs $O(m^5)$ vs. $O(m^3)$
 - absence of a isometric gauge



- tricks based on transfer matrices of long homogeneous chains may help



Periodic Boundaries: tensor networks



$$s_j$$

$$\alpha \quad \beta$$

$$A_{s_j \alpha \beta}^{[j]}$$

$$s_j \in \{0, \dots, n_j^{\max}\}$$

$$\alpha, \beta = 1 \dots m$$

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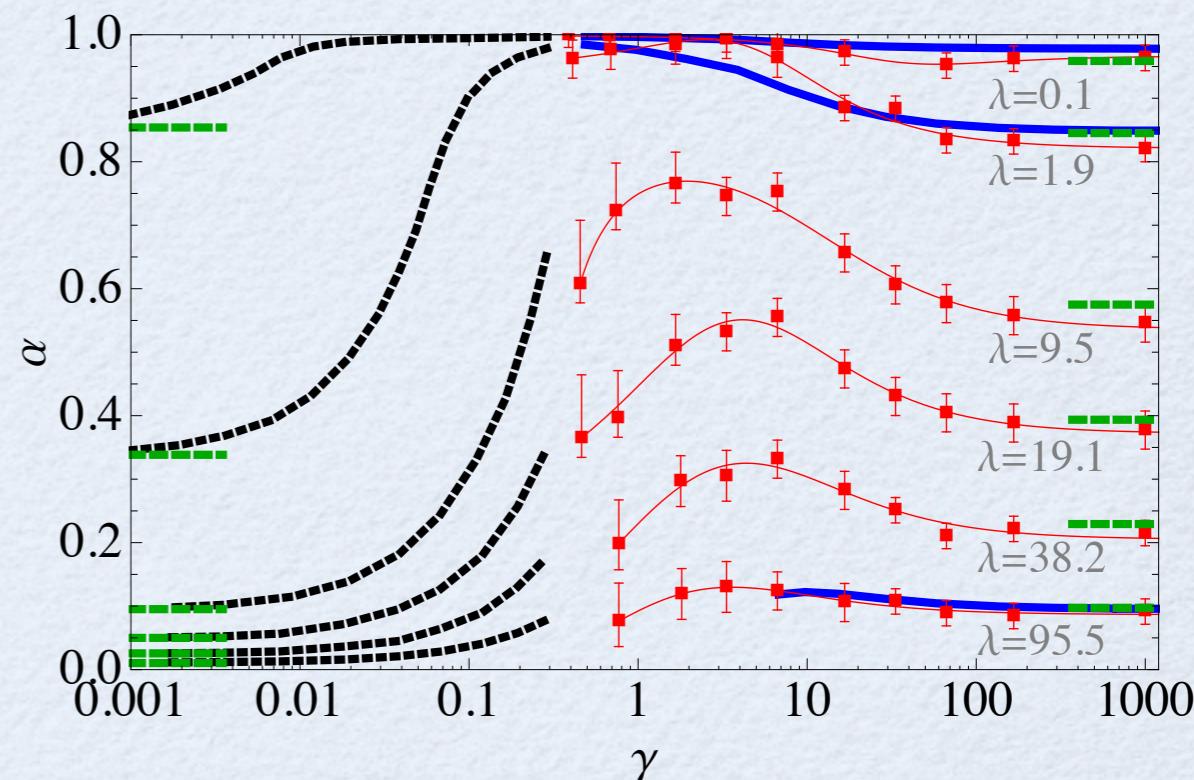
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- EXAMPLE:

Bose-Hubbard model at low filling
 + Peierls substitution + impurity

Cominotti, M.R., et al., *PRL* 113, 025301 (2014)

alternative: cMPS for Lieb-Liniger
ongoing with D. Draxler, J. Haegeman



OUTLINE

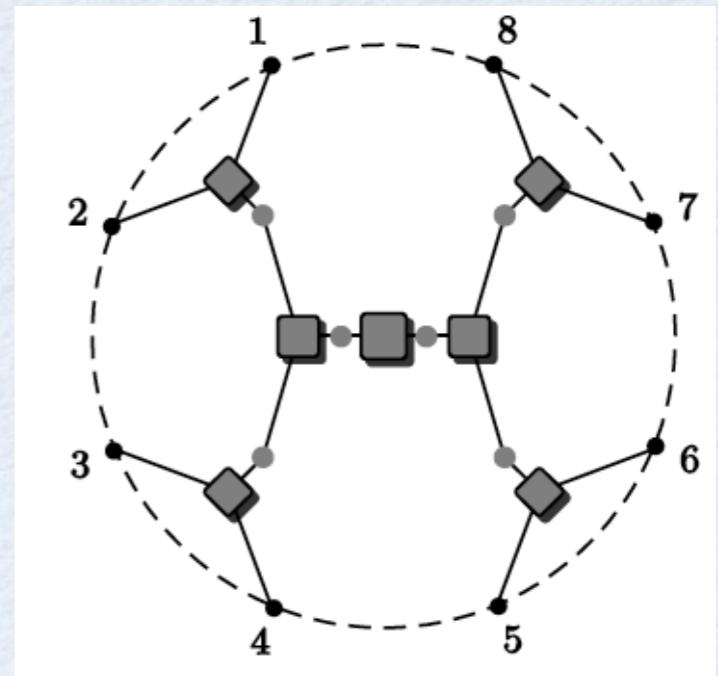
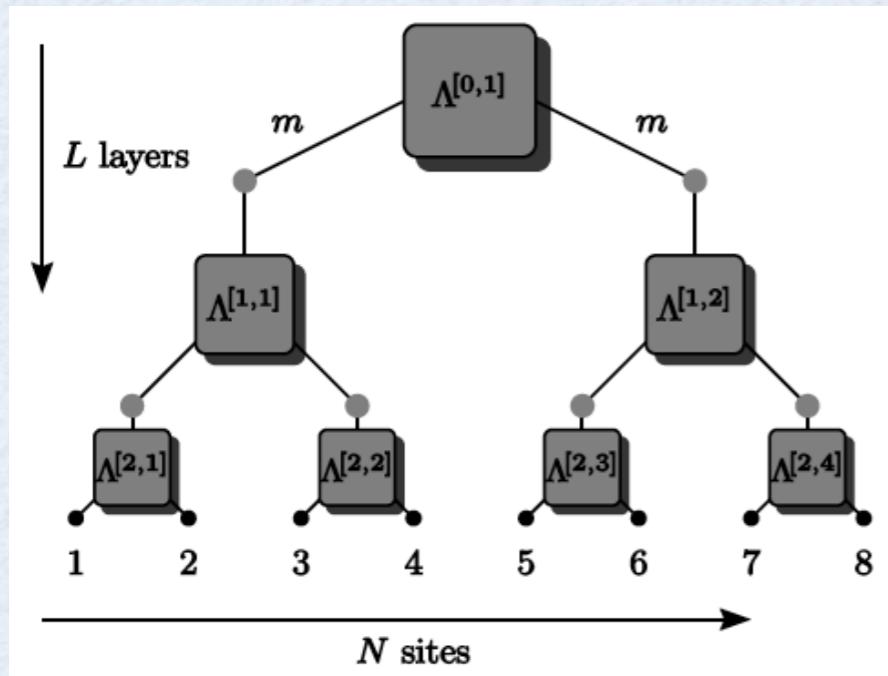
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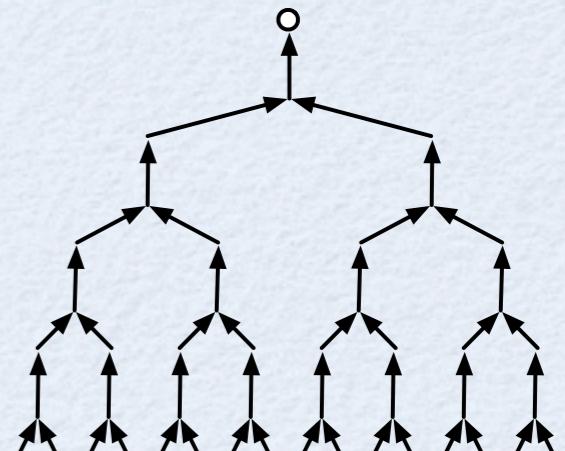
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Tree Tensor Networks (TTN)

- loop-free, hierarchical, structure treating PBC on the same footing of OBC

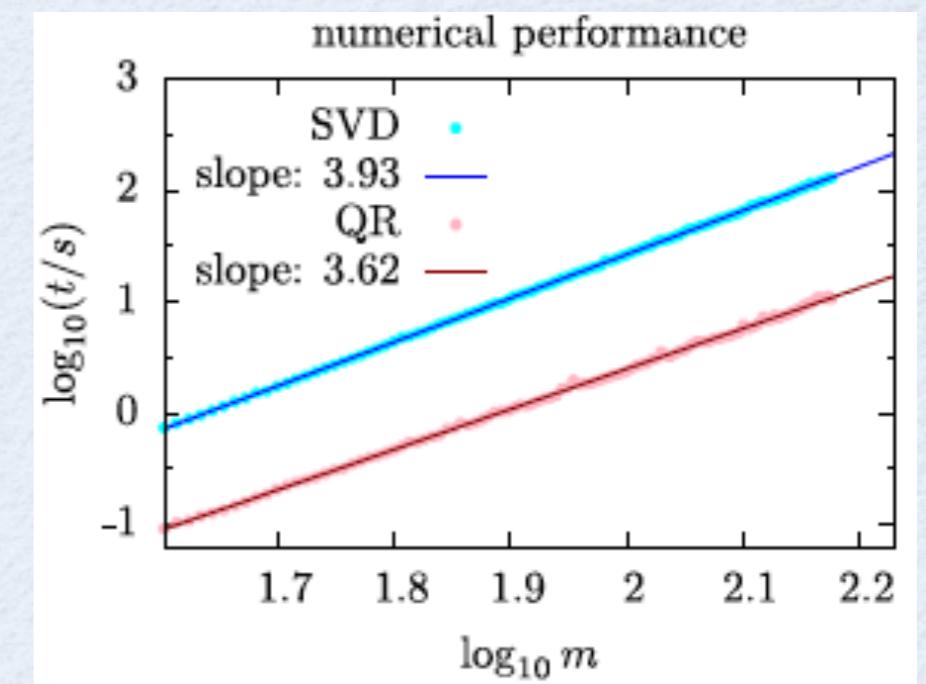
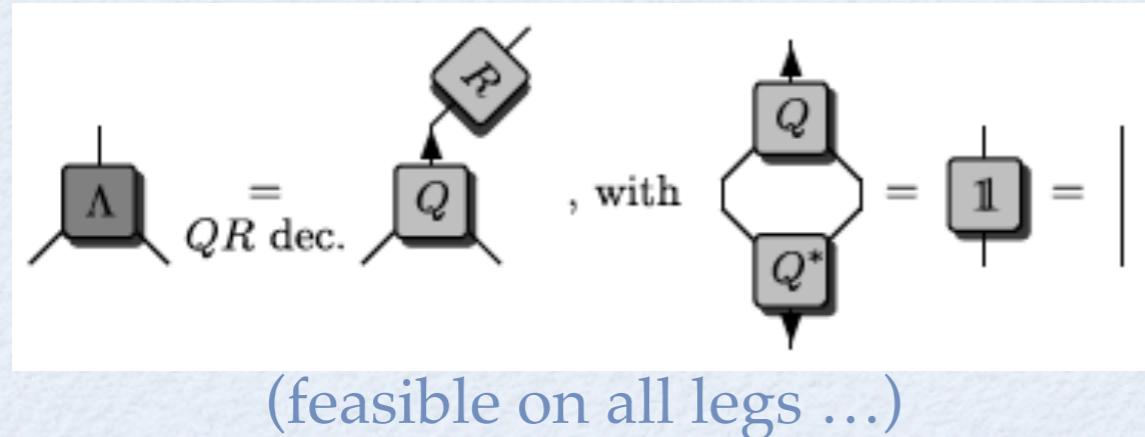


- set of $(N-1)$ tensors $\left\{ \Lambda^{[l,n]} \right\}_{n=1,\dots,2^l}^{l=0\dots \log_2(N/2)}$ bond dimension m
- storage $O(Nm^3)$; computation $O(Nm^4)$
- standard interpretation: RG flow from L towards 0 [i.e., a MERA without disentanglers ...]



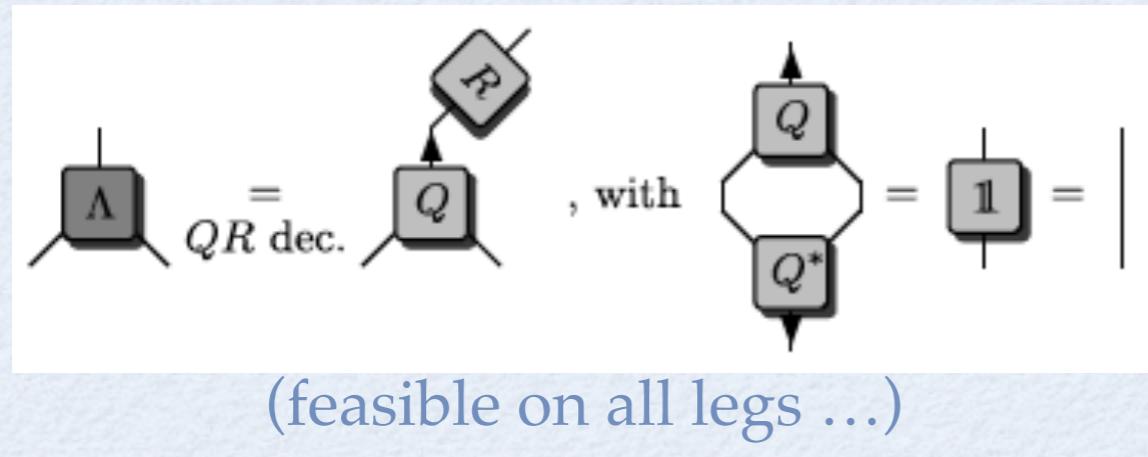
Adaptive gauging of a $TT\mathcal{N}$

- loop-free structure allows for more ! *Central gauge* towards any tensor !
- INGREDIENT: Isometrization of a single tensor via QR decomposition

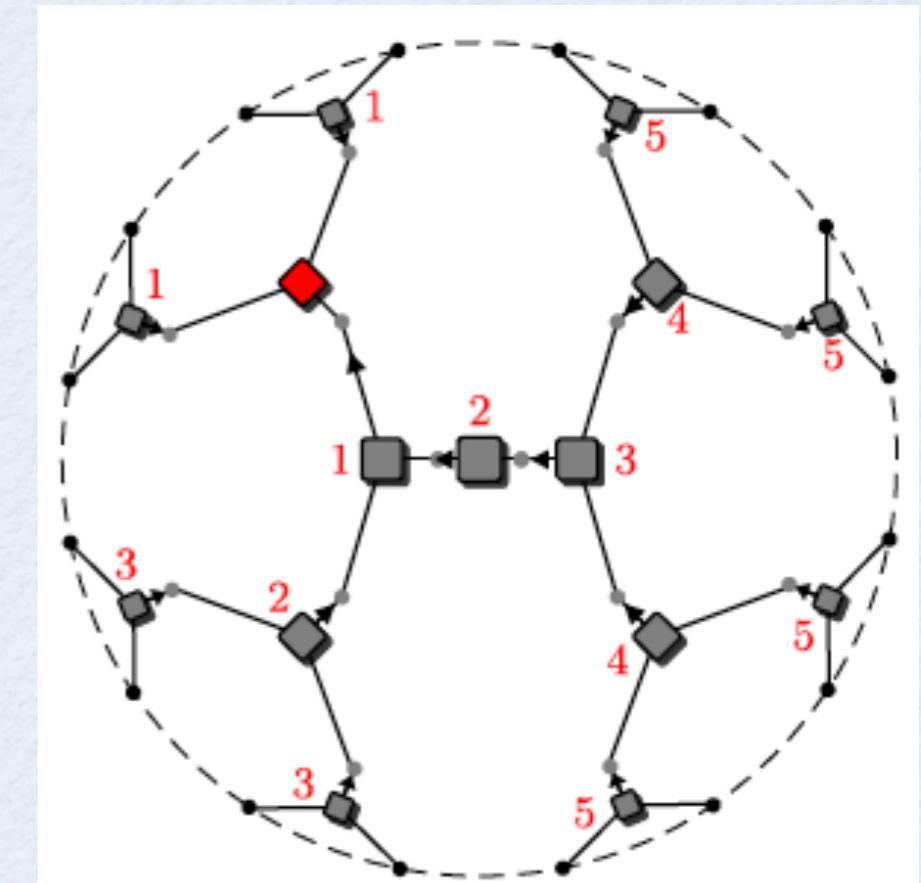


Adaptive gauging of a $TT\mathcal{N}$

- loop-free structure allows for more ! *Central gauge* towards any tensor !
- INGREDIENT: Isometrization of a single tensor via QR decomposition



- RECIPE:
 - for each tensor determine distance from “nucleus”
 - perform QR in order & direction of decreasing distance
 - adsorb the R remainder in the not yet isometrized tensors

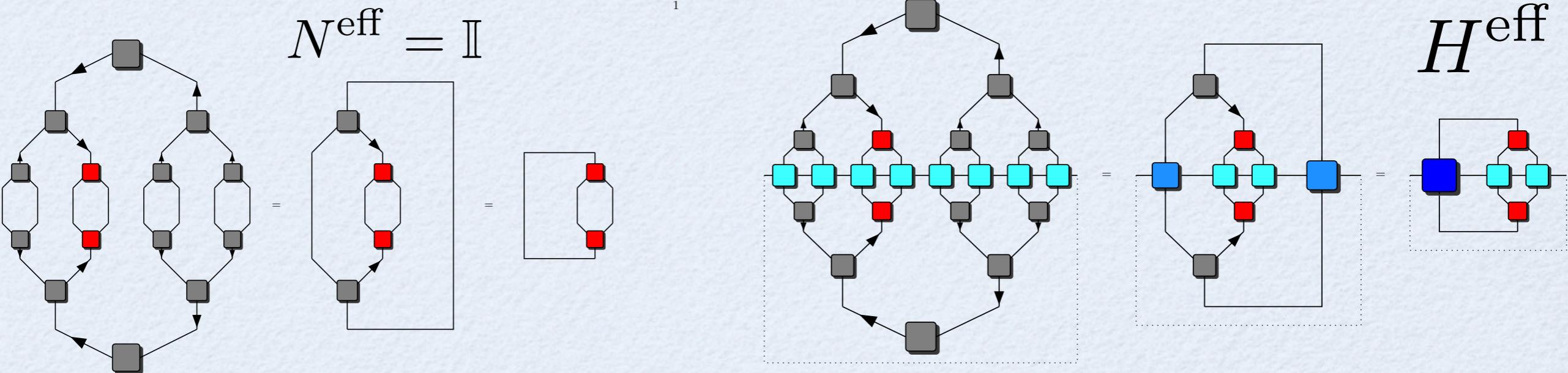


Ground state variational algorithm

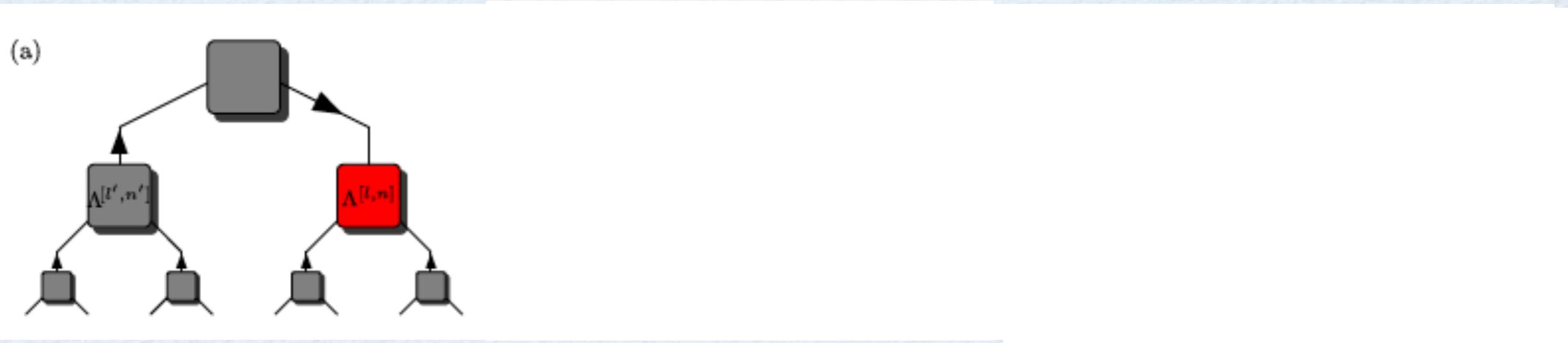
- loop-free structure allows for more ! *Central gauge* towards any tensor !
- ADVANTAGE: effective norm operator disappears in the secular problem i.e., no need for less stable generalized eigenvalue problem solver !

$$\min_{|\Psi\rangle \in TN} \langle \Psi | H | \Psi \rangle / \langle \Psi | \Psi \rangle \quad \rightarrow \quad H_j^{\text{eff}} A_{[j]} = \varepsilon N_j^{\text{eff}} A_{[j]}$$

(cycle on j)

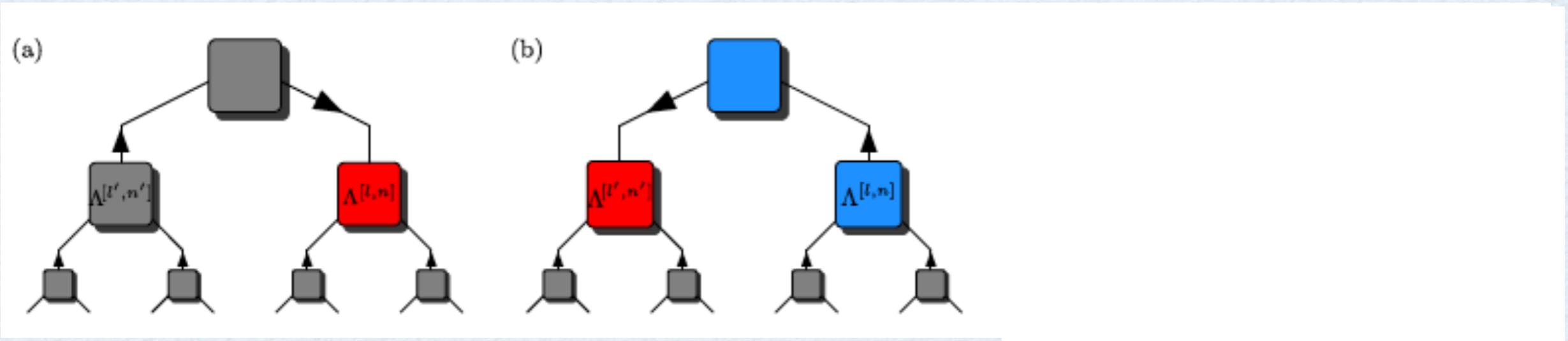


Ground state variational algorithm



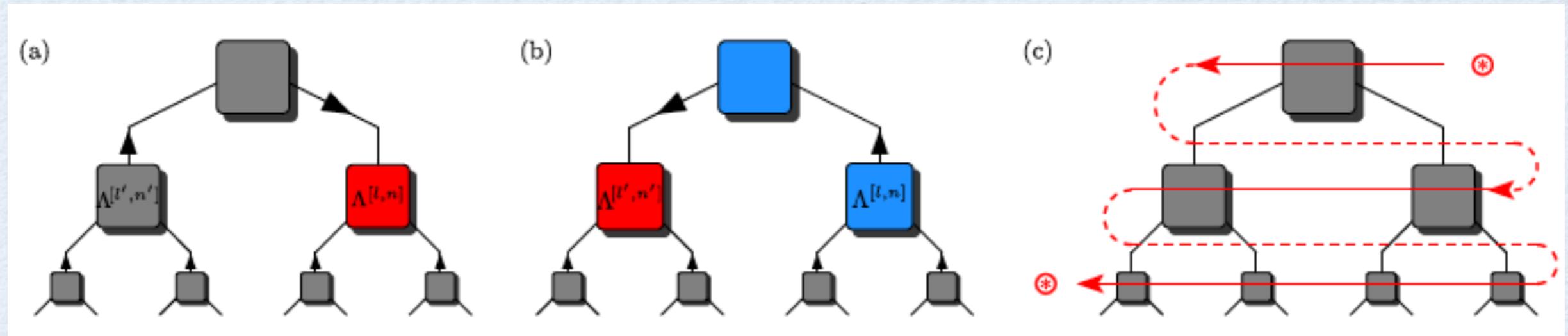
(a) optimize $\Lambda^{[l,n]}$, i.e., solve the secular problem $H_{[l,n]}^{\text{eff}} \Lambda_{[l,n]} = \varepsilon \Lambda_{[l,n]}$

Ground state variational algorithm



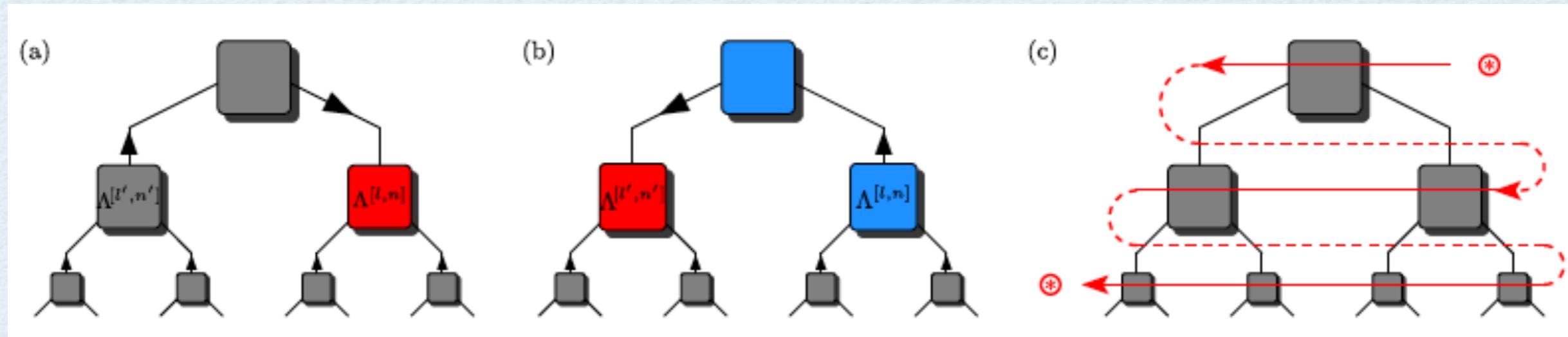
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- (b) target the next tensor $\Lambda^{[l',n']}$ by adjusting isometrization
and updating effective Hamiltonian terms

Ground state variational algorithm



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- (c) repeat for each tensor (= “sweep”) and stop when converged

Ground state variational algorithm



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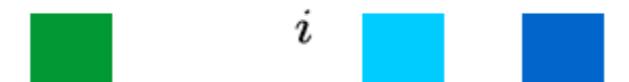
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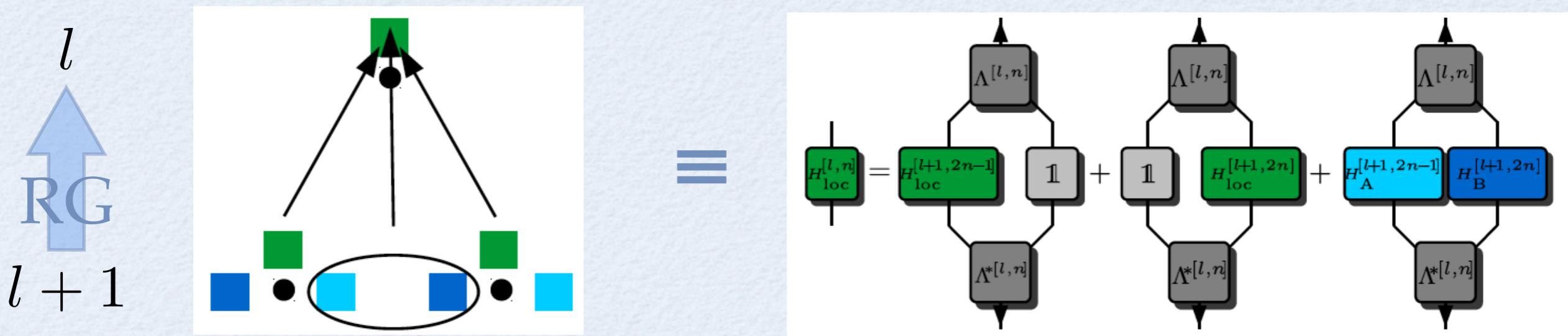
- Numerically stable! Only ingredients needed:
QR + eigensolver (Arnoldi/Lanczos) + tensor contraction routines
(+ SVD in case of two-tensor optimization)
- ternary tensors + loop-free ==> easily implemented symmetries !

Effective Hamiltonian Construction

- Particularly simple with nearest-neighbor terms only
(and easily generalizable also to MPOs)

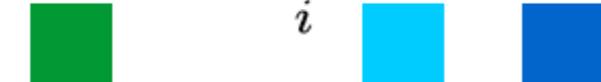
$$H = \sum_i H_{\text{loc}}^i + \sum_i H_A^i H_B^{i+1}$$


- Mapping from one level to the next:

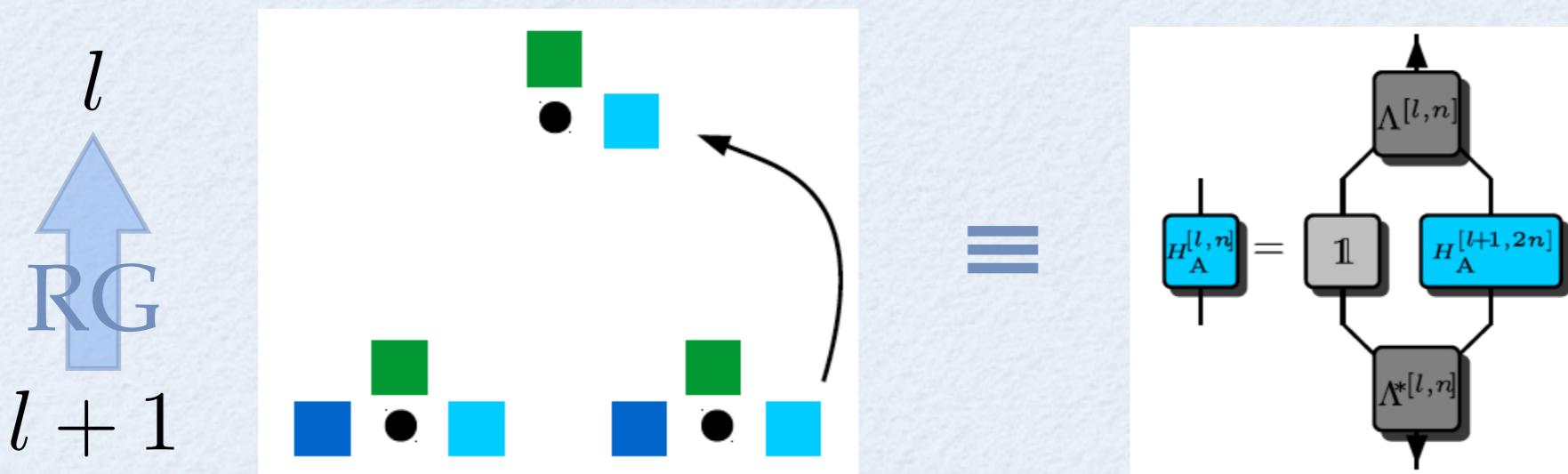


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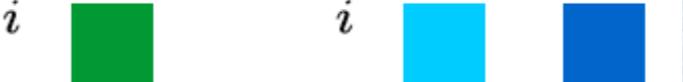
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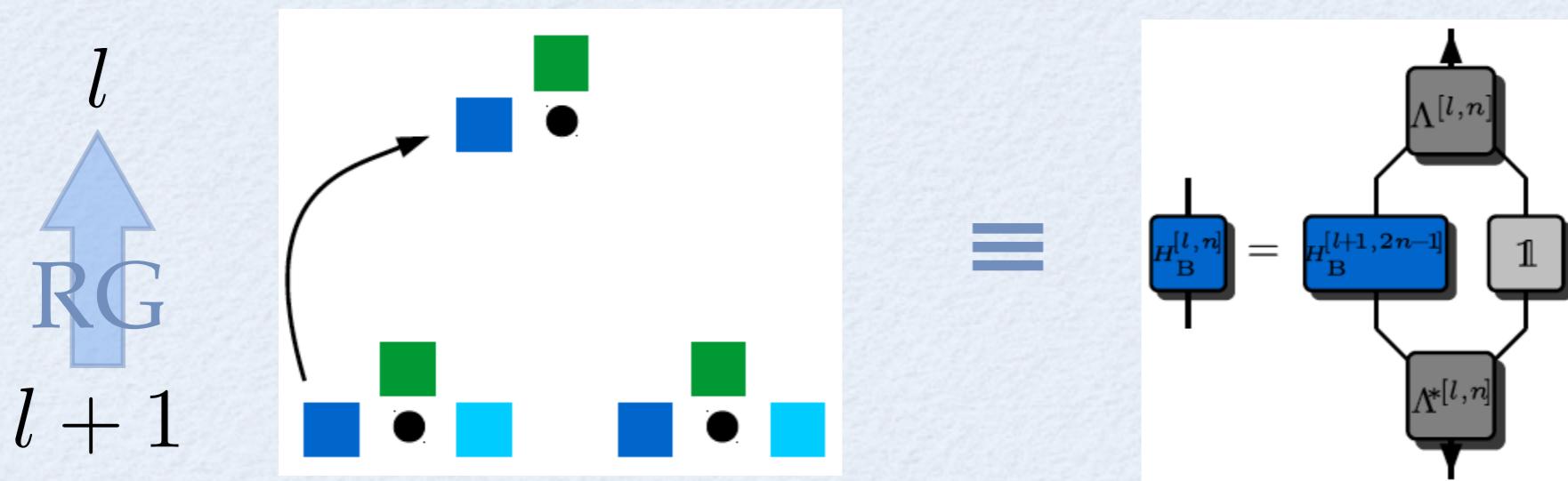


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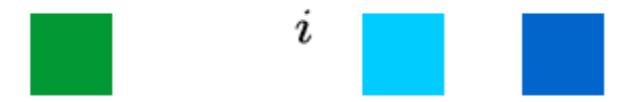
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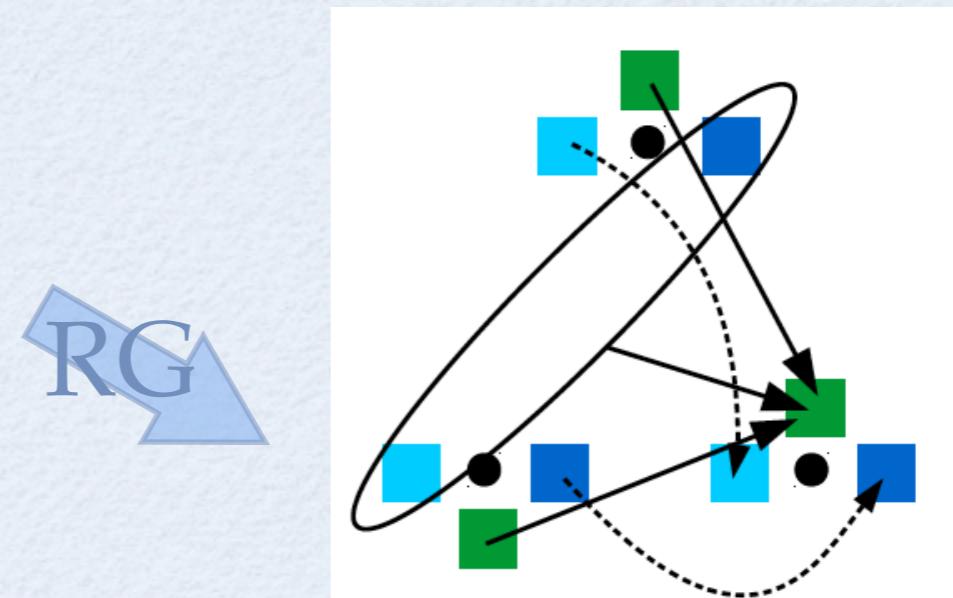
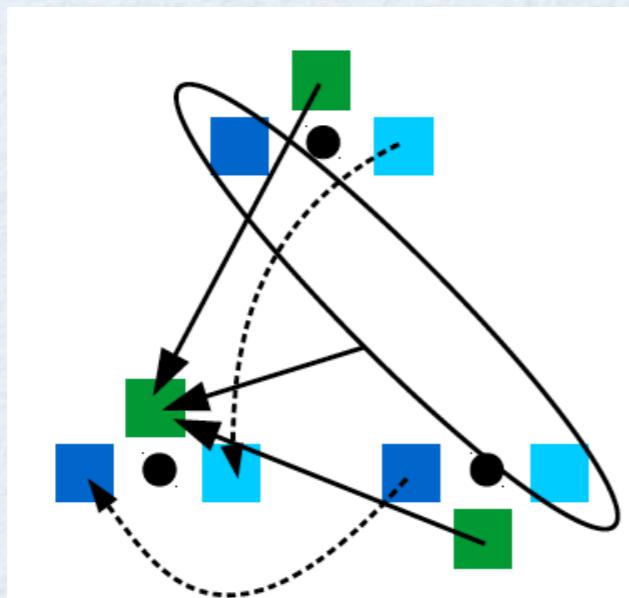


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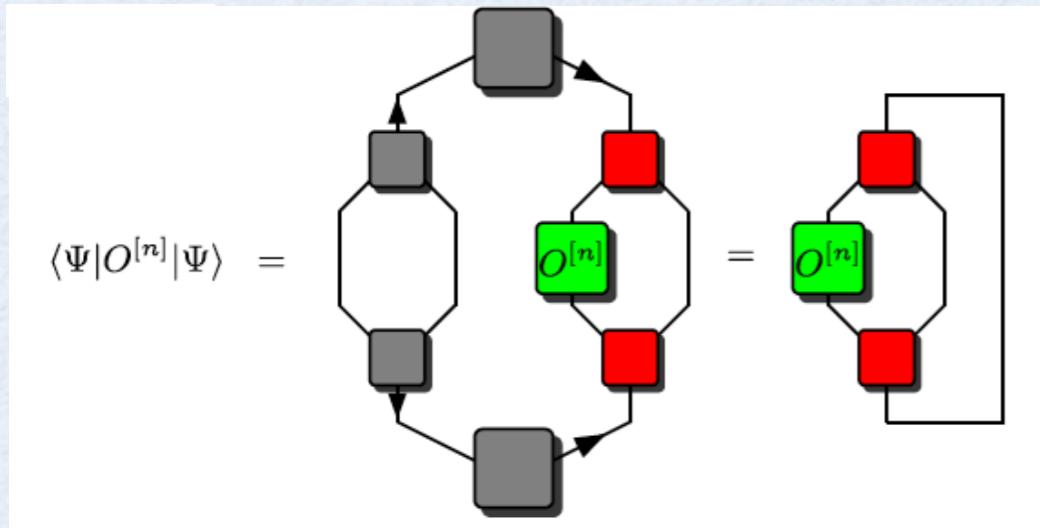
- Mapping works identically in all directions !



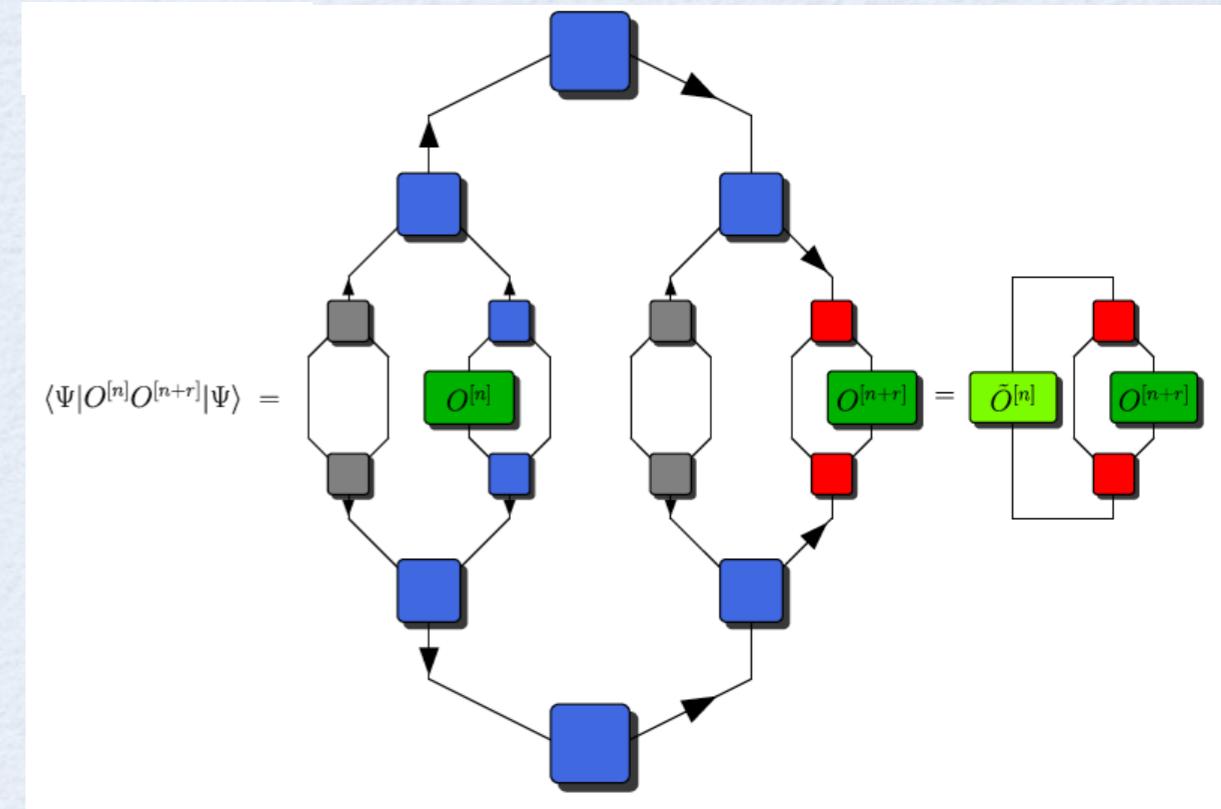
- Mapping should be performed in the same order as isometrization
(i.e., from furthest to closest tensors to the “nucleus”)

Measurement of observables

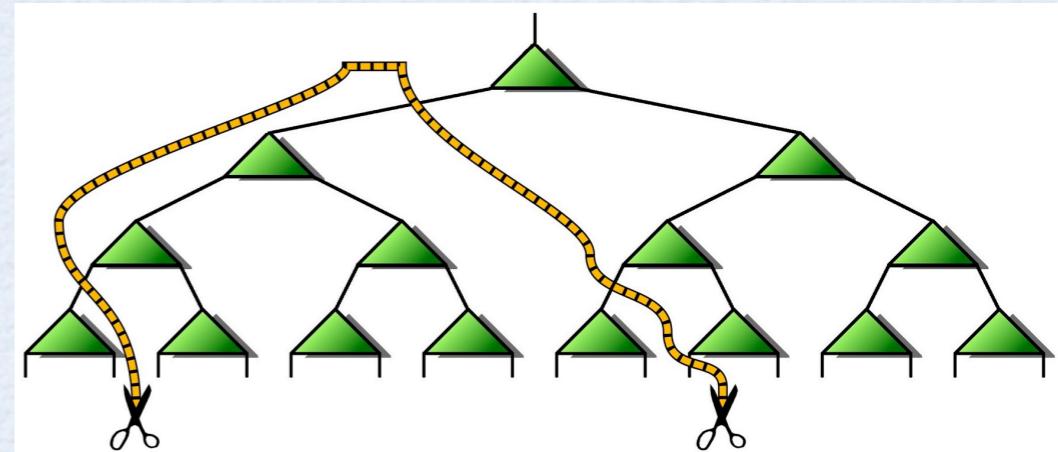
- local observables:
only 3 contractions



- correlation functions:
only $O(\log N)$ contractions



- hierarchical structure could encompass critical properties
- log divergence of entang. entropy captured “on average”



OUTLINE

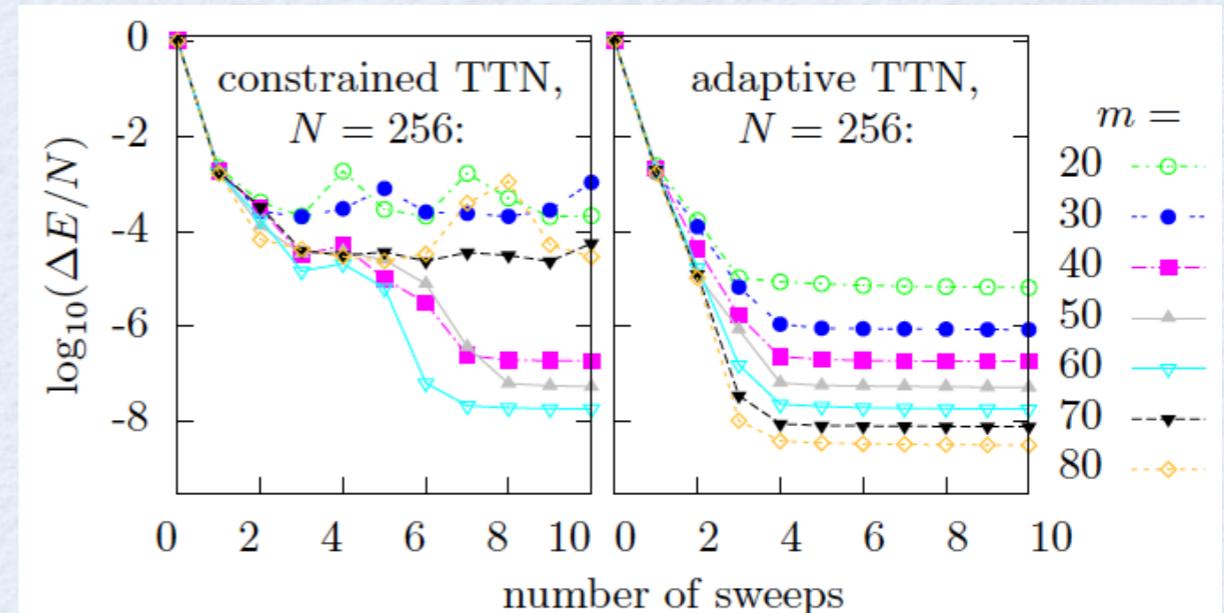
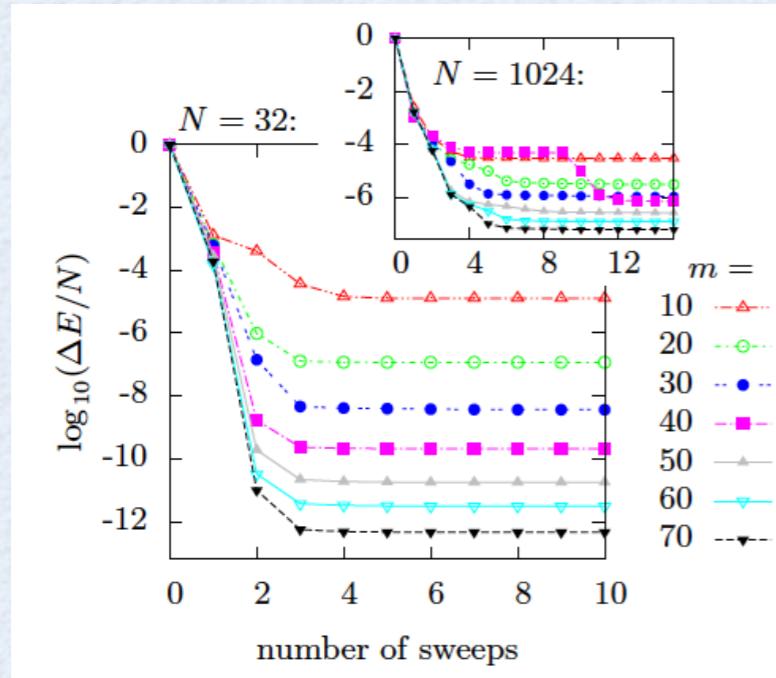
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Ising in transverse field: energy

- Convergence in few sweeps -- more stable than *standard* isometric TTN

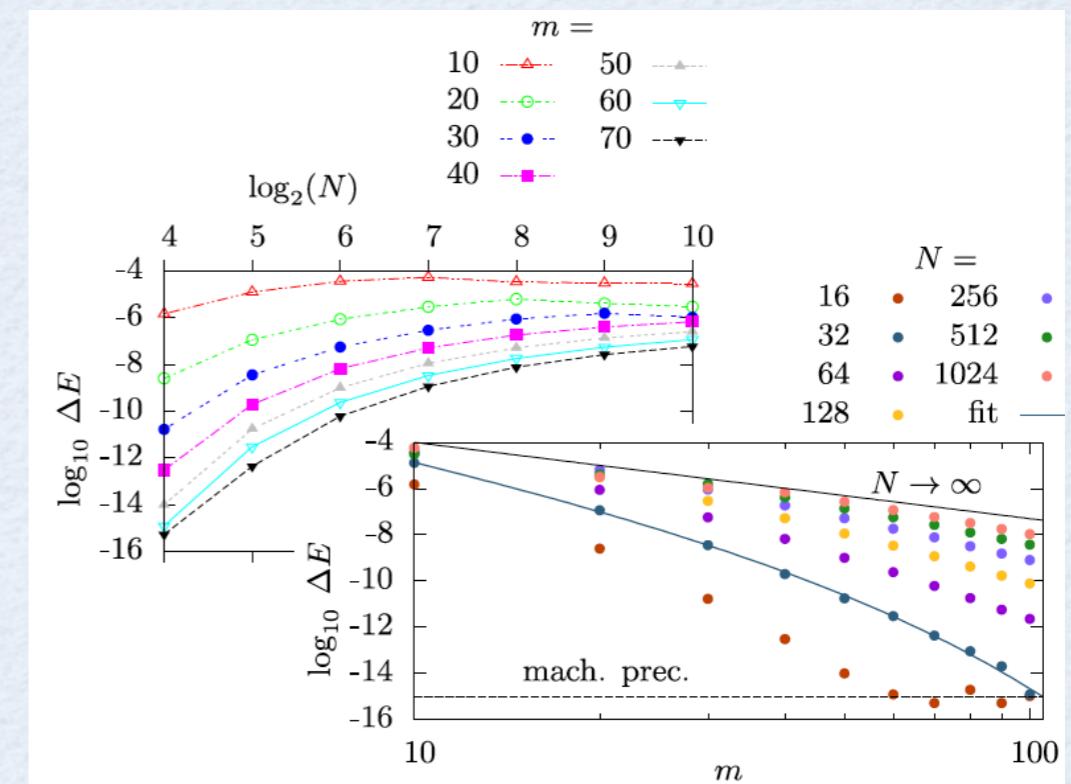


- Power-law convergence in the bond-dimension

$$\Delta E(m) \propto m^{-a} e^{-b m}$$

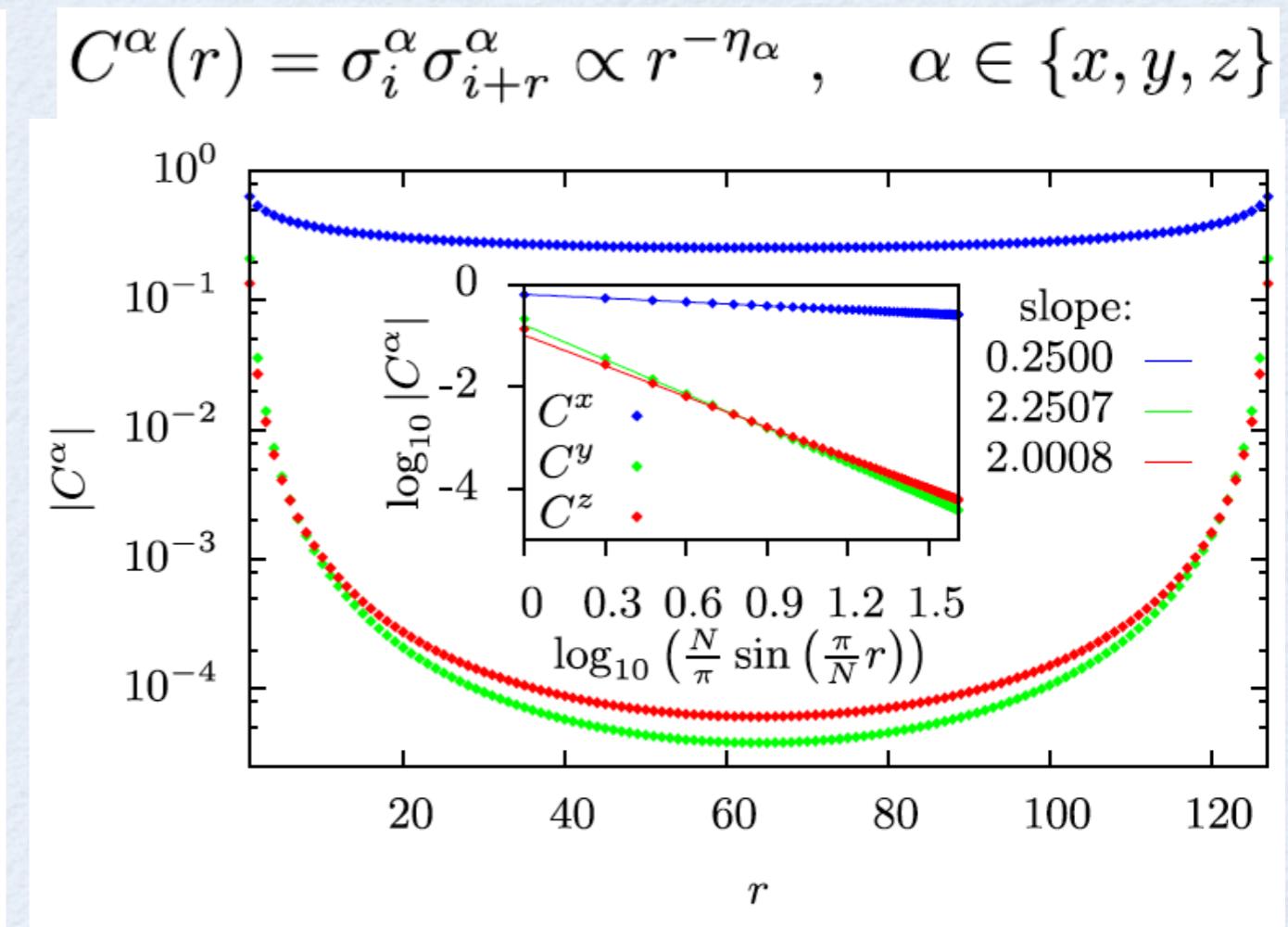
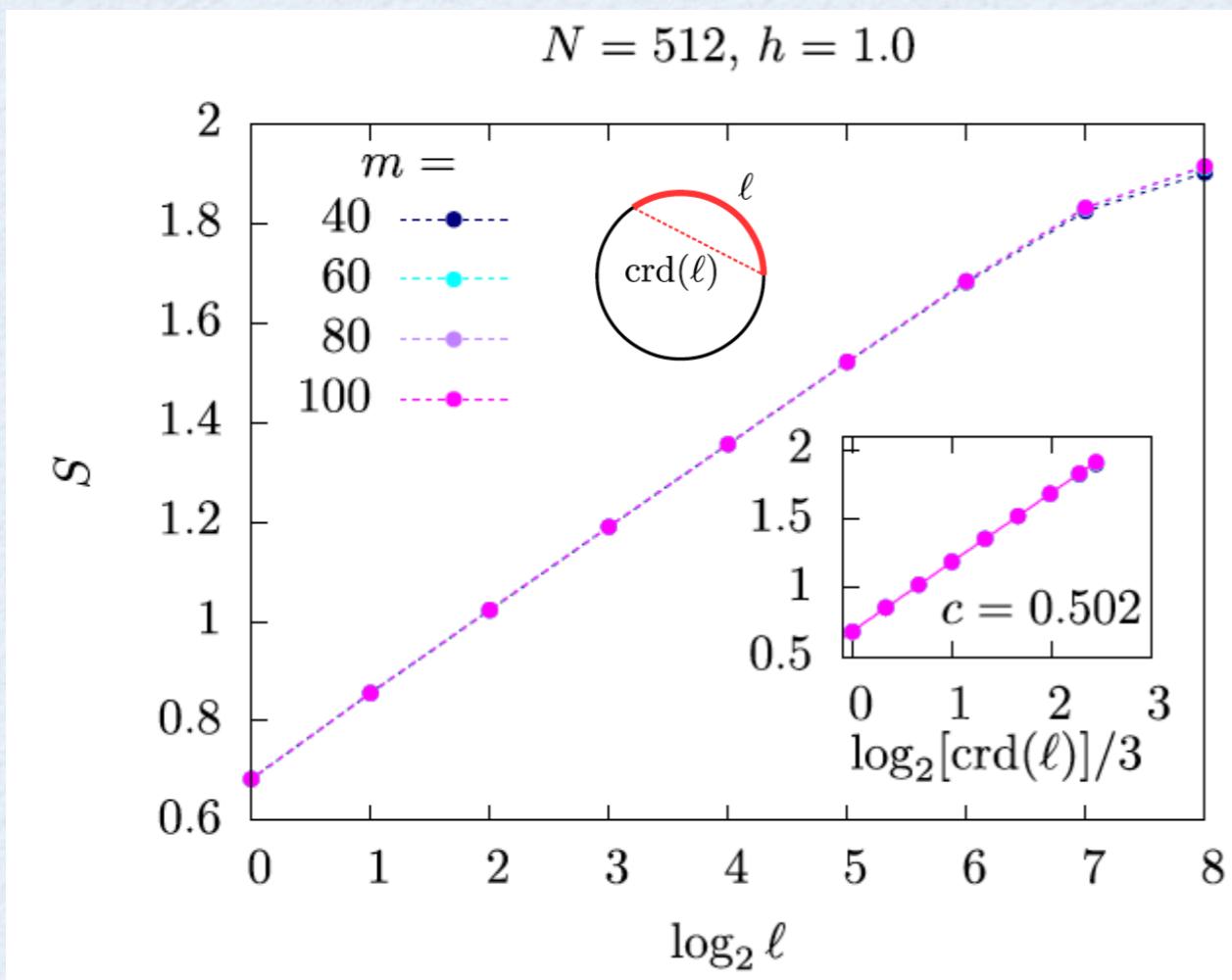
b vanishing at TL

$a \sim 3$ at TL



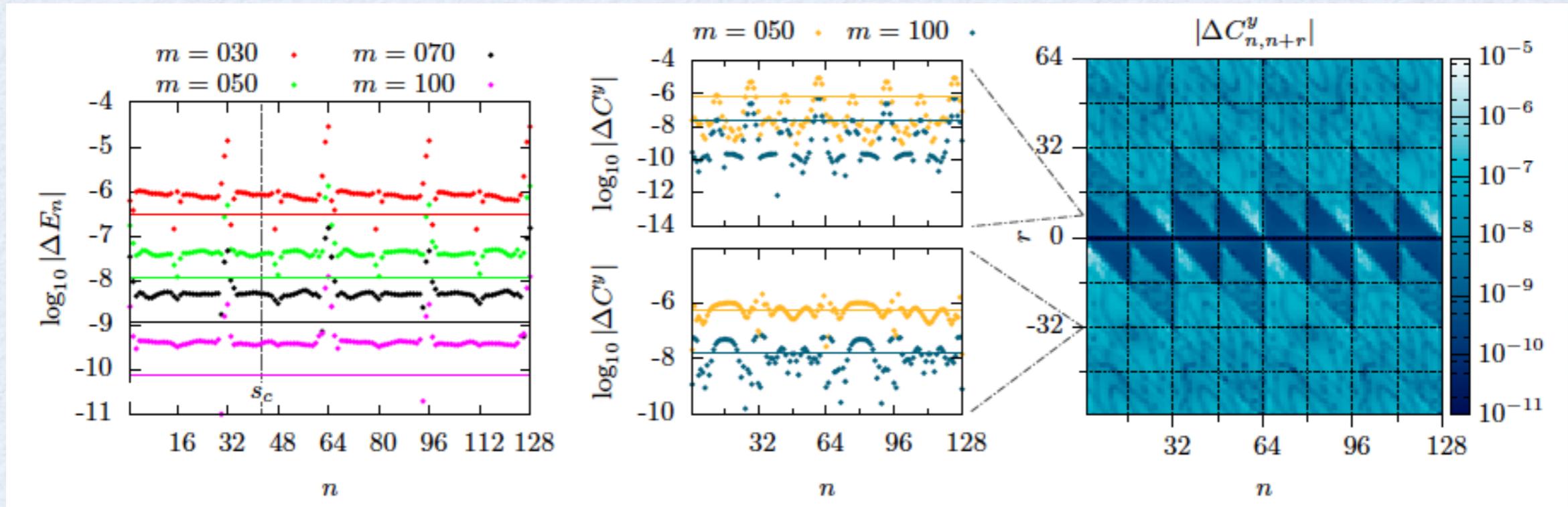
Ising in transverse field: correlations

- Critical behaviour captured with high accuracy

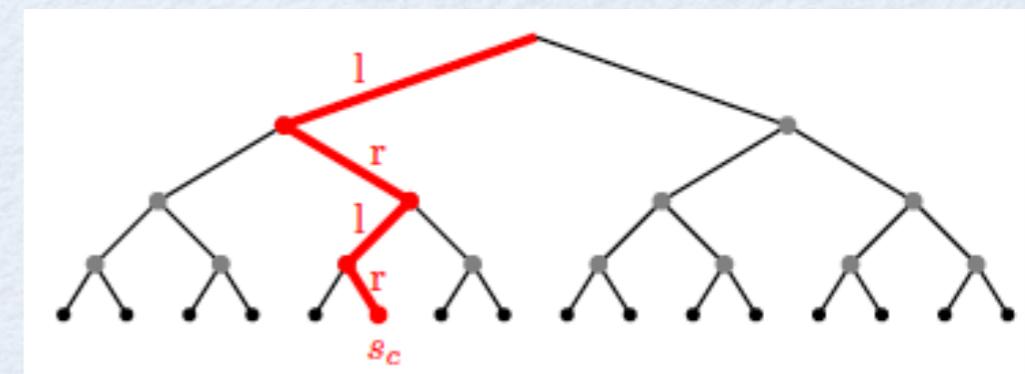


Ising in transverse field: translations

- breaking of translational invariance compensated by large bond dimens.

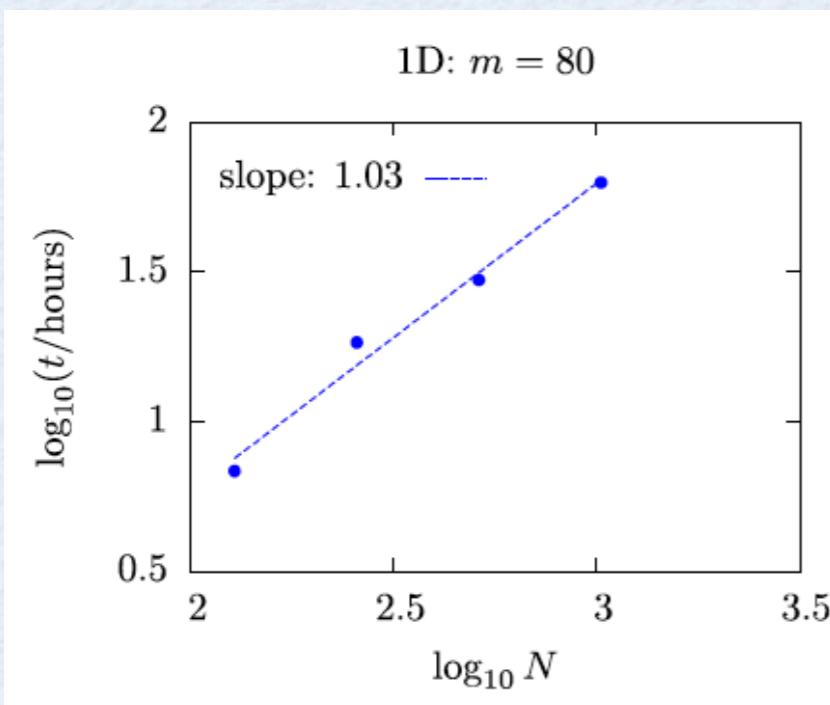


- no strict need to introduce a “central” site...

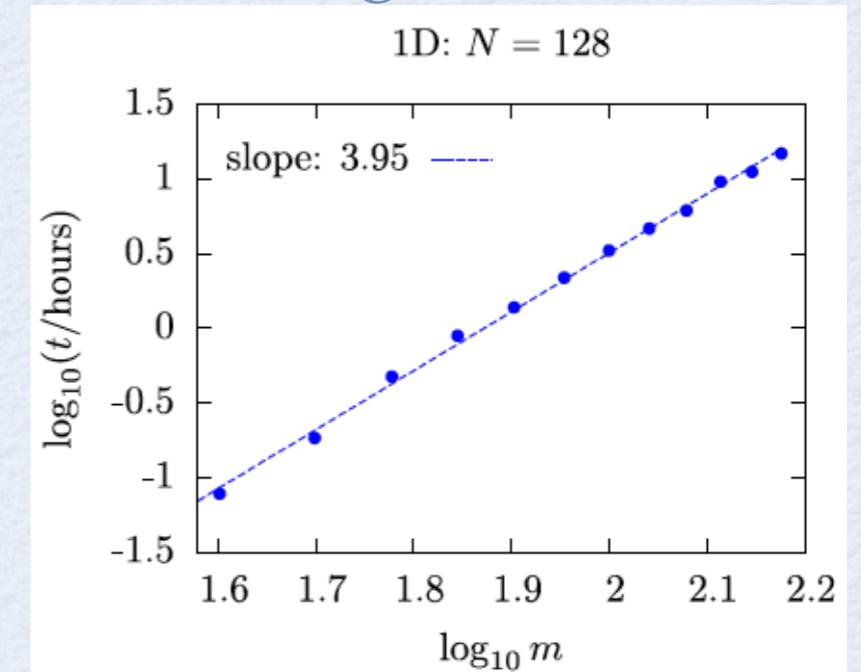


CPV running time

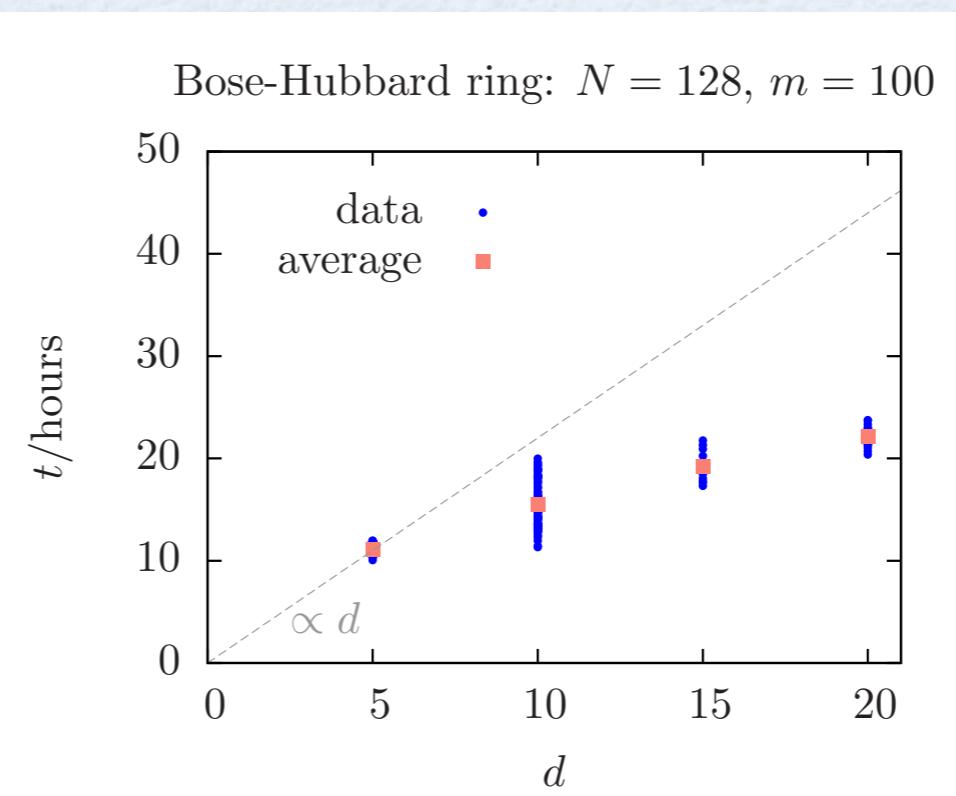
- linear scaling with system size



- $O(m^4)$ scaling with bond dim.



- sub-linear scaling with local dimension !
[OBC is $O(d^n m^3)$]



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The Hamiltonian

$$\mathcal{H} = -t \sum_j \left(b_j^\dagger b_{j+1} + \text{h.c.} \right) + \frac{U}{2} \sum_j n_j(n_j - 1) - \sum_j V_j n_j$$

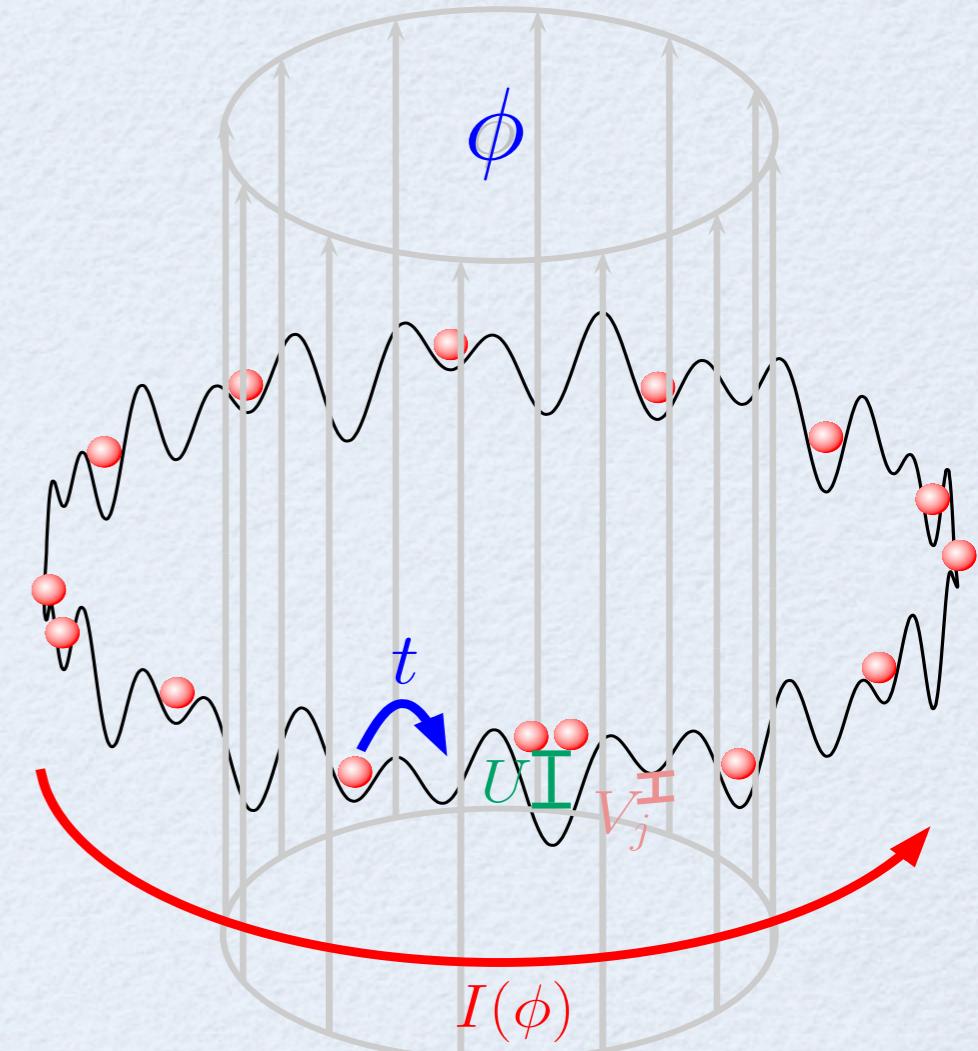
Commensurate particle density $n = N/L = 1$

Uniform disorder distribution $V_j \in [-\Delta, +\Delta]$

On-site interactions

Peierls substitution $t \rightarrow t e^{-2\pi i \phi / N_s}$

Superfluid stiffness $\rho_s = \frac{N_s}{8\pi^2} \frac{\partial^2 E_0}{\partial \phi^2} \Big|_{\phi=0}$



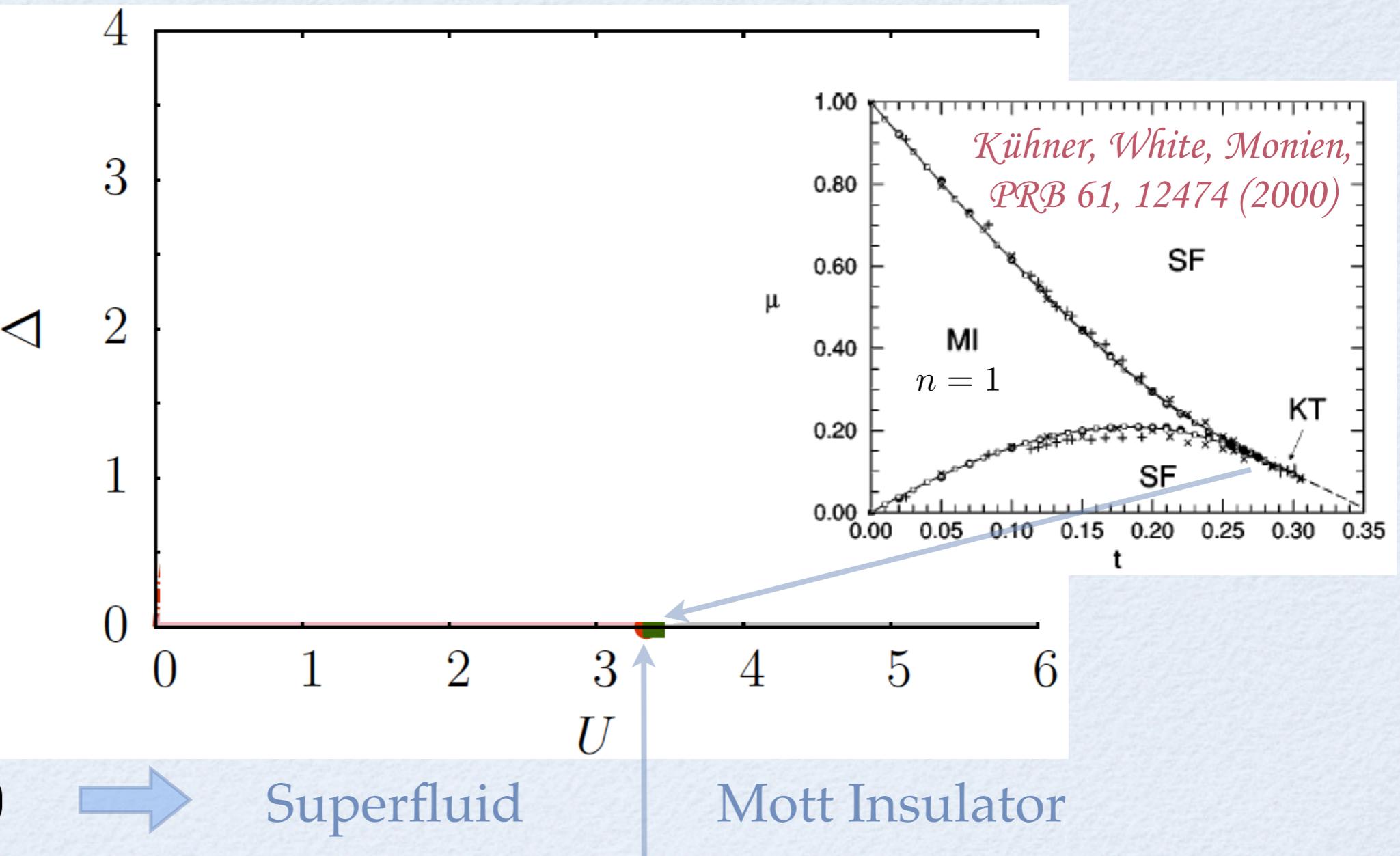
The phase diagram

$$U = 0$$



Anderson
Localization

$$\Delta \neq 0$$



$$\Delta = 0$$



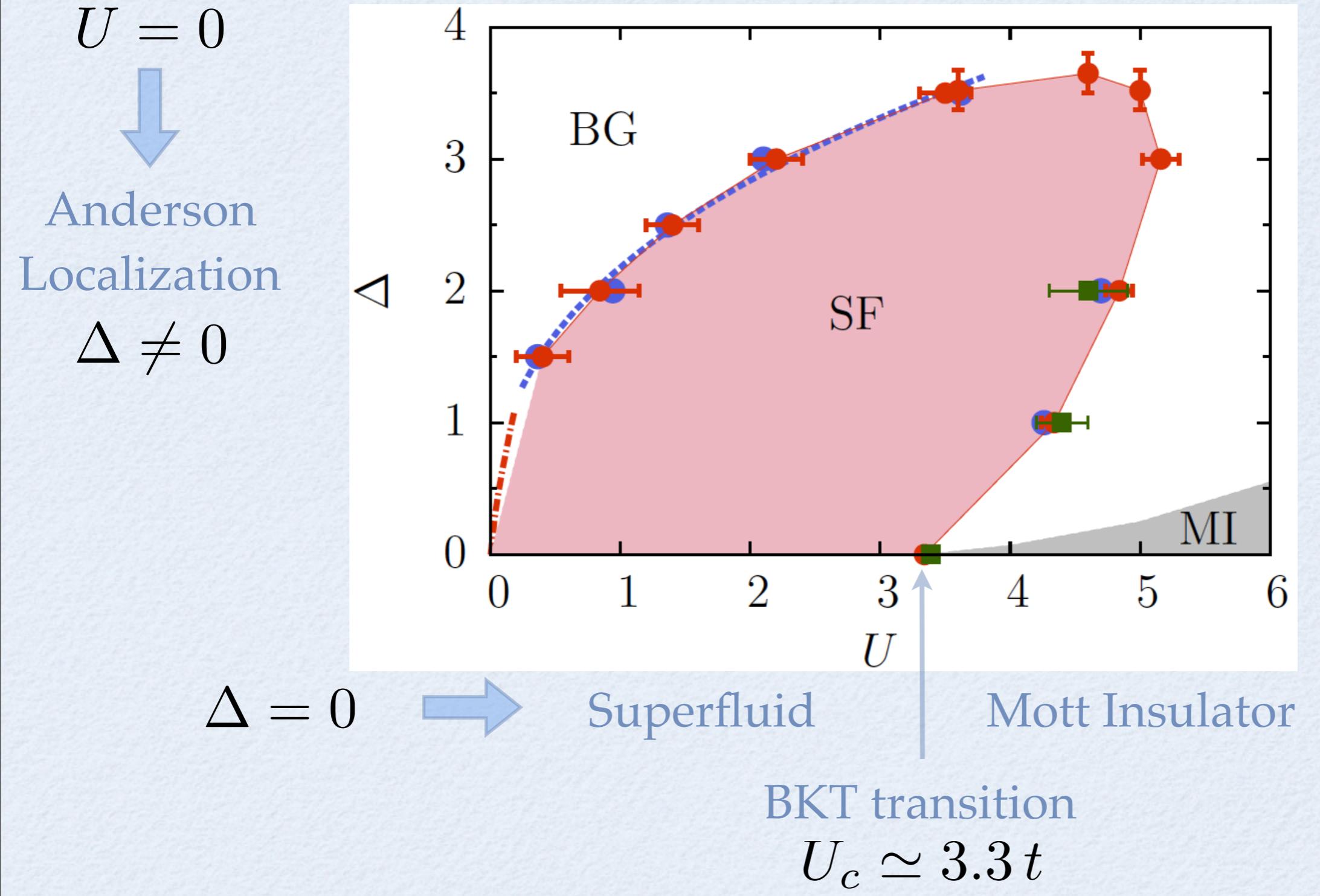
Superfluid

Mott Insulator

BKT transition

$$U_c \simeq 3.3t$$

The phase diagram



The phase diagram cold atoms experiments !?

$U = 0$
 ↓
 Anderson
 Localization

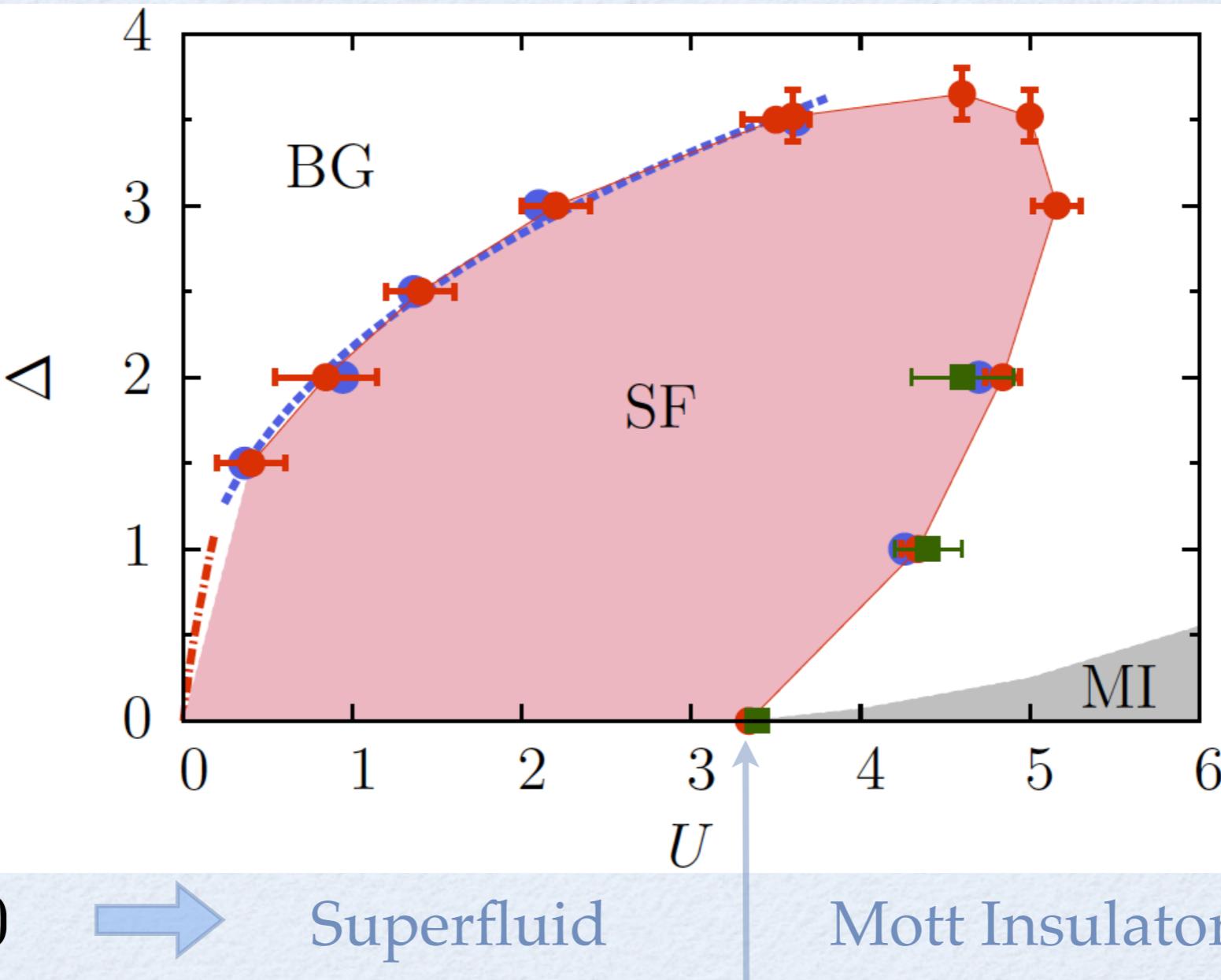
$\Delta \neq 0$

J. Billy, et al.,
Nature 453, 891 (2008);
 G. Roati, et al.,
Nature 453, 895 (2008).

$\Delta = 0$ → Superfluid Mott Insulator

M. Greiner, et al.,
Nature 415, 39 (2002).

BKT transition
 $U_c \simeq 3.3 t$



Bose Glass
 • compressible
 • not coherent !
 Fisher, et al. ('89)
 Giamarchi, Schulz,
 Altman, Zwerger,
 Prokof'ev, Svistunov,
 Pollet, & many others

C. D'Errico, et al.,
PRL 113, 095301 (2014)

Indicator 1: superfluid stiffness

$$\rho_s = \frac{N_s}{8\pi^2} \frac{\partial^2 E_0}{\partial \phi^2} \Big|_{\phi=0}$$

universal jump
(~ classical 2D XY)

$$\rho_s^c = (2/\pi^2) U_c$$

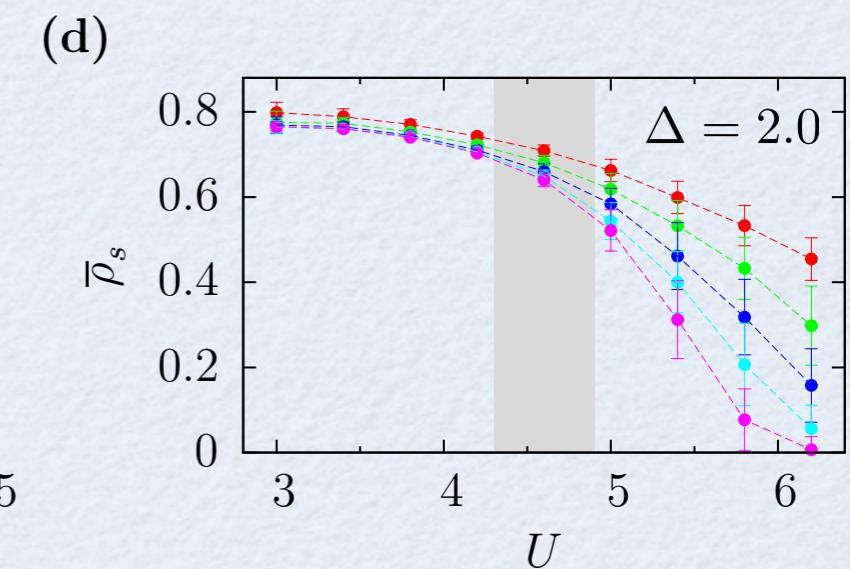
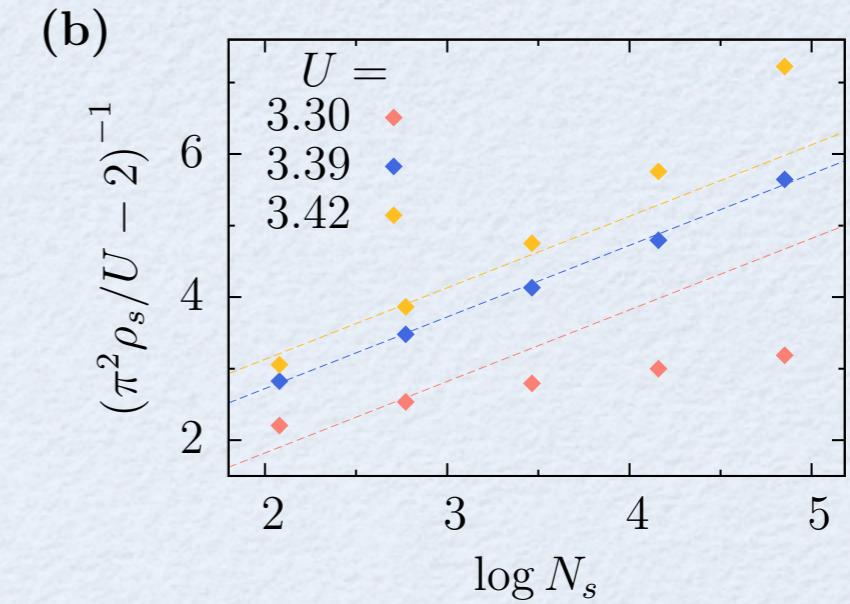
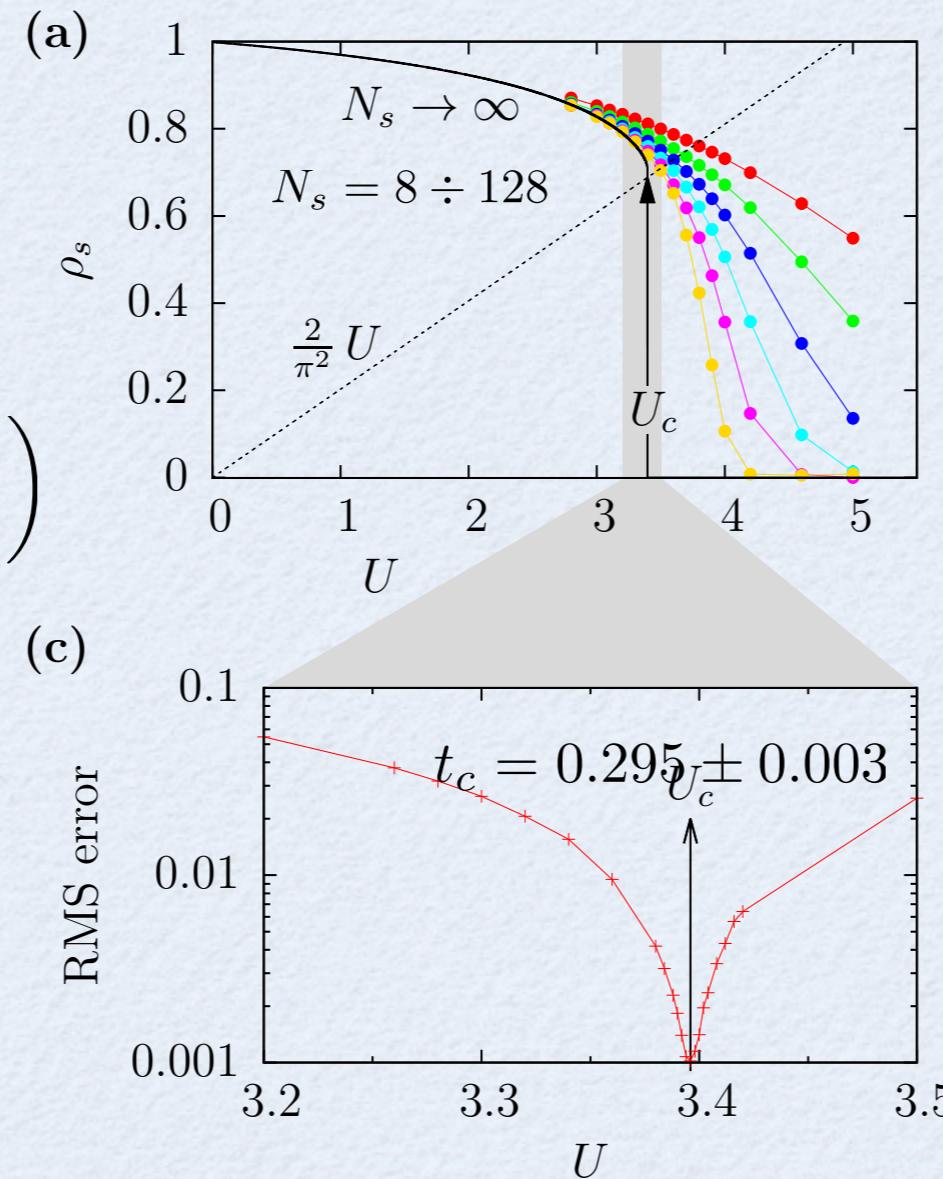
Nelson & Kosterlitz, *PRL* 39, 1201 (1977)

M. Fisher, et al., *PRB* 40, 546 (1989)

Finite size scaling

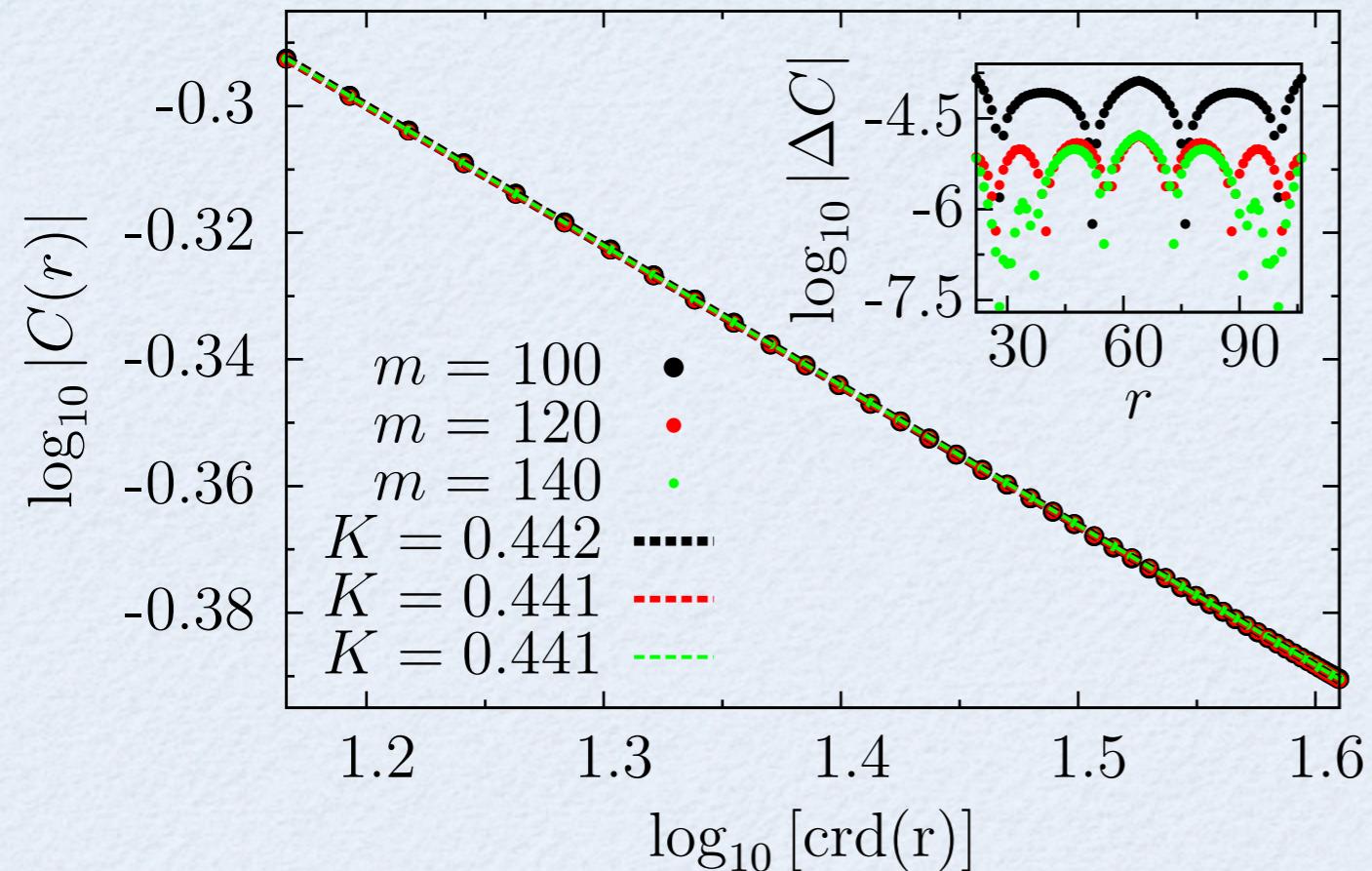
$$\rho_s^c(N) = \frac{2U}{\pi^2} \left(1 + \frac{1}{2} \frac{1}{\log N + b} \right)$$

H. Weber, P. Minnhagen,
PRB 37, 5986 (1988).



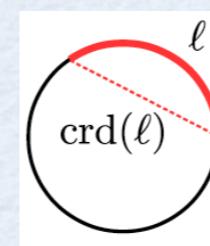
M. Gerster, M.R., et al. *NJP* 18 015015 (2016)

Indicator 2: hopping correlation decay (K)



Luttinger liquid theory

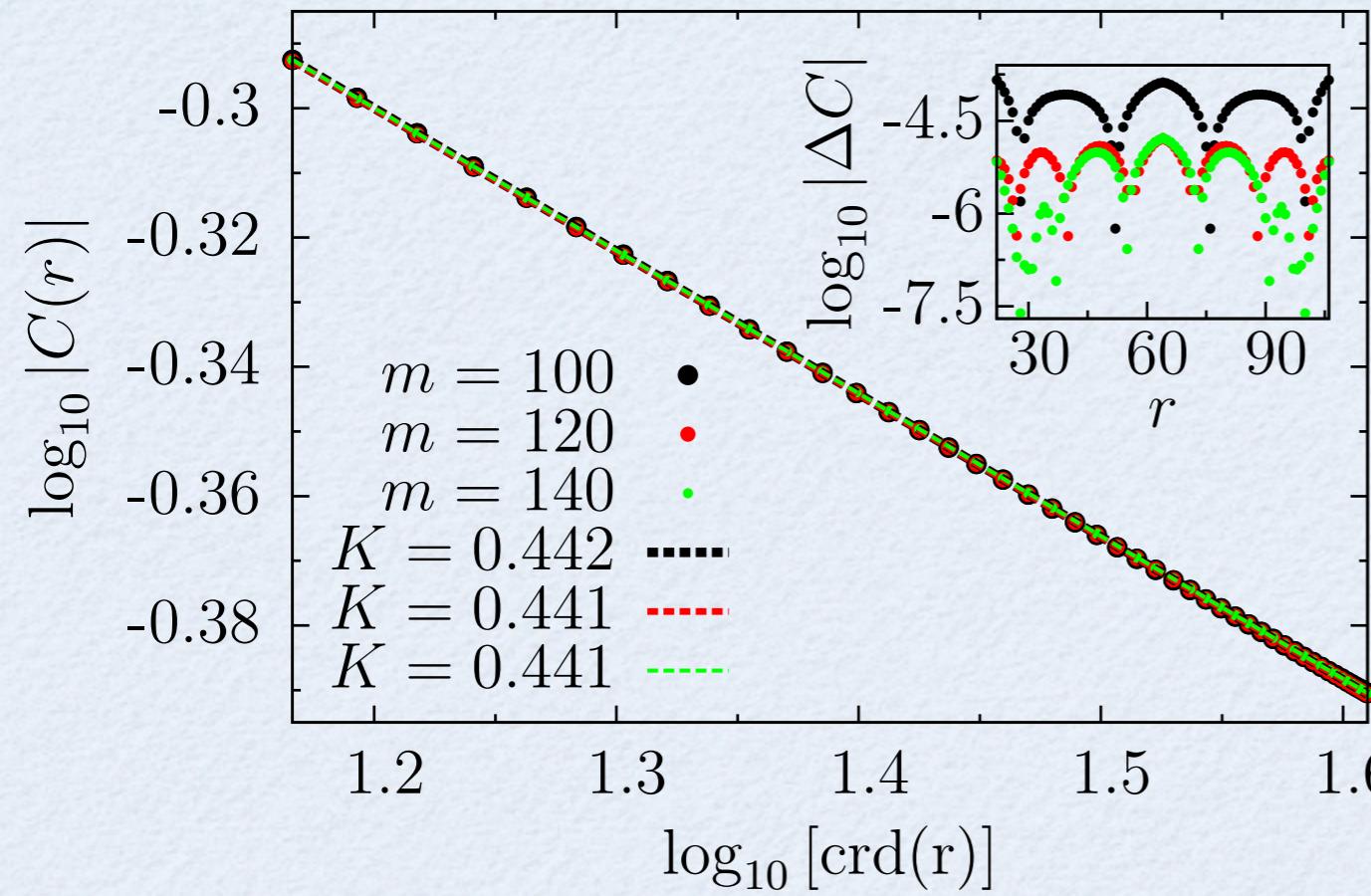
$$C(r) = \langle b_j^\dagger b_{j+r} \rangle \propto \text{crd}(r)^{-K/2}$$



PBC \rightarrow chord distance

$$\text{crd}(r) = N_s / \pi \sin(\pi r / N_s)$$

Indicator 2: hopping correlation decay (K)



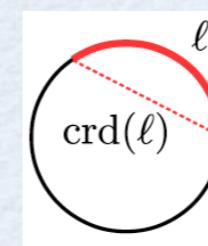
“Clean” Mott - Superfluid trans.

$$K_c = 1/2$$

$$t_c = 0.299 \pm 0.002$$

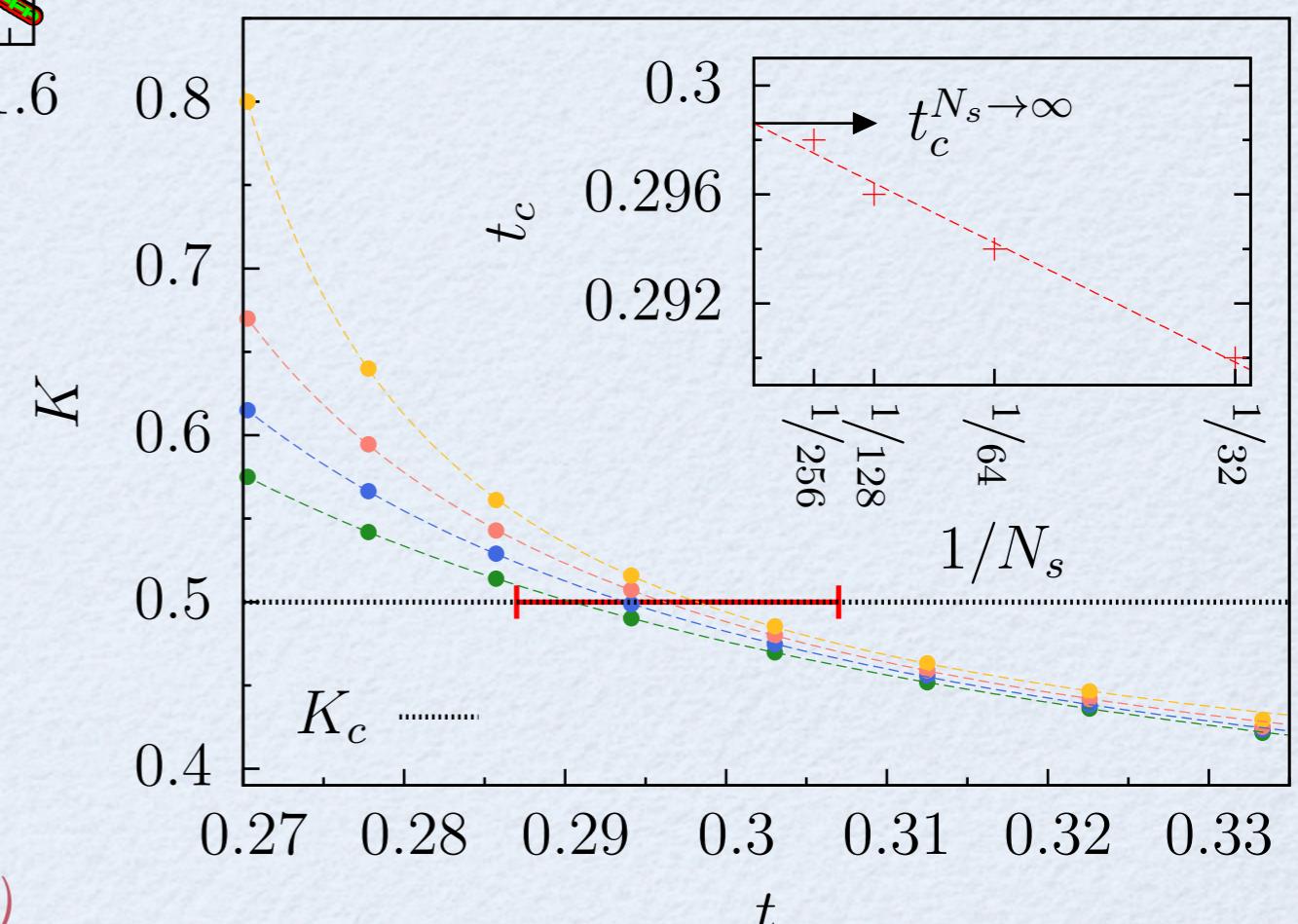
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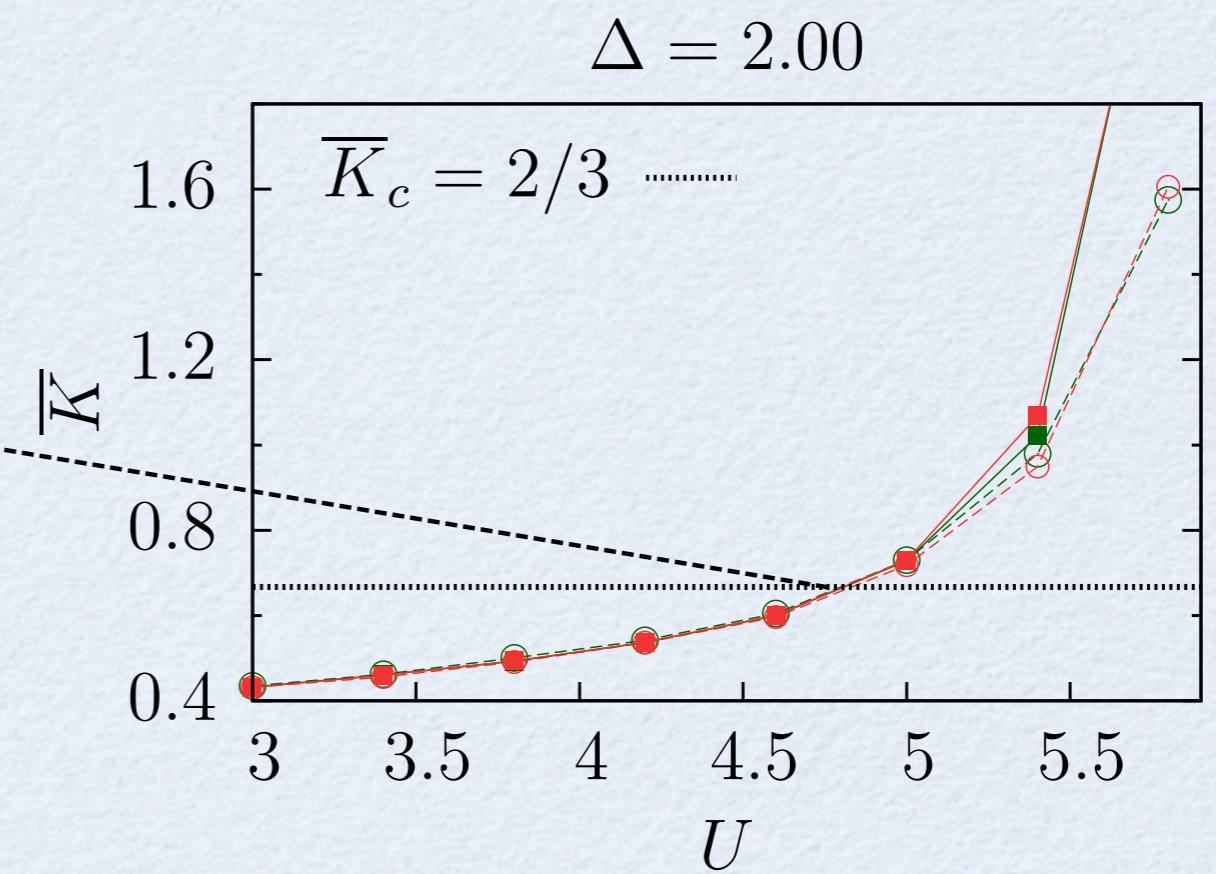
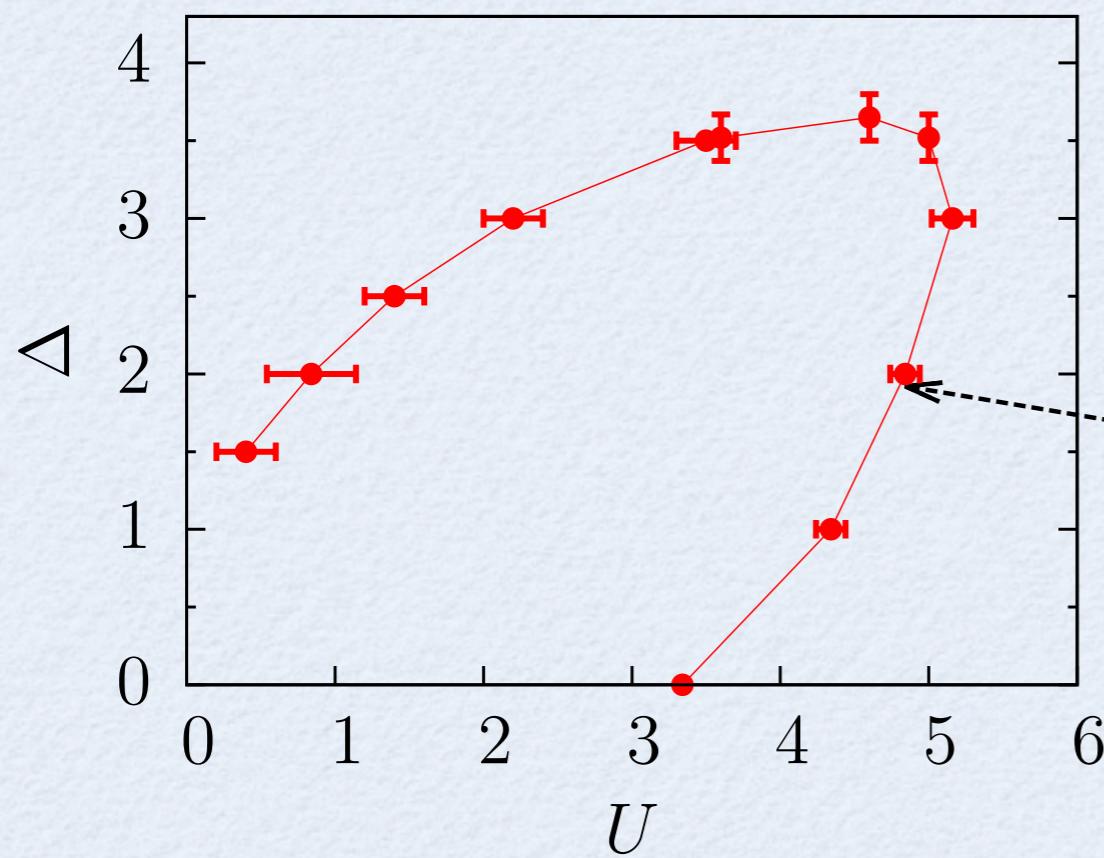


Indicator 2: hopping correlation decay (\bar{K})

Disorder-averages $\bar{A}_s \equiv \frac{1}{n_r} \sum_{\gamma=1}^{n_r} \langle A \rangle_{\gamma}$ over “reasonable” $n_r = 10^2 \div 10^3$

Giamarchi-Schulz SF criterion $\bar{K}_c = 2/3$

T. Giamarchi, H.J. Schulz, PRB 37, 325 (1988).



Indicator 2: hopping correlation decay (K)

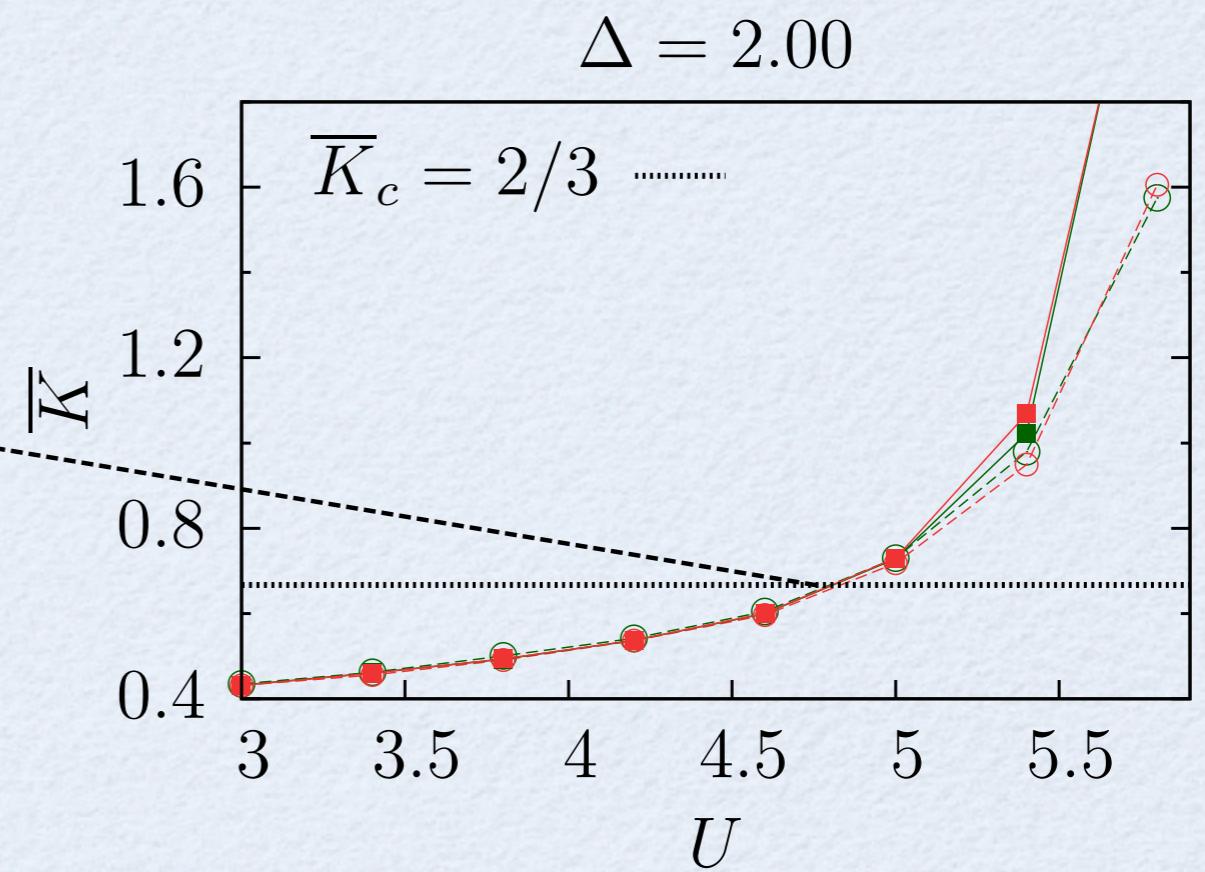
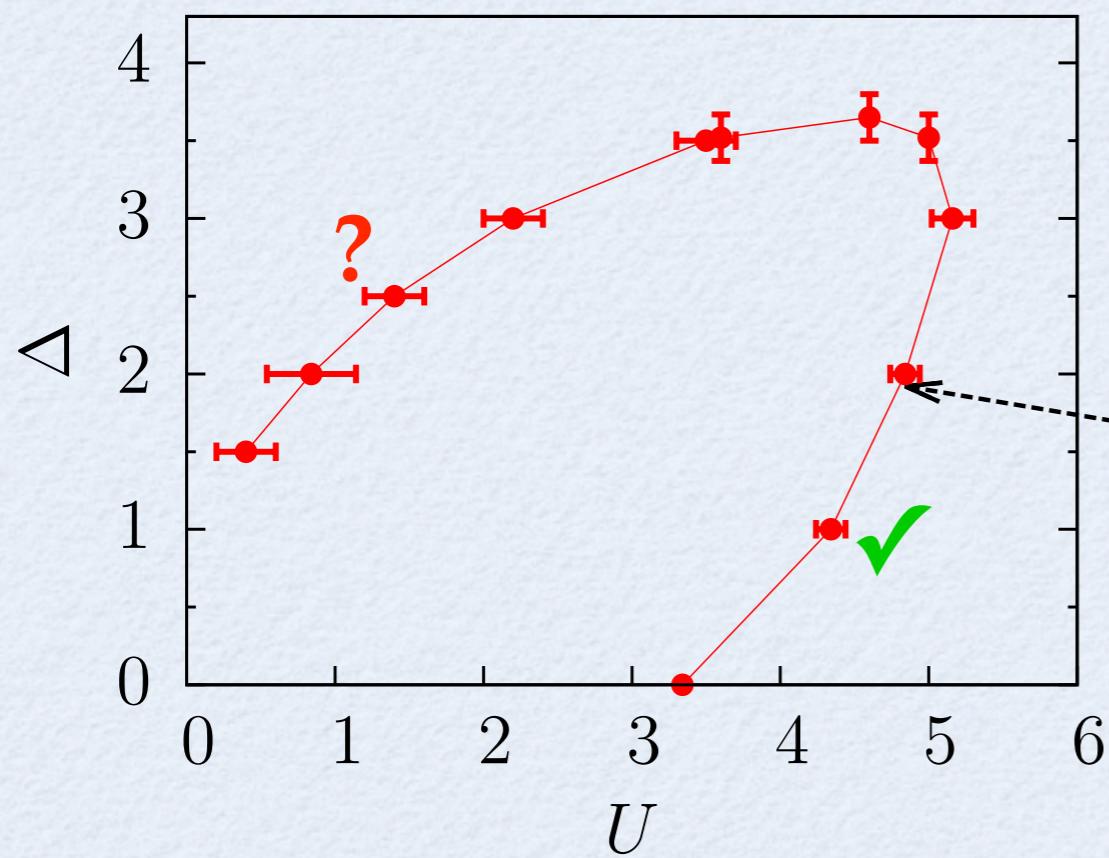
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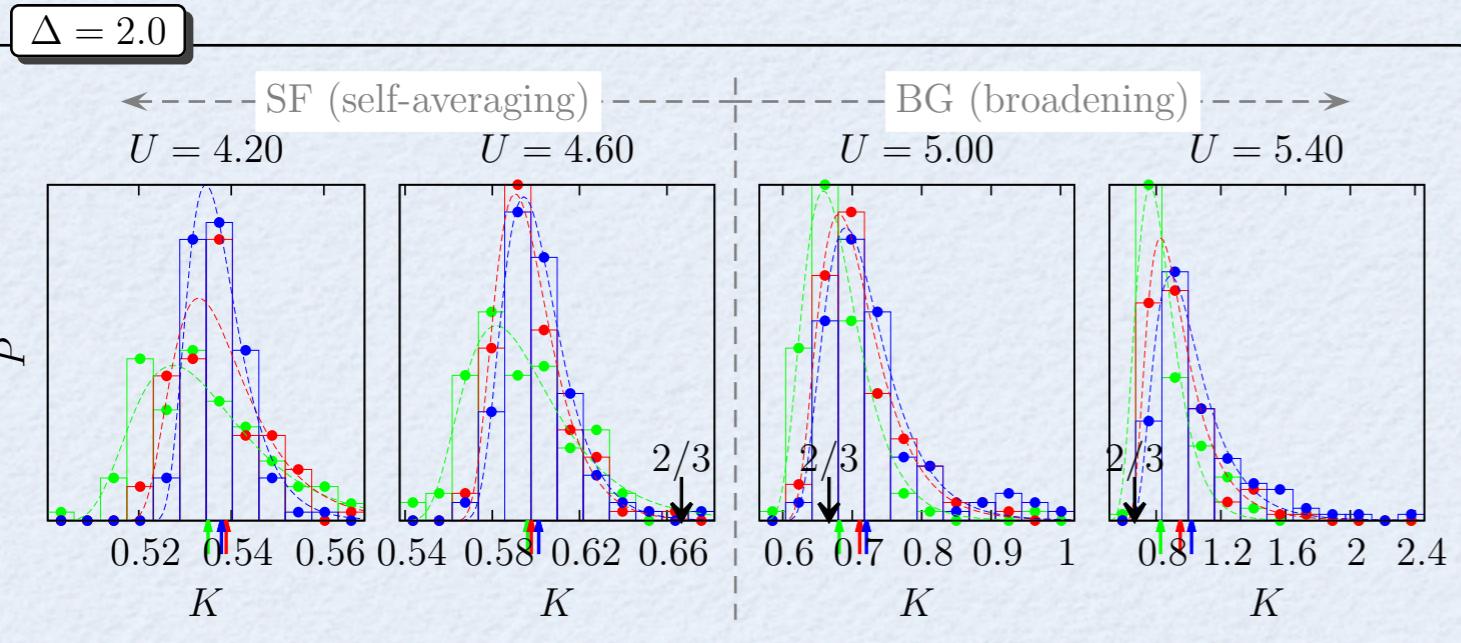
✓ appropriate $\Delta/U \ll 1$
 ? (highly) debated $\Delta/U \gg 1$

L. Pollet, Comptes Rendus Physique 14, 712 (2013)



Indicator 3: K -distribution properties

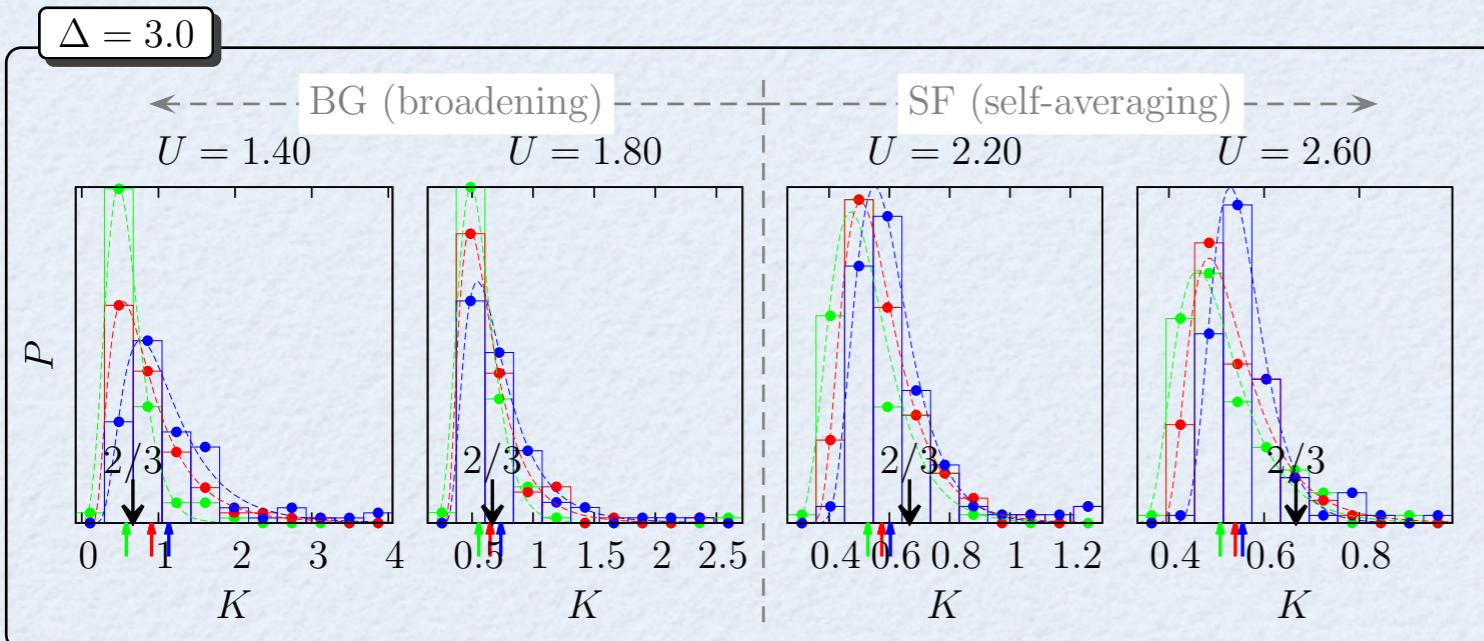
New universality class:
XY-scratched !? → Lobe shrinking
due to rare events → Broadening vs. averaging
with system size



*Pollet, Prokof'ev, Svistunov,
PRB 87, 144203 (2013)*

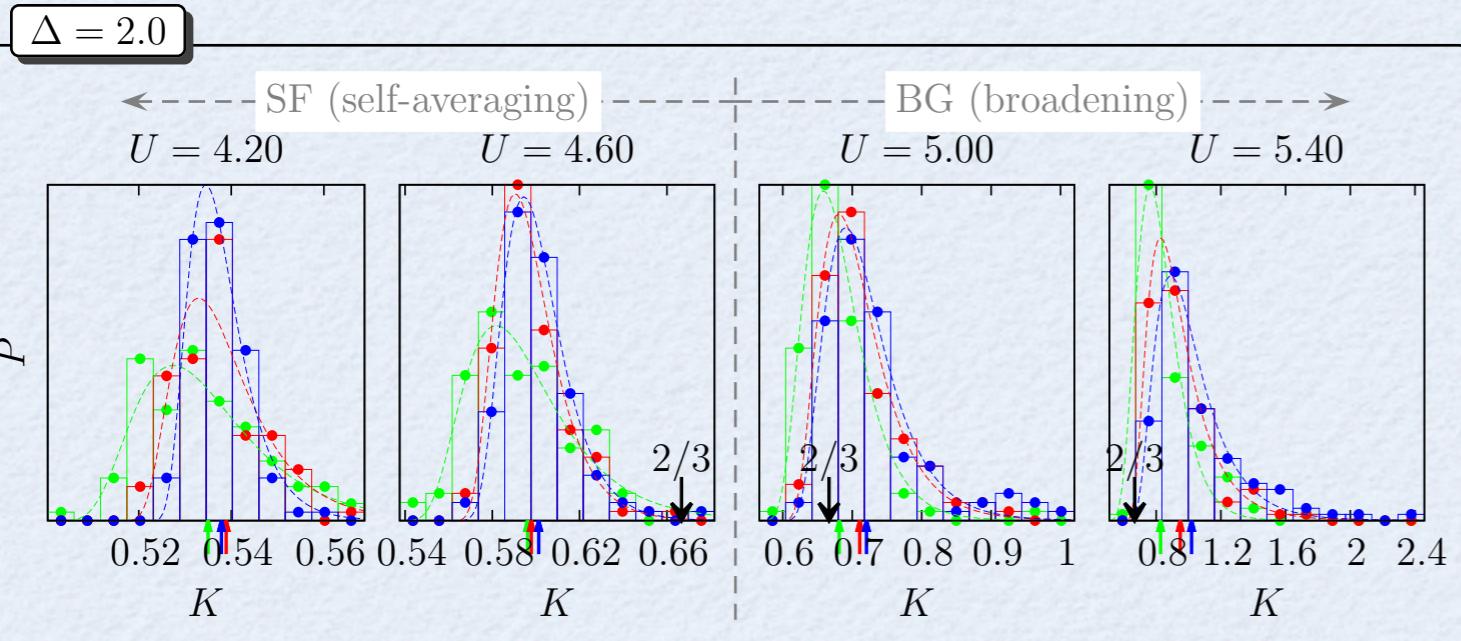
$$P(x) = \frac{1}{\sigma\sqrt{2\pi}} \frac{1}{x} \exp\left(-\frac{1}{2}\left(\frac{\log x - \mu}{\sigma}\right)^2\right)$$

$$x = K - K_{\min}$$



Indicator 3: K -distribution properties

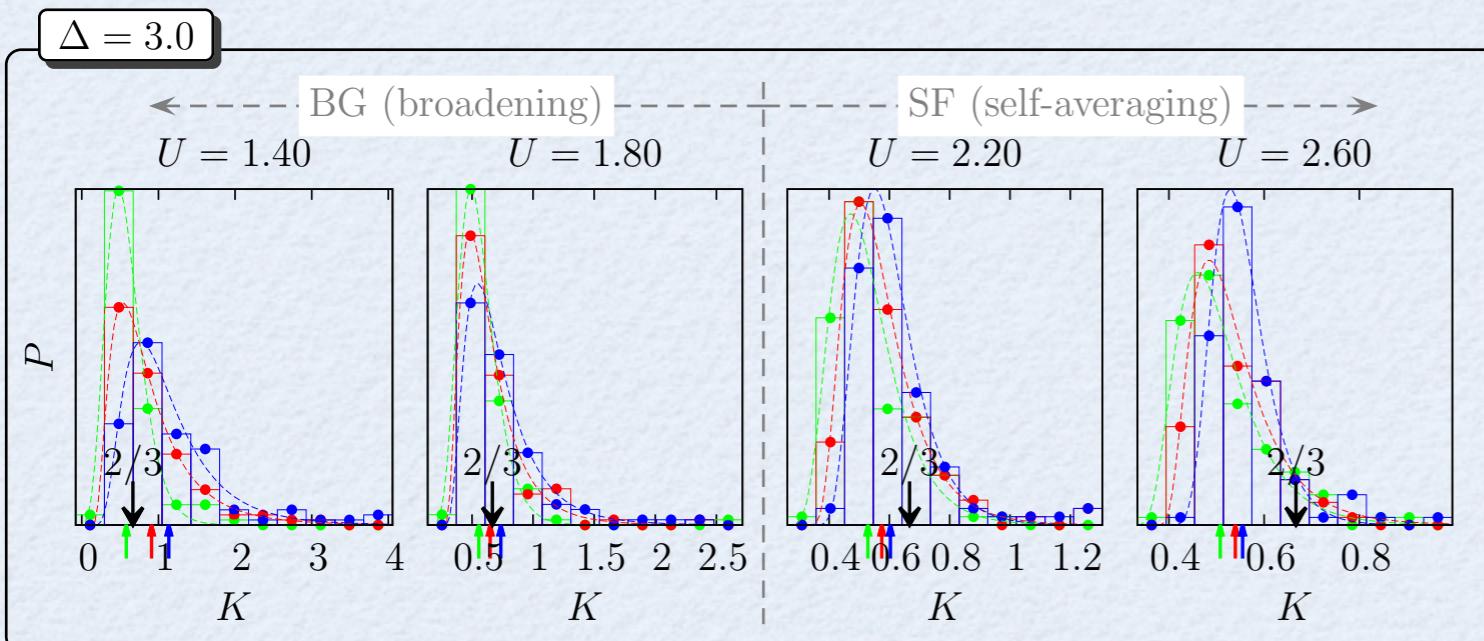
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Pollet, Prokof'ev, Svistunov,
PRB 87, 144203 (2013)

$$P(x) = \frac{1}{\sigma\sqrt{2\pi}} \frac{1}{x} \exp\left(-\frac{1}{2}\left(\frac{\log x - \mu}{\sigma}\right)^2\right)$$

$$x = K - K_{\min}$$



For “reasonable” sampling

$$\sigma(N_s) \simeq \sigma(N_s/2) \quad \overline{K} \simeq \overline{K}_c = 2/3$$

$n_r \gg N_s$
 $n_r \gtrsim 10^5$

to see deviations !

↓
Out of experimental reach !?

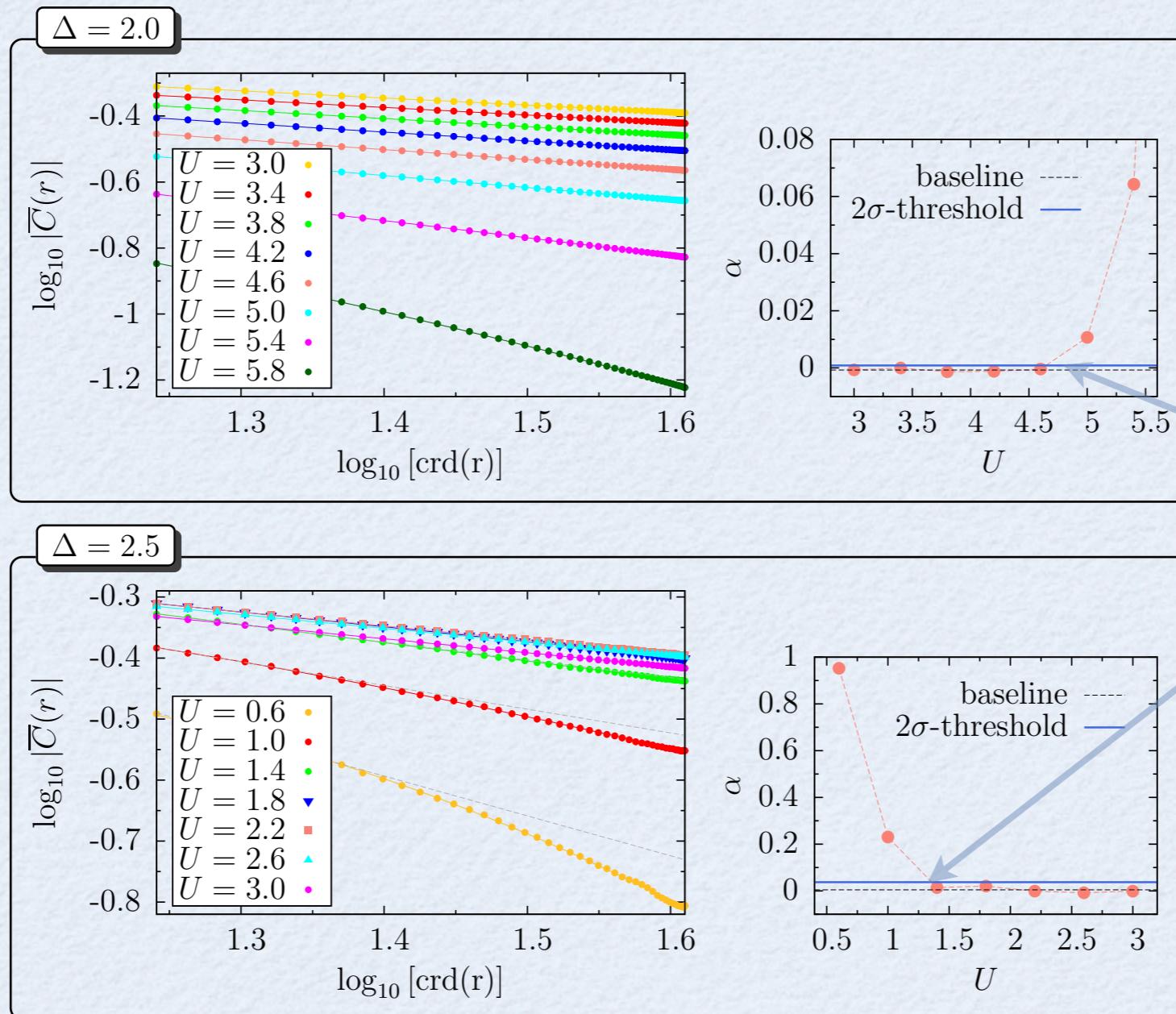
Indicator 4: averaged hopping correlations

No assumption on transition class $\log [\bar{C}(r)] = -\alpha \tilde{r}^2 - \frac{K}{2} \tilde{r} + \text{const.}$

$$\tilde{r} = \text{crd}(r)$$

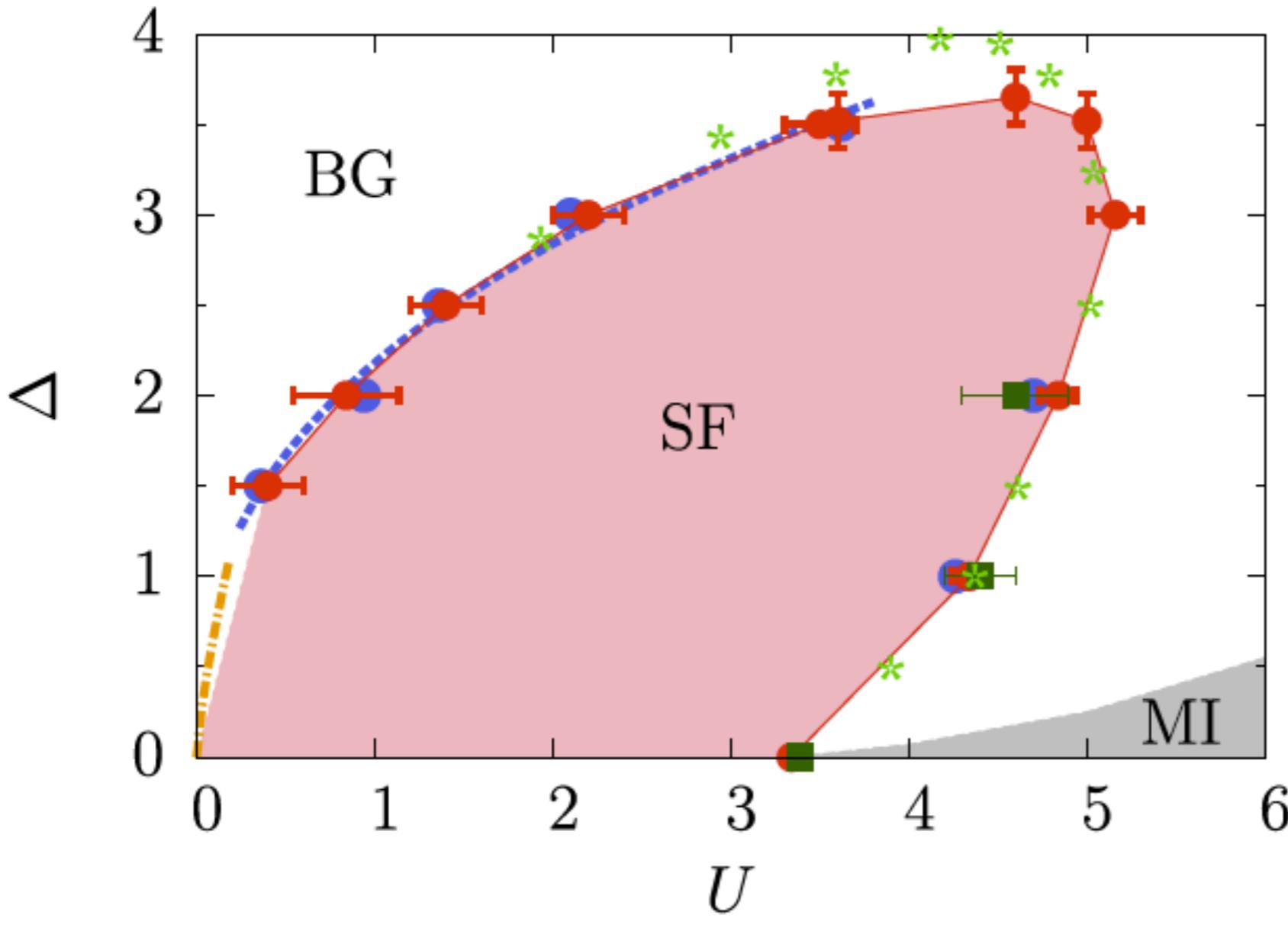
$\alpha = 0$ Superfluid

$\alpha \neq 0$ Insulator (BG)



guessed U_c

The phase diagram



jump in $\bar{\rho}_s$ ■
 $\overline{K} = 2/3$ ●
 $\overline{C}(r)$ crossover ○
fit -----
 $\Delta_c \sim U^{3/4}$ - - -

Quantum MonteCarlo
*N.V. Prokof'ev, B.V. Svistunov,
PRL 80, 4355 (1998)*

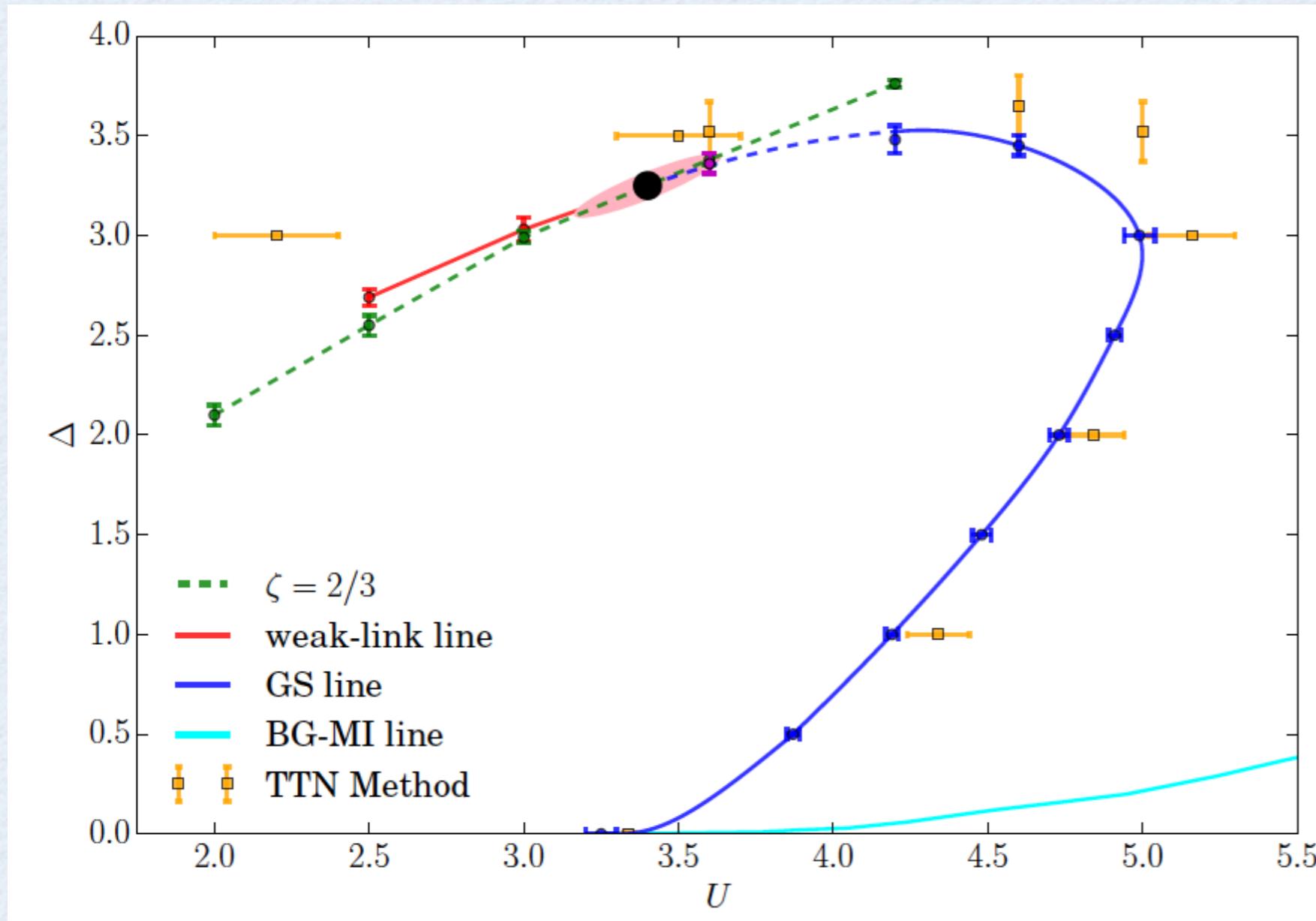
“scratched XY” conjecture
 $\Delta_c \propto U^{3/4}$

L. Pollet, Comptes Rendus Physique 14, 712 (2013)

The phase diagram

Most recent QMC results - averages over 50.000 realizations

Z. Yao, et al., arXiv:1601.06185



OUTLINE

- Motivation: why periodic boundaries?
- Tree Tensor Networks & adaptive gauge picture
- Some benchmark data
- Disordered Bose-Hubbard model
- Summary & Future perspectives

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Persistent currents in Dirac rings



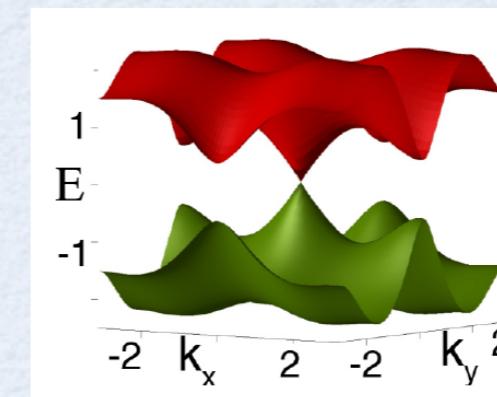
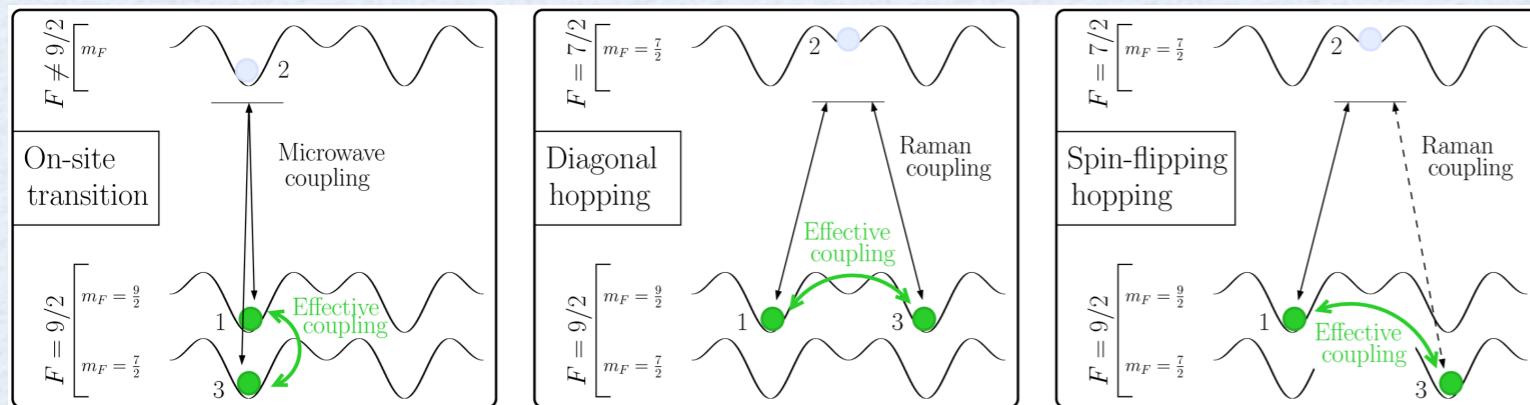
orbital magnetic susceptibility of 1D cold Dirac fermions

→ orbital paramagnets of pure many-body origin !?



J. Jünemann

tunable gauge potentials with cold atoms



M. Bischoff

M. Rizzi, POS (SISSA) 193 (QCD-TNT-III), 036 (2013)



$$\begin{aligned} & i t \sigma_z \\ & g \sigma_x \\ & m \sigma_x \end{aligned}$$

Creutz ladder at $m=g=t$



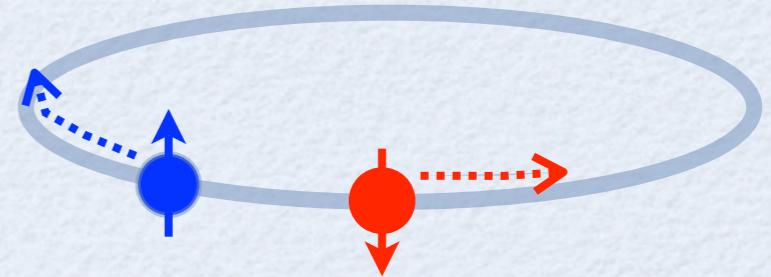
isolated cone at $k=0$



consider interactions

Future: time-dependent problems

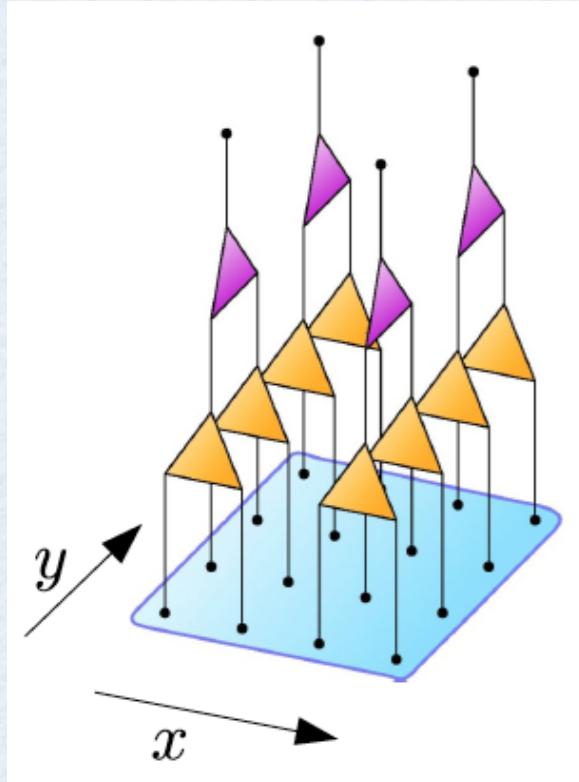
- implement time-dependence in TTN's
(e.g., TEBD or TDVP like)
- study generation and decay
of orbital and spin currents:
spin-drag, dynamical instabilities, pairing effects, ...
- study quenches and relaxation with disorder (MBL!?)



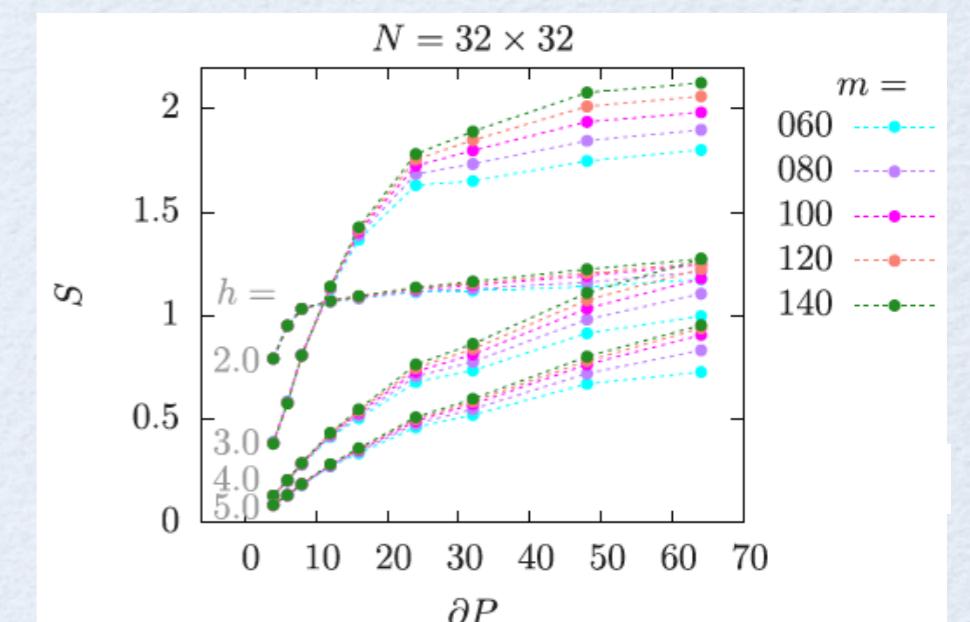
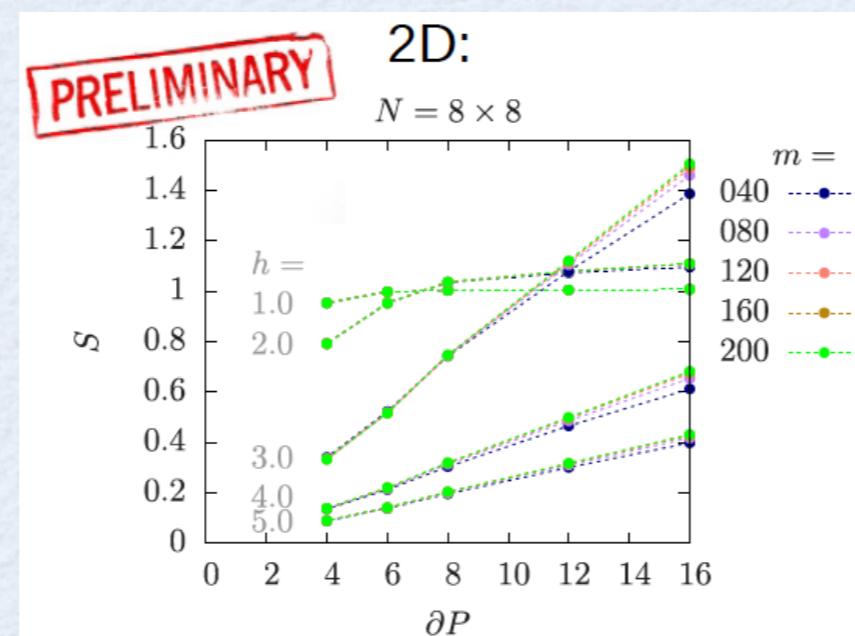
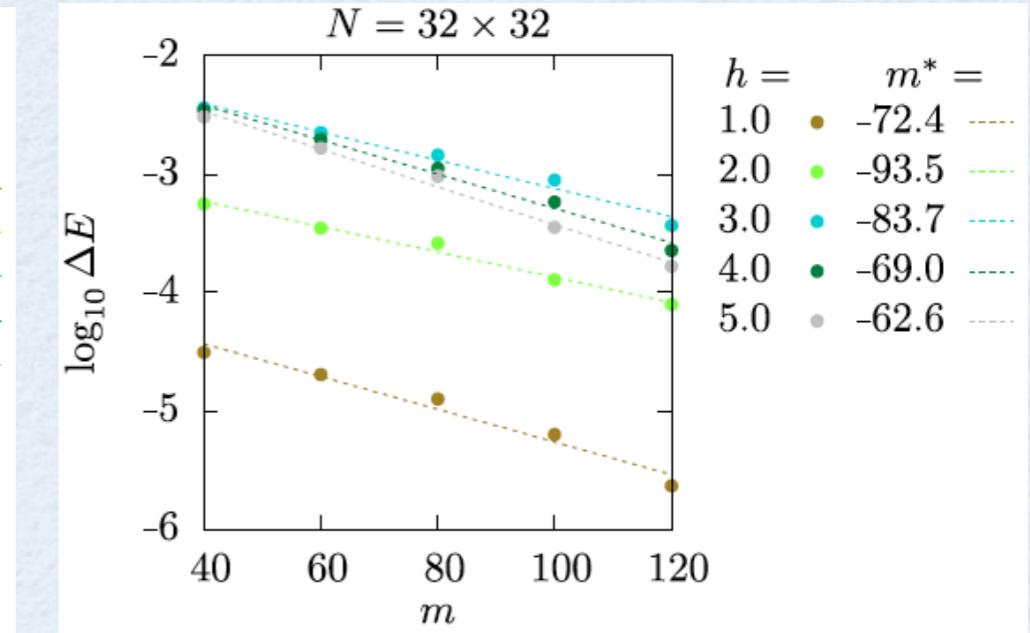
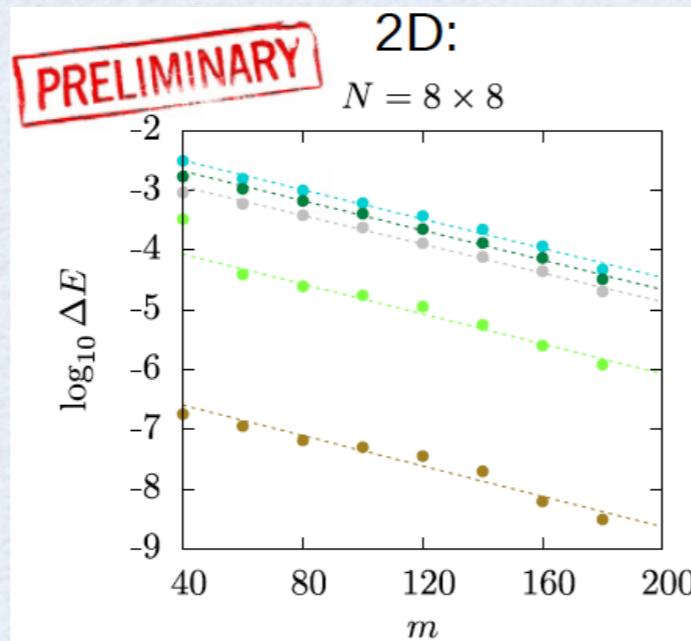
Future: what about 2D ?



- it should **not** work, but what if brute force helps ?
on-going tests on Ising in transverse field ($h_c \sim 3.04$)



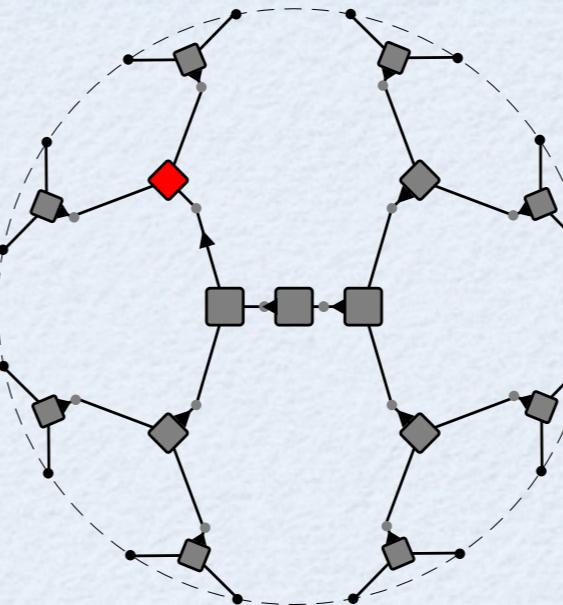
M. Gerster (Ulm)



Summary

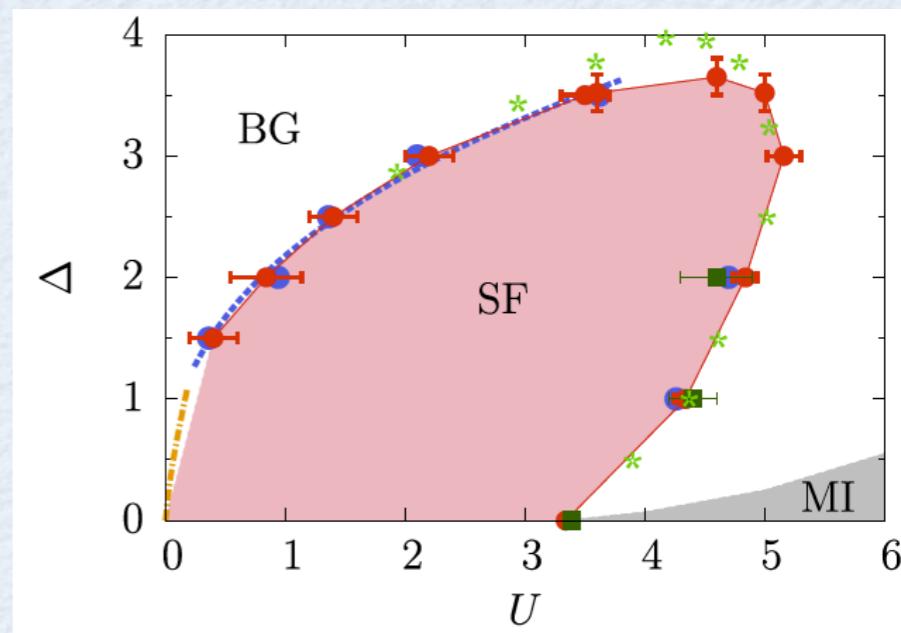
- Adaptive gauge strategy
for Tree Tensor Networks:
pbc enhanced performance !

PRB 90, 125154 (2015)



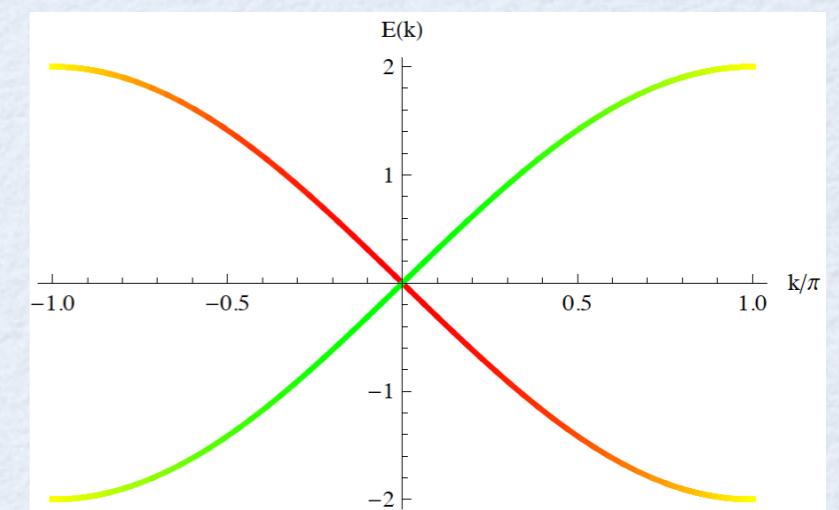
- 1D disordered Bose-Hubbard model:
a TTN study on Bose-Glass transition

NJP 18 015015 (2016)



- Future studies on persistent currents
in Dirac rings & other systems

POSTER by J. Jünemann (arriving tomorrow)



Thanks to ...

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D. Draxler (Wien)

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My group: J. Jünemann, A. Haller, M. Bishoff

\$\$\$:



JOHANNES GUTENBERG
UNIVERSITÄT MAINZ



... and all of you for your attention !