

# Large Cluster Dynamical Mean Field Simulations Emanuel Gull

A.J. Millis, A. Georges, M. Ferrero, N. Lin, O. Parcollet, P. Werner  
S. Fuchs, P. Staar, P. Nukala, M. Summers, T. Pruschke, T. Schulthess, T. Maier  
L. Pollet, E. Kozik, E. Burovski, M. Troyer  
KITP, Santa Barbara, Nov. 08 2010

[Phys. Rev. B 80, 045120 \(2009\)](#)

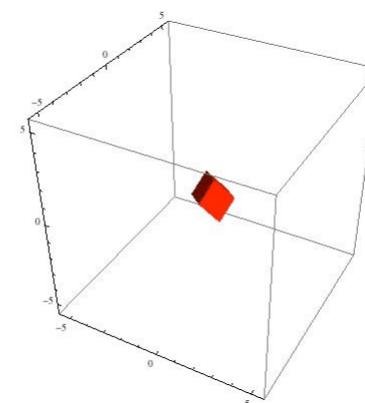
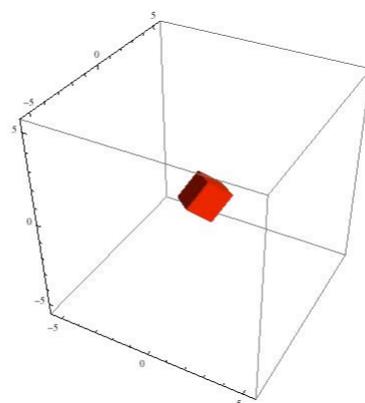
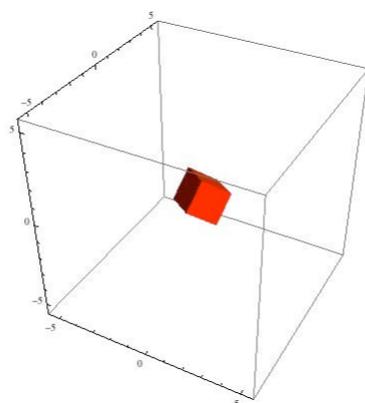
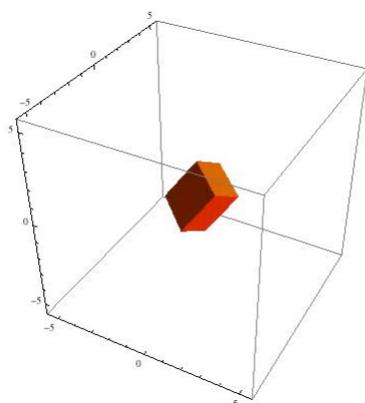
[Phys. Rev. B 82, 045104 \(2010\)](#)

[arXiv:1009.2759](#)

[Phys. Rev. B 80, 245102 \(2009\)](#)

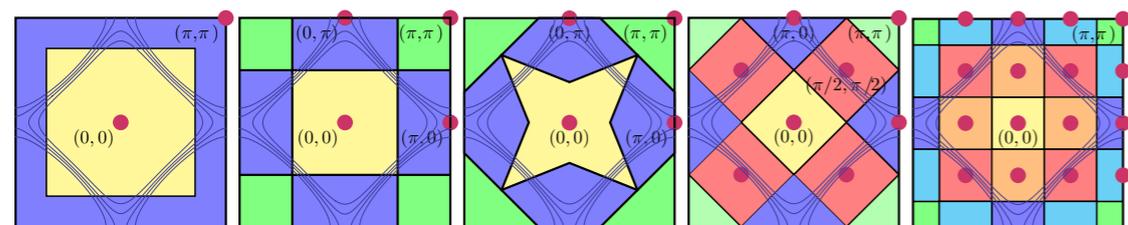
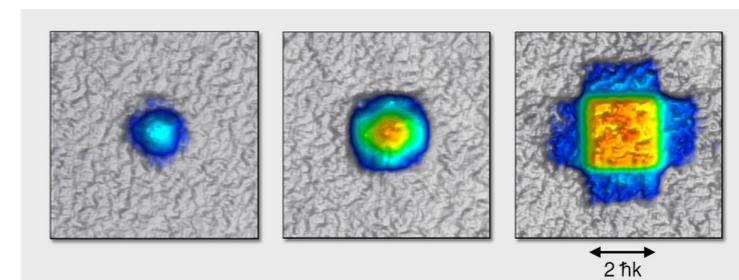
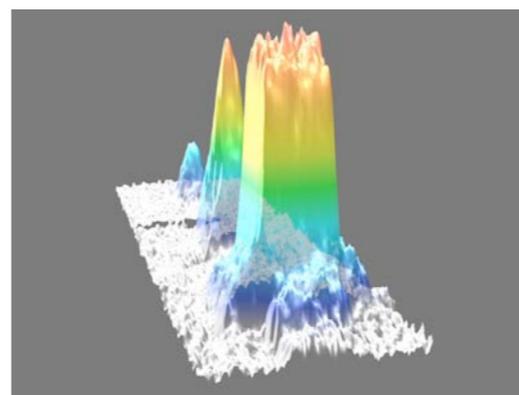
[Phys. Rev. B 82, 155101 \(2010\)](#)

[arXiv:1010.3690](#)



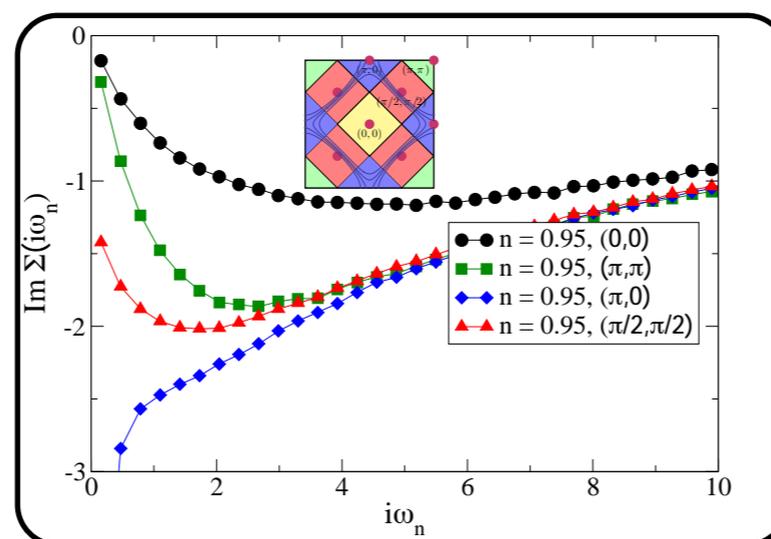
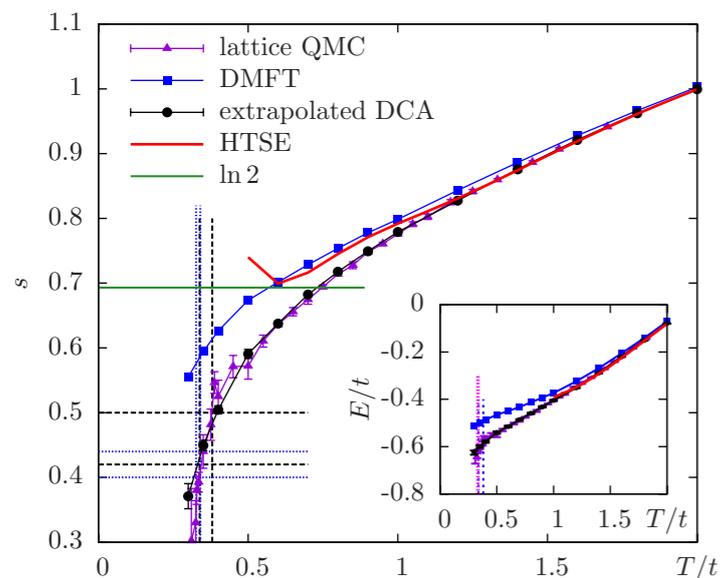
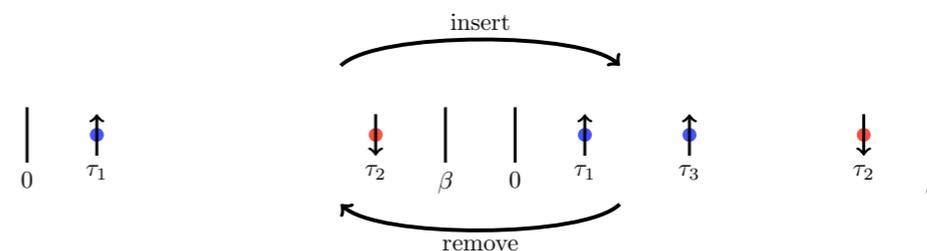
# Overview

## Large Cluster Studies – Motivation



## Cluster Dynamical Mean Field Theory with large clusters

## Impurity solver – Continuous-Time Auxiliary Field with sub-matrix updates



Results – Thermodynamics of the 3D Hubbard model (above  $T_N$ ), 2D Pseudogap physics

# Motivation – Large Cluster Studies

Optical Lattice Systems:  
Cold Fermionic Gases

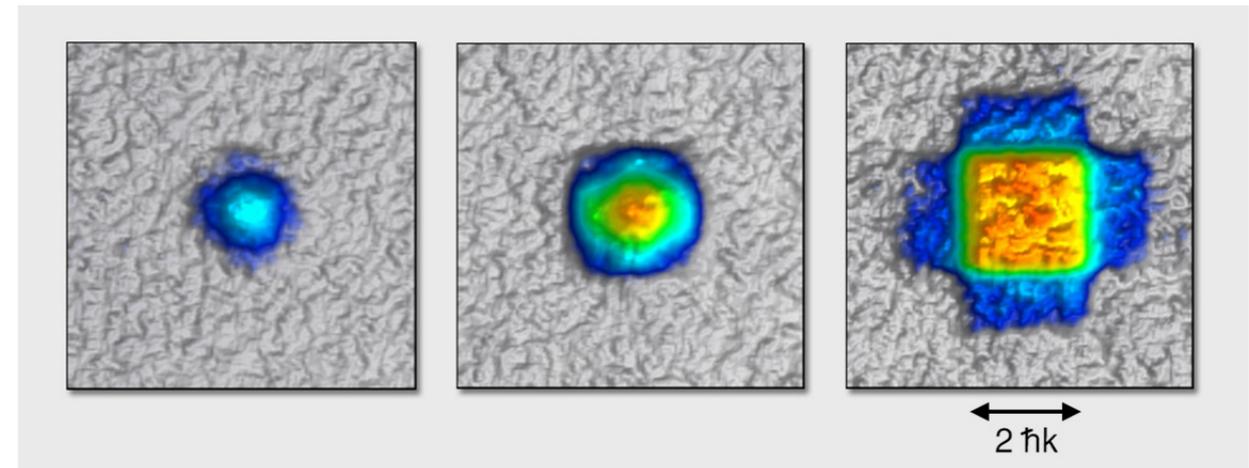
Cold Atomic Gases: goal to simulate  
simple model Hamiltonians

fermionic case: 3D Hubbard model

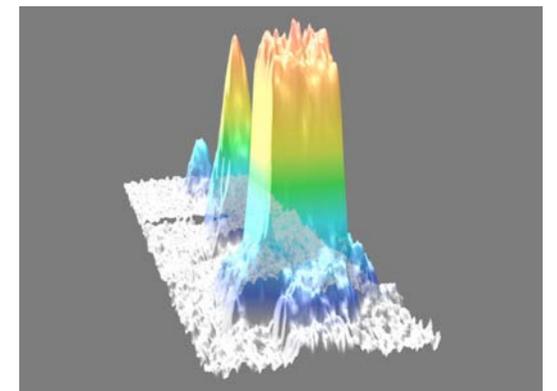
$$H = - \sum_{\langle ij \rangle, \sigma} t_{ij} (c_{i\sigma}^\dagger c_{j\sigma} + c_{j\sigma}^\dagger c_{i\sigma}) + U \sum_i n_{i\uparrow} n_{i\downarrow}.$$

Question to theory [numerics]: What is the thermodynamics of this model? (for all fillings, as a function of  $U/t$  and  $T/t$ ? Exact (or controlled) answer is needed.

- Temperatures in experiment are high (for now): When will we reach  $T_N$ ?
- Qualitative physics is comparatively simple and well understood (no exotic phases, no long range order above  $T_N$ )



T. Esslinger, Annu. Rev. Condens. Matter Phys. 1, 129-152 (2010)

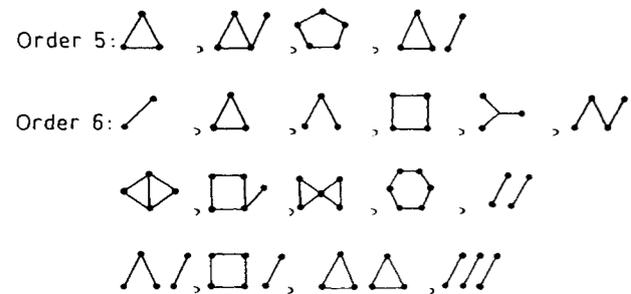


# Motivation – Large Cluster Studies

Controlled answer needed! Need to obtain results (values, error bars) to arbitrary accuracy; no systematic error or uncontrolled approximations.

Candidates:

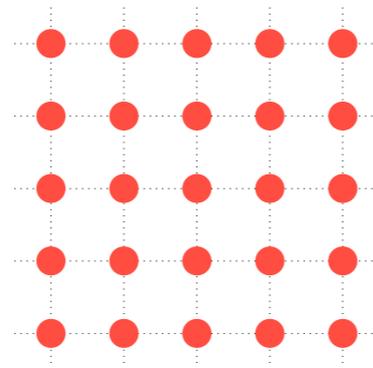
## High Temperature Series Expansion



Perfect at high temperature and for nearly empty bands

Henderson et al., Phys. Rev. B 46, 6328 (1992), De Leo et al., arXiv: 1009.2761

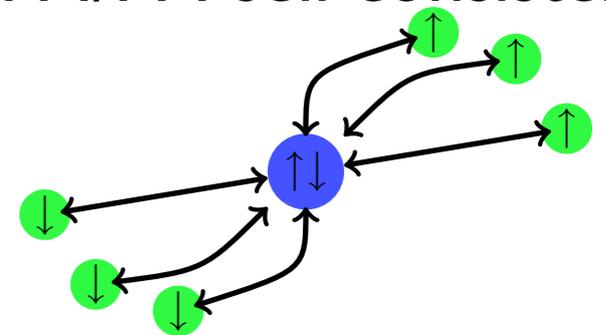
## Lattice algorithms (BSS, DiagMC, Det. DiagMC)



Strong at half filling, bad sign problem away from half filling

Scalettar et al., Phys. Rev. B 39, 4711 (1989), Fuchs et al., arxiv:1009.2759

## Single Site **Dynamical Mean Field** Method (+AFM/PM self consistency)

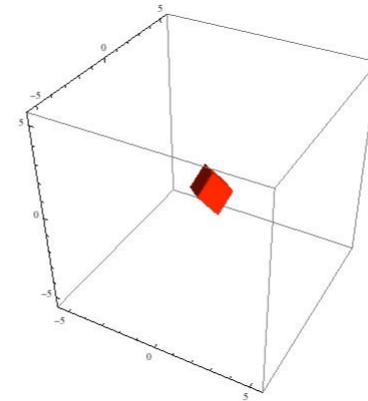


Different philosophy: Single Site DMFT is uncontrolled. (does not necessarily mean bad!)

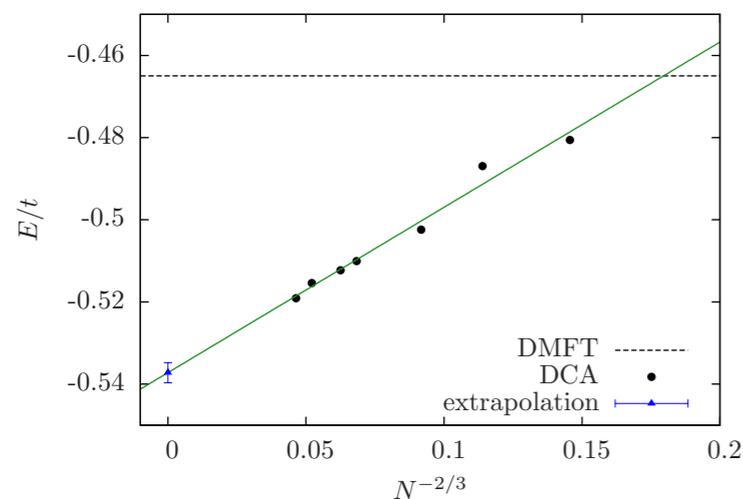
# Motivation – Large Cluster Studies

Another Candidate: Cluster Dynamical Mean Field Theory!

Method based on **discretization of the self energy in momentum (or real) space**



Blocks: patches on which self energy is constant



Exact limit is obtained by **extrapolating to the system with infinite cluster size** (as with BSS / DiagMC / other lattice simulations). This needs large enough cluster sizes [ here: 48-100 sites ]

Why **cluster** DMFT instead of **lattice** methods?

- **Convergence is faster** than in the lattice simulations.
- **Sign problem** away from half filling is better in DCA.
- However: Scaling of impurity solver algorithms is worse!

# Cluster Dynamical Mean Field Theory

Maier et al., Rev. Mod. Phys. 77, 1027 (2005)

$$\Sigma(k, \omega) = \sum_n \Sigma_n(\omega) \phi_n(k) \approx \sum_n^{N_c} \Sigma_n(\omega) \phi_n(k)$$

Approximation:  
Systematic truncation  
by cluster sites  $N_c$

$\phi_n(k)$  Basis functions

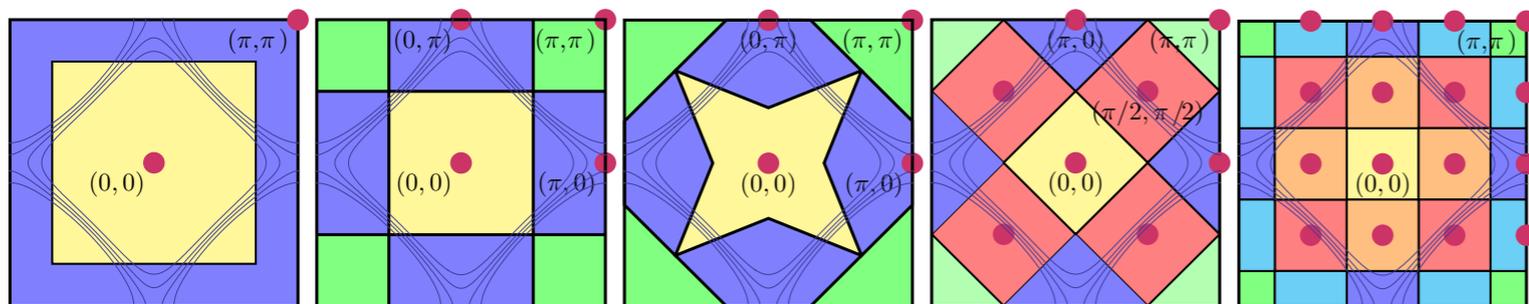
‘Machinery’ for obtaining approximated self energy:  
Cluster DMFT.

$\Sigma_n(\omega)$  Energy dependent, k-independent self-energy

Cluster DMFT is a controlled approximation.

Variants of cluster DMFT: **D**ynamical **C**luster **A**pproximation (used here) and **C**ellular **D**ynamical **M**ean **F**ield **T**heory: Differ in types of basis functions  $\phi_n(k)$

Within **DCA**:  $\phi_n(k)$  chosen to be constant on patches in momentum space.



Typical 2d DCA clusters  
with 2, 4, 4, 8, and 16 sites

# Cluster DMFT – Impurity Solvers

$$\Sigma(k, \omega) = \sum_n \Sigma_n(\omega) \phi_n(k) \approx \sum_n^{N_c} \Sigma_n(\omega) \phi_n(k)$$

Algorithm that produces  $\Sigma_n(\omega)$  : Mapping onto an **impurity problem** & **self-consistent hybridization** with a “bath”.

$$H_{\text{QI}} = H_{\text{loc}} + H_{\text{hyb}} + H_{\text{bath}}$$
$$H_{\text{loc}} = \sum_i \epsilon_i (n_{i\uparrow} + n_{i\downarrow}) + U n_{i\uparrow} n_{i\downarrow}$$
$$H_{\text{bath}} = \sum_{k\alpha} \epsilon_{k\alpha} c_{k\alpha}^\dagger c_{k\alpha}$$
$$H_{\text{hyb}} = \sum_{k\alpha b} V_k^{\alpha b} c_{k\alpha}^\dagger d_b + H.c.$$

Requirements for an ‘impurity solver’ algorithm:

- Solve **large cluster impurity** problems, at and **away from half filling**, for small and large interactions (density-density), at finite temperature.
- No further approximations ( $\Delta\tau$  - errors, bath discretization, ...).

# Cluster DMFT – Impurity Solvers

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Only Candidates: **Continuous-Time** quantum Monte Carlo algorithms. We use: **Continuous-Time Auxiliary Field (CT-AUX)** algorithm.

# Continuous-Time quantum Monte Carlo impurity solvers

Diagrammatic expansion of the partition function of an impurity model in the interaction or the hybridization, sampling of the resulting series stochastically up to infinite order.

$$H_{\text{QI}} = H_a + H_b$$

A. N. Rubtsov, V. V. Savkin,  
A. I. Lichtenstein, Phys.  
Rev. B 72 035122 (2005)

$$Z = \text{Tr} T_\tau e^{-\beta H_a} \exp \left[ - \int_0^\beta d\tau H_b(\tau) \right] = \sum_k (-1)^k \int_0^\beta d\tau_1 \dots \int_{\tau_{k-1}}^\beta d\tau_k \text{Tr} [e^{-\beta H_a} H_b(\tau_k) H_b(\tau_{k-1}) \dots H_b(\tau_1)]$$

## Hybridization Expansion

$$H_a = H_{\text{loc}};$$

$$H_b = H_{\text{hyb}} + H_{\text{bath}}$$

Exponential scaling in size of local Hilbert space

P. Werner, A. Comanac, L. de Medici, M. Troyer, and  
A. J. Millis, Phys. Rev. Lett. 97, 076405 (2006)

## Continuous-Time Auxiliary Field

$$H_a = H_{\text{bath}} + H_{\text{hyb}} + H_{\text{loc}}^0;$$

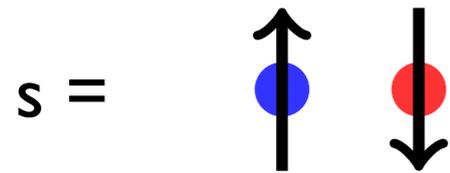
$$H_b = H_{\text{loc}}^I$$

Efficiency dependent on type of interaction in  $H_{\text{loc}}^I$

E. Gull, P. Werner, O. Parcollet, M. Troyer, EPL 82,57003 (2008)

# Continuous-Time Auxiliary Field impurity solver

Auxiliary field decoupling of  
interaction term  $s=\pm 1$



$$1 - \frac{\beta U}{K} \left( n_{i\uparrow} n_{i\downarrow} - \frac{n_{i\uparrow} + n_{i\downarrow}}{2} \right) = \frac{1}{2} \sum_{s=\pm 1} \exp(\gamma s (n_{i\uparrow} - n_{i\downarrow})),$$

$$\cosh(\gamma) = 1 + \frac{U\beta}{2K}.$$

$$Z = \sum_{k=0}^{\infty} \sum_{s_1, \dots, s_k = \pm 1} \int_0^{\beta} d\tau_1 \cdots \int_{\tau_{k-1}}^{\beta} d\tau_k \left( \frac{K}{2\beta} \right)^k Z_k(\{s_k, \tau_k\}),$$

Partition function expansion

$$Z_k(\{s_i, \tau_i\}) \equiv \text{Tr} \prod_{i=k}^1 \exp(-\Delta \tau_i H_0) \exp(s_i \gamma (n_{\uparrow} - n_{\downarrow})).$$

Compute trace of product of  
exponentials of one-body operators  
as determinant of matrix.

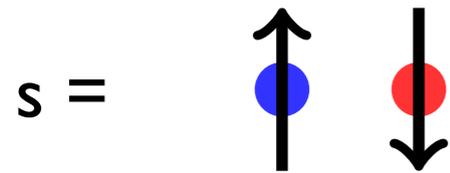
Stochastic sampling of diagrams  
of the partition function:

No truncation of expansion!  $0$

$\beta$

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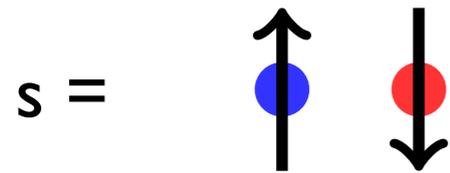
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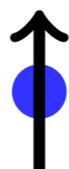
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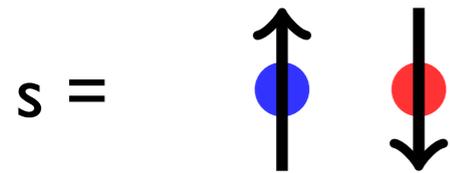
  
 $\tau_1$

  
 $\tau_2$

$\beta$

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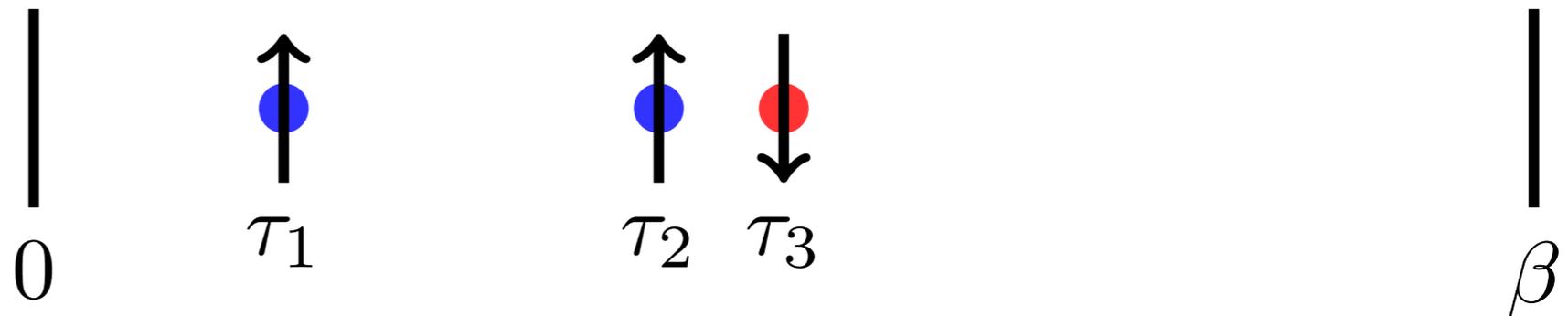
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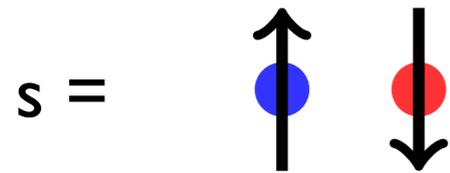
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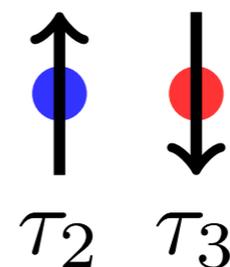
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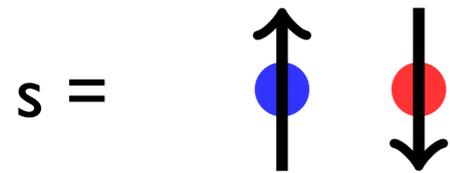
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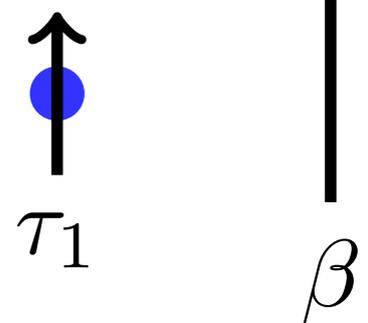
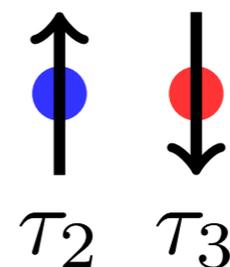
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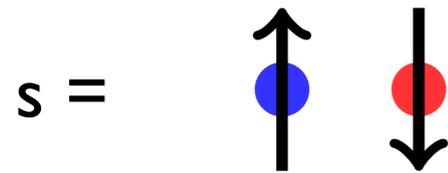
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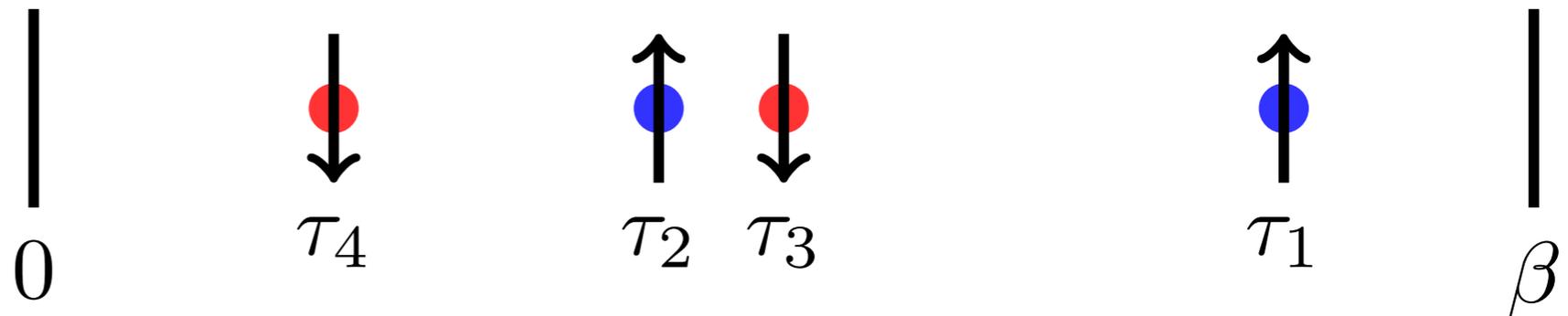
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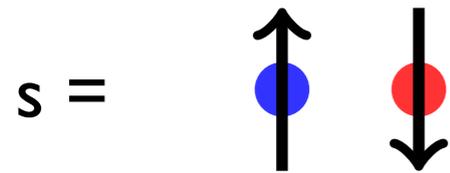
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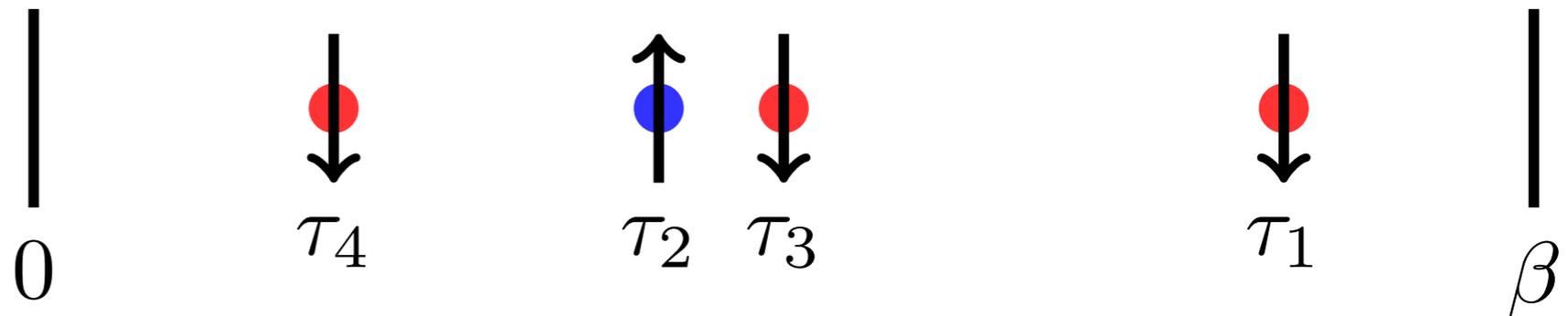
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# Sub-Matrix updates

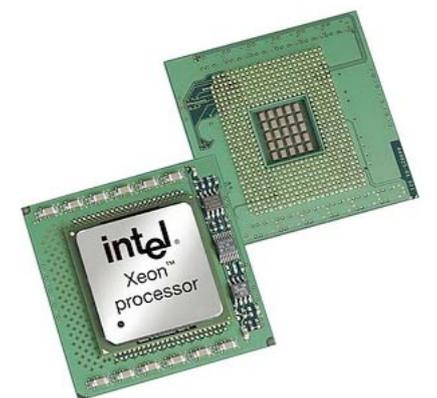
Standard updates in auxiliary field impurity solvers: rank one operations (ger),  $O(N^2)$  operations for  $O(N^2)$  data: dominated by data access.

$$N'_{ij} \leftarrow N_{ij} + (G_{ip} - \delta_{ip}) \lambda_p \times [N_{pj}]$$



Sub-Matrix updates: based on matrix (gemm) operations:  $O(N^3)$  operations on  $O(N^2)$  data: runs at speed of (fast) CPU/Cache.

$$N^{q+1}_{ij} \leftarrow D_i^{-1} (N^q_{ij} - G^q_{ip_k} \times [\Gamma^{-1}_{p_k p_l}] \times [N_{p_l j}])$$



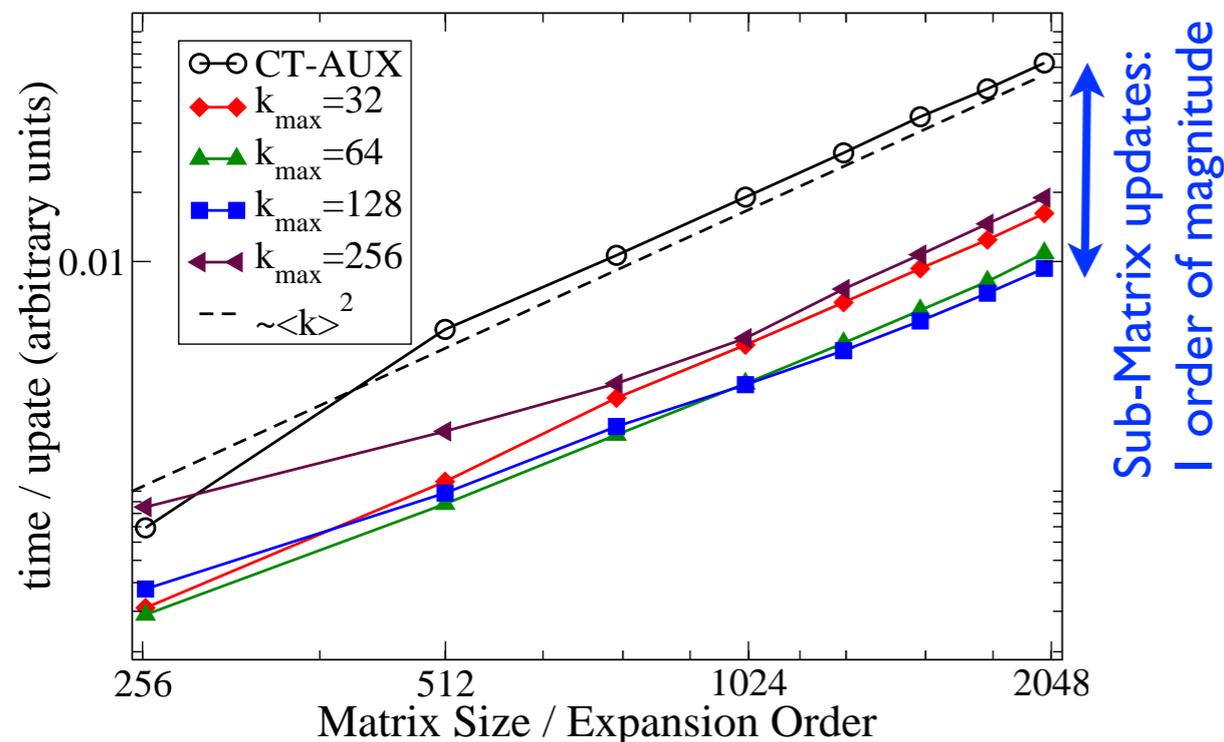
Linear algebra reformulated, overhead grows with size of  $\Gamma$  but operations 10x faster

# Technical Challenges

Scaling: determines how large clusters are accessible; whether the infinite cluster size extrapolation is possible **in practice**.

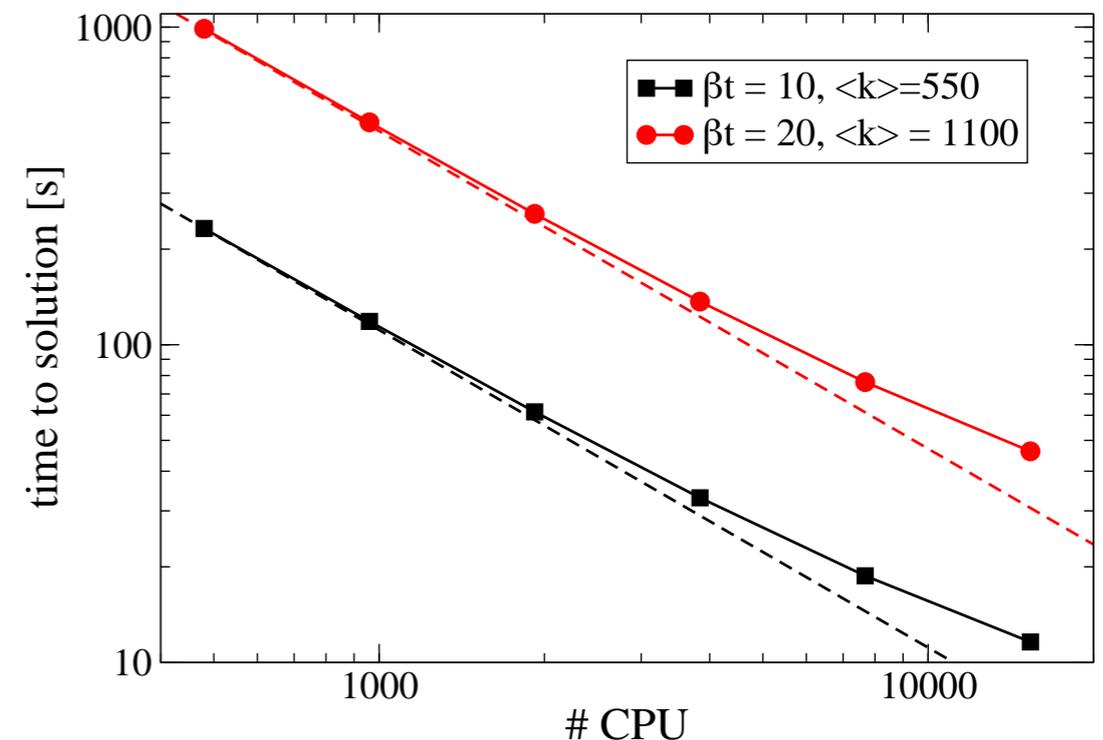
## Weak Scaling

Scaling as a function of **problem size** (cluster size, interaction strength, inverse temperature).



## Strong scaling

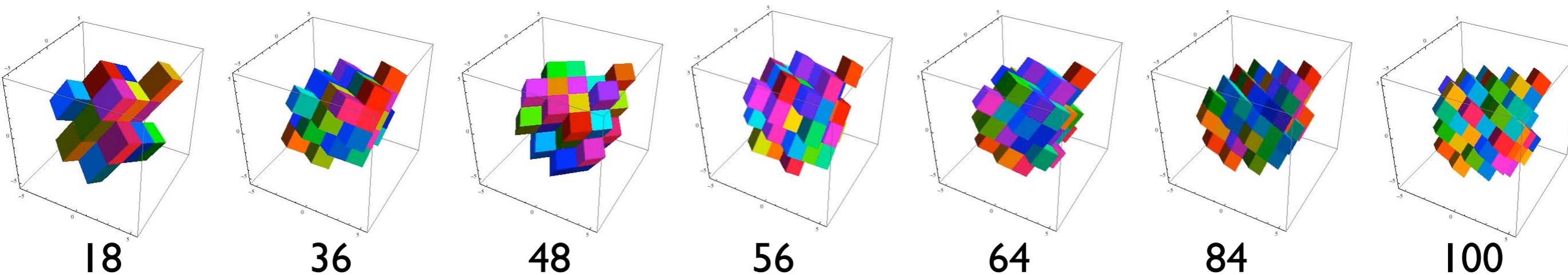
Scaling as a function of **resources**: Time to solution for a typical problem (16 site cluster,  $U/t = 8$ , beta  $t=10$  and  $20$ )



All results from now on: Obtained with  $\leq 128$  CPUs,  $\leq 2$ h per iteration.

# Extrapolation procedure

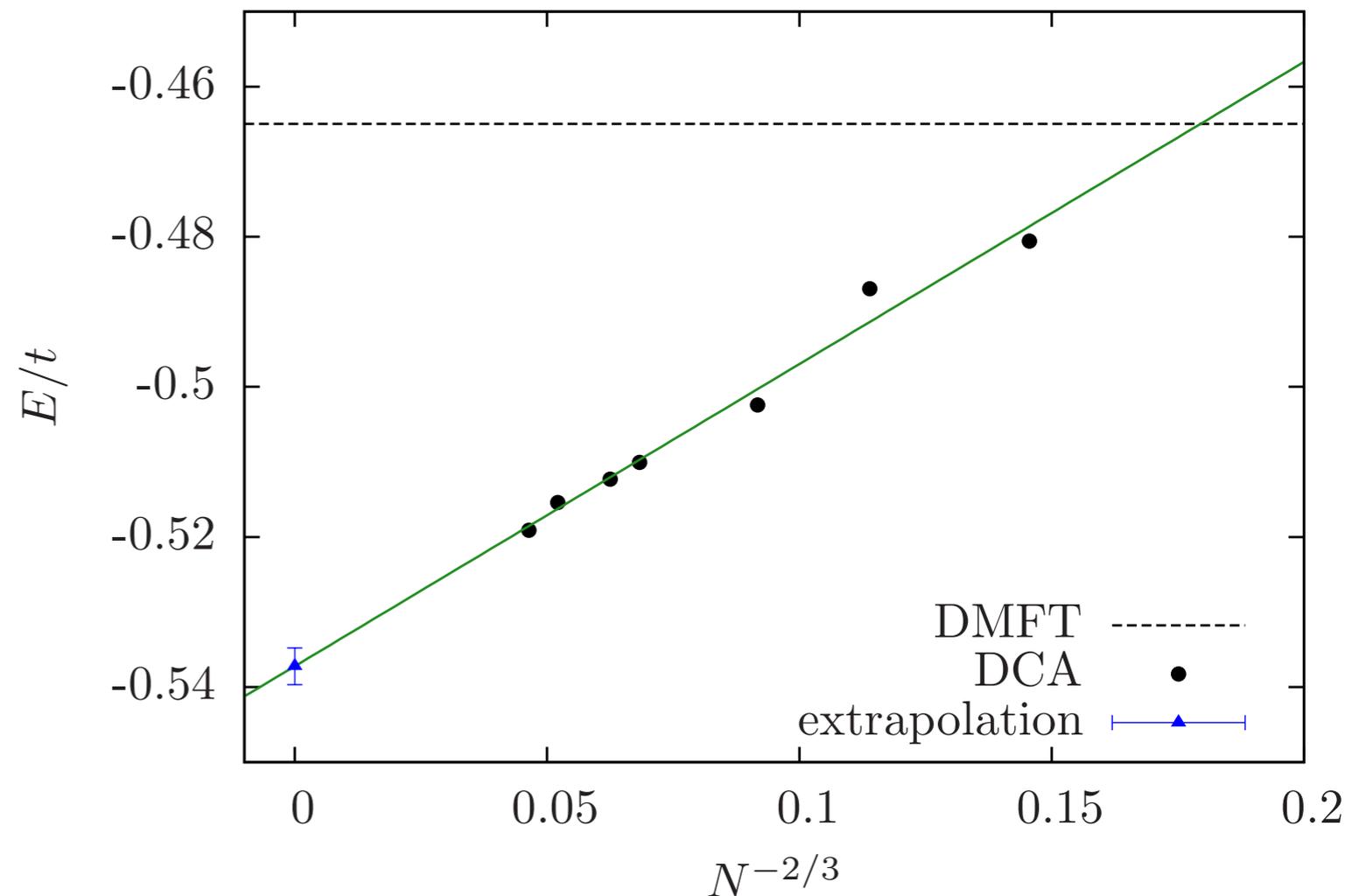
Solve quantum impurity model self-consistently for a range of cluster sizes:



Compute thermodynamics: energy, density, entropy, free energy, double occupancy, spin correlation functions, ...: Results and error estimates for a finite size system.

Extrapolate observable estimate to the infinite system size limit using known finite size scaling:

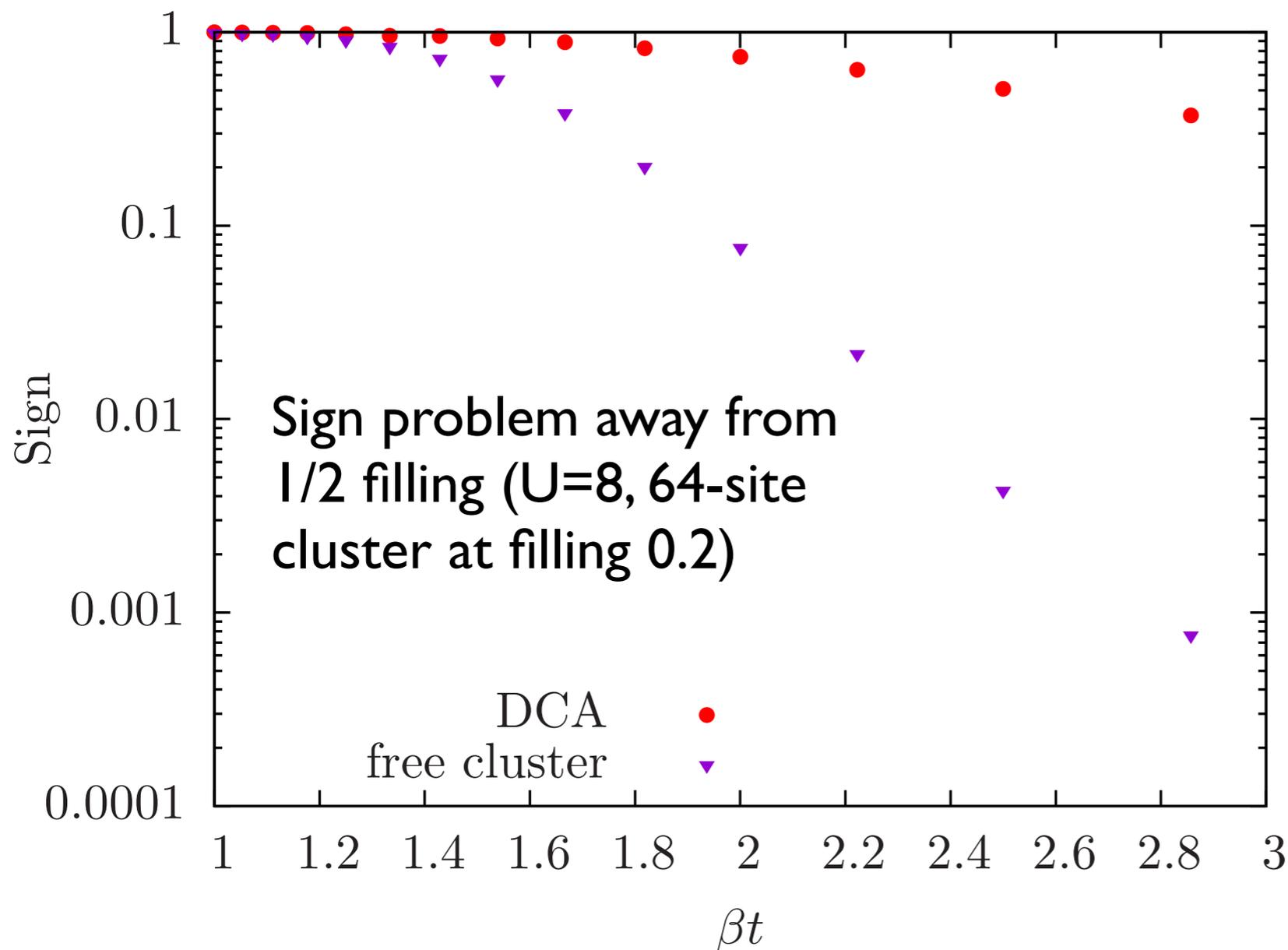
Results for finite clusters without extrapolations are not accurate!



# Cluster DMFT vs Lattice Methods

What is gained by embedding the cluster into a self-consistent bath (vs lattice)?

- **Convergence** in DCA seems to be faster: series 64-84-100 sites comparable to  $6^3, 8^3, 10^3$  sites in lattice simulation.
- **Sign problem** is better:



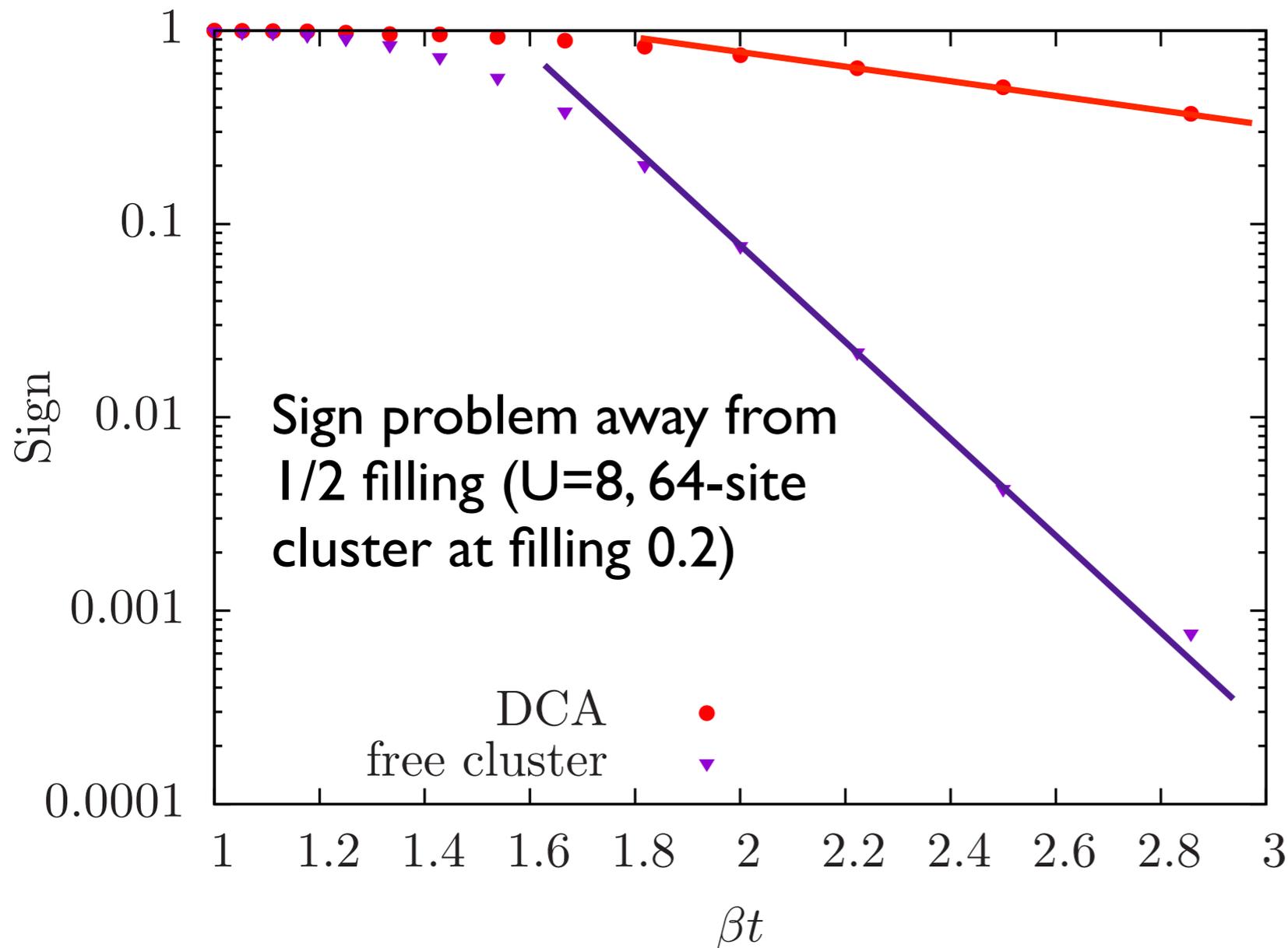
Slope of drop of sign for **cluster calculation** is different from **lattice calculation**

First self-consistency iteration (starting from free solution): lattice problem with periodic boundary conditions. Sign problem for lattice problem : the same in BSS / CT-AUX

# Cluster DMFT vs Lattice Methods

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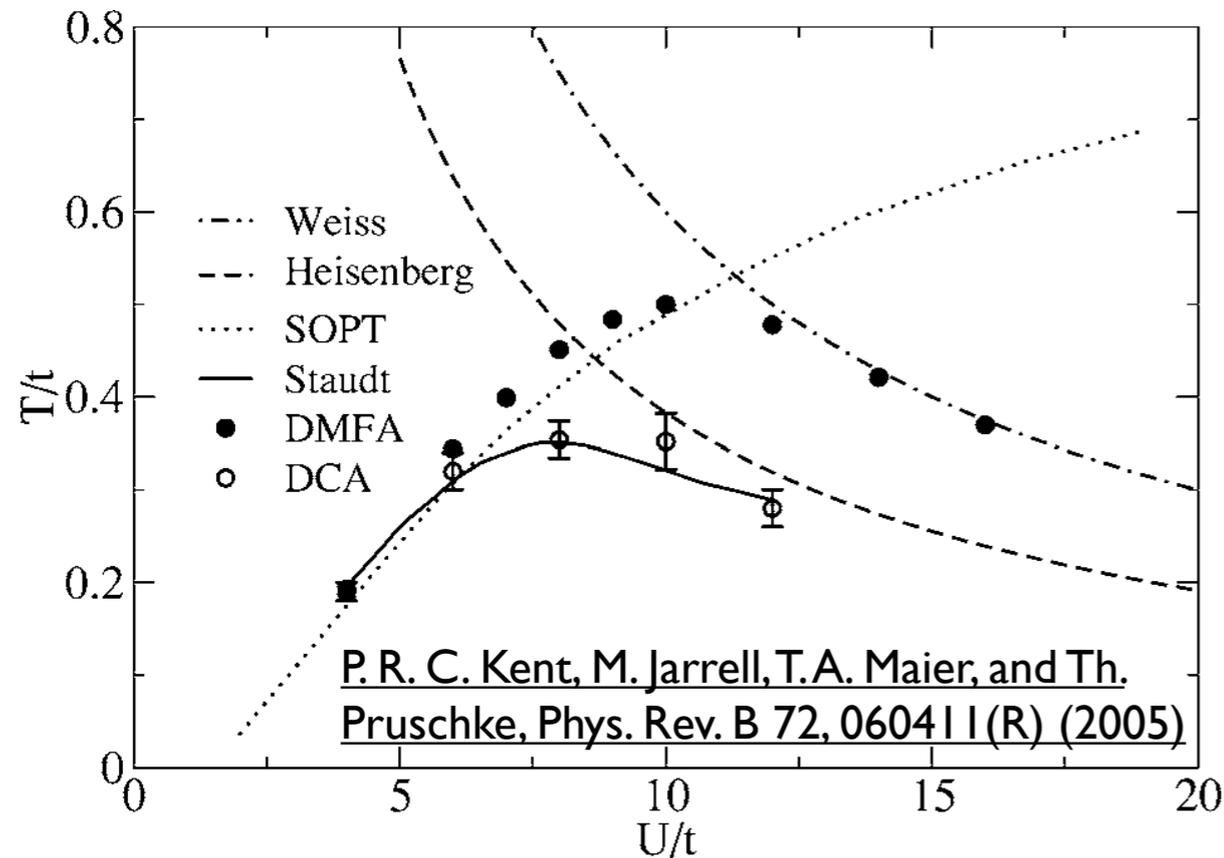
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# DCA Results: The 3D Hubbard Model



**At half filling:** Antiferromagnetic state below  $T_N$ . Single site DMFT transition temperature too high.

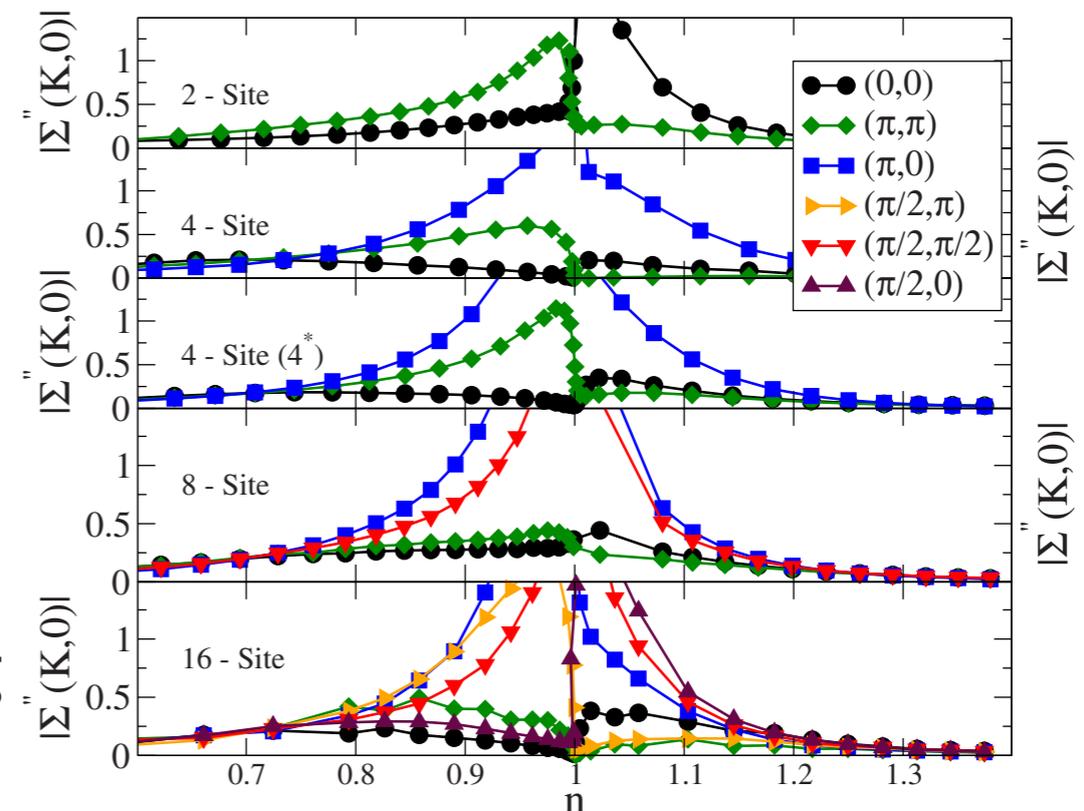
Anything below (or very near)  $T_N$  not considered in this study!

**Away from half filling: ?**

In 2d: isotropic Fermi Liquid regime in two dimensions for small fillings ( $n \sim 0.7$ ). Cluster corrections important for larger fillings

Cluster sign problem far away from half filling is much worse than close to half filling!

2d results: momentum independent behavior for low filling.



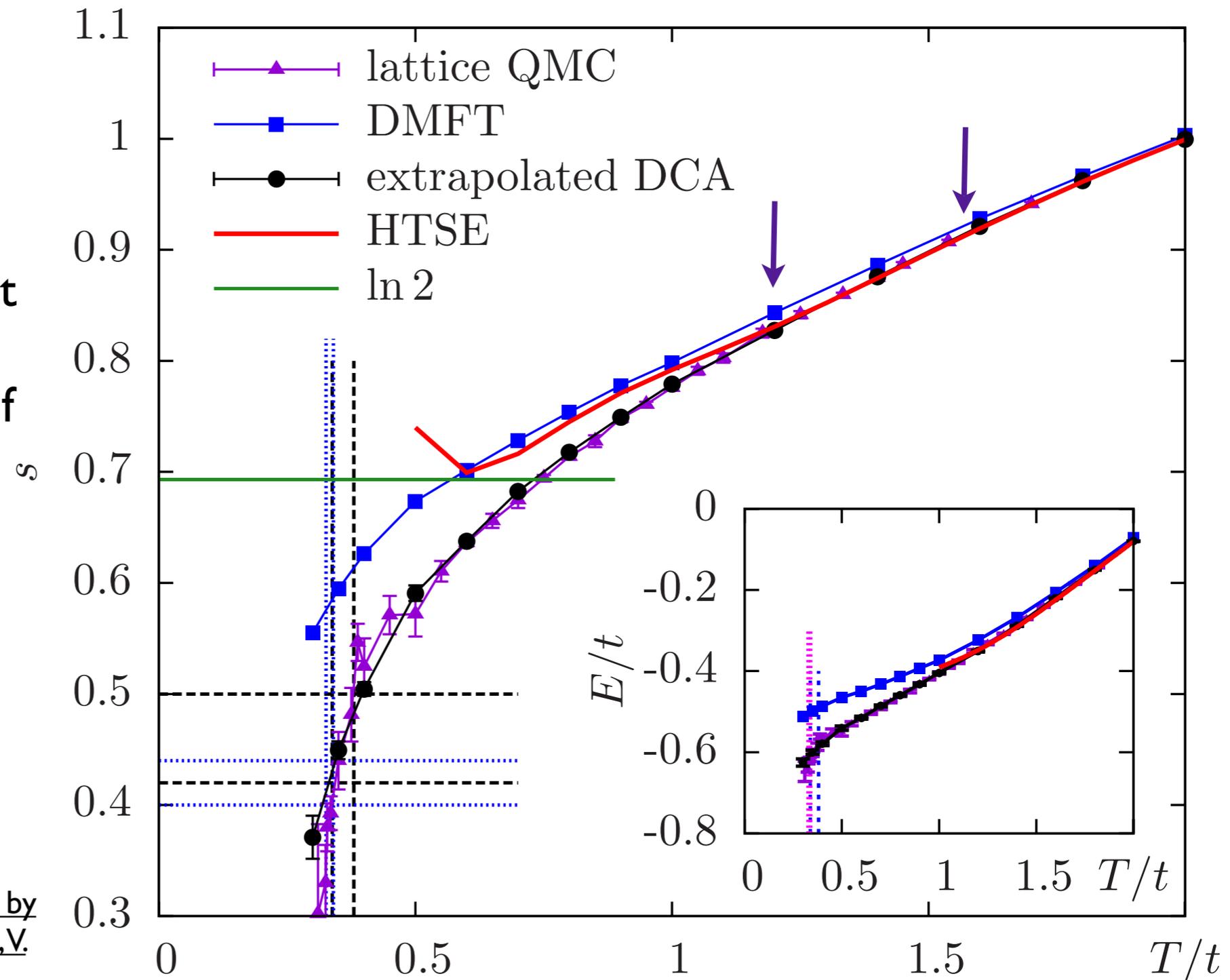
# DCA Results: The 3D Hubbard Model

Comparison **HTSE** / DCA?  
(6<sup>th</sup>, 8<sup>th</sup>, 10<sup>th</sup> order)

HTSE order by order  
convergence: at  $U=8$  correct  
down to  $T \sim 1.6t$  (at half  
filling). Worse away from half  
filling.

Agreement of 10th order  
HTSE with DCA down to  
 $T \sim 1.4t$ .

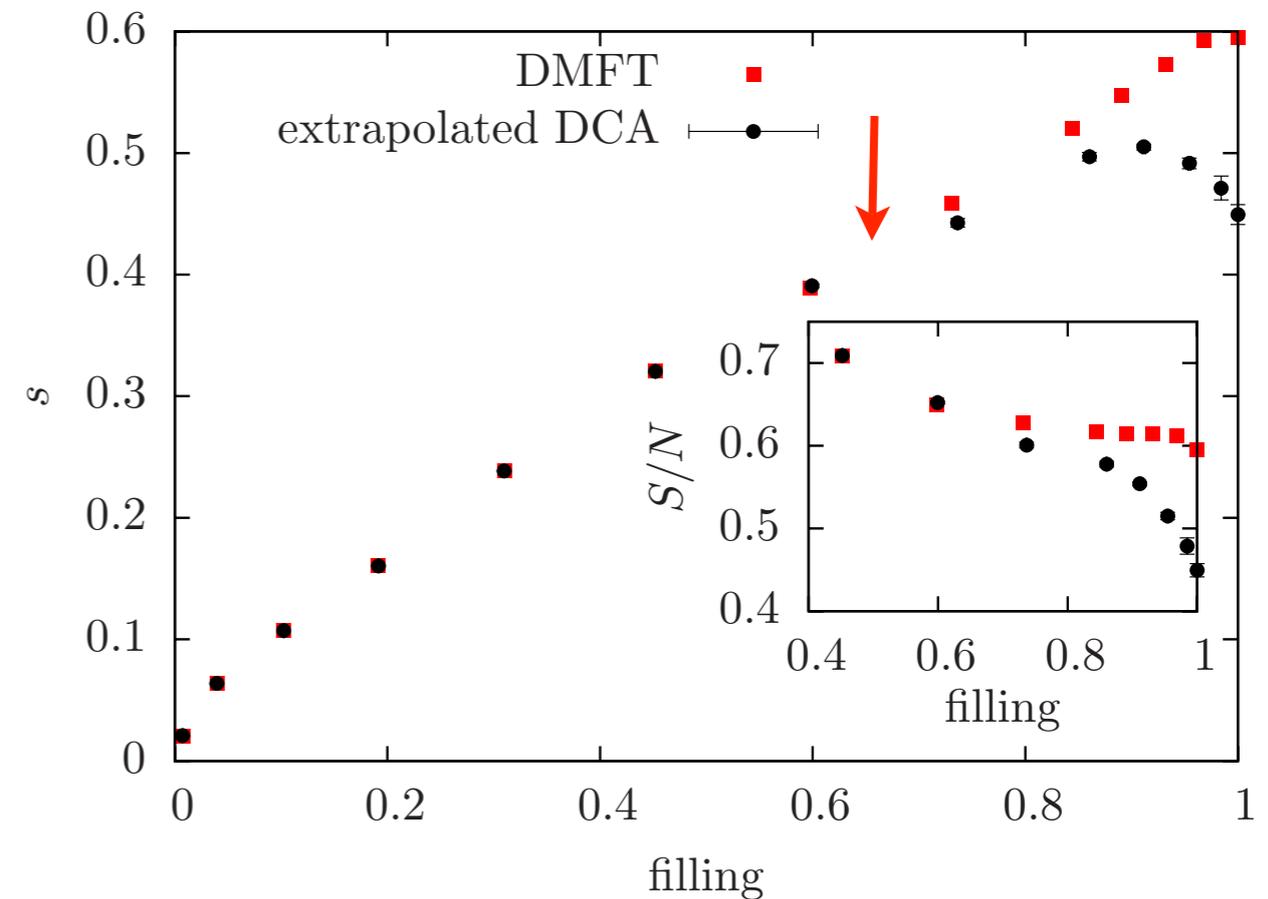
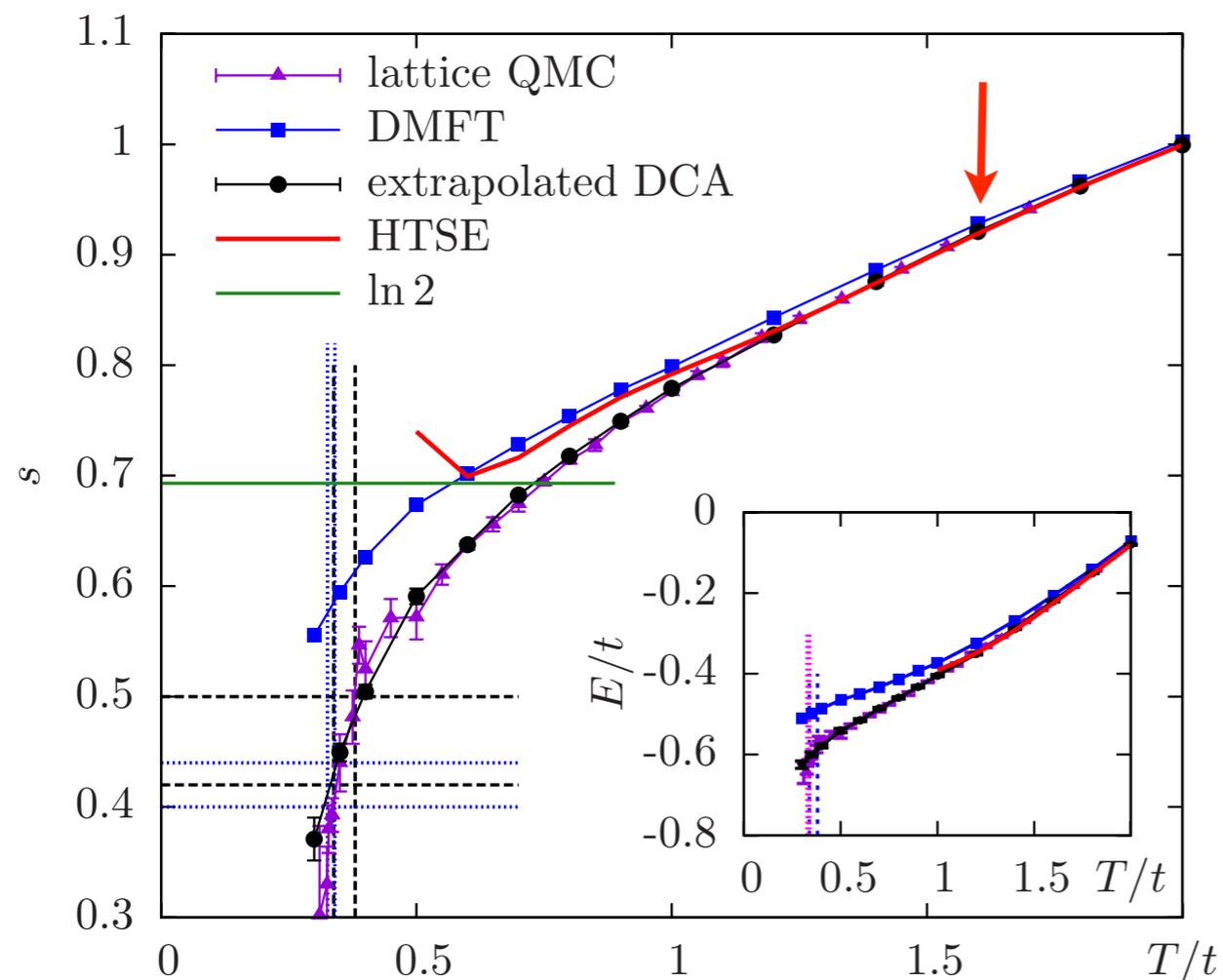
See also: in depth analysis of HTSE & DMFT by  
L. De Leo, J.S. Bernier, C. Kollath, A. Georges, V.  
W. Scarola, arXiv: 1009.2761



# DCA Results: The 3D Hubbard Model

How well does single site **DMFT** work?  
(Single Site, PM self consistency)

First deviations at **half filling** are visible  
at  $T \sim 1.6t$  [AFM  $T_N$  at  $\sim 0.5t$ ]



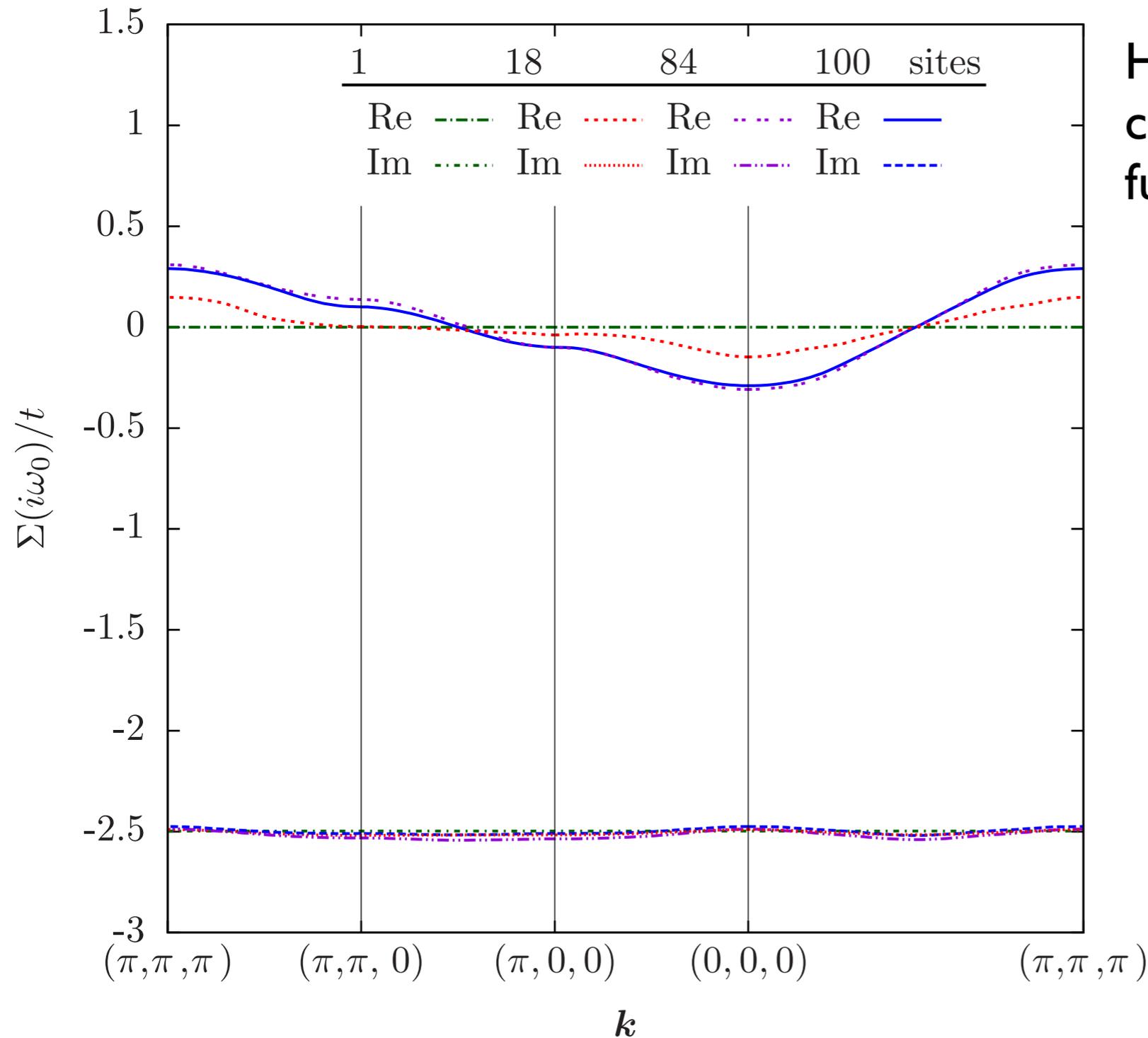
**Away from half filling**, for  $n \leq 0.7$ : same behavior as in 2D; DMFT is exact, no momentum dependence of the self energy:

$$\Sigma(k, \omega) = \sum_n \Sigma_n(\omega) \phi_n(k) = \Sigma_{\text{DMFT}}(\omega)$$

$\uparrow$   
 $n < 0.7$

# DCA Results: The 3D Hubbard Model

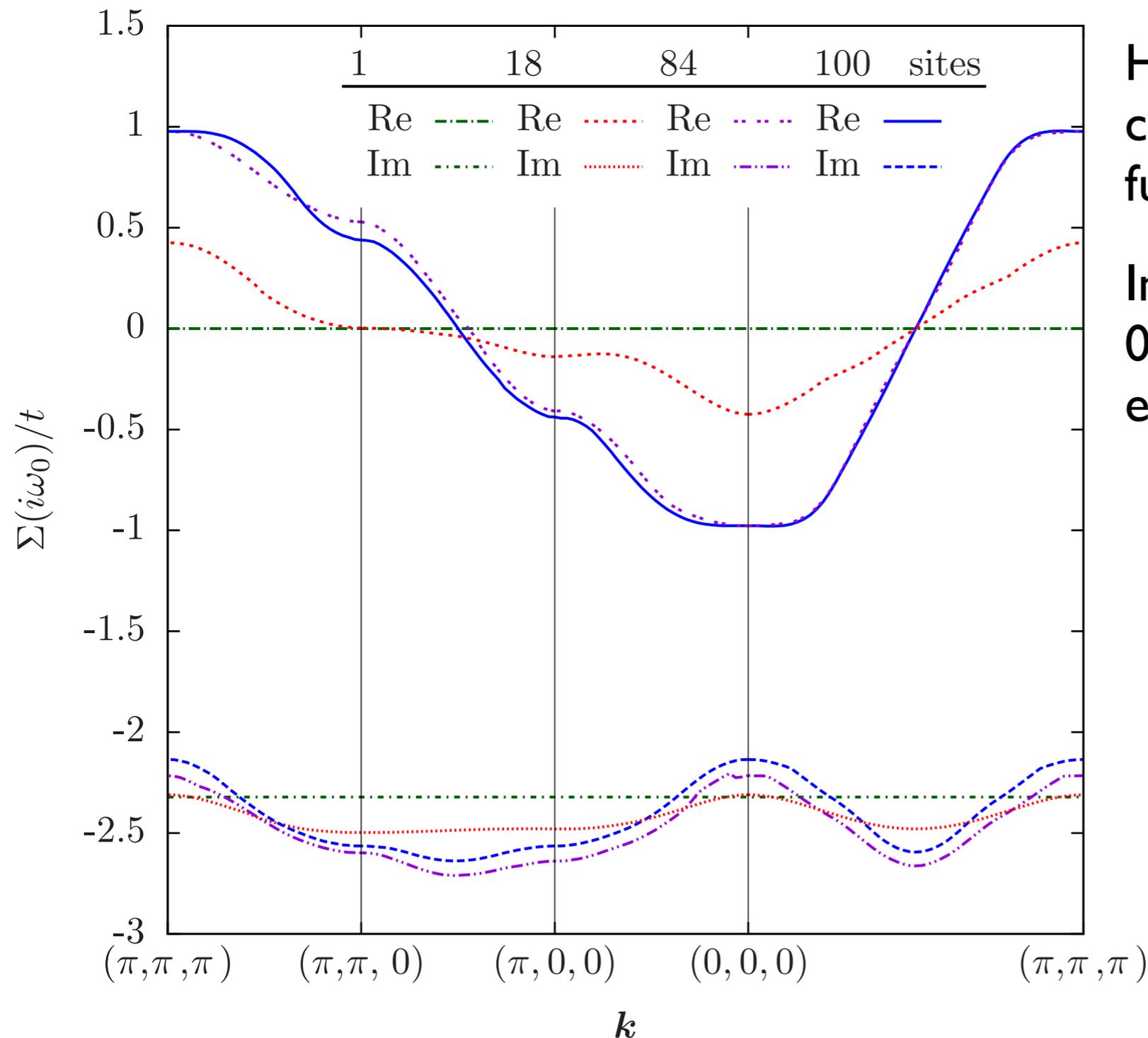
Everywhere else: Non-local (momentum dependent) physics beyond DMFT is important.



High temperature  $T/t = 1$ : Exact convergence of the self energy as a function of cluster size.

# DCA Results: The 3D Hubbard Model

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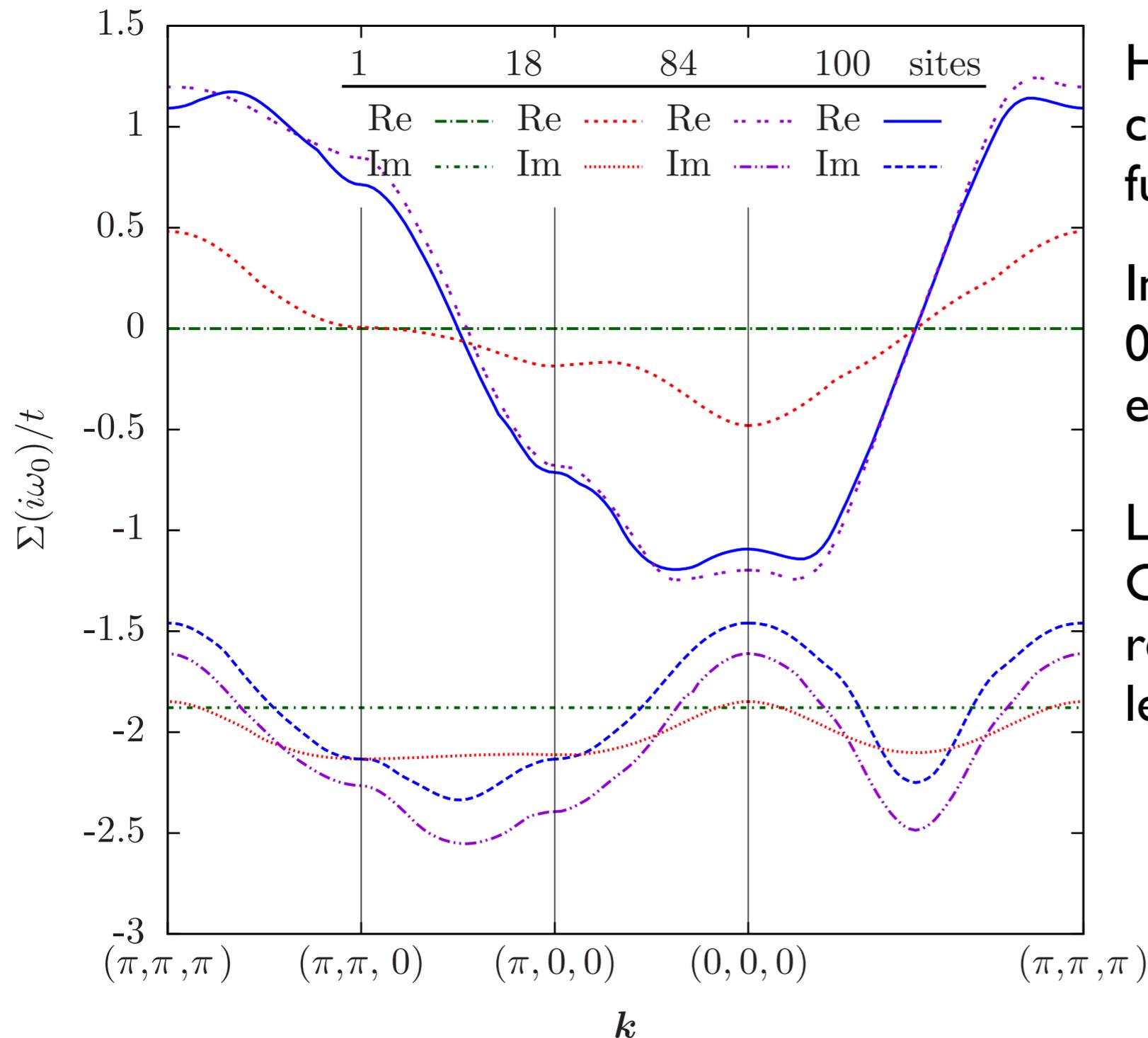


High temperature  $T/t = 1$ : Exact convergence of the self energy as a function of cluster size.

Intermediate temperature  $T/t = 0.5$ : Convergence visible, extrapolation needed.

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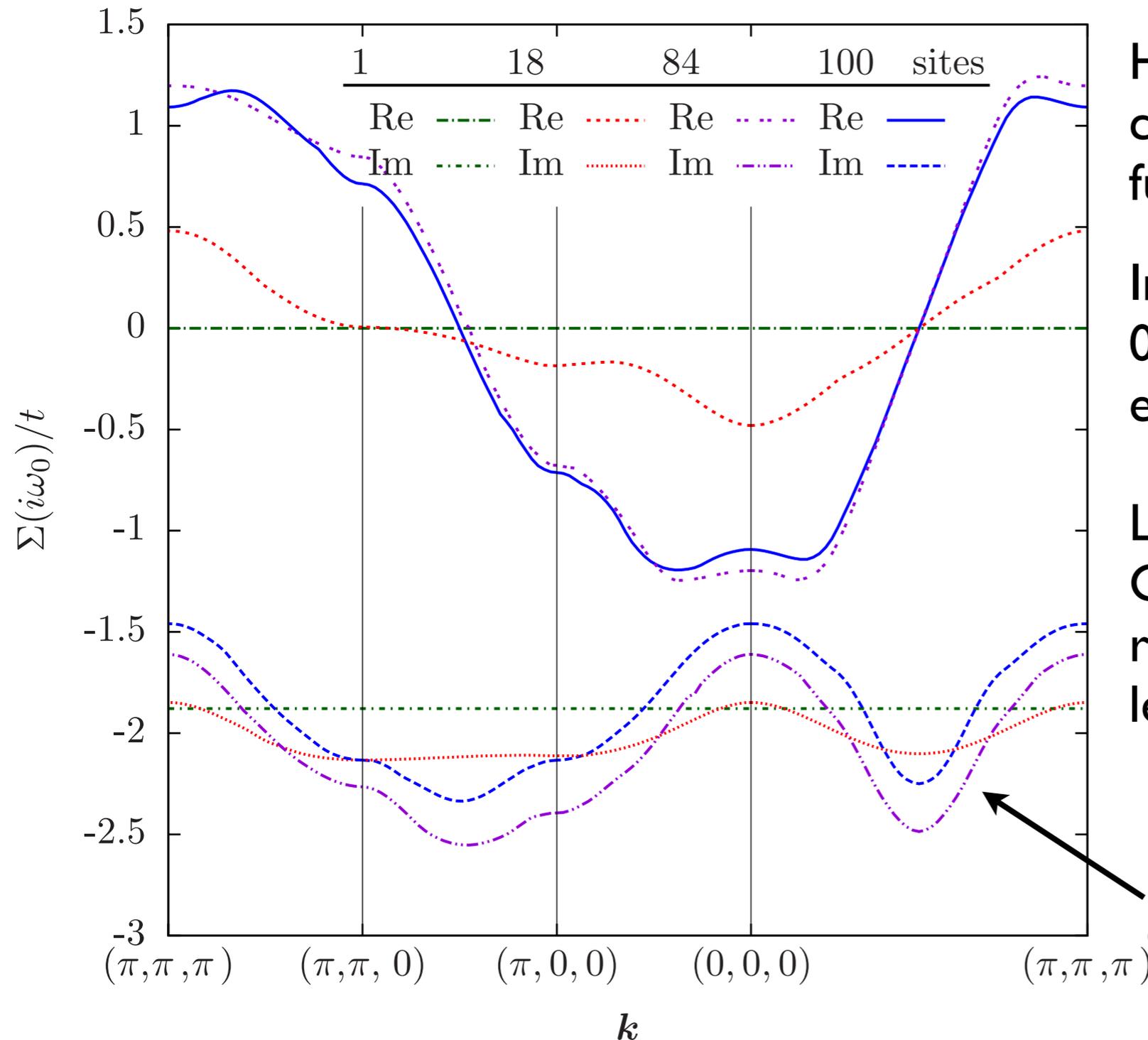
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Low temperature  $T/t = 0.35$ : Convergence not obvious, critical regime with diverging correlation length not well captured.

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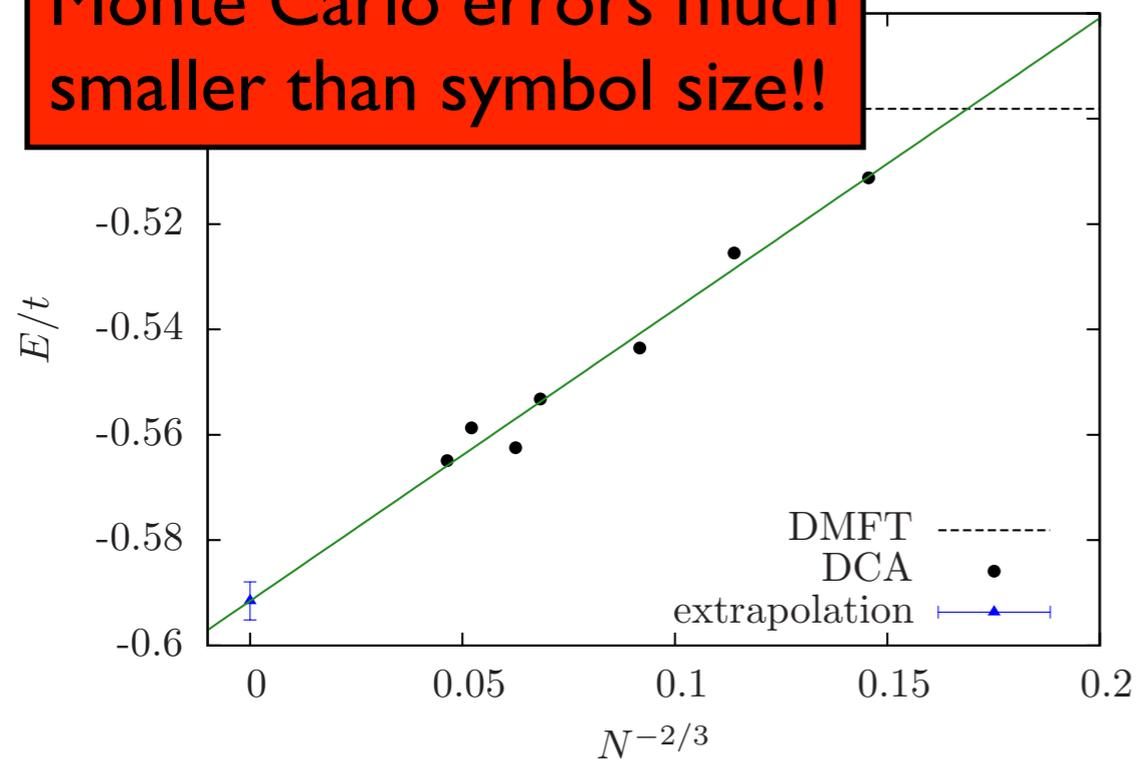
Low temperature  $T/t = 0.35$ : Convergence not obvious, critical regime with diverging correlation length not well captured.

Non-trivial momentum dependence!

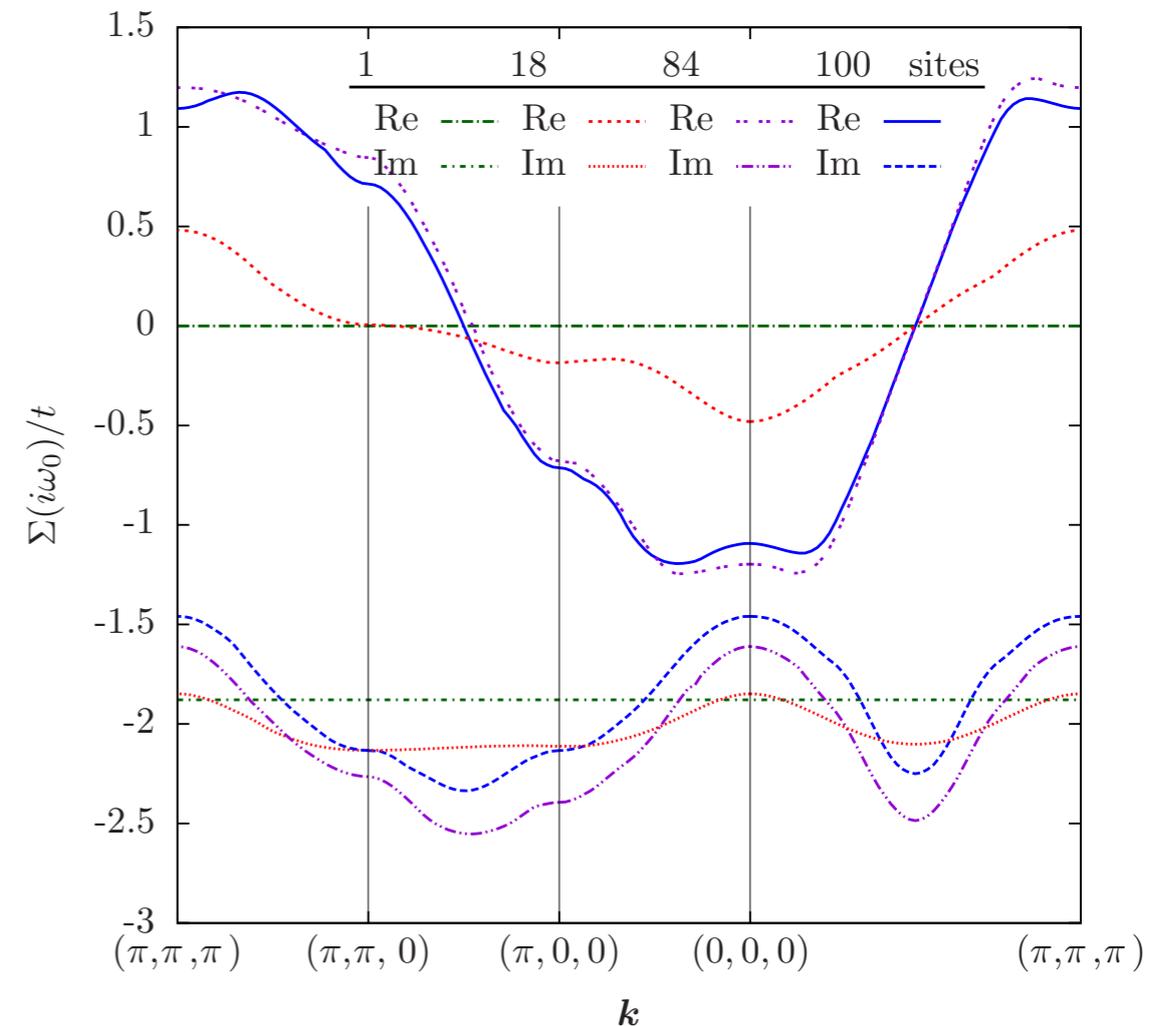
# DCA Results: The 3D Hubbard Model

Failure (?) of the method for larger interactions / lower temperatures

Monte Carlo errors much smaller than symbol size!!



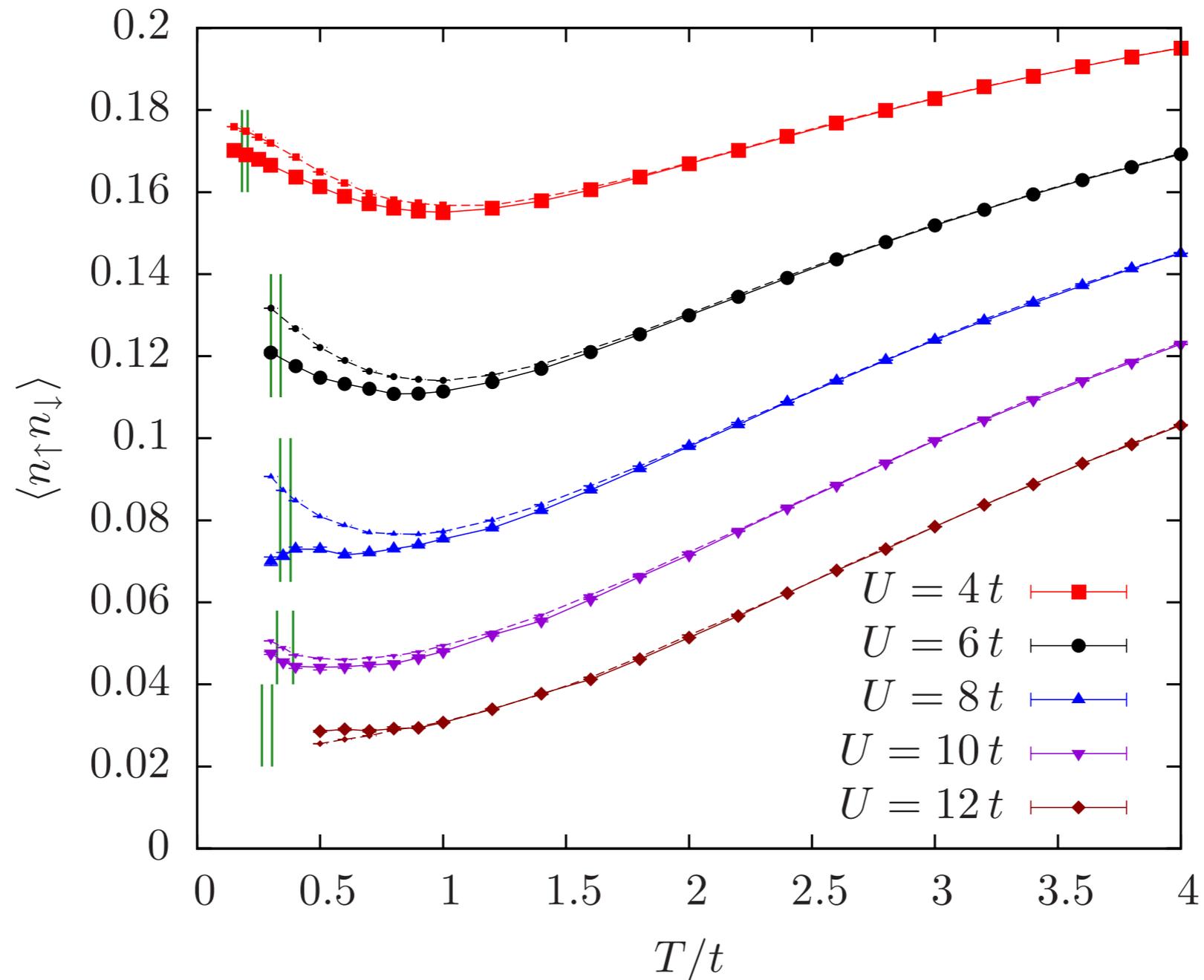
Finite size extrapolation of the energies still ~ OK



Extrapolation of the self energy not ok, would need even larger clusters (or a next generation method?)

# DCA Results: The 3D Hubbard Model

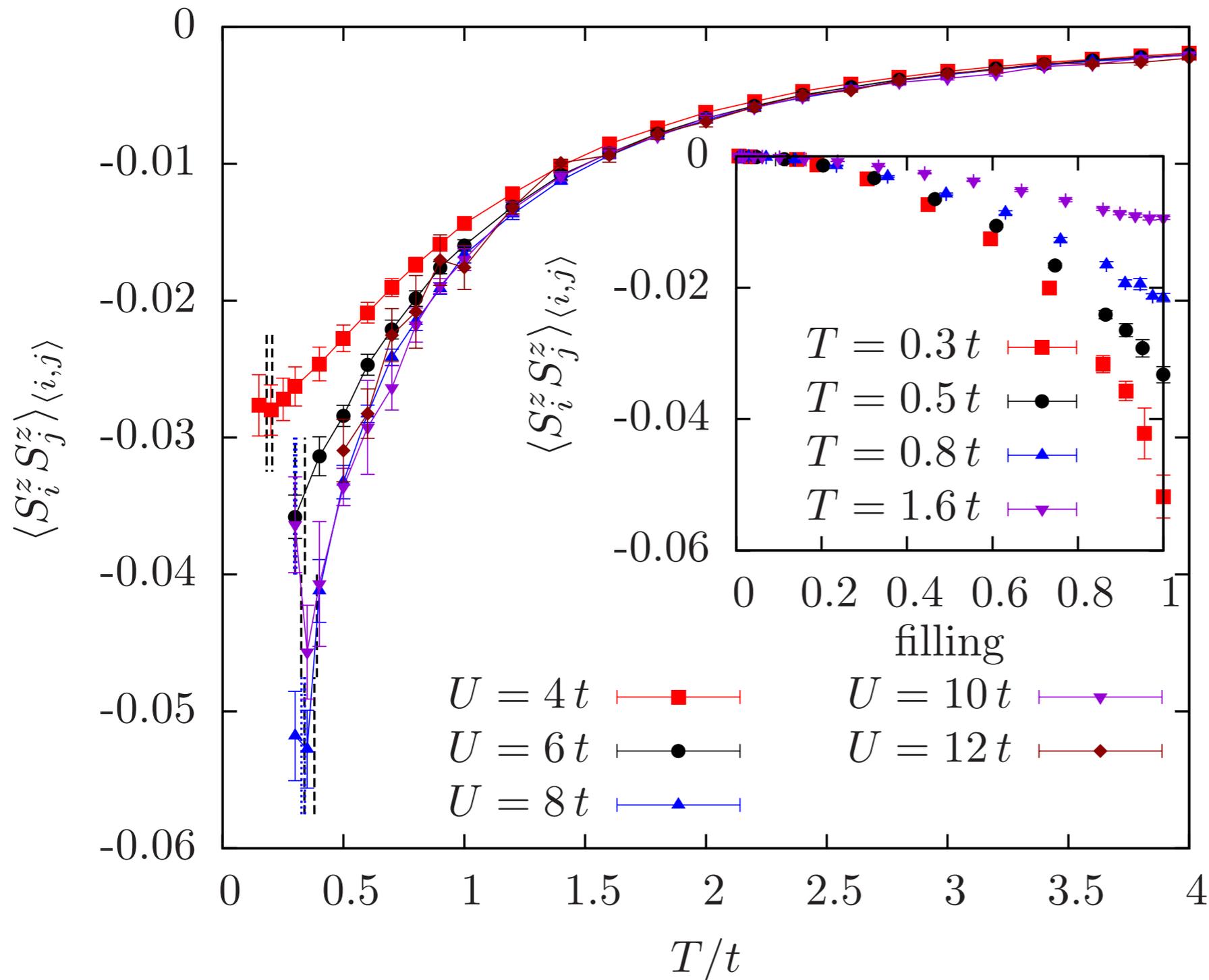
Double occupancies / deviation from DMFT



'Local' quantity shows max 20% deviations

# DCA Results: The 3D Hubbard Model

**Non-local** quantities, e.g. nearest neighbor spin correlation function



Requires cluster method,  
also for low filling.

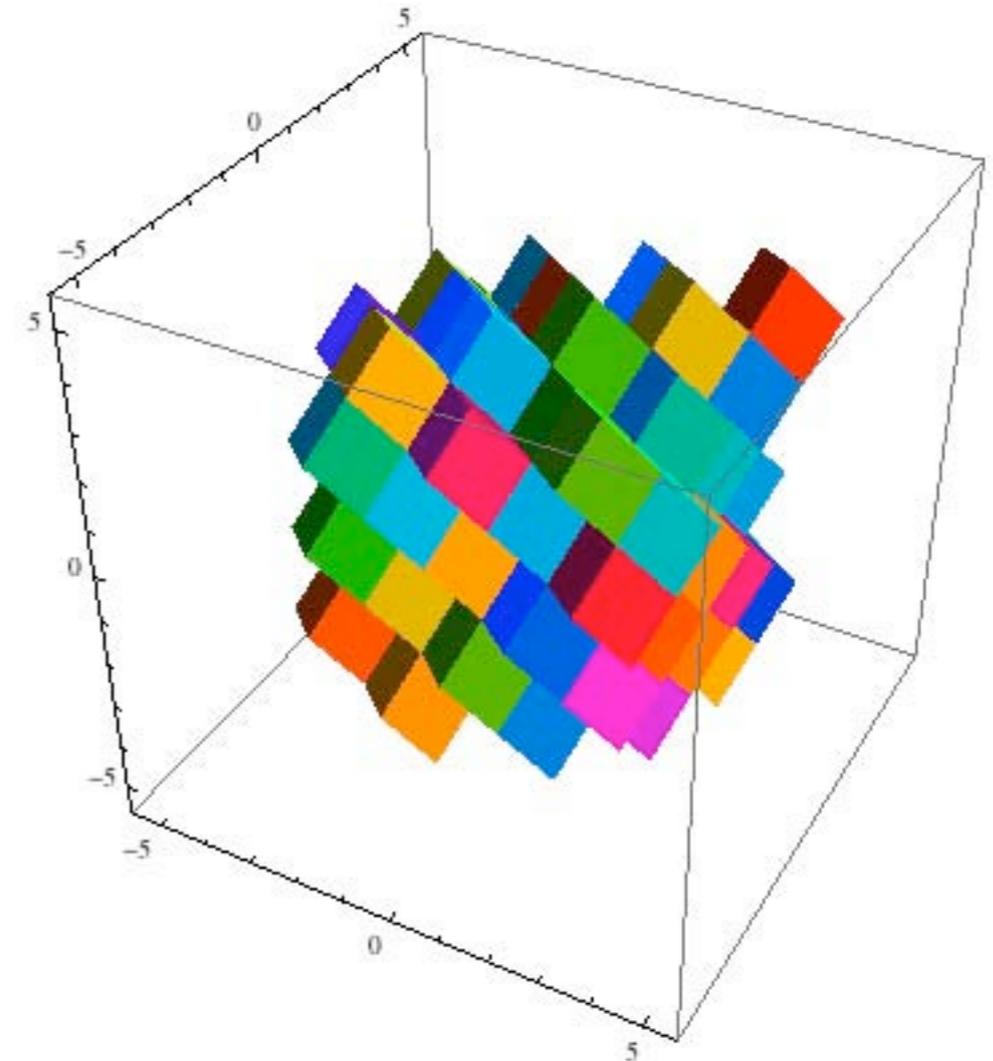
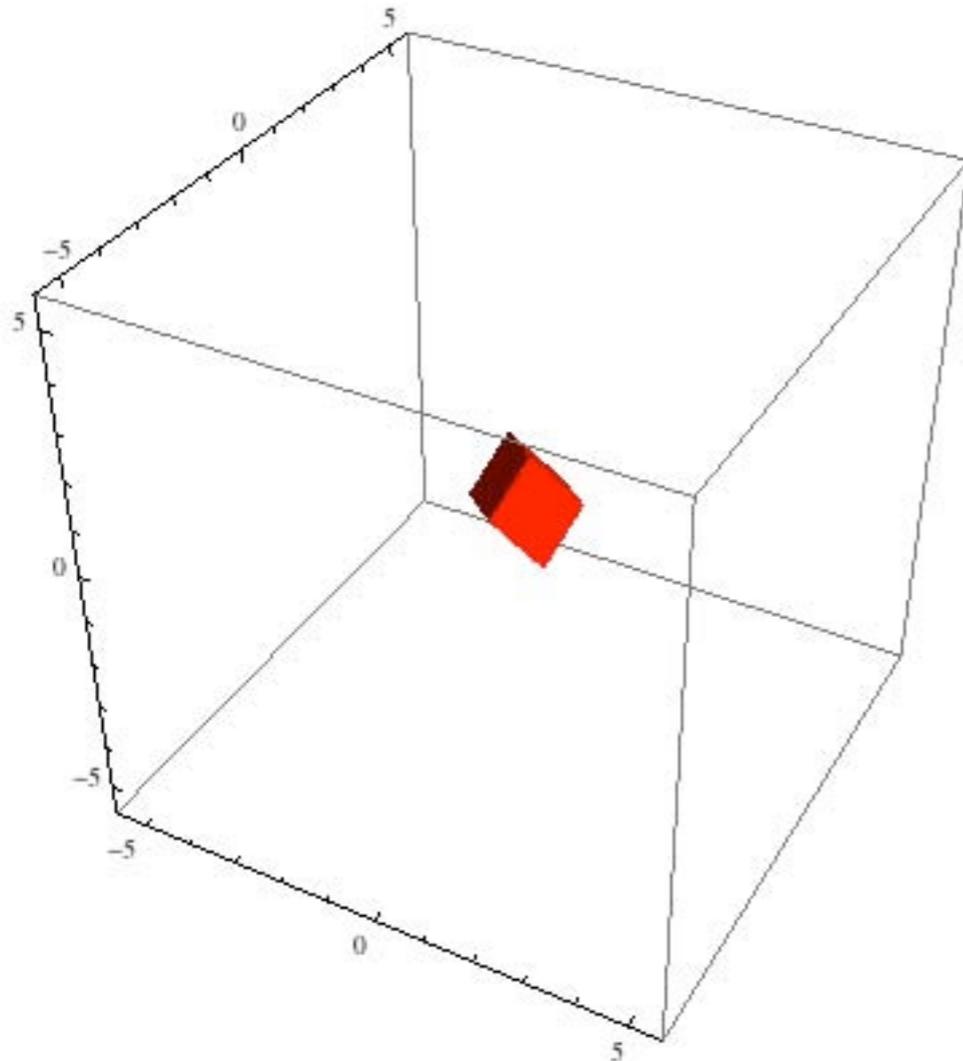
Larger finite size effects.

Interesting physics: steep  
slope means possible  
candidate for  
thermometry; measurable  
in cold atom experiments.

# DCA Results: The 3D Hubbard Model

We have [solved the 3D Hubbard model](#) at high temperature! Full tables for the entire phase diagram with energies, densities, entropies, double occupancies, and spin correlation functions are available online

[ For  $U \leq 12t$ , and  $T$  above  $T_N$  : about **5 times lower in  $T$**  than previous methods ]

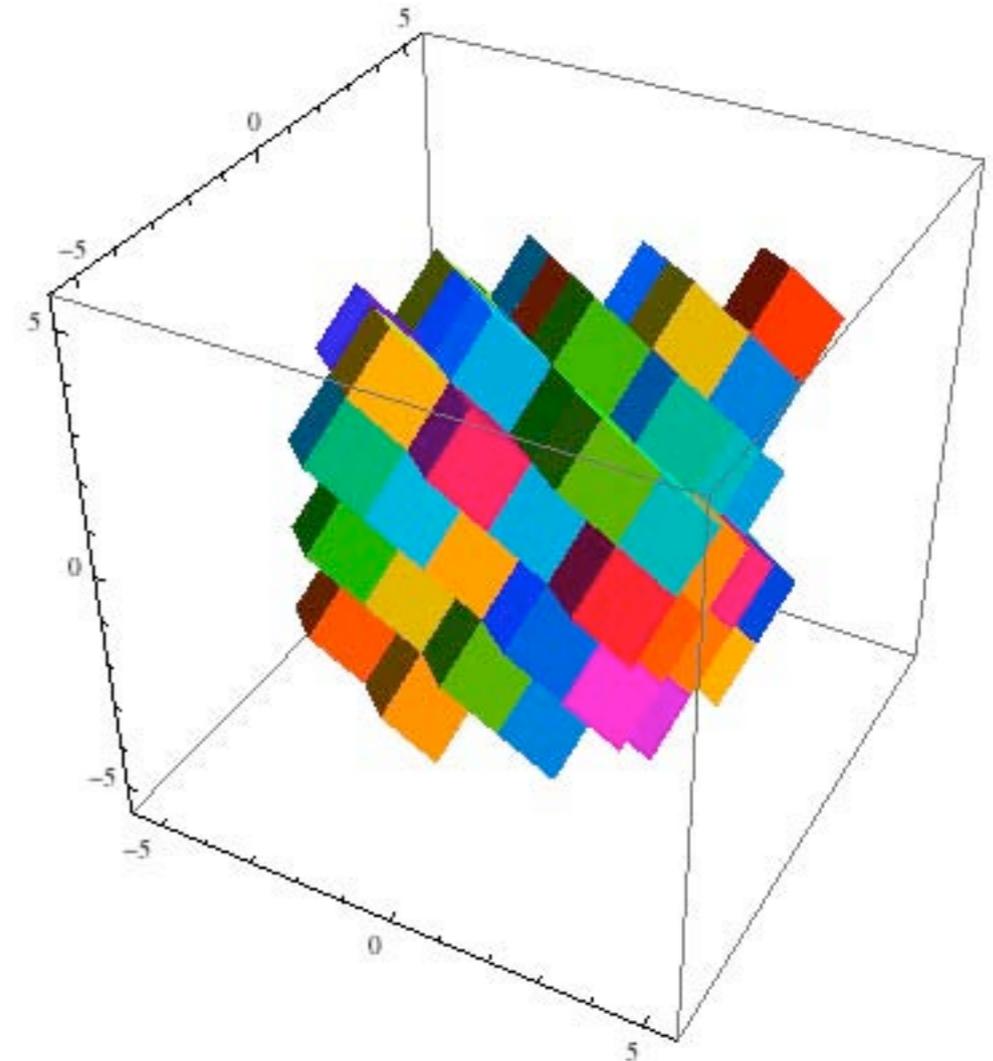
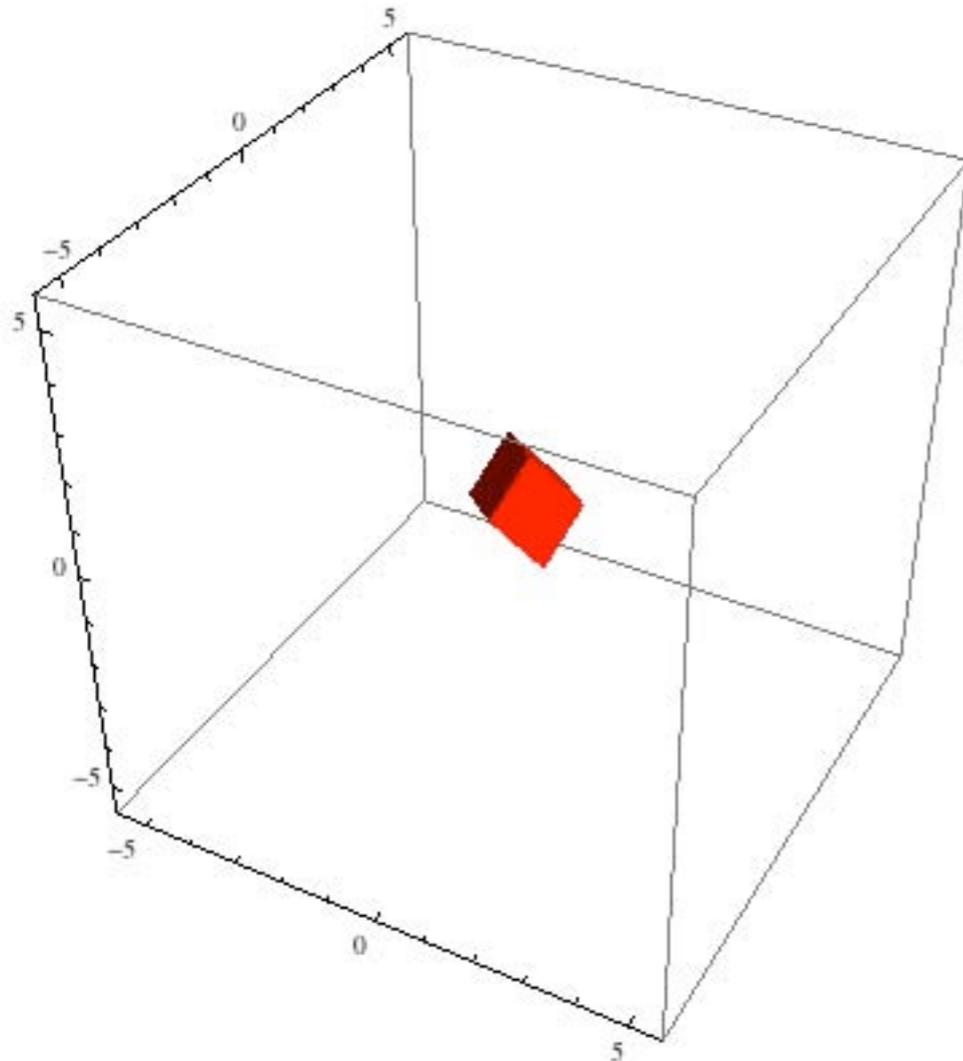


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HTSE works for high  $T$

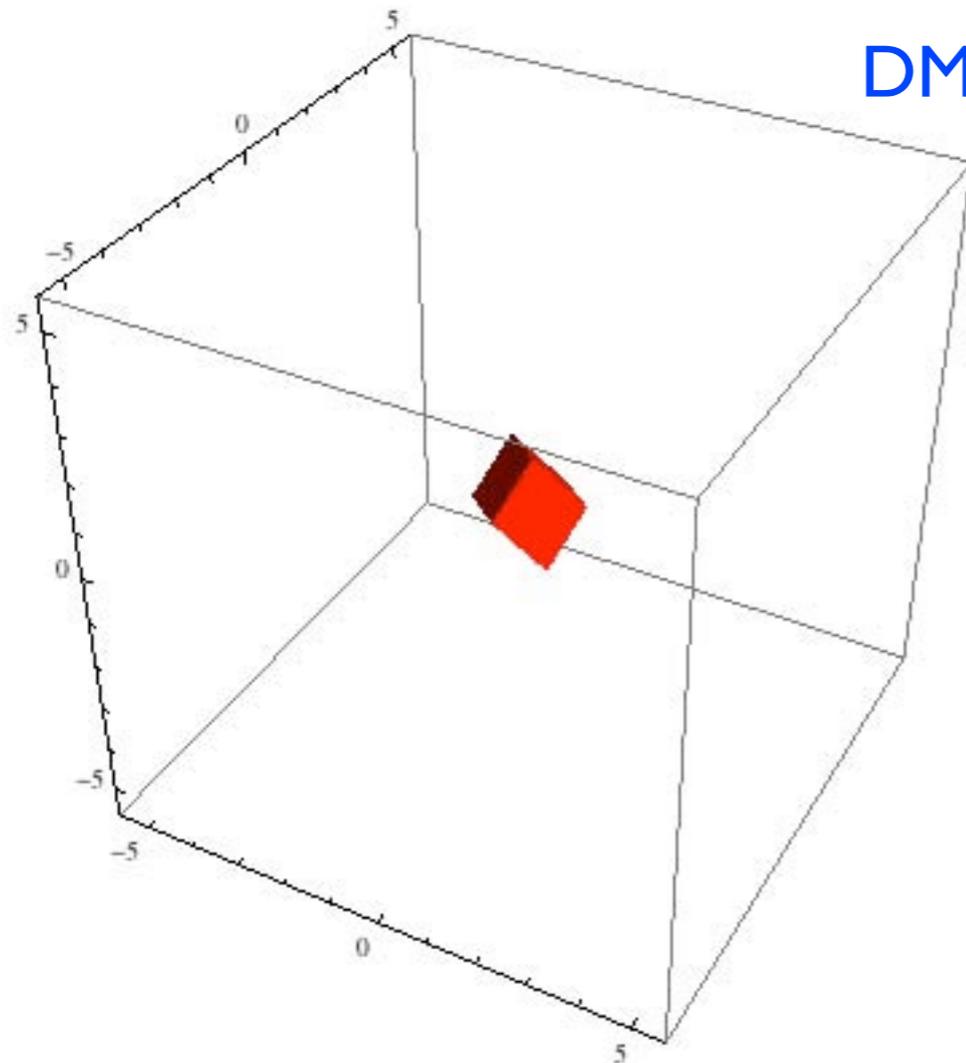


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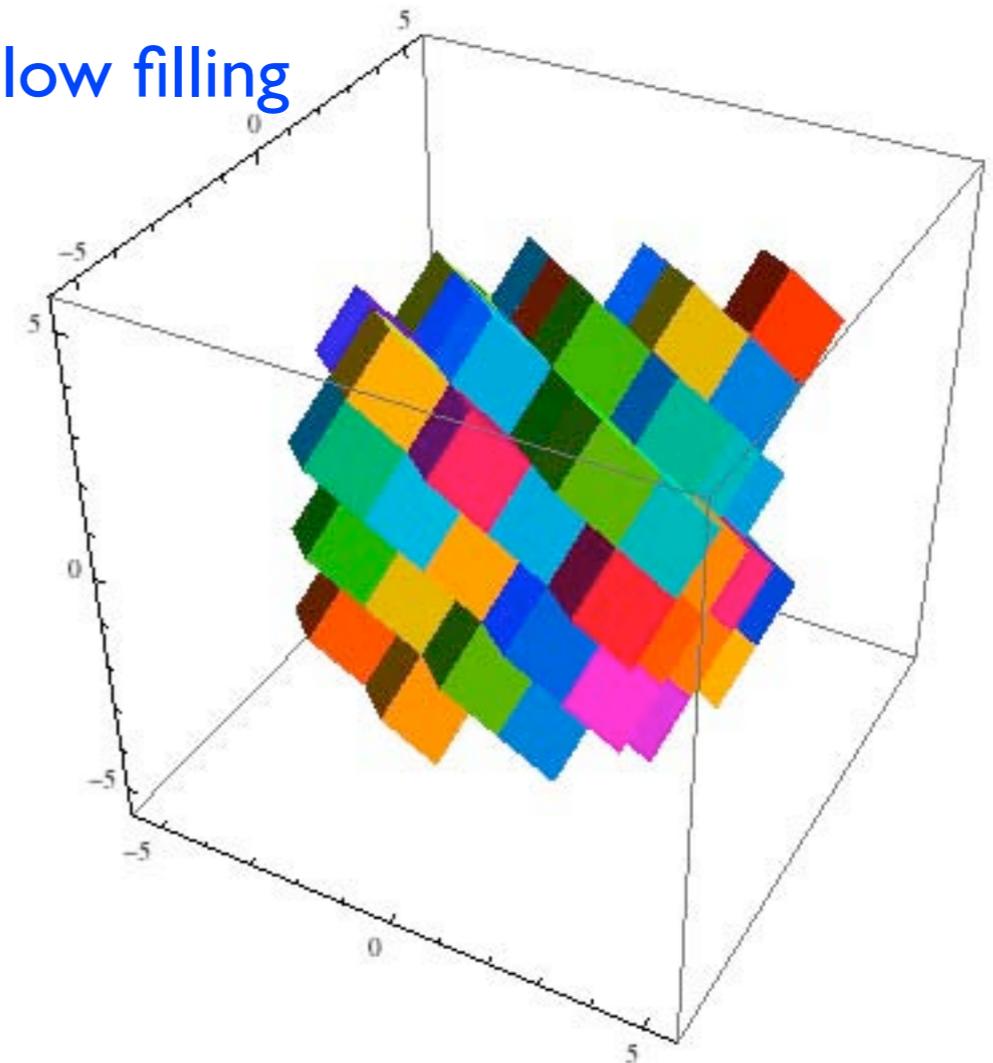
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HTSE works for **high  $T$**



DMFT works well for **low filling**

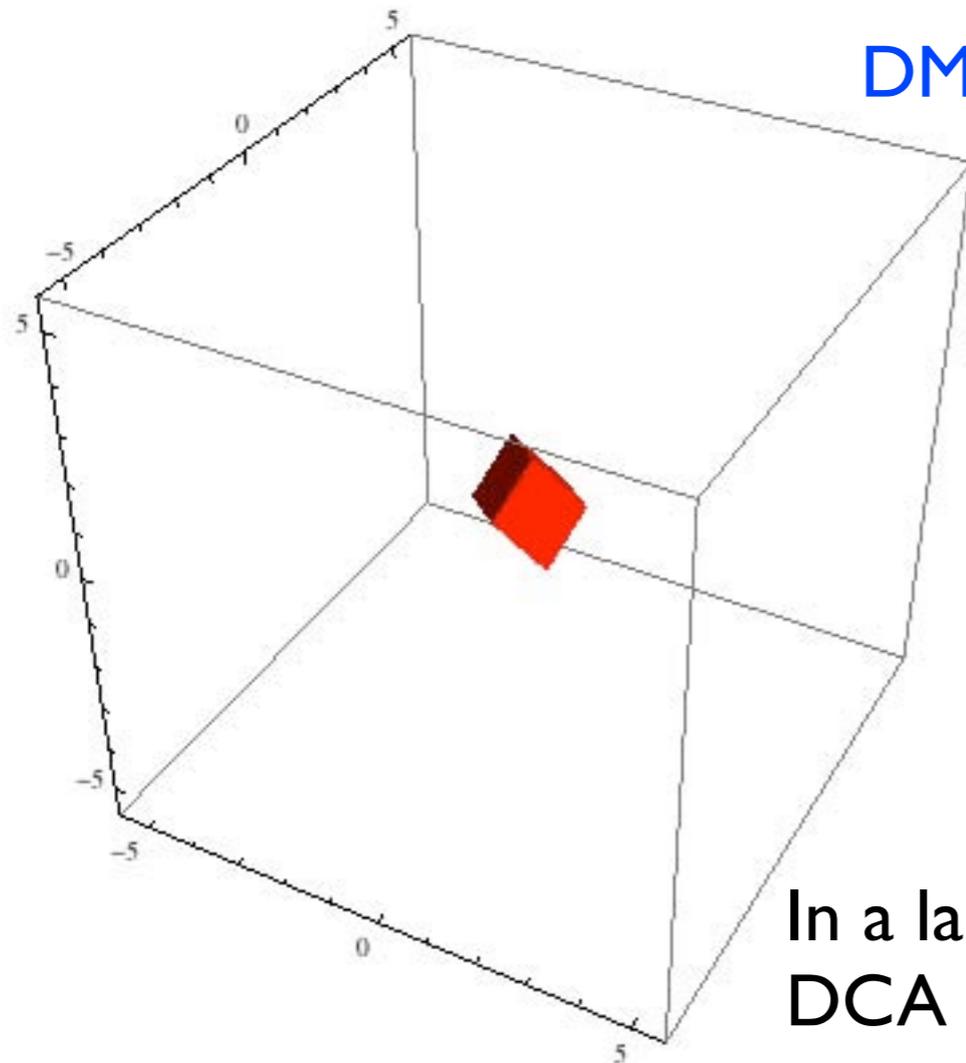


# DCA Results: The 3D Hubbard Model

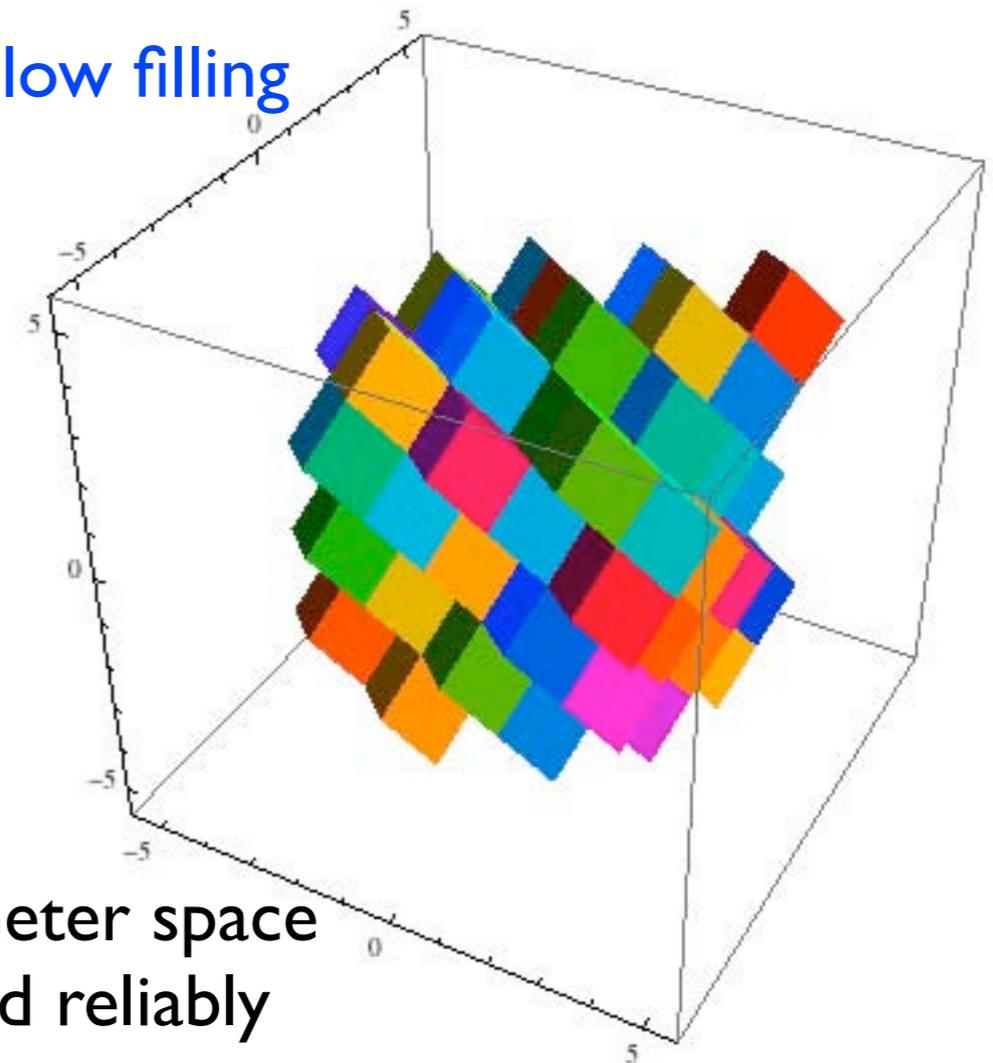
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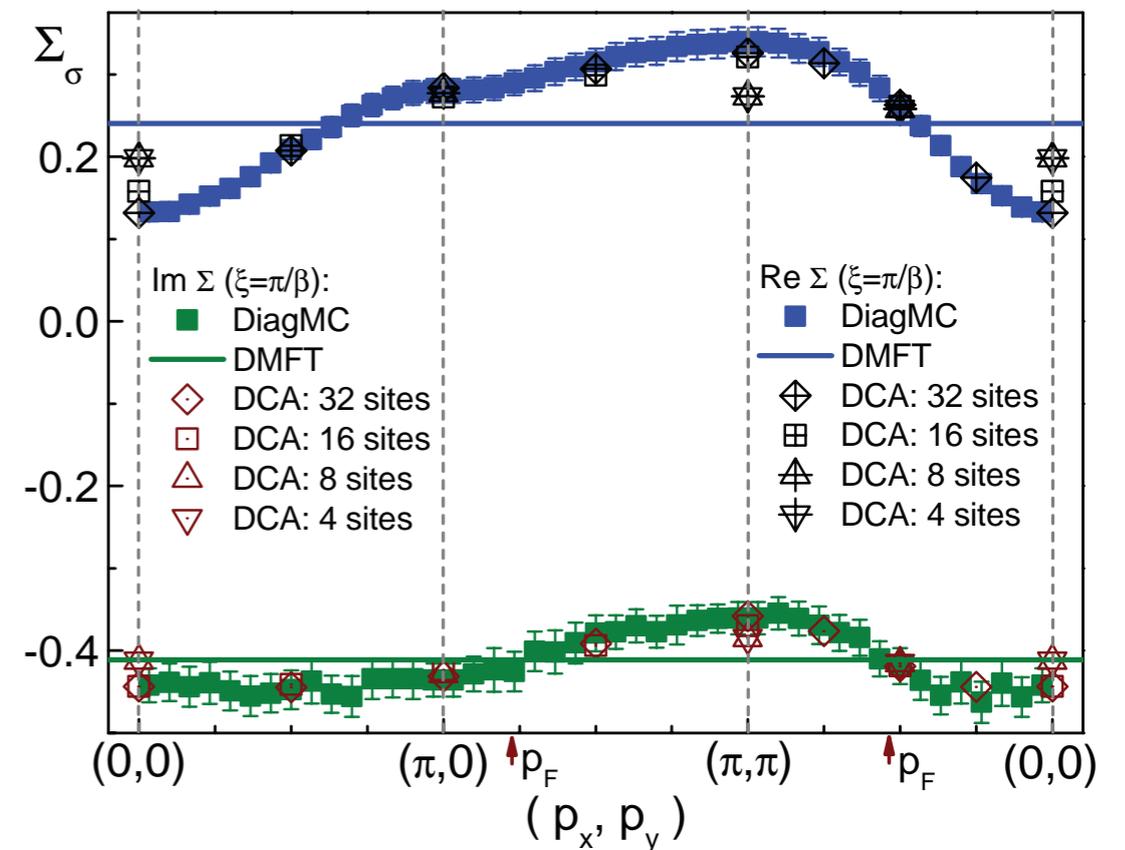
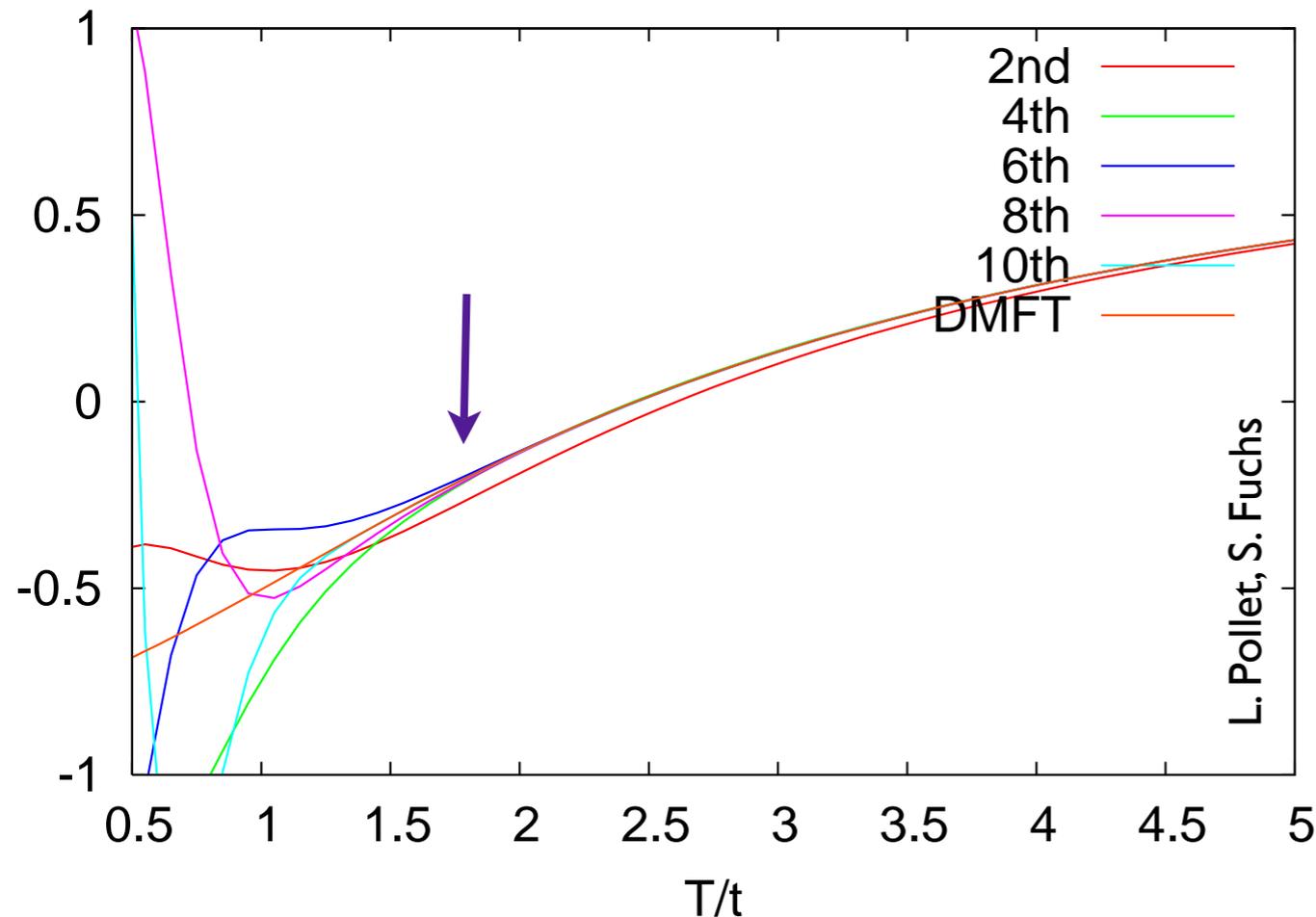
In a large range of parameter space  
DCA can be extrapolated reliably

# How about 2D?

High temperature series expansion and DMFT available, similar behavior.  
Convergence of cluster DMFT spot-checked for some parameters

## HTSE & DMFT

U=4, half filling, 2d Hubbard model

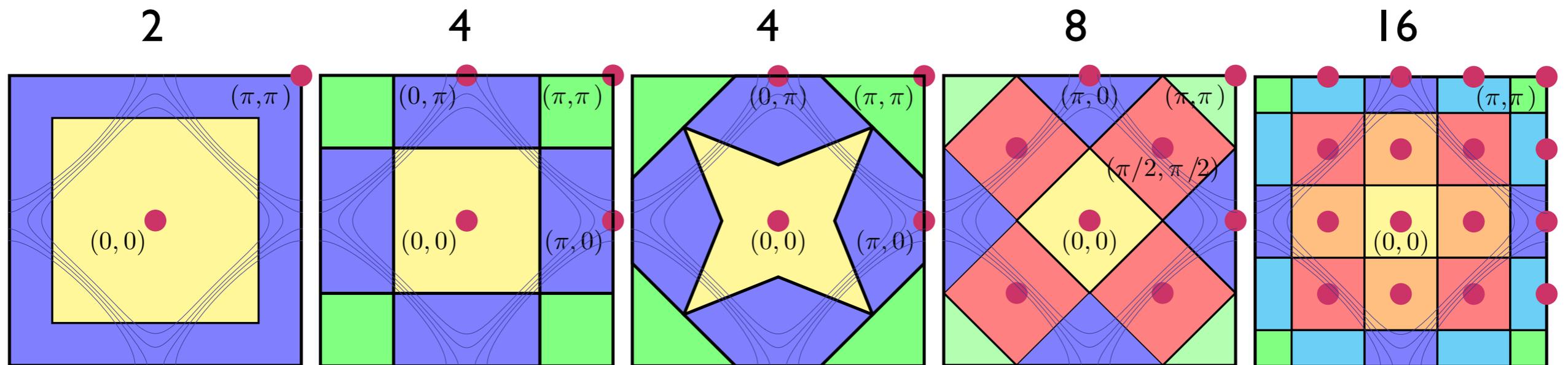


Cluster DMFT convergence vs numerically exact DiagMC result

E. Kozik, K. van Houcke, E. Gull, et al., EPL 90, 10004 (2010)

# How about 2D?

What can we say about the interesting physics happening at **much lower temperature**?  
 Sign problem! Limit to clusters of size  $\leq 16$  for surveys of the entire phase space



Qualitative answers, not quantitative extrapolations: Which results are cluster specific, which are universal? How do results change by going to larger and larger clusters? Which parts of the phase diagram are converged?

Previous / Other work on (mostly small) cluster DMFT in 2D:

O. Parcollet, G. Biroli, and G. Kotliar, Phys. Rev. Lett. 92, 226402 (2004), M. Civelli, M. Capone, S. S. Kancharla, O. Parcollet, and G. Kotliar, Phys. Rev. Lett. 95, 106402 (2005), T. Maier, M. Jarrell, T.C. Schulthess, P.R.C. Kent, J.B. White, Phys. Rev. Lett. 95, 237001 (2005), B. Kyung, S. S. Kancharla, D. Sénéchal, A.-M. S. Tremblay, M. Civelli, and G. Kotliar, Phys. Rev. B 73, 165114 (2006), T. D. Stanescu and G. Kotliar, Phys. Rev. B 74, 125110 (2006), A. Macridin, M. Jarrell, T. Maier, P. R. C. Kent, and E. D'Azevedo, Phys. Rev. Lett. 97, 036401 (2006), Y. Z. Zhang and M. Imada, Phys. Rev. B 76, 045108 (2007), M. Civelli, M. Capone, A. Georges, K. Haule, O. Parcollet, T. D. Stanescu, and G. Kotliar, Phys. Rev. Lett. 100, 046402 (2008), E. Gull, P. Werner, X. Wang, M. Troyer, and A. J. Millis, EPL 84, 37009 (2008), H. Park, K. Haule, and G. Kotliar, Phys. Rev. Lett. 101, 186403 (2008), M. Ferrero, P. S. Cornaglia, L. D. Leo, O. Parcollet, G. Kotliar, and A. Georges, EPL 85, 57009 (2009), M. Ferrero, P. S. Cornaglia, L. De Leo, O. Parcollet, G. Kotliar, and A. Georges, Phys. Rev. B 80, 064501 (2009), M. Civelli, Phys. Rev. B 79, 195113 (2009), A. Liebsch and N.-H. Tong, Phys. Rev. B 80, 165126 (2009), N. Lin, E. Gull, and A. J. Millis, Phys. Rev. B 80, 161105(R) (2009), S. Sakai, Y. Motome, and M. Imada, Phys. Rev. Lett. 102, 056404 (2009), G. Sordi, K. Haule, and A. Tremblay, Phys. Rev. Lett. 104, 226402 (2010), S. Sakai, Y. Motome, and M. Imada, arXiv:1004.2569, M. Ferrero, O. Parcollet, G. Kotliar, and A. Georges, arXiv:1001.5051.

# Motivation - Pseudogap

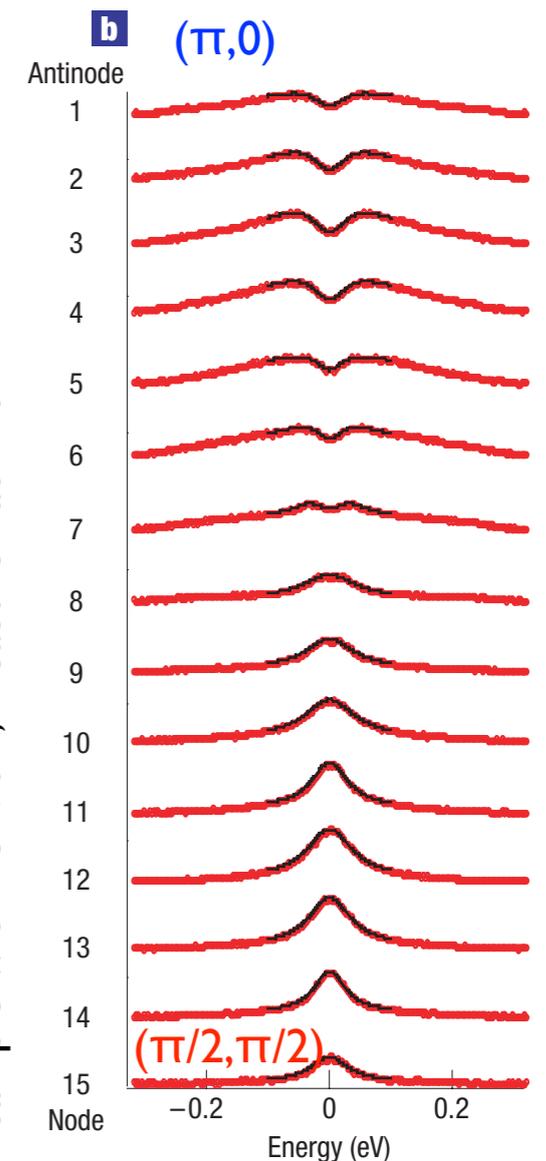
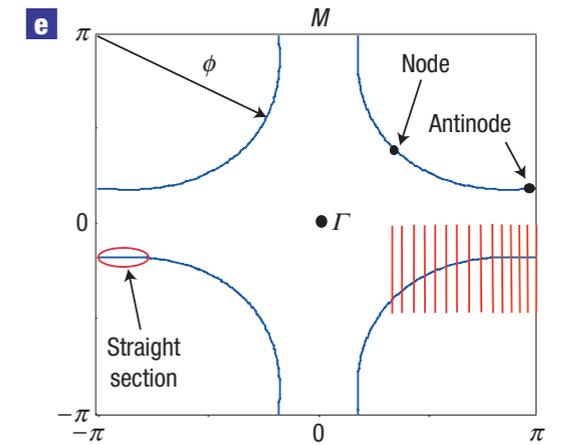
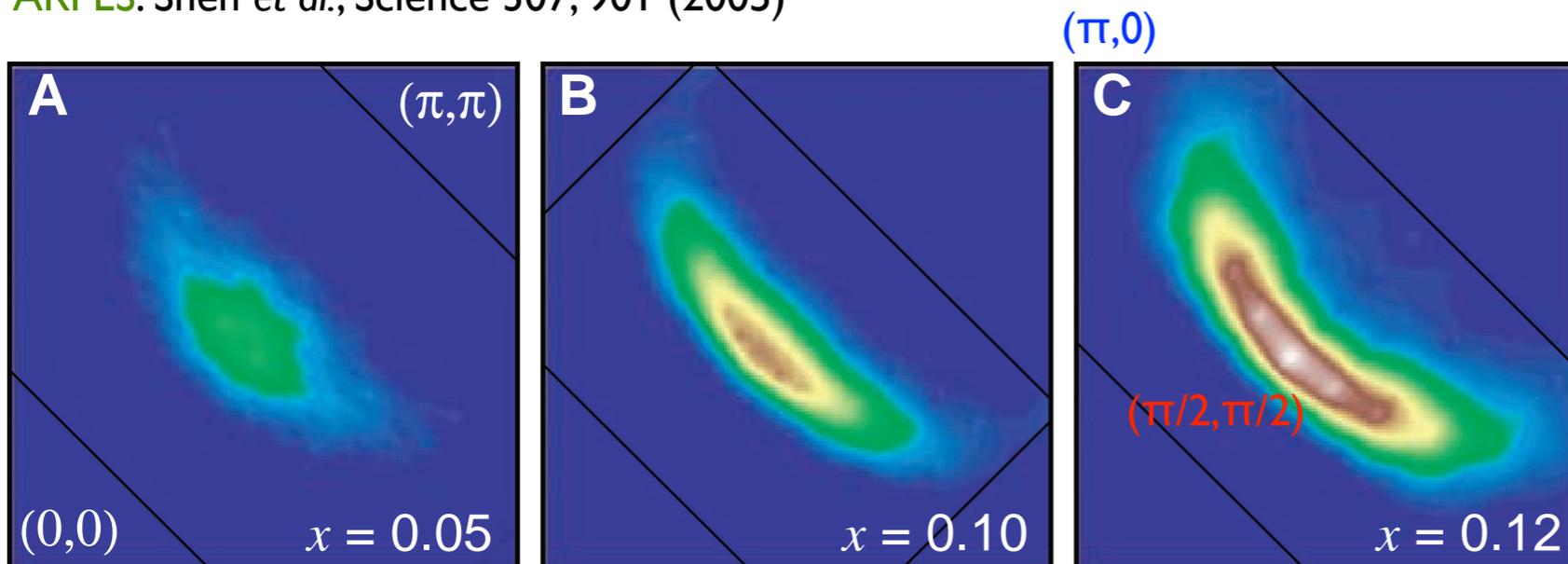
in high- $T_c$  materials: Electronic spectral function is **suppressed** along the **BZ face**, but not along **zone diagonal**.

No (obvious) long range order.

Key physics dependence on momentum around Fermi surface,  
Difference of spectral function around Fermi surface.

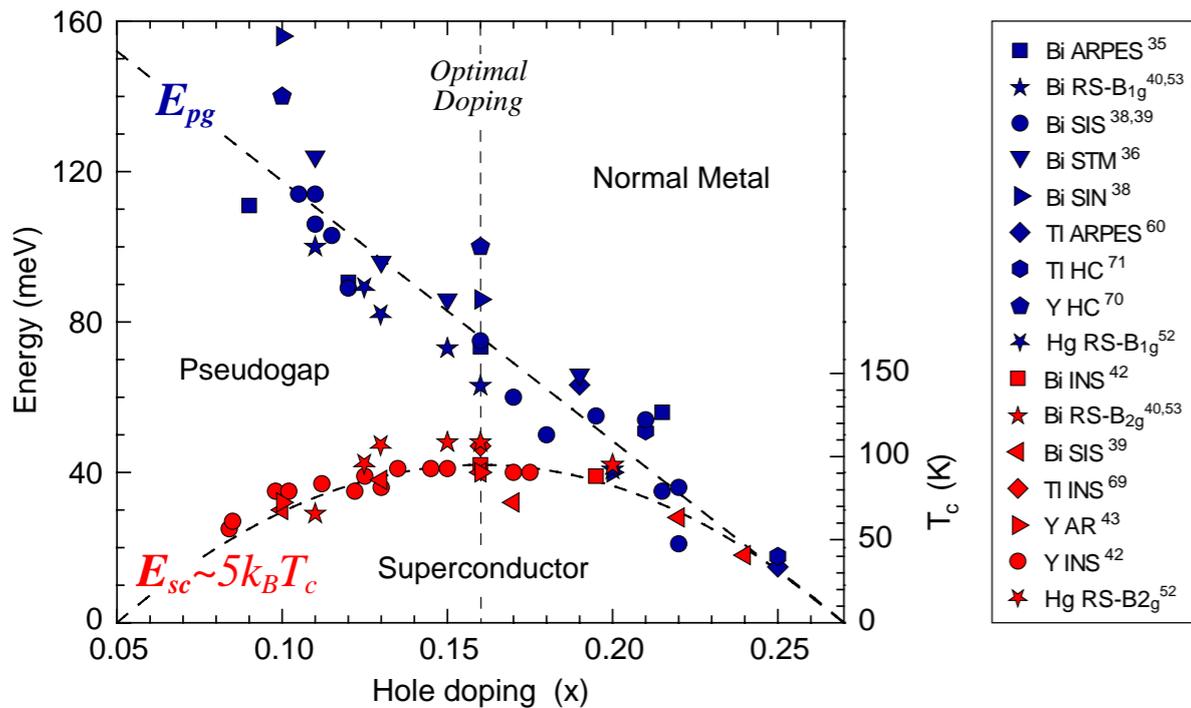
Controversial if contained in Hubbard model without long ranged order.

ARPES: Shen *et al.*, Science 307, 901 (2005)



ARPES: Kanigel *et al.*, Nature Physics 2, 447 - 451 (2006). Bi2212 sample with  $T_c=90K$ , measured at 140K

# Motivation - Pseudogap

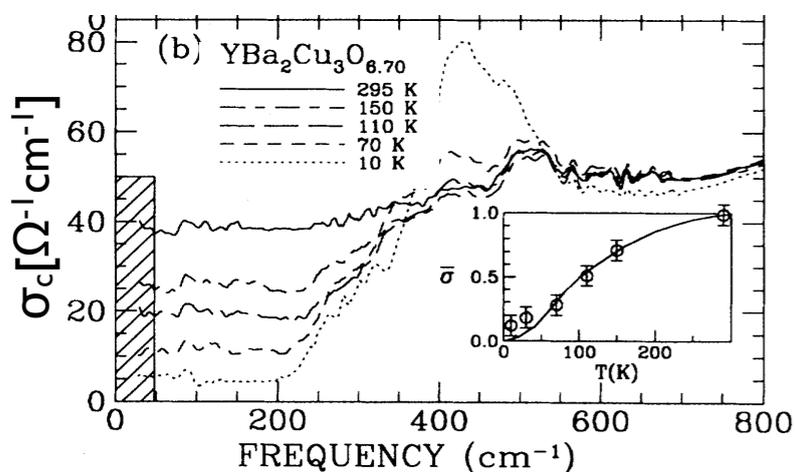


## Property of underdoped cuprates

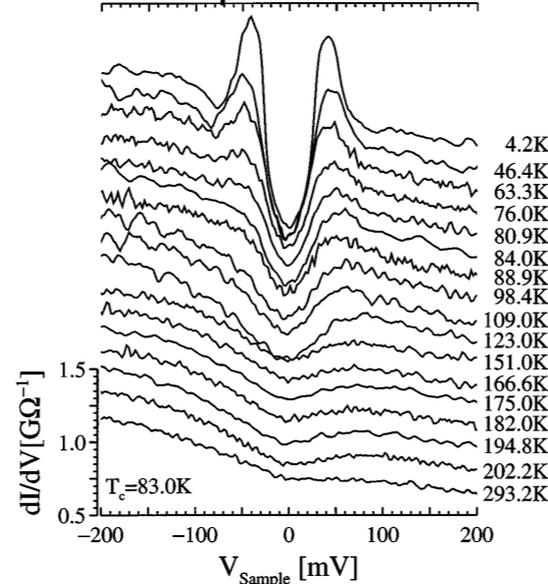
Hüfner *et al.*, Rep. Prog. Phys. 71, 062501 (2008)

## Observed in various experimental probes

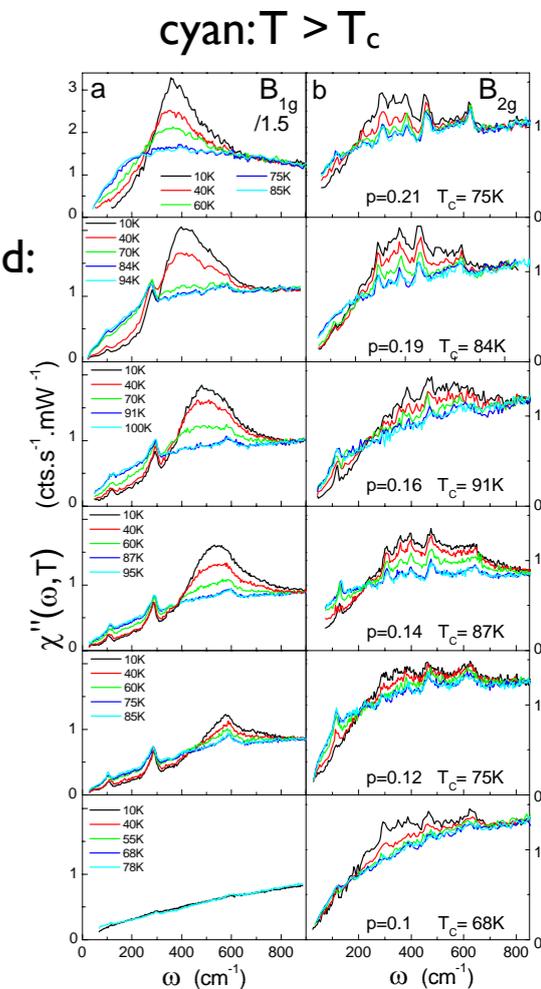
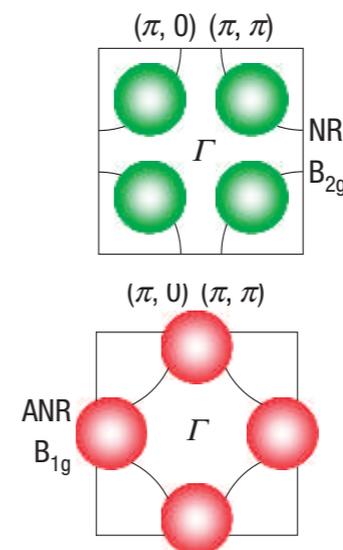
Homes *et al.*, Phys. Rev. Lett. 71, 1647 (1993). **c-axis conductivity**,  $T_c=63K$



Renner *et al.*, Phys. Rev. Lett. 80, 149 (1998). **Tunneling spectra** of Bi2212 sample with  $T_c=83K$

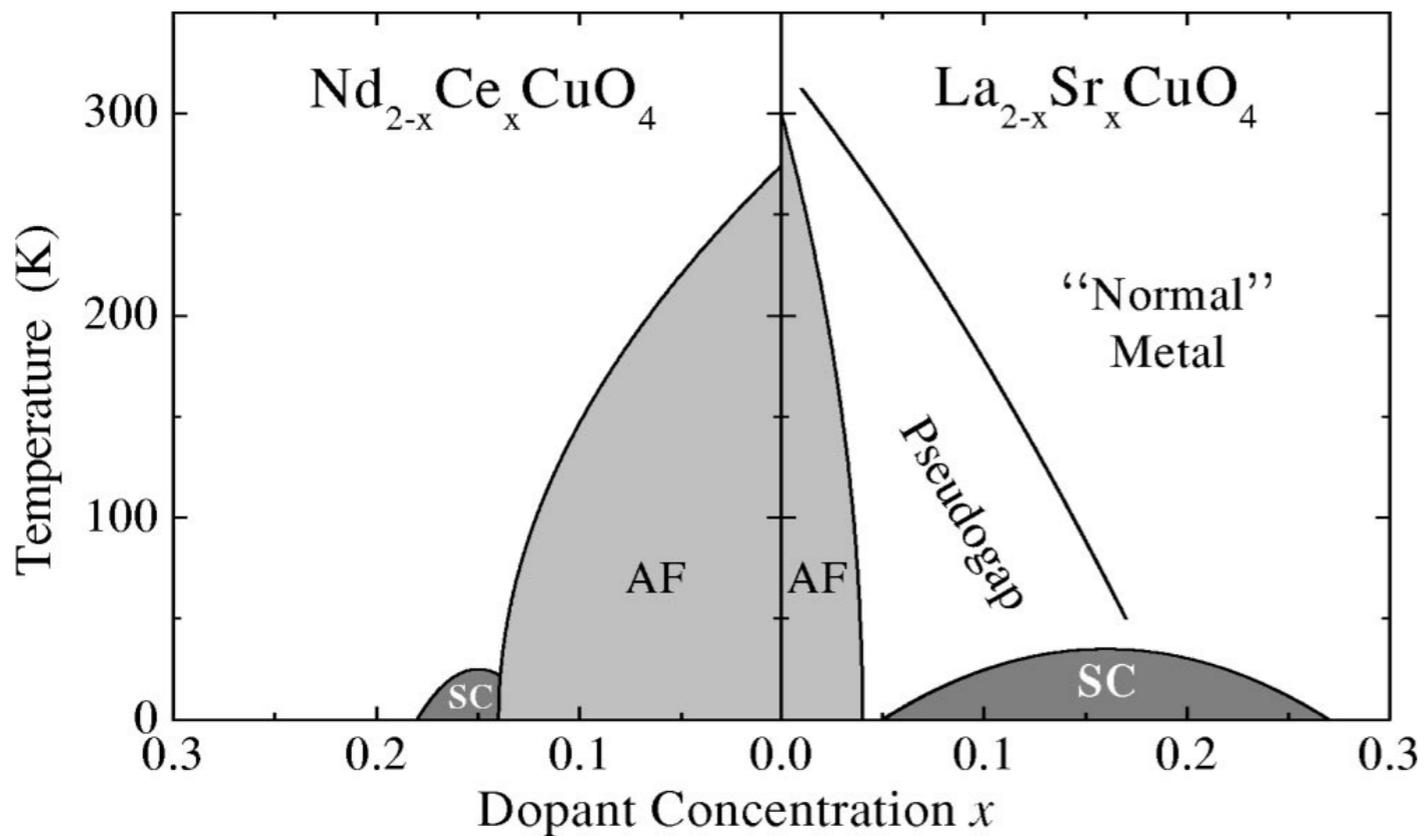


S. Blanc *et al.*, unpublished: **Raman spectroscopy** on  $\text{HgBa}_2\text{CuO}_{4+\delta}$



# Difference of electron and hole doping

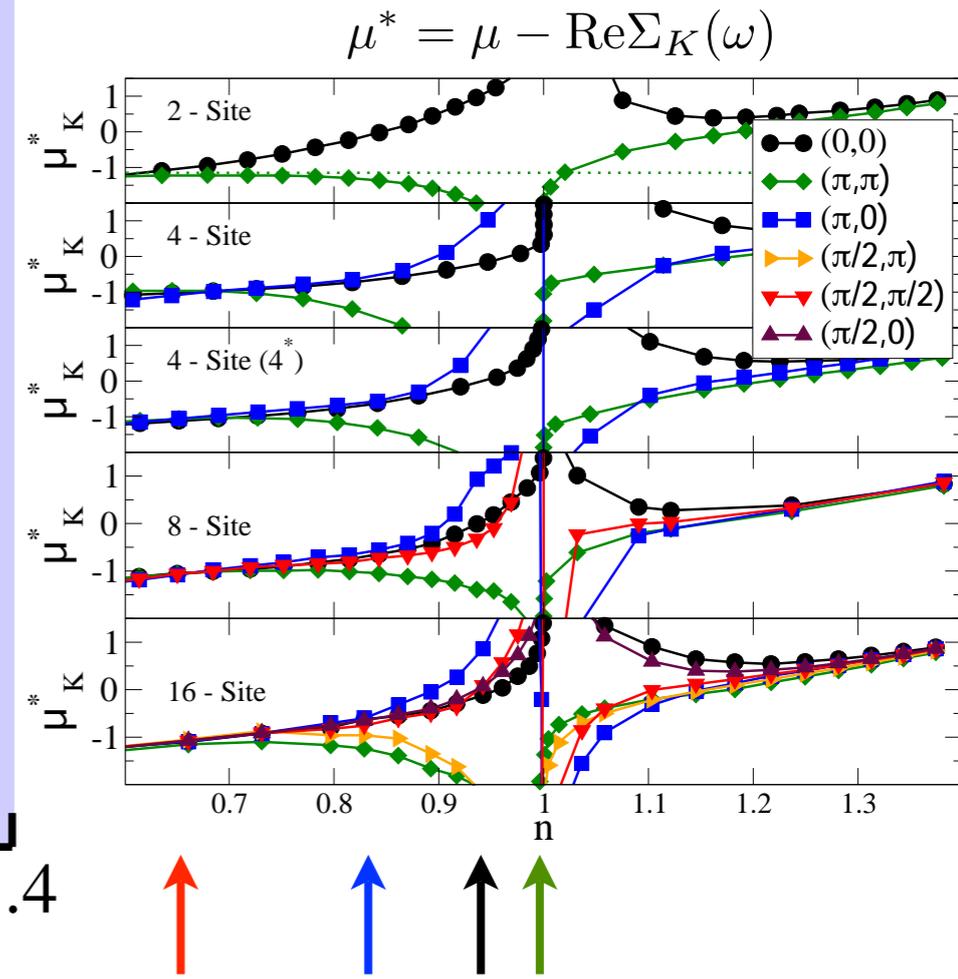
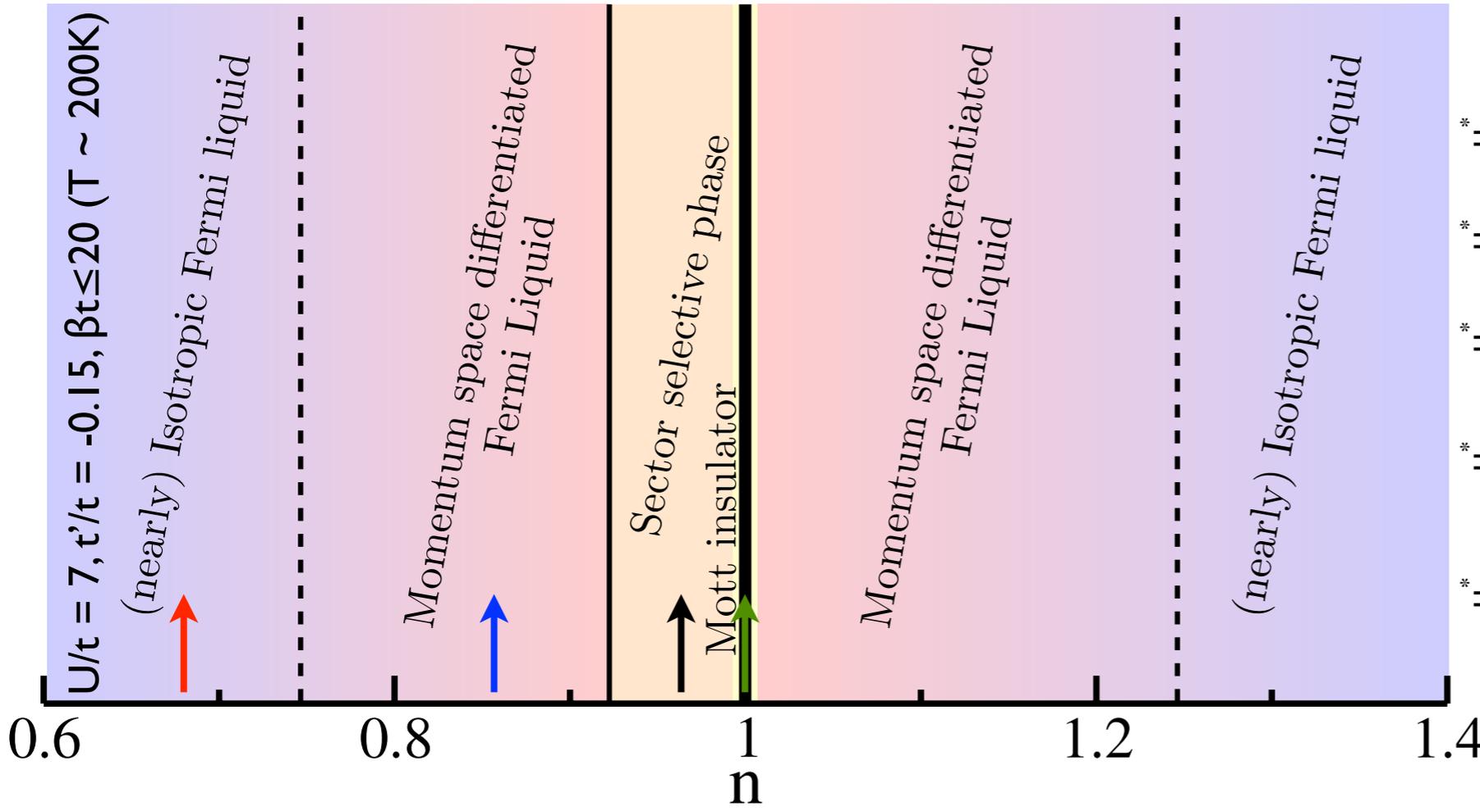
Damascelli *et al.*, Rev. Mod. Phys 75, 2 (2003)



Pseudogap appears only on the hole doped side (right side),  
dopings smaller than optimal doping,  
Temperatures up to  $\sim 300\text{K}$

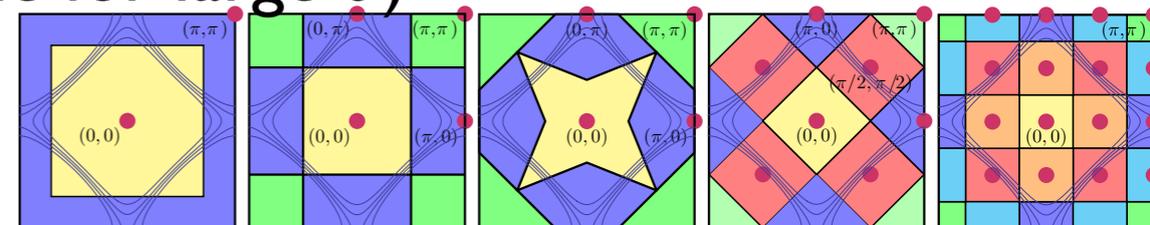
FIG. 1. Phase diagram of  $n$ - and  $p$ -type superconductors, showing superconductivity (SC), antiferromagnetic (AF), pseudogap, and normal-metal regions.

# Results: Regimes – Doping

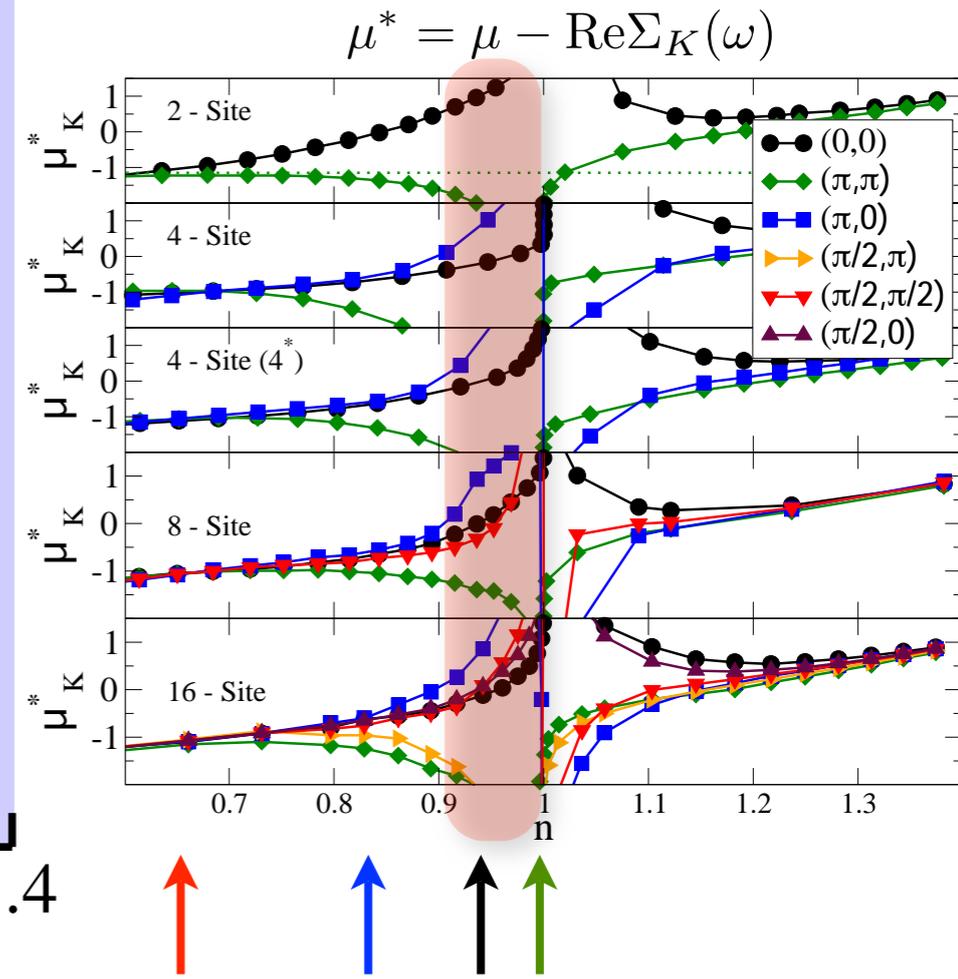
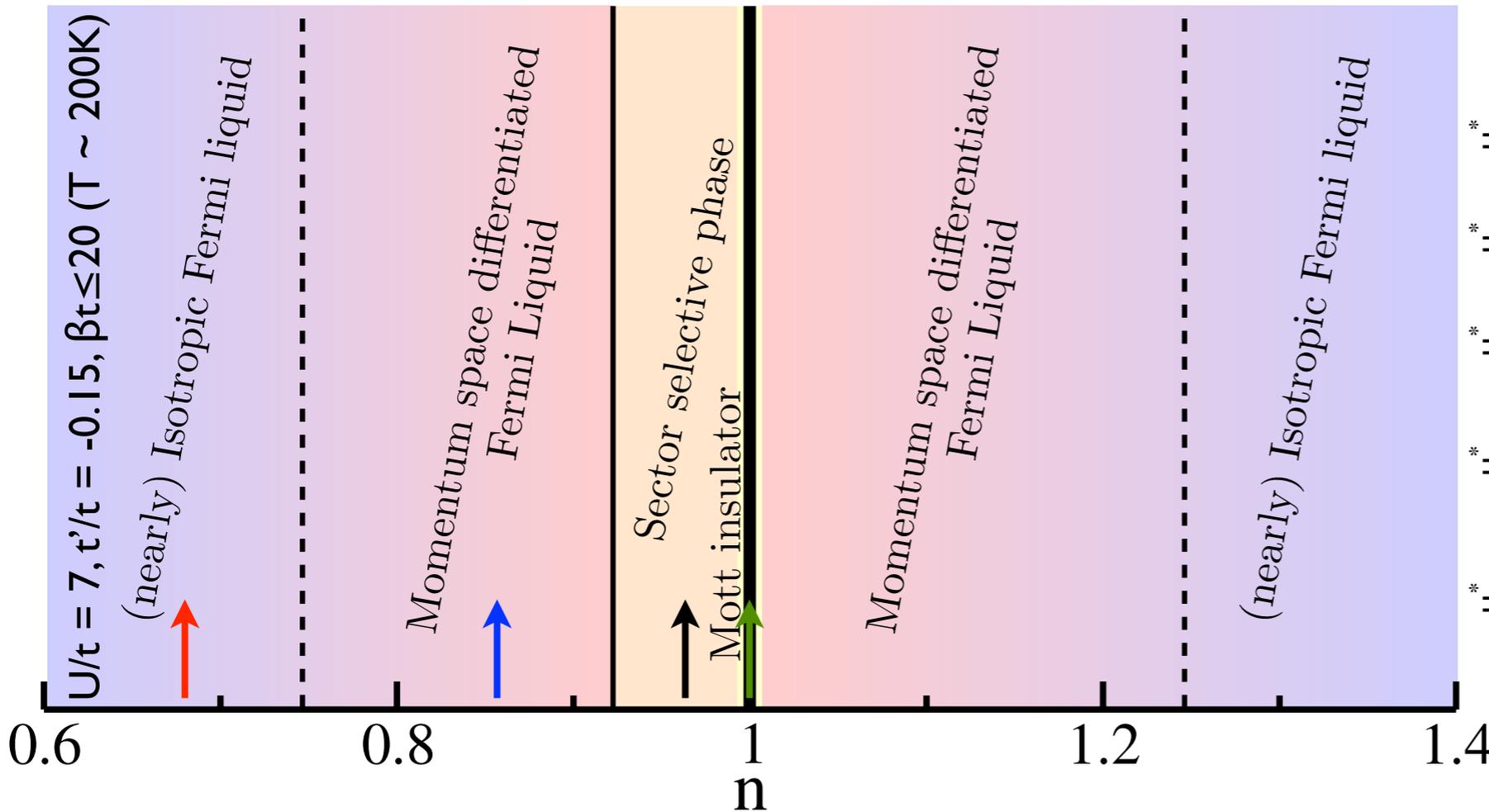


Study on five cluster geometries shows same features:

- Isotropic Fermi Liquid for large doping, as in 3D  $\Sigma(k, \omega) = \Sigma(\omega)$
- Momentum space differentiated Fermi liquid regime
- Sector Selective Phase (absent on el-doped side for large  $t'$ )
- Mott Insulator

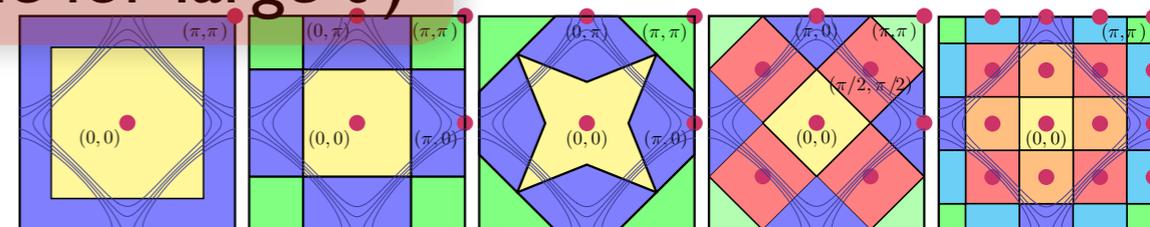


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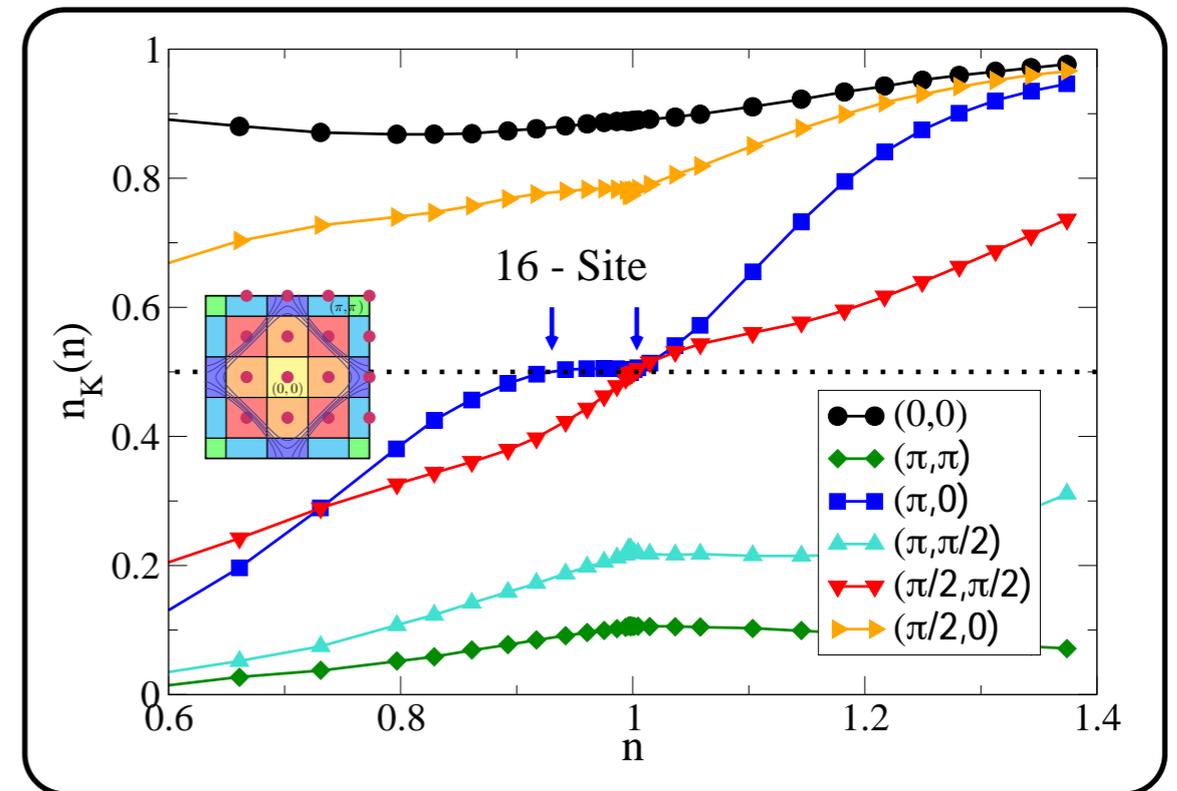
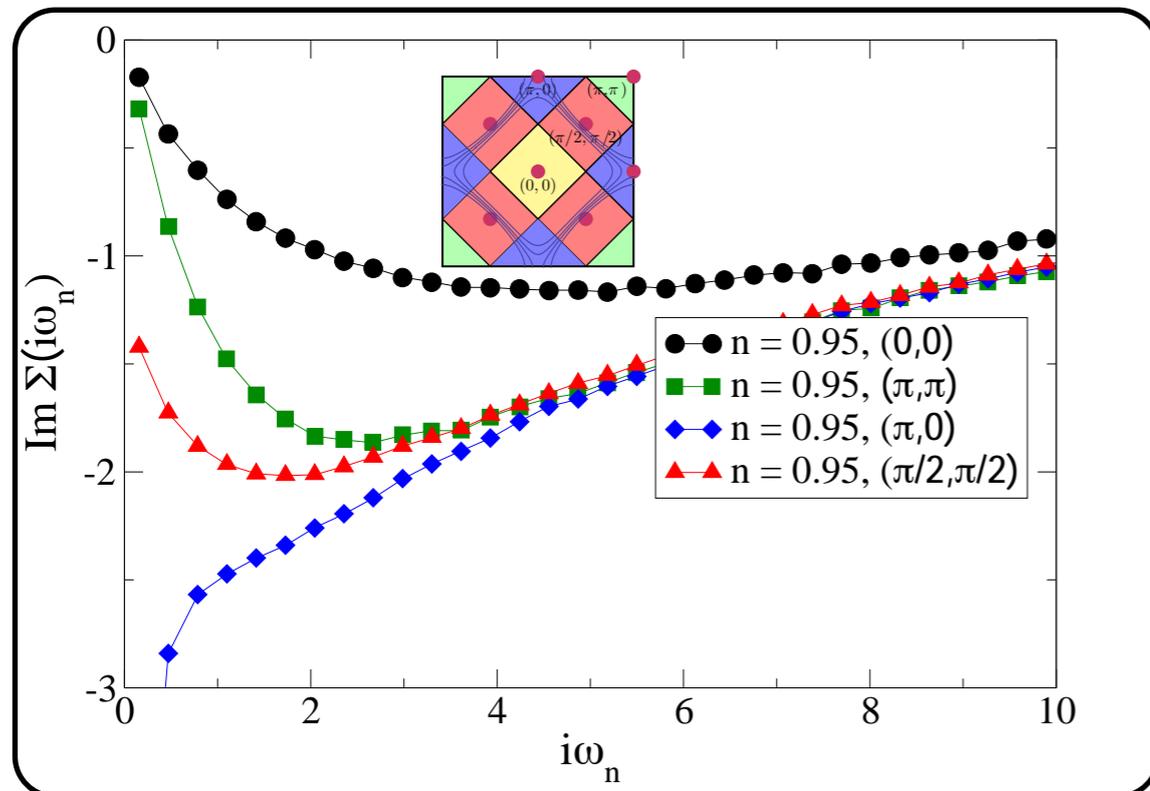
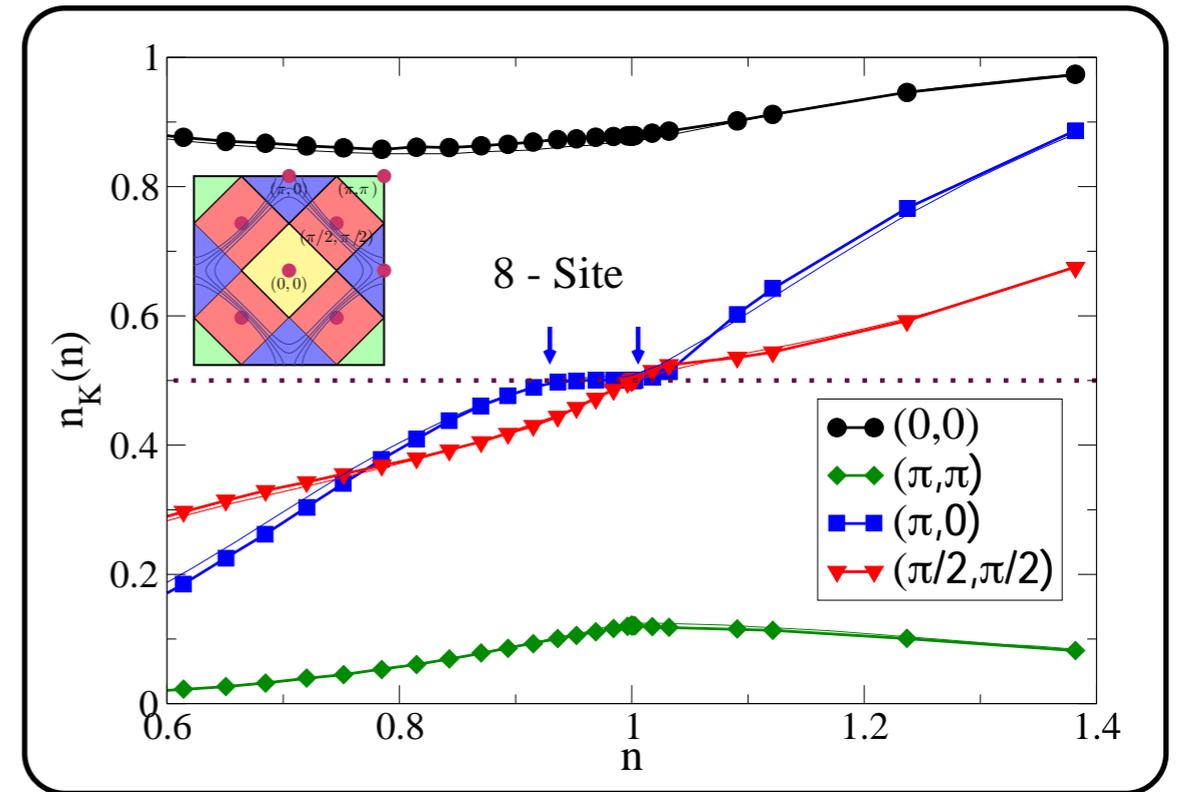
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- Mott Insulator



# Results: Sector Selective Regime

Sector selectivity:

- Some momentum sectors become insulating, while others stay metallic.
- Region around  $(\pi, 0)$  insulating, quasiparticles in  $(\pi/2, \pi/2)$  region.

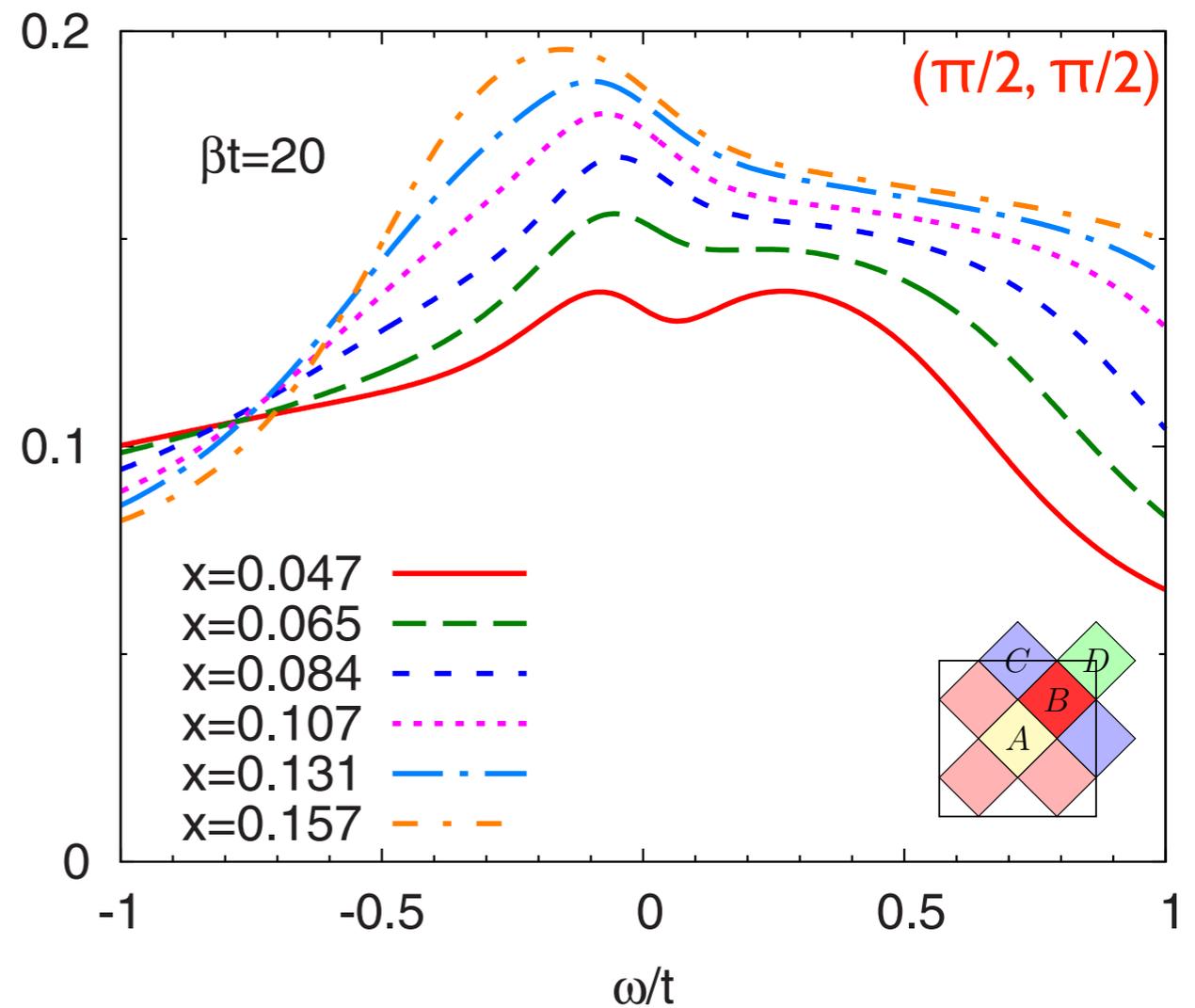
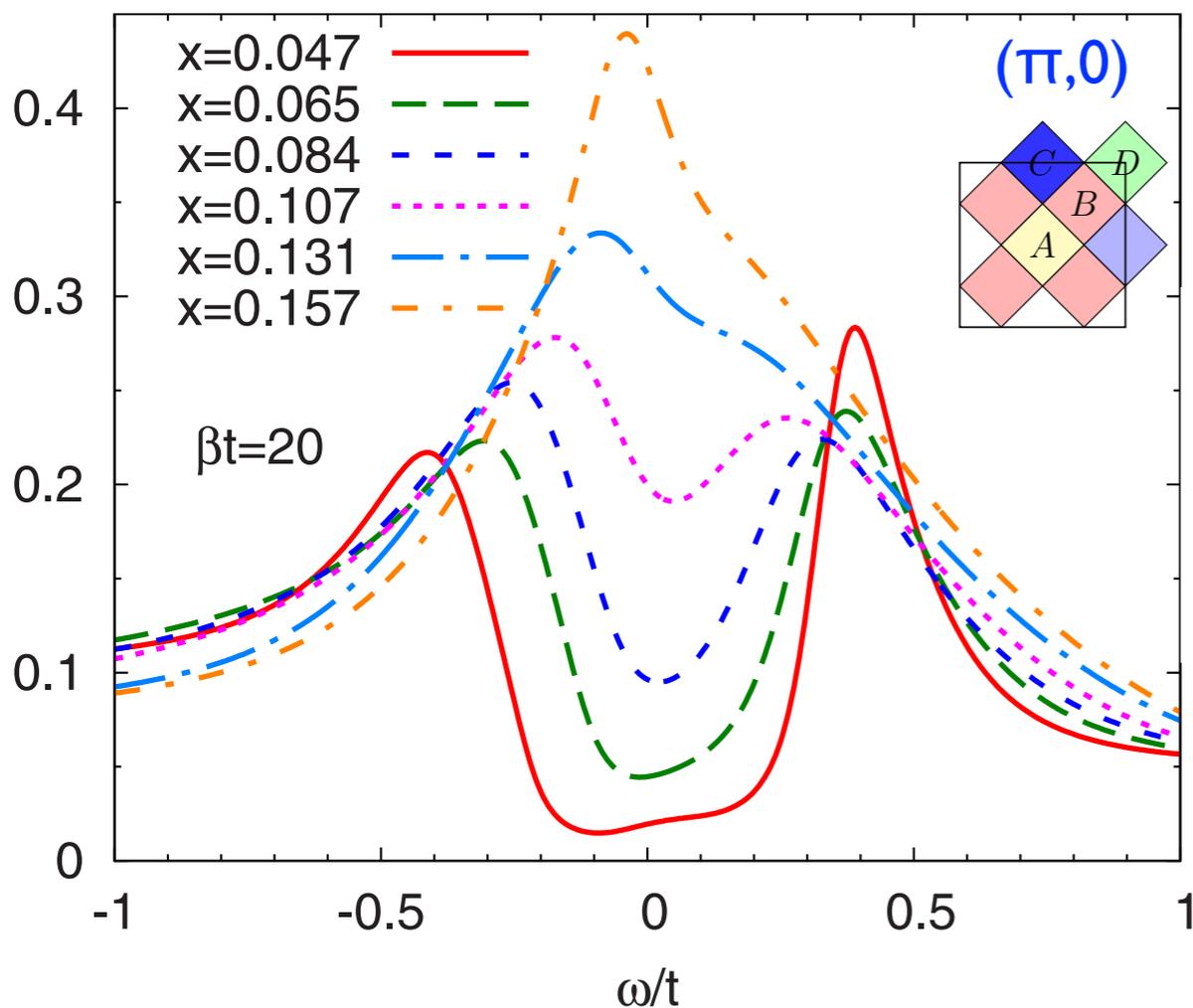


# Results: Spectral Function

Analytic continuations  
by Nan Lin

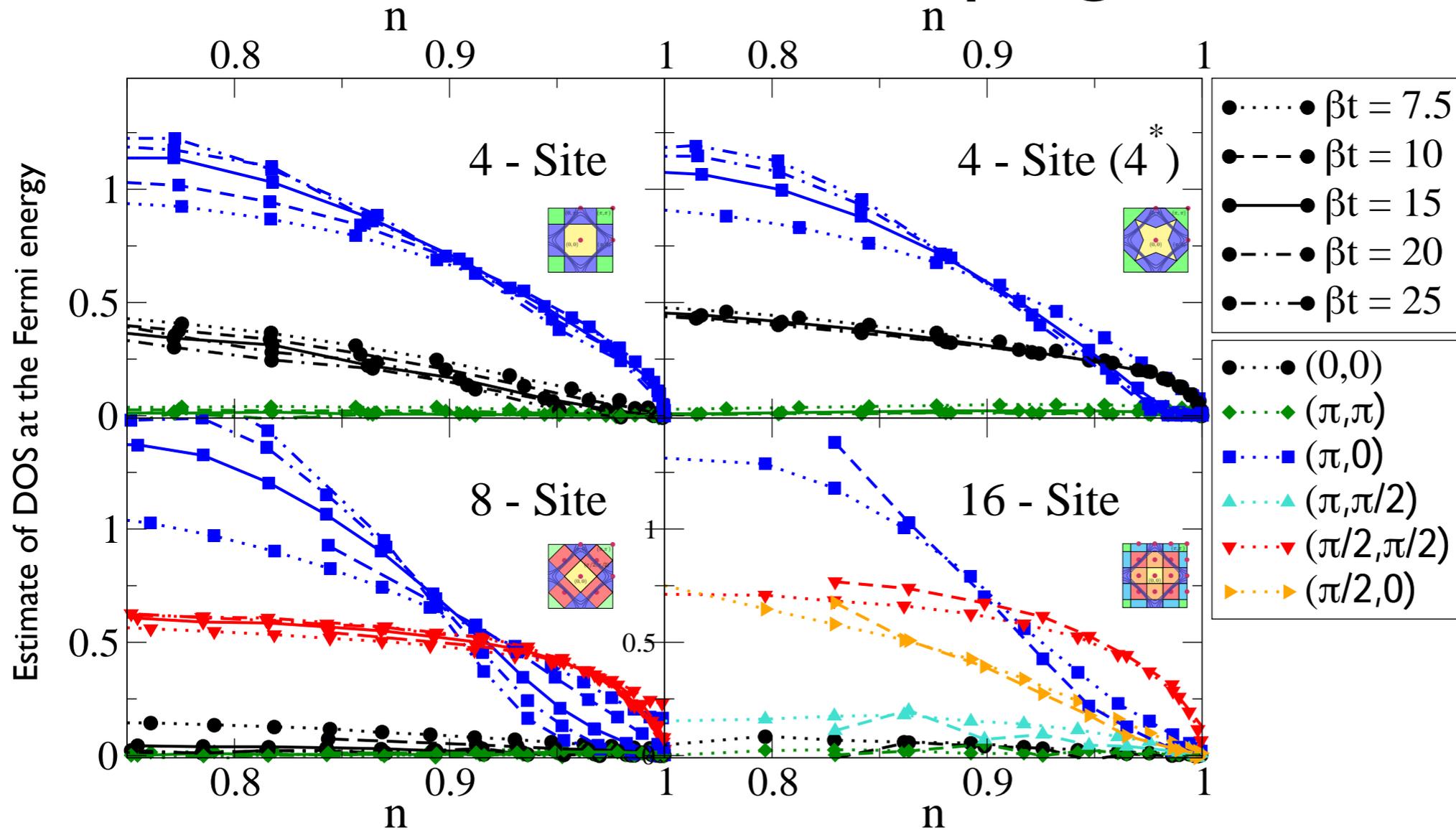


Analytically continued spectral function  $A(\omega)$  for the **antinodal** and the **nodal** sector, as a function of doping  $x$

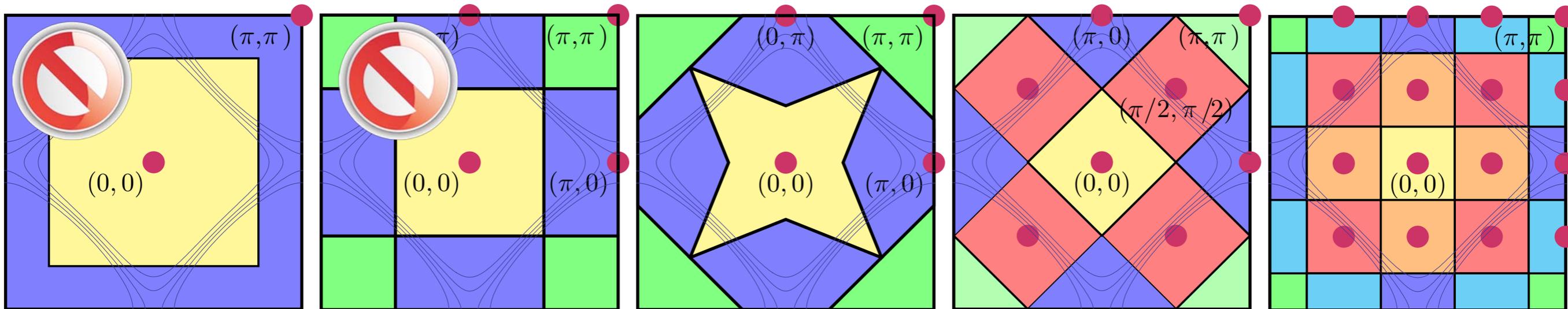


$U = 7t, t'/t = 0.15, \beta t = 20$

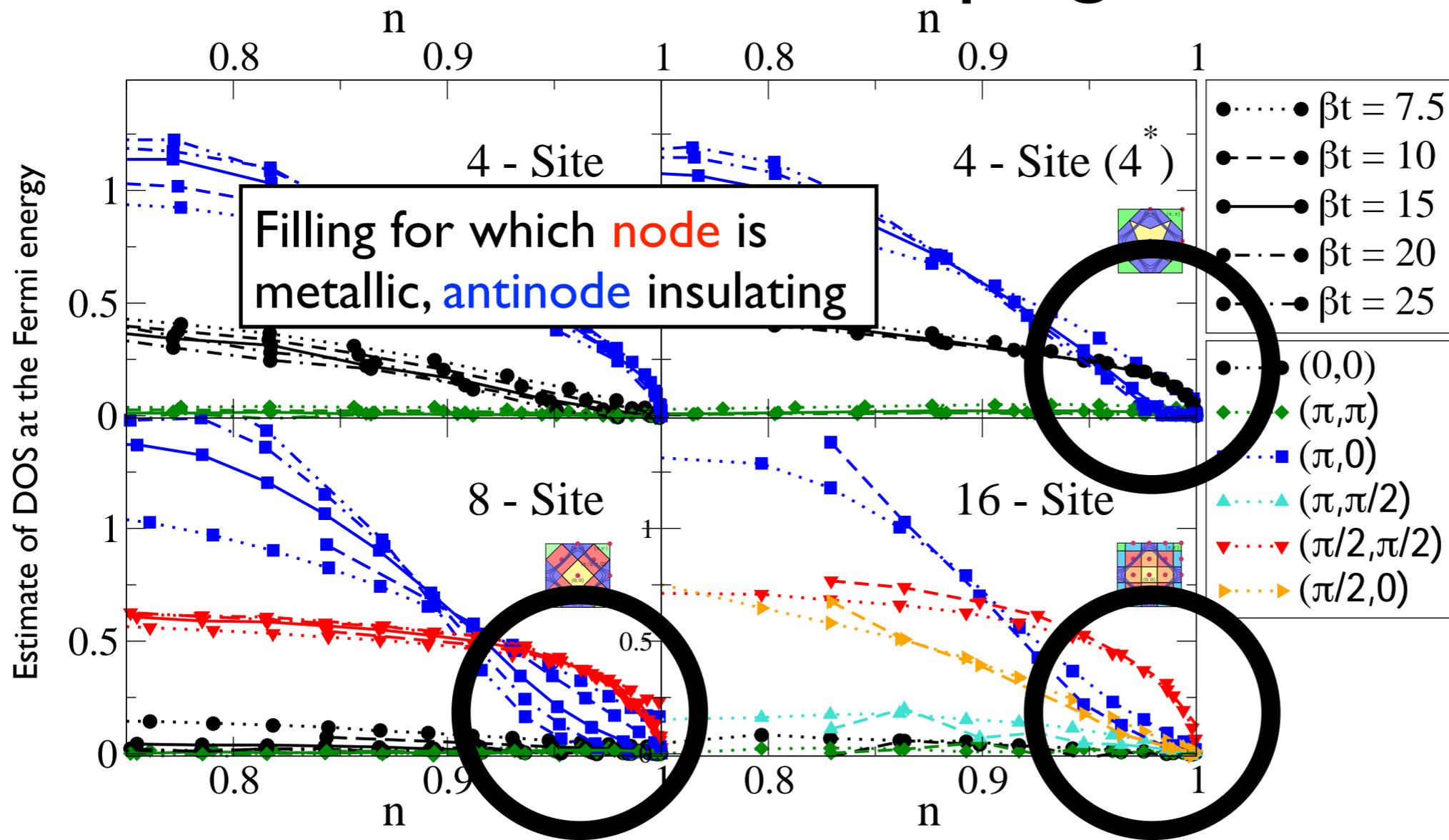
# Results: Doping Transition



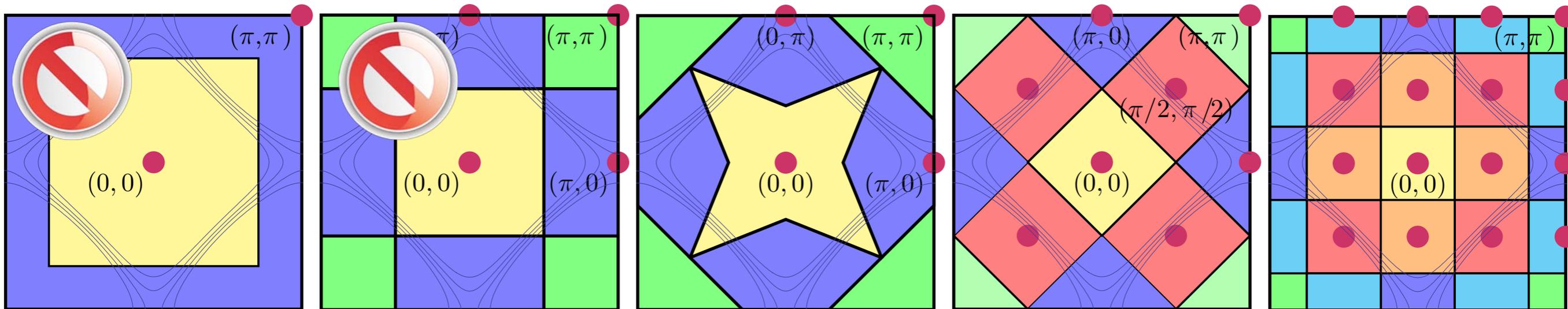
Sector selective transition is robust in DCA (for all clusters large enough to have nodal antinodal differentiation), is the DCA representation of pseudogap physics.



# Results: Doping Transition



Sector selective transition is robust in DCA (for all clusters large enough to have nodal antinodal differentiation), is the DCA representation of pseudogap physics.





# Results: Pseudogap Phase

Sector selective transition is **robust** (for all clusters large enough to have nodal antinodal differentiation), is the cluster DMFT representation of pseudogap physics.

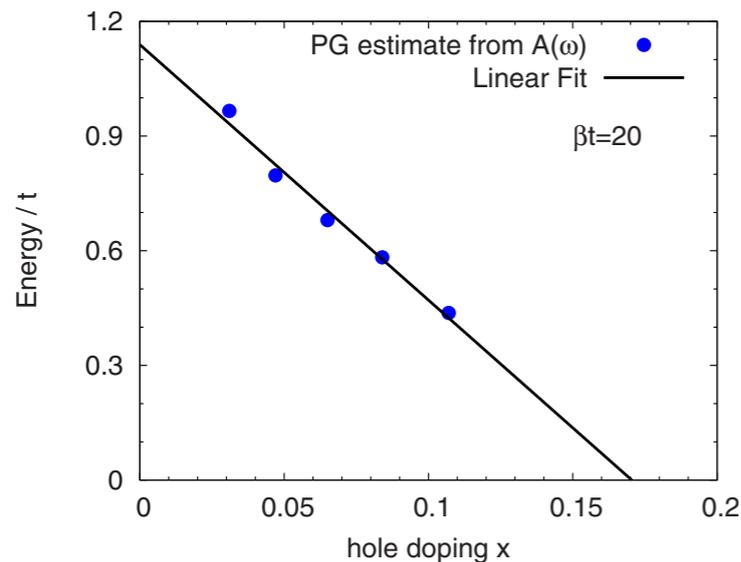
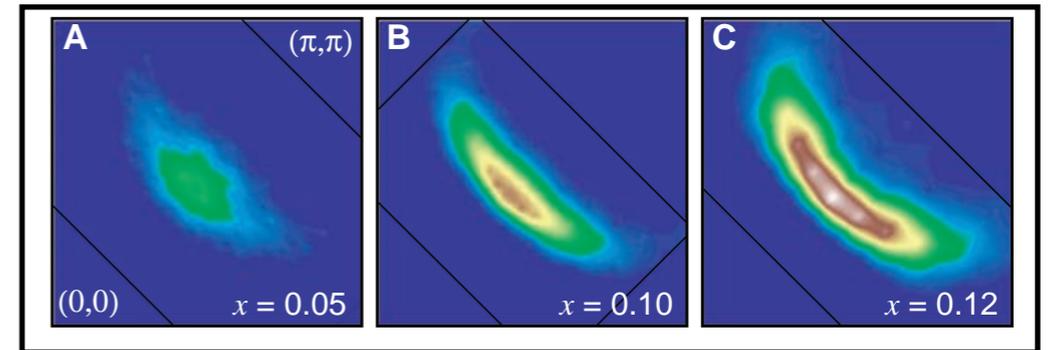
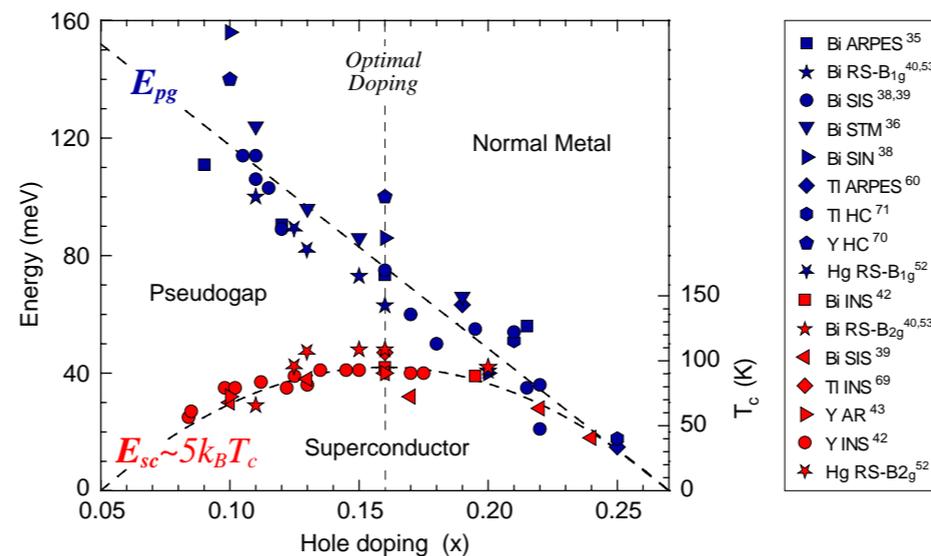


FIG. 15. (Color online) Points: pseudogap size determined from electron spectral function as a function of hole doping  $x$  for  $U=7t$  and inverse temperature  $\beta=20/t \approx 200$  K. Line: linear fit to results.



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Pseudogap Size

The pseudogap is a feature of the Hubbard model at intermediate correlation strength. **No long range order is required** to obtain a pseudogap.

Remarkable agreement with other experimental probes: c-axis, in-plane optical conductivity, Raman.

# Large Cluster DMFT – Conclusions

We can do **large interacting systems** (100 sites and more), at and away from half filling

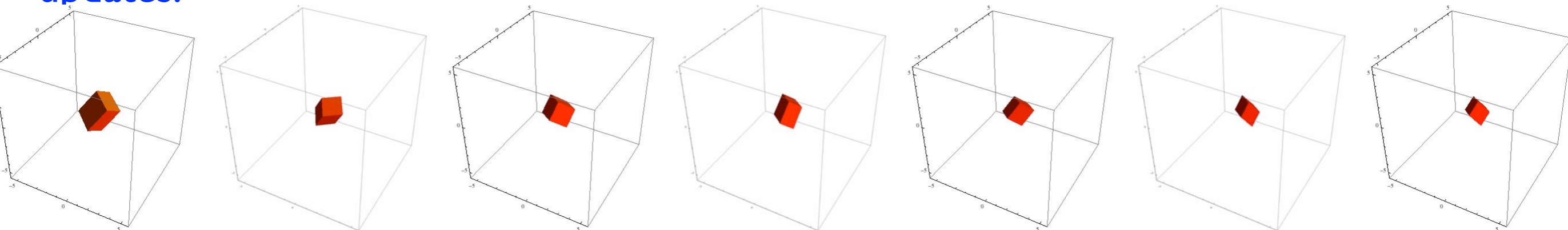
To obtain **converged results** all sources of errors need be addressed:

- **Monte Carlo** errors
- **Finite size errors**
- In methods that have them: further internal systematic errors like Trotter errors or bath discretization errors

In 3D: Exact results for **temperatures five times lower**

In 2D: Features in phase diagram established as robust, clear which regimes are converged and which are not.

Progress made possible by advances in numerical methods: **CT-AUX** and **sub-matrix updates**.



# Acknowledgments

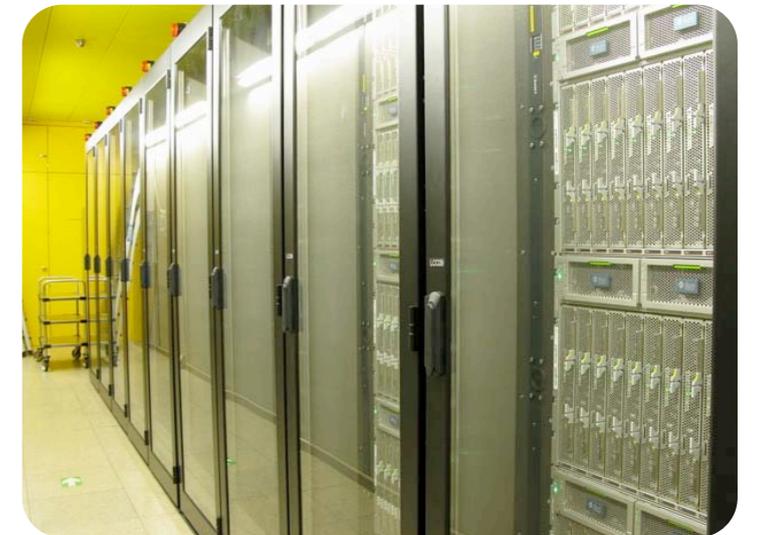
A.J. Millis, A. Georges, M. Ferrero, N. Lin, O. Parcollet, P. Werner (2D)  
T. Maier, P. Staar, P. Nukala, M. Summers, T. Schulthess (Numerics)  
S. Fuchs, L. Pollet, E. Kozik, E. Burovski, T. Pruschke, M. Troyer (3D)



Titane cluster, CEA



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Brutus cluster, ETH Zurich

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