



UCDAVIS



Harnessing the Sign Problem to study Quantum Magnetism and Metal-Insulator Transitions

- 1. Energy Bands in Solids (noninteracting Hubbard Model)
Initial Implications for Strongly Correlated Materials
- 2. The Hubbard Model
- 3. Quantum Monte Carlo (Solving the Hubbard Model)
Powerful (when it works ...) → the Sign Problem
- 4. Making Use of the Sign Problem !!
- 5. An Alternate Approach: Simplified Materials
Optical lattices and Engineered Silicon
- 6. Some Conclusions

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Rubem
Mondaini



Nandini
Trivedi



Thereza
Paiva



Sabyasachi
Tarat



Randy
Hulet



Simone
Chiesa



Chris
Varney



Ehsan
Khatami

QUANTUM MECHANICS OF ONE- AND TWO-ELECTRON ATOMS

BY

HANS A. BETHE AND EDWIN E. SALPETER

JOHN WENDELL ANDERSON
PROFESSOR OF PHYSICS

PROFESSOR OF PHYSICS
AND NUCLEAR STUDIES

CORNELL UNIVERSITY, ITHACA, NEW YORK

WITH 41 FIGURES

SPRINGER-VERLAG • BERLIN • GÖTTINGEN • HEIDELBERG • 1957
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The aim of this book is two-fold. First, to act as a reference work on calculations pertaining to hydrogen-like and helium-like atoms and their comparison with experiment. However, these calculations involve a vast array of approximate methods, mathematical tricks, and physical pictures

For atoms and ions with two electrons, such as H^- , He , Li^+ , etc., exact analytic solutions are not possible at the present time (1957, three decades after the invention of quantum mechanics, and still true today!)

What shall we do with solids with 10^{23} electrons?!?!

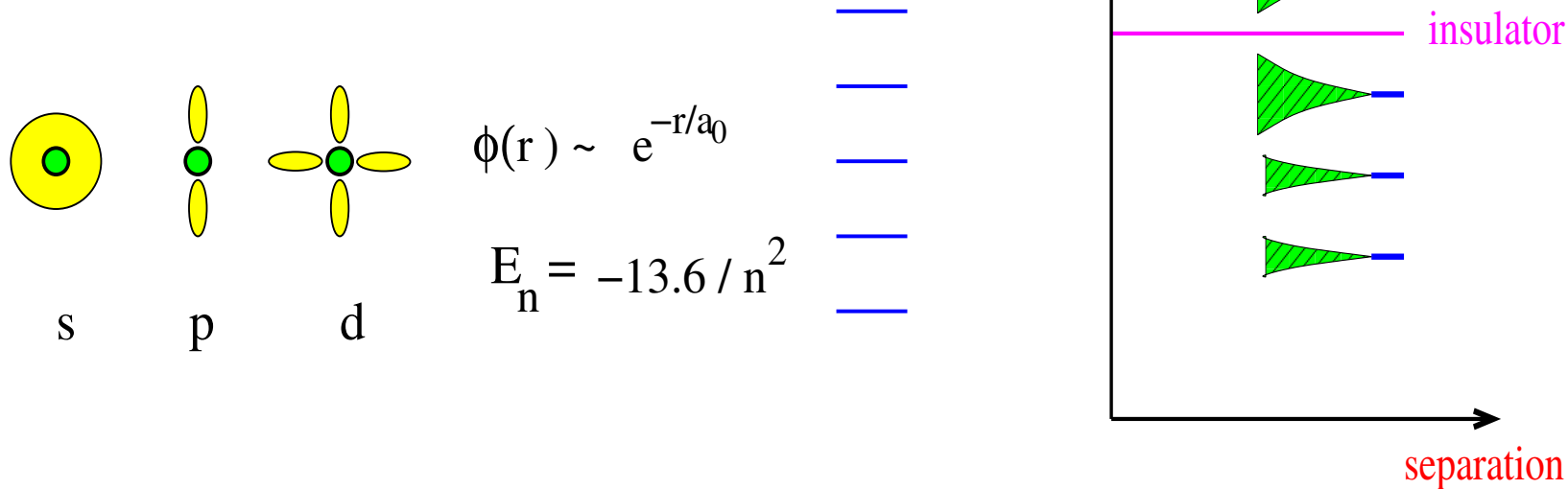
1. Origin of Energy Bands in a Solid (noninteracting HM)

Individual atoms: discrete energy levels

Atoms far apart: electrons are **localized** on single atom

Atoms brought together (solid): degenerate level couple and broaden into a band.

Eigenvectors are **delocalized** (plane/“Bloch” waves)



Energy band **completely filled**: Insulator

Finite energy **gap** to next unoccupied level

Simple counting arguments predict whether many solids are metallic or insulating!!

k eigenstate can be occupied by two electrons (spin \uparrow, \downarrow).

Solids with an odd number of electrons per unit cell must be metallic.

Alkalis (Li, Na, K):

one valence e^-

$(2s^1, 3s^1, 4s^1)$ per unit cell:

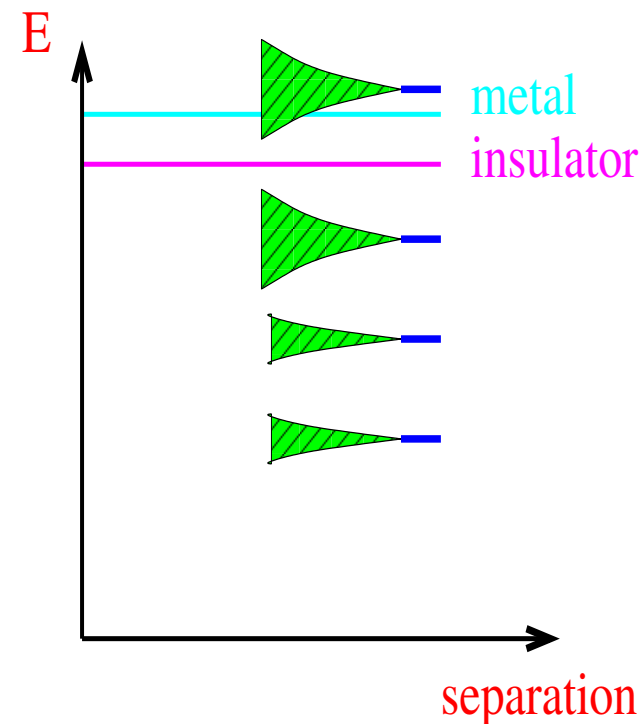
Good metals.

Diamond, silicon, germanium (C, Si, Ge):

eight valence electrons

$(2s^2 2p^2, 3s^2 3p^2, 4s^2 4p^2)$: per unit cell

Insulators.



Density Functional Theory: Accurate Energy Bands for Real Materials

Tight binding model:

Given a lattice geometry.

Electrons hop on neighboring sites $\langle lj \rangle$:

$$H = -t \sum_{\langle lj \rangle} (c_l^\dagger c_j + c_j^\dagger c_l)$$

Go to momentum space

$$c_k^\dagger = \frac{1}{\sqrt{N}} \sum_l e^{ikl} c_l^\dagger$$

to diagonalize H :

$$H = \sum_k E_k c_k^\dagger c_k$$

Dispersion relation: $E(k)$

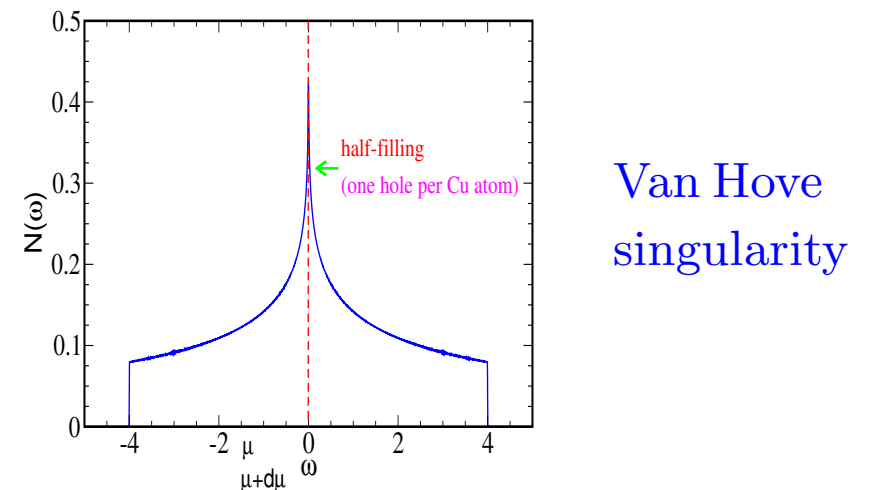
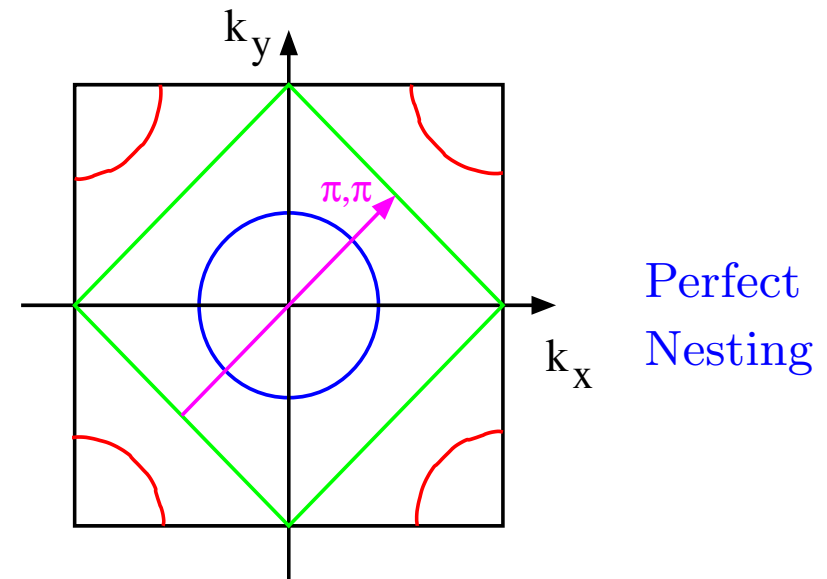
Fermi Surface: constant E_k trajectory.

Density of states:

$$N(\omega) = \int dk_x dk_y \delta(\omega - E_k)$$

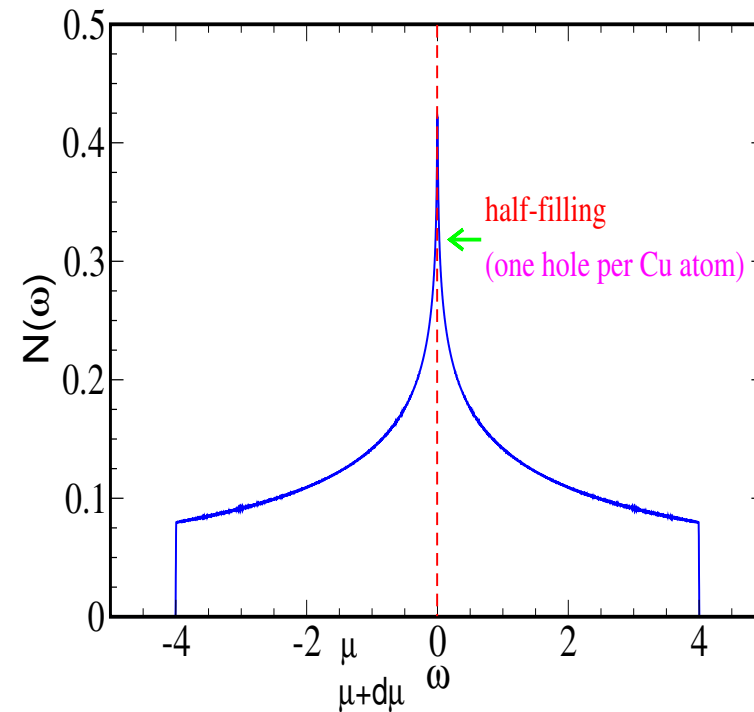
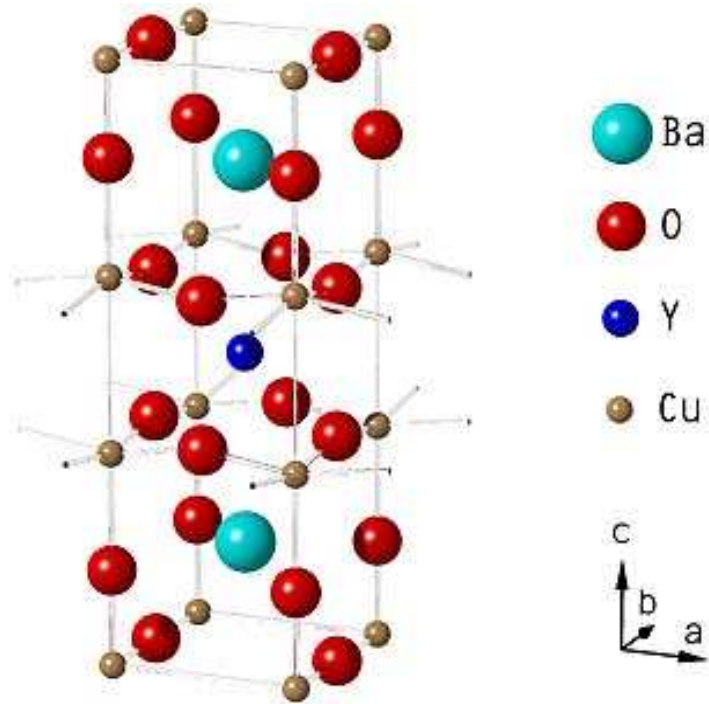
2D square lattice

$$E_k = -2t (\cos k_x + \cos k_y)$$



Simplest picture of cuprate (high temperature) superconductors. (Nobel Prize 1987)

Focus on square array of copper atoms in CuO_2 sheets.



VanHove singularity of DOS: $N(\omega = 0)$ diverges.

Early theory of high T_c

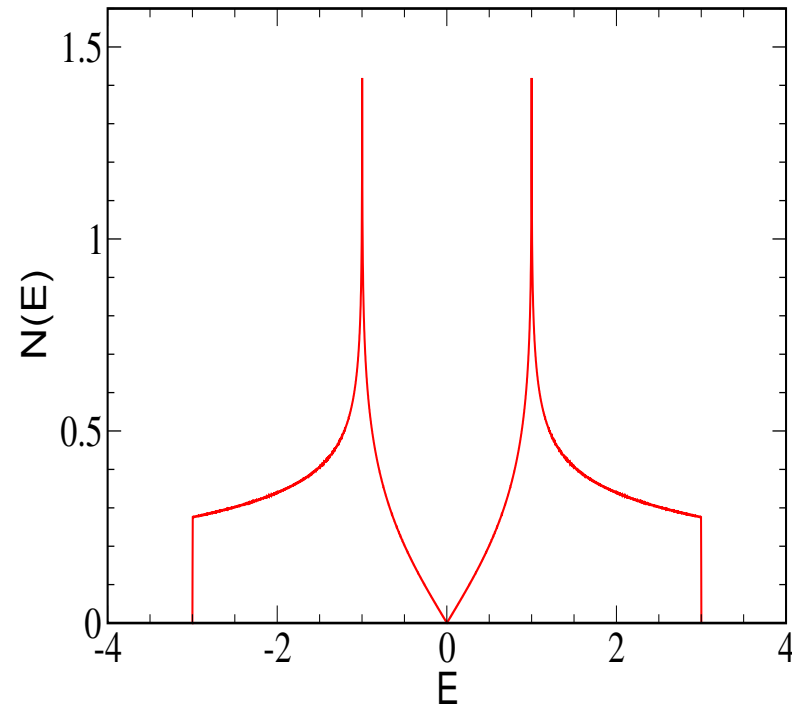
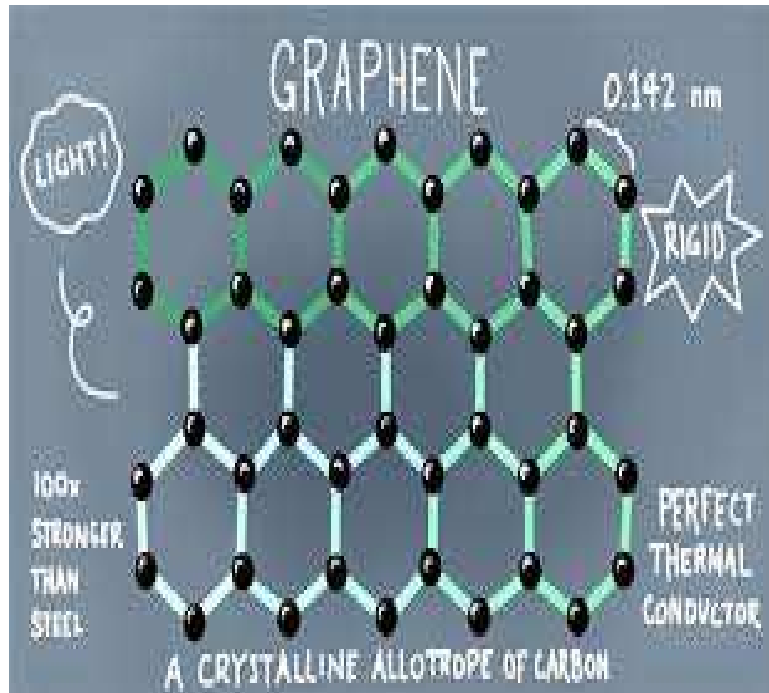
$$T_c \sim e^{-1/\lambda N(\omega=0)} \Rightarrow T_c \text{ is high.}$$

Previous superconductors: $\lambda N(\omega = 0) \sim 1/4$.

Critical coupling $U_c = 0$ for antiferromagnetic (AF) order.

$$\chi(q, T) = \frac{\chi_0(q, T)}{1 - U \chi_0(q, T)}$$

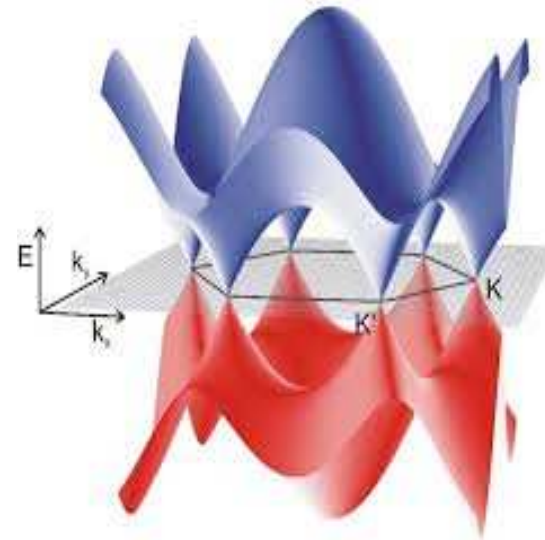
Graphene (Honeycomb lattice)



Density of states vanishes linearly at $\omega \rightarrow 0$.

Tied to 'Dirac cones' $E(\mathbf{k}) = v |\mathbf{k}|$.

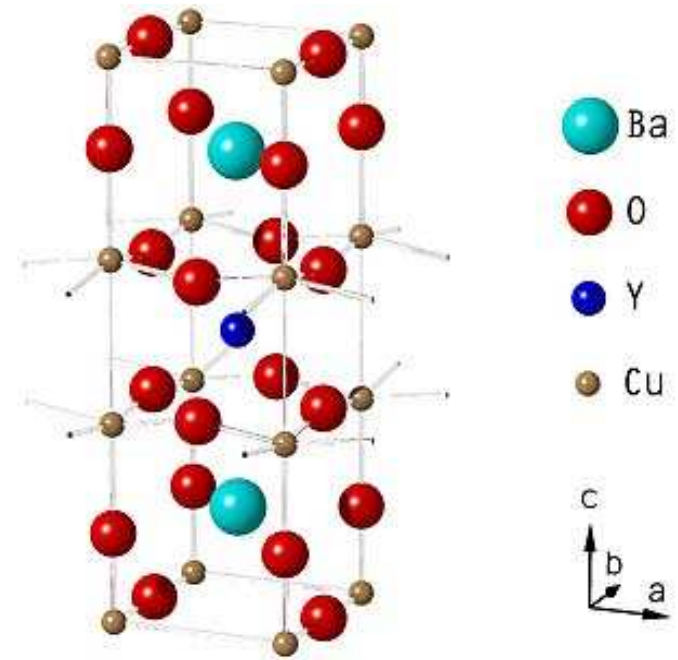
$N(E) = 0 \rightarrow U_c \neq 0$ for AF order



Trouble in Paradise ...

Parent compounds of cuprate superconductors:

- 1 hole/Cu
- Fermi level cuts middle of band.
- Why are they antiferromagnetic insulators?!

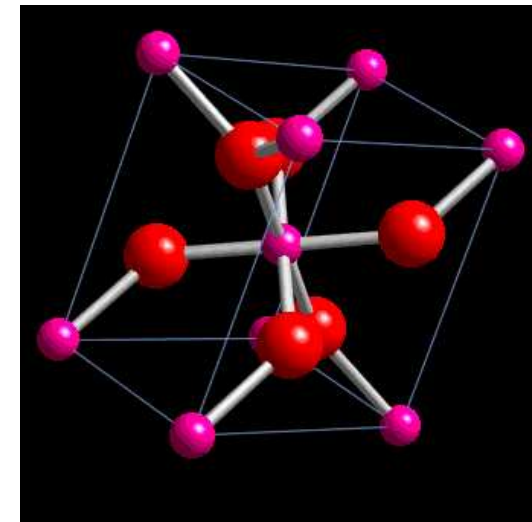


Transition metal monoxides (MnO, FeO, CoO):

(Many oxides in earth's interior.)

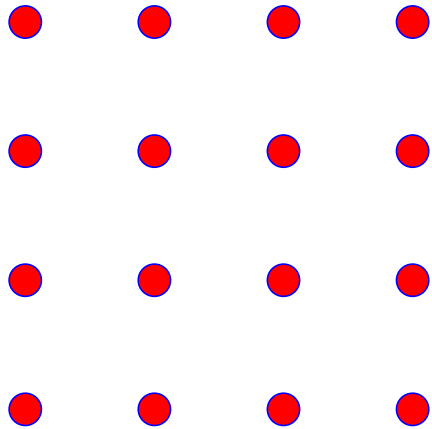
MnO: Mn^{2+} d band half-filled (d^5 : odd # electrons)

- Why are they antiferromagnetic insulators?!



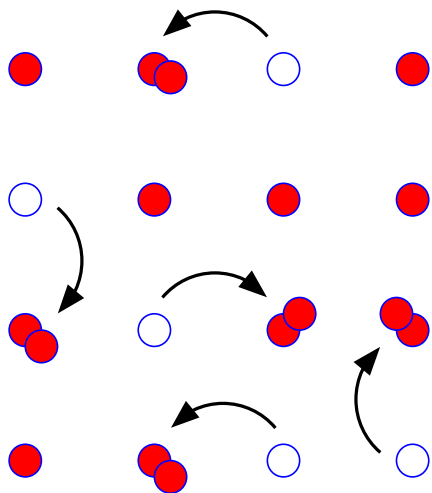
2. The Hubbard Hamiltonian

(A different type of Insulator)



Consider a lattice of sites with
“commensurate filling”:

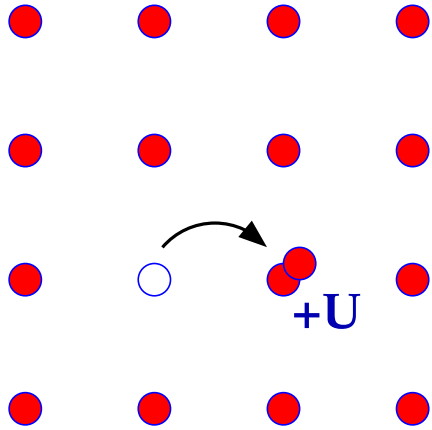
The **average** number of particles
is one per site.



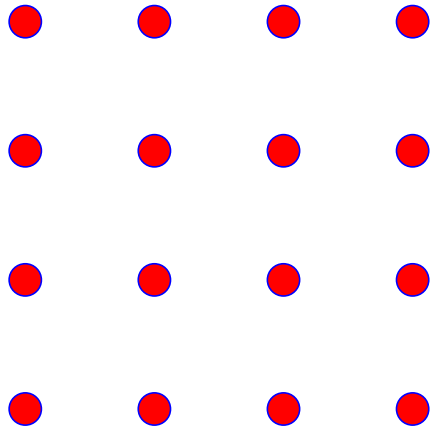
Kinetic energy and entropy both
favor particles moving around lattice.

Metal: odd number (one) particle per cell/site.

(Like cuprate superconductors.)



But what if there were a large repulsive interaction U between particles on the same site?



A **Mott Insulator** forms.

Basic physics of parent compounds of cuprate superconductors!

(Also other solids: FeO, CoO, MnO.)

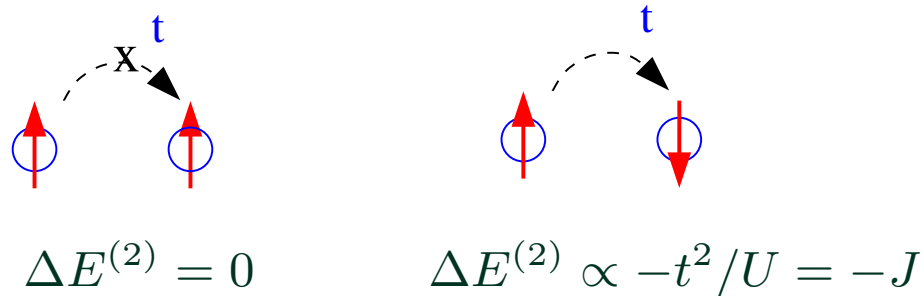
Two ways to destroy Mott Insulator:

- * Decrease U/t : By applying pressure (MnO)
- * Shift $\langle n \rangle \neq 1$: Dope chemically (cuprate superconductors)

What is optimal spin arrangement?

Hopping of neighboring **parallel** spins forbidden by Pauli.

Antiparallel arrangement lower in second order perturbation theory.



Mott insulating behavior and antiferromagnetism go hand-in-hand.

Qualitative picture of cuprate physics before doping.

Surprisingly, square lattice Hubbard Model captures physics of **doped** cuprates:

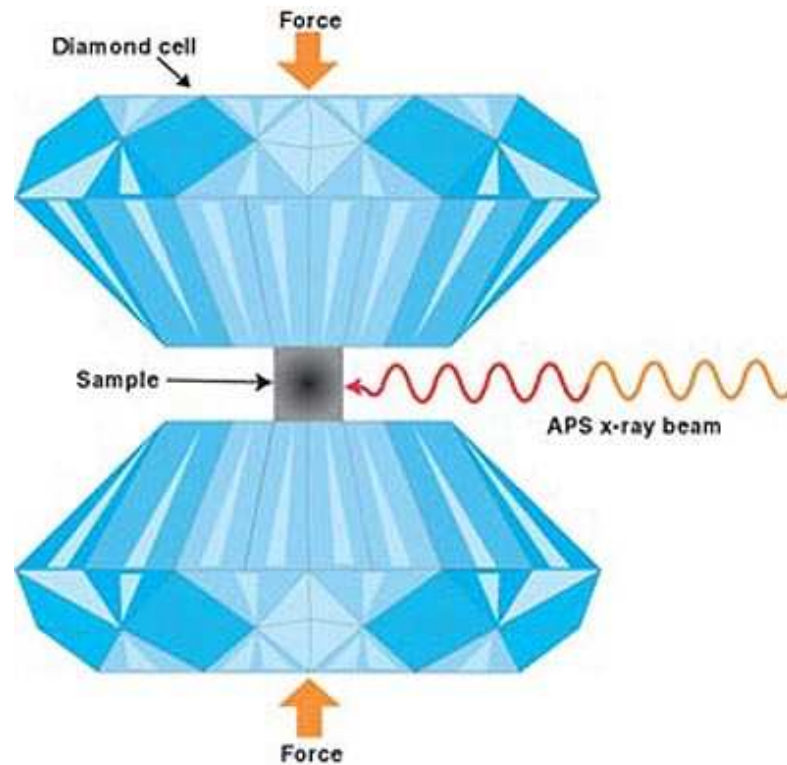
Spin gap and strange metal behavior, stripes, *d*-wave pairing ...

Can however make MnO have the expected metallic behavior...

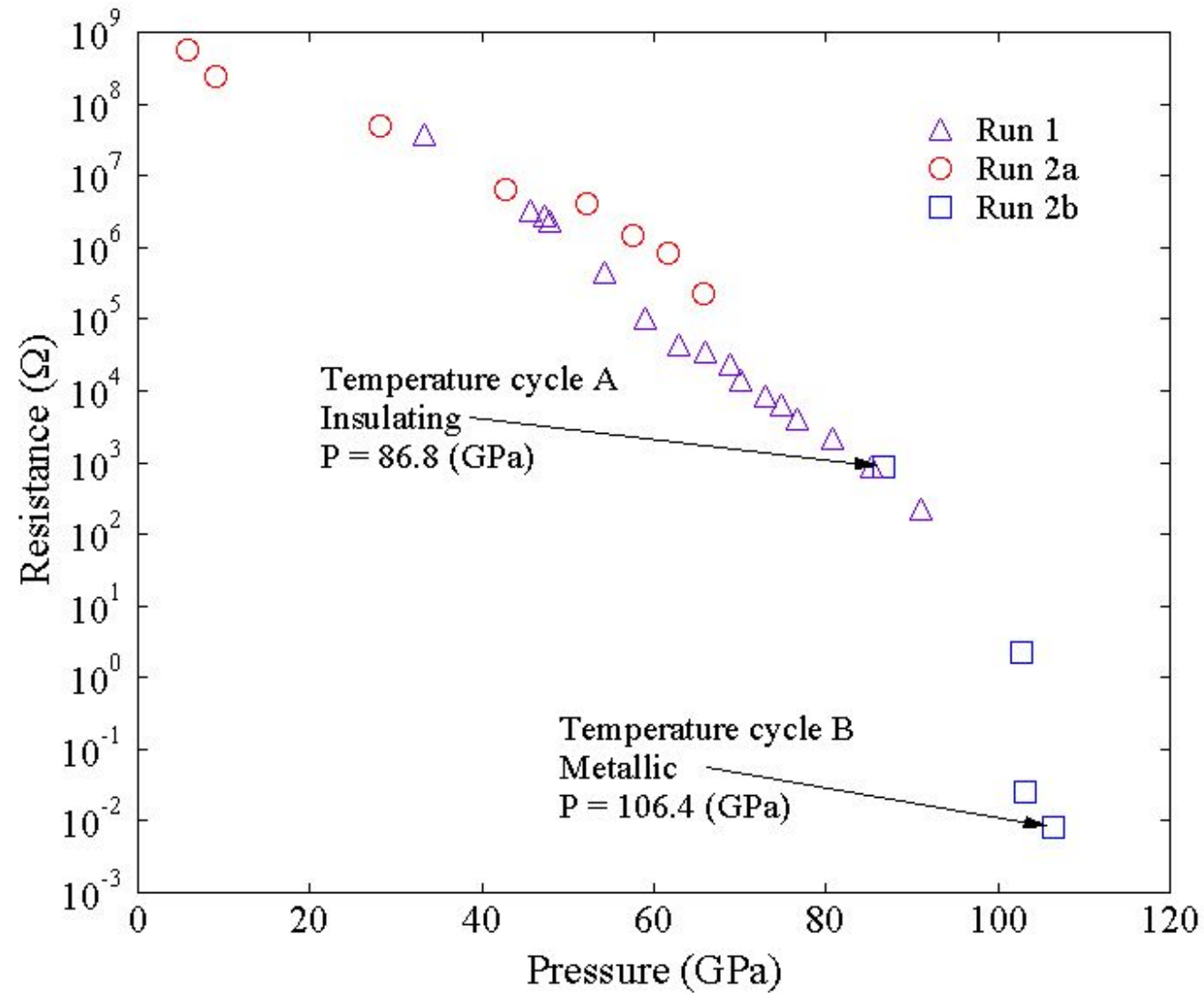
Diamond Anvil Cell

Apply pressure (and lots of it!) to push atoms closer.

- * Direct measurement of resistance
- * Probe magnetic moments with synchrotron radiation (APS at Argonne)



Resistance drops to typical metallic values at $P \approx 100$ GPa.



J.R. Patterson *et al.*, Phys. Rev. B69, 220101(R) (2004).

(Single band) Hubbard Hamiltonian

$$\hat{H} = -t \sum_{\langle \mathbf{ij} \rangle \sigma} (c_{\mathbf{i}\sigma}^\dagger c_{\mathbf{j}\sigma} + c_{\mathbf{j}\sigma}^\dagger c_{\mathbf{i}\sigma}) + U \sum_{\mathbf{i}} (n_{\mathbf{i}\uparrow} - \frac{1}{2})(n_{\mathbf{i}\downarrow} - \frac{1}{2}) - \mu \sum_{\mathbf{i}\sigma} (n_{\mathbf{i}\sigma} + n_{\mathbf{i}\sigma})$$

- Two spin species $\sigma = \uparrow, \downarrow$.
- Kinetic energy t describes hopping between near-neighbor sites $\langle \mathbf{ij} \rangle$.
- On-site repulsion U discourages double occupancy
- Chemical potential μ controls filling.
- Half-filling ($\rho = 1$) at $\mu = 0$.

Cuprate materials (LaSrCuO, YBaCuO, ...) drive interest in 2D square lattice:

Cu atoms in CuO₂ sheets are in that geometry.

Ignore bridging O atoms.

Ignore La, Sr, Y, Ba between layers.

Graphene → honeycomb lattice.

Determinant Quantum Monte Carlo

Compute operator expectation values

$$\begin{aligned}\langle \hat{A} \rangle &= Z^{-1} \text{Tr} [\hat{A} e^{-\beta \hat{H}}] \\ Z &= \text{Tr} [e^{-\beta \hat{H}}]\end{aligned}$$

Hubbard Hamiltonian

$$\hat{H} = -t \sum_{\langle \mathbf{ij} \rangle \sigma} (c_{\mathbf{i}\sigma}^\dagger c_{\mathbf{j}\sigma} + c_{\mathbf{j}\sigma}^\dagger c_{\mathbf{i}\sigma}) + U \sum_{\mathbf{i}} (n_{\mathbf{i}\uparrow} - \frac{1}{2})(n_{\mathbf{i}\downarrow} - \frac{1}{2}) - \mu \sum_{\mathbf{i}\sigma} (n_{\mathbf{i}\sigma} + n_{\mathbf{i}\sigma})$$

- Inverse Temperature discretized: $\beta = L\Delta\tau$

$$Z = \text{Tr} [e^{-\beta \hat{H}}] = \text{Tr} [e^{-\Delta\tau \hat{H}}]^L$$

- Suzuki-Trotter Approximation

$$e^{-\Delta\tau \hat{H}} \approx e^{-\Delta\tau \hat{K}} e^{-\Delta\tau \hat{P}}$$

Extrapolation to $\Delta\tau = 0$.

- (Discrete) Hubbard-Stratonovich Fields (Hirsch) decouple interaction:

$$e^{-\Delta\tau U(n_{\mathbf{i}\uparrow} - \frac{1}{2})(n_{\mathbf{i}\downarrow} - \frac{1}{2})} = \frac{1}{2} e^{-U\Delta\tau/4} \sum_{S_{\mathbf{i}\tau}} e^{\Delta\tau\lambda S_{\mathbf{i}\tau}(n_{\mathbf{i}\uparrow} - n_{\mathbf{i}\downarrow})} = e^{-\Delta\tau\mathcal{P}_{\mathbf{i}}(\tau)}$$

where $\cosh(\Delta\tau\lambda) = e^{U\Delta\tau/2}$.

- Quadratic Form in fermion operators: Do trace analytically

$$\begin{aligned} Z &= \sum_{\{S_{\mathbf{i}\tau}\}} \text{Tr} [e^{-\Delta\tau\hat{K}} e^{-\Delta\tau\hat{\mathcal{P}}(1)} e^{-\Delta\tau\hat{K}} e^{-\Delta\tau\hat{\mathcal{P}}(2)} e^{-\Delta\tau\hat{K}} \dots e^{-\Delta\tau\hat{\mathcal{P}}(L)}] \\ &= \sum_{\{S_{\mathbf{i}\tau}\}} \det M_{\uparrow}(\{S_{\mathbf{i}\tau}\}) \det M_{\downarrow}(\{S_{\mathbf{i}\tau}\}) \end{aligned}$$

$\dim(M_{\sigma})$ is the number of spatial sites. For multi-band models dimension is (number of spatial sites)x(number of orbitals per site).

- Sample HS field stochastically.

$$\begin{aligned} S_{\mathbf{i}_0 \tau_0} &\rightarrow -S_{\mathbf{i}_0 \tau_0} \\ \det M_\sigma(\{S_{\mathbf{i}_\tau}\}) &\rightarrow \det M_\sigma(\{S_{\mathbf{i}_\tau}\}') \end{aligned}$$

Algorithm is order $N^3 L$.

$N \sim 10^2 - 10^3$ lattice sites/electrons

$L = \beta/\Delta\tau \sim$ a hundred imaginary time slices (low temperatures).

- Measurements

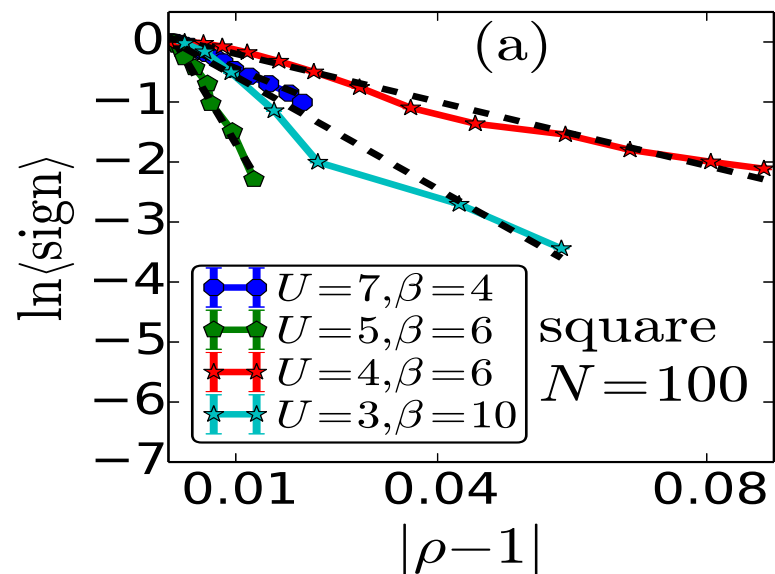
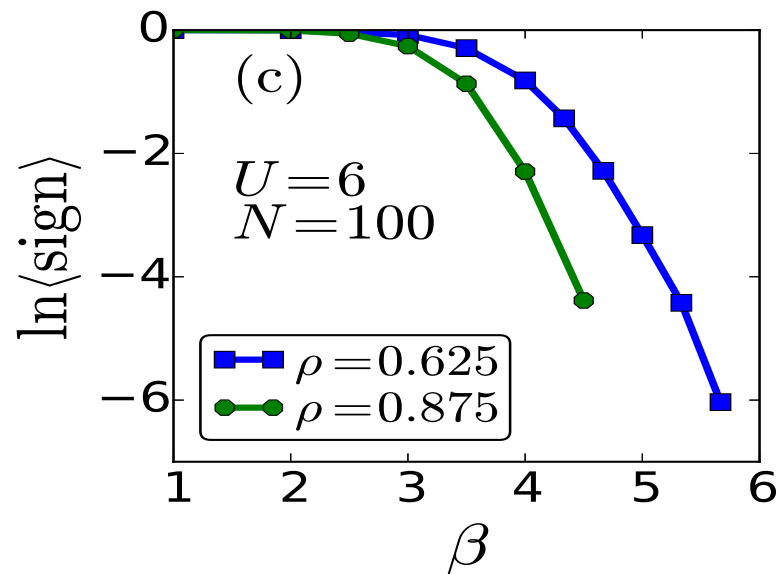
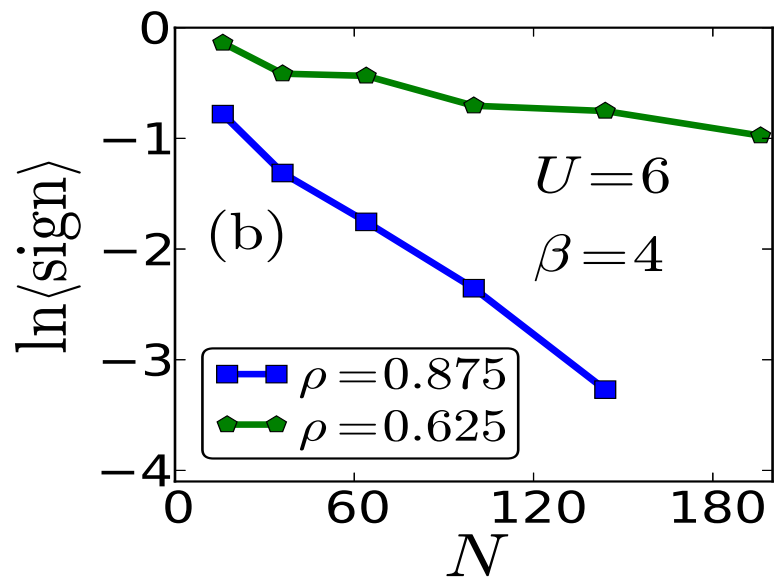
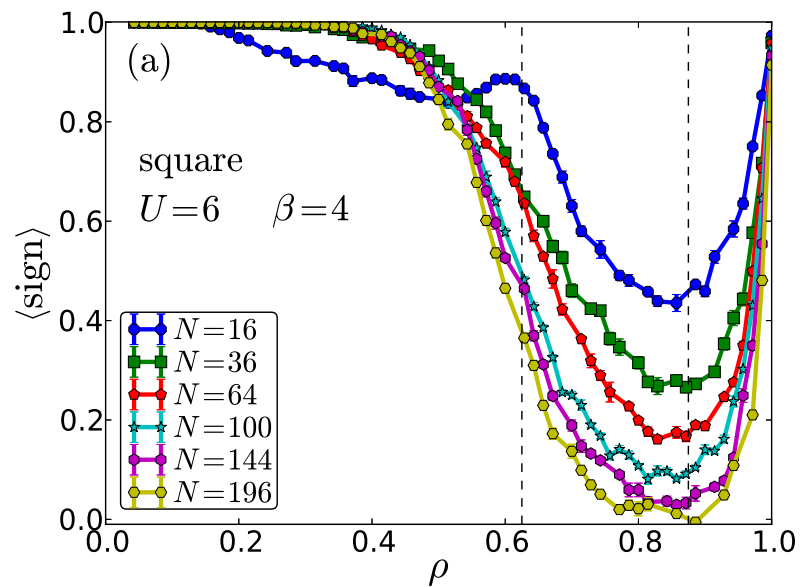
$$\langle c_{\mathbf{i}\sigma} c_{\mathbf{j}\sigma}^\dagger \rangle \leftrightarrow \langle [M_\sigma^{-1}]_{\mathbf{ij}} \rangle = \langle [G_\sigma]_{\mathbf{ij}} \rangle$$

- Sign Problem

At low temperature $\det M_\sigma$ can go **negative**.

CPU time grows **exponentially** in L (β).

QMC limited to $T \gtrsim t/4$.



Special symmetry points (half-filling $\rho = 1$) $\det M_{\uparrow} = \det M_{\downarrow}$. No Sign Problem!

Kolodrubetz et al, The Journal of Chemical Physics 138, 024110 (2013).

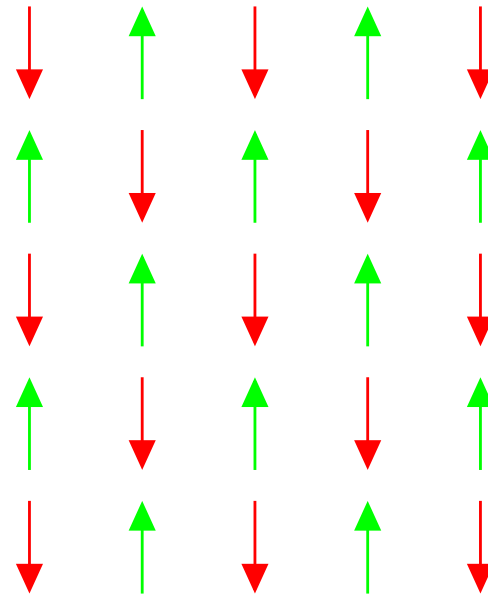
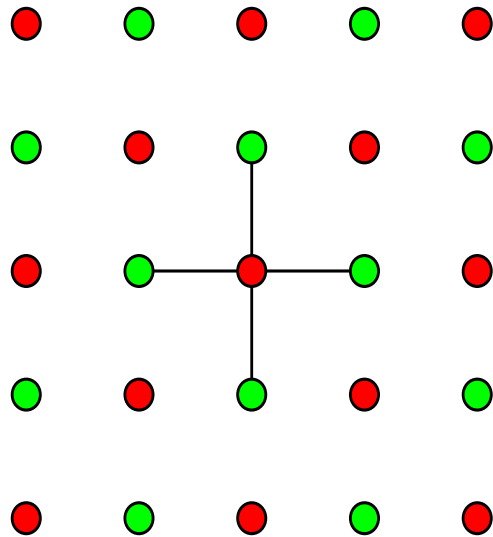
DQMC is really nice (when it works ...)

The Square Lattice at Half filling

Electron spins on two neighboring sites like to be antiparallel.

Bipartite lattices are a natural for **long range antiferromagnetic order**
where this up-down pattern **extends over entire lattice**.

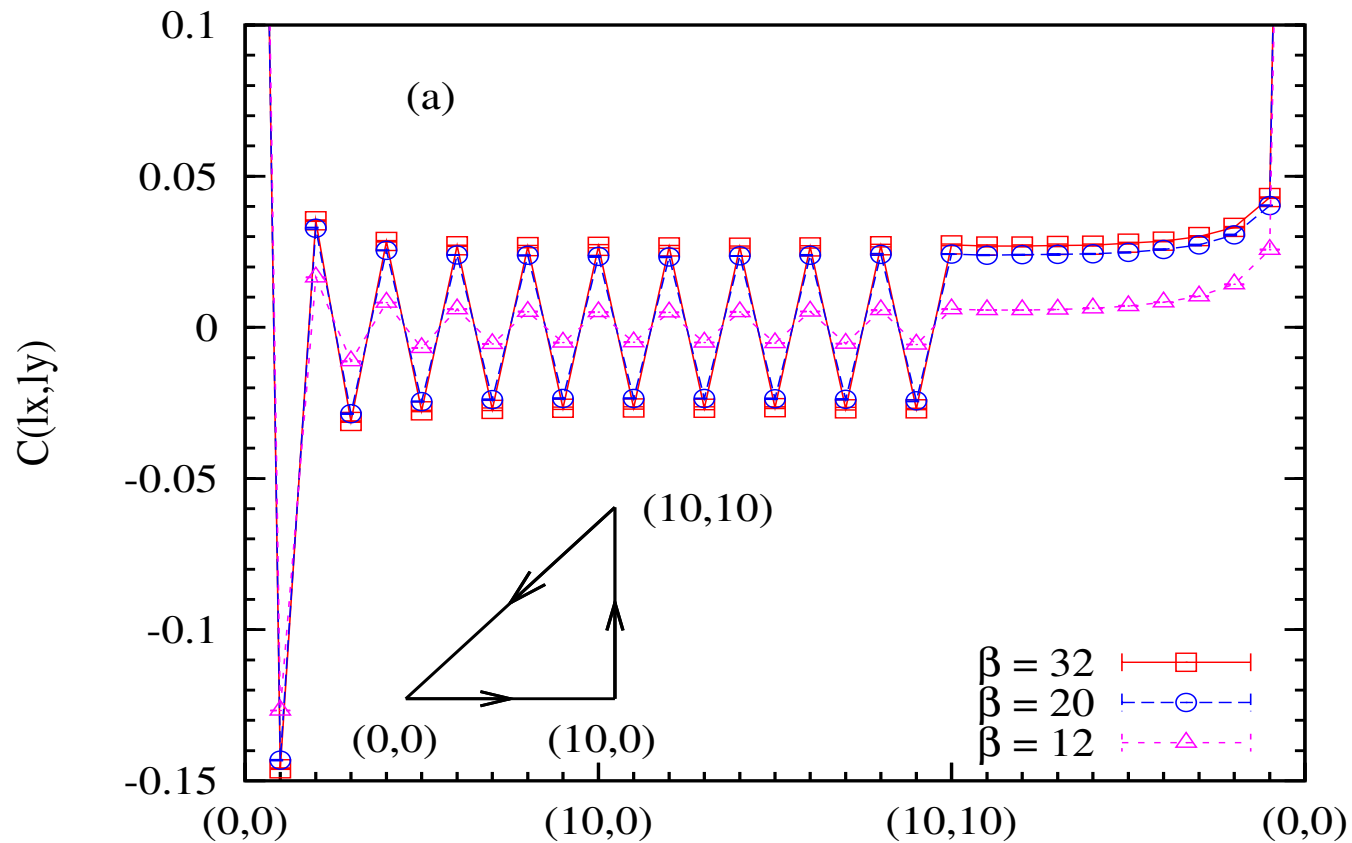
Especially square lattice: Perfect nesting



Antiferromagnetic spin correlations

$$c(l_x, l_y) = \langle (n_{l_x, l_y, \uparrow} - n_{l_x, l_y, \downarrow}) (n_{0,0, \uparrow} - n_{0,0, \downarrow}) \rangle$$

20 x 20 $U = 2.00$

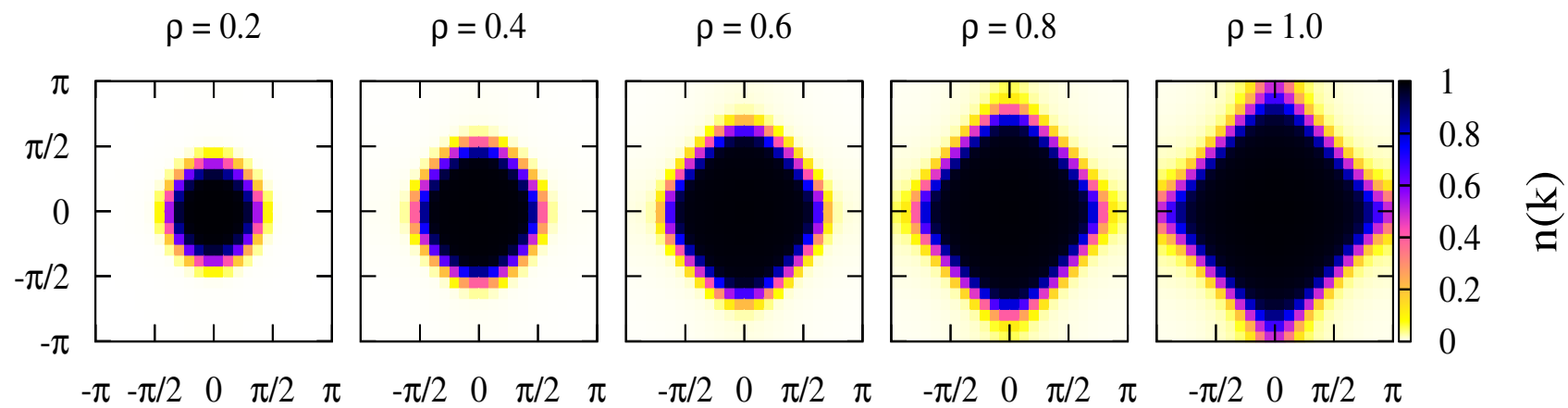


There is **long range antiferromagnetic order**!

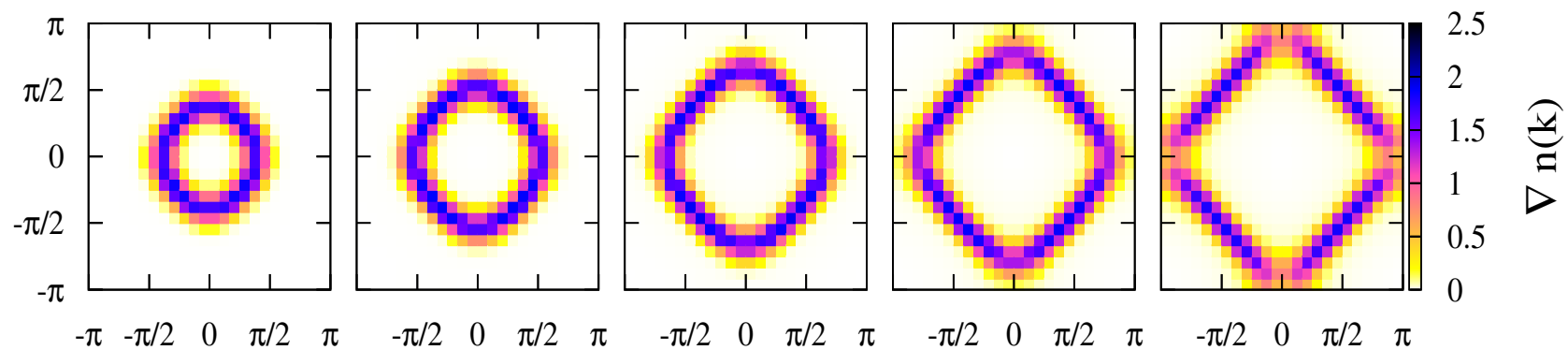
“Quantum Monte Carlo Study of the 2D Fermion Hubbard Model at Half-Filling”, C.N. Varney, C.R. Lee, Z.J. Bai, S. Chiesa, M. Jarrell, and RTS, Phys. Rev. B80, 075116 (2009).

DQMC results- Fermi distribution $n(k_x, k_y)$

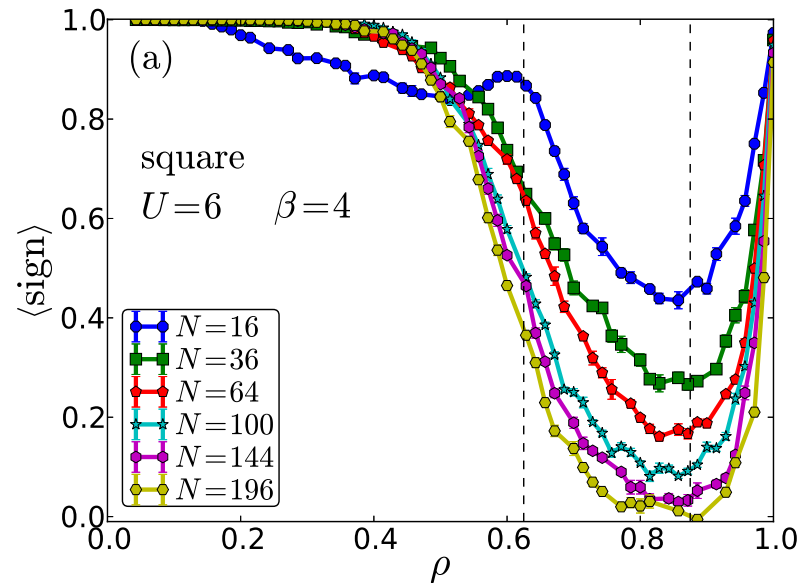
$U = 2$ Fermi function:



$U = 2$ Gradient of Fermi function:



4. Making Use of the Sign Problem



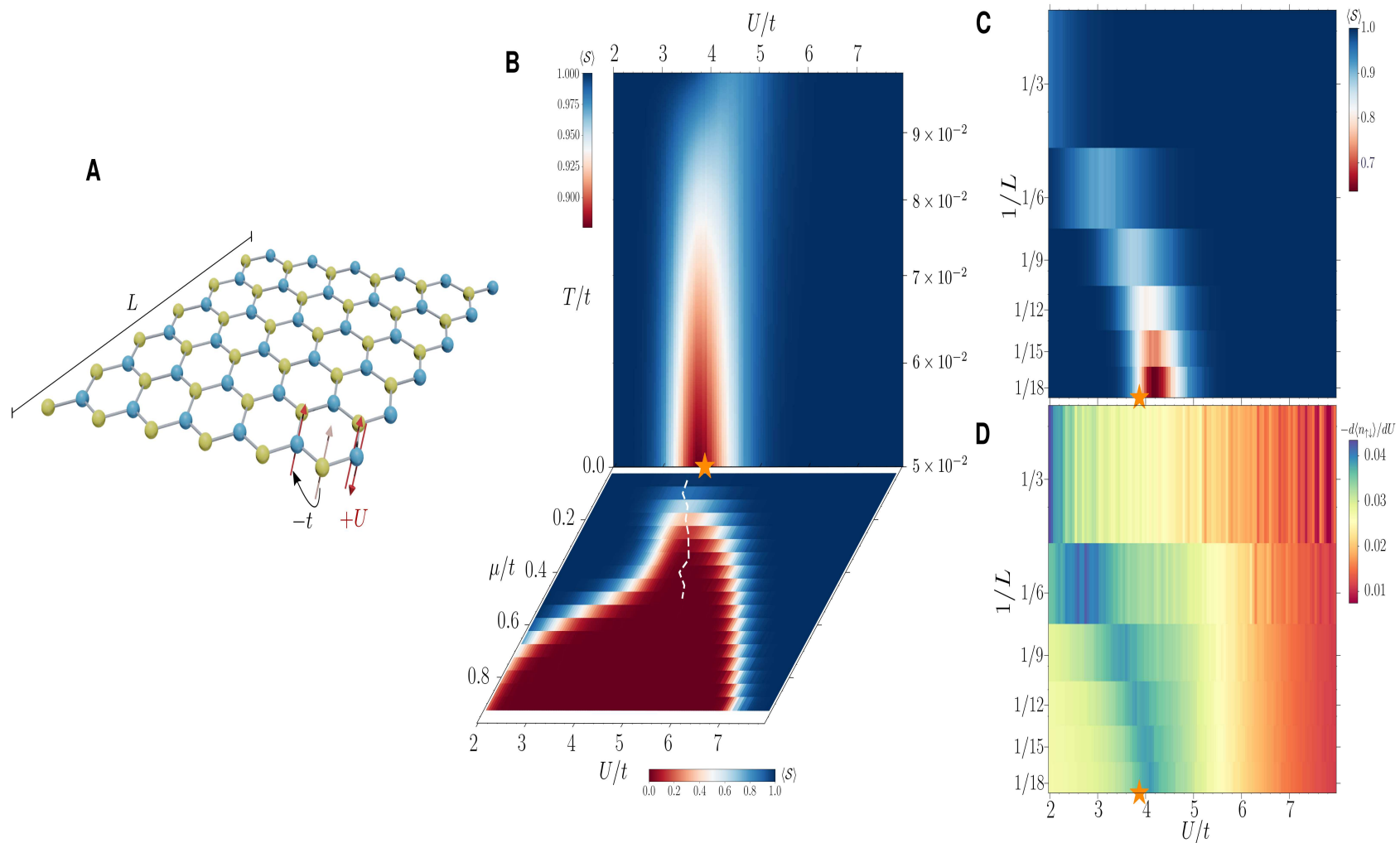
Is it a **coincidence** that the sign problem in the 2D Hubbard model is worst at density $\rho \sim 0.87$ precisely where T_c is highest?

Examine the behavior of $\langle \mathcal{S} \rangle$ for models whose **critical points are known**.

Example 1: **spinful Hubbard model on a honeycomb lattice.**

Vanishing of $N(E=0)$ (semi-metal) gives $U_c/t \sim 3.869$ for **semi-metal to AF QCP**.

“Absence of a Spin Liquid Phase in the Hubbard Model on the Honeycomb Lattice”, S. Sorella, Y. Otsuka, and S. Yunoki, Sci. Rep. 2, 992 (2012).



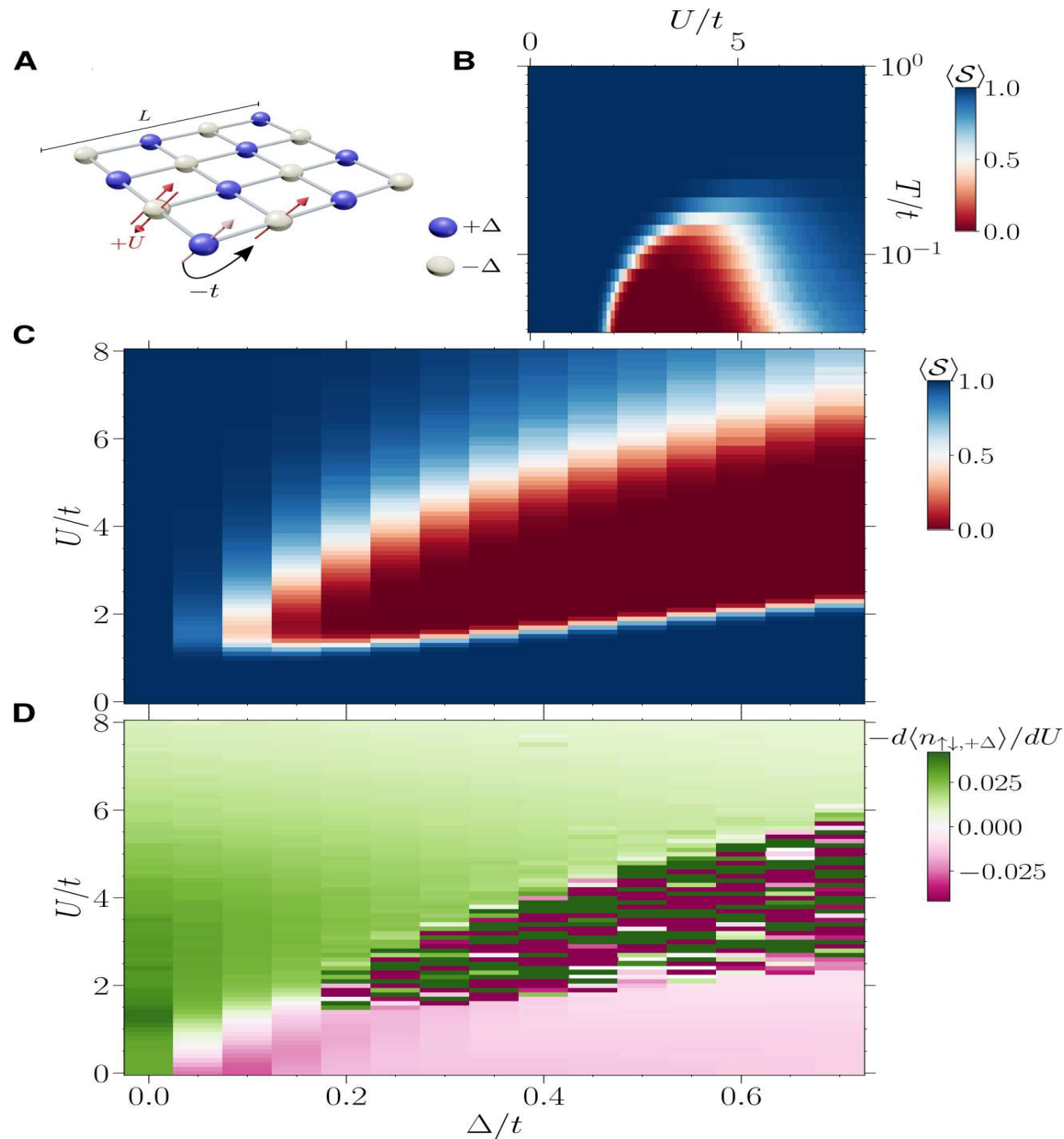
B upper(lower): $\langle S \rangle$ in T/t - U/t (μ/t - U/t) planes.

C: $\langle S \rangle$ extrapolated in linear system size L at $T/t = 1/20$ and $\mu/t = 0.1$.

D: Derivative of double occupancy

Star Marker: known QCP from ‘traditional’ observables. (eg. AF structure factor).

“Quantum Critical Points and the Sign Problem”, R. Mondaini, S. Tarat, and R.T. Scalettar.



Example 2: Square lattice Ionic Hubbard model

Site energy $\pm\Delta$
on sublattices A/B
→ Band gap opens.

“Traditional Observables”:

$$S_{\text{af}}, \rho_{\text{dc}}, A(\omega), \langle n_{\uparrow\downarrow} \rangle$$

Band insulator $U/t \lesssim 2$.

Mott insulator $U/t \gtrsim 5$.

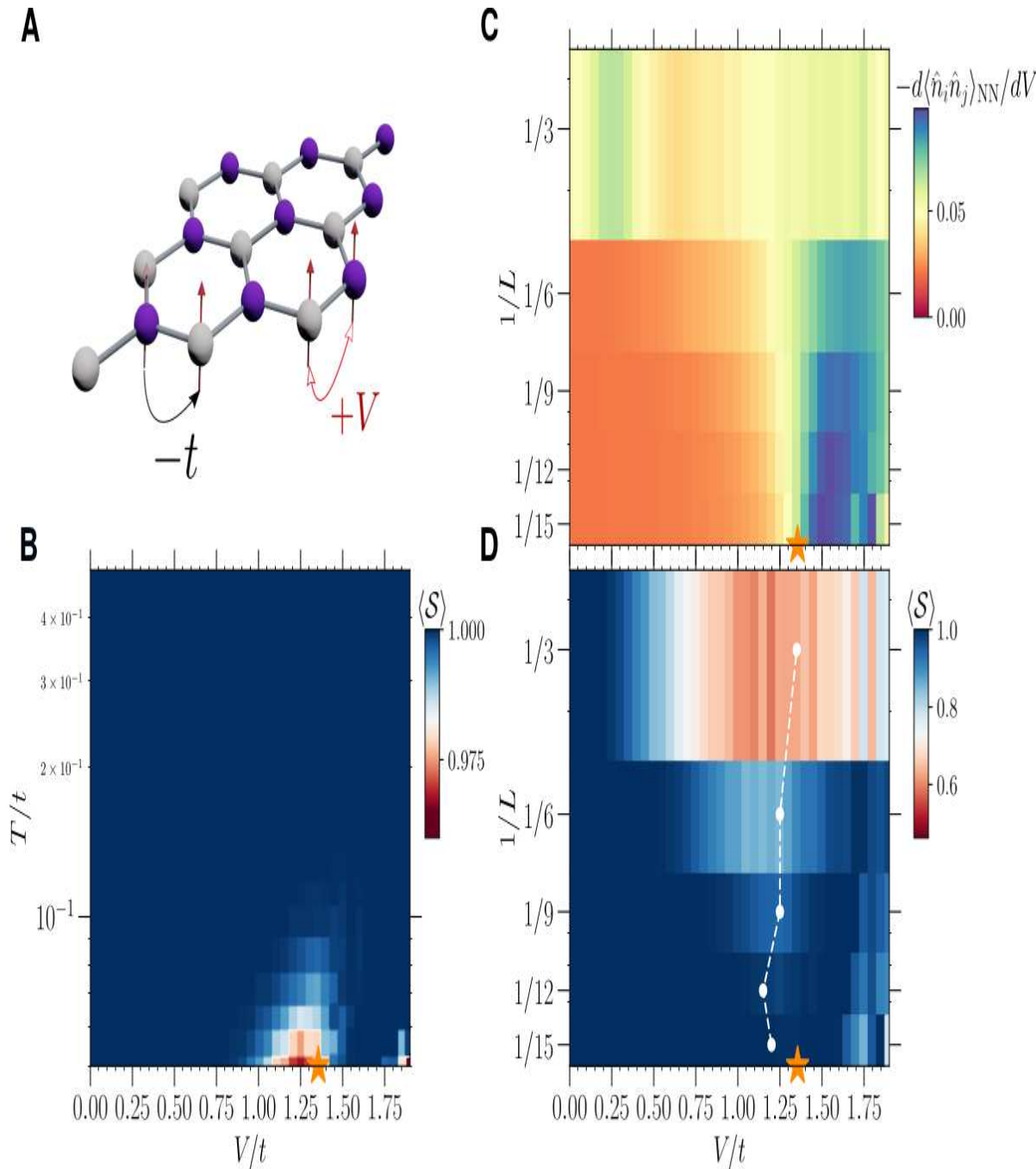
Metallic phase intervenes.

$\langle S \rangle$ reproduces known PD.

Fermionic superlattices:

Chuanwei Zhang,

Phys. Rev. A100, 023616 (2019)



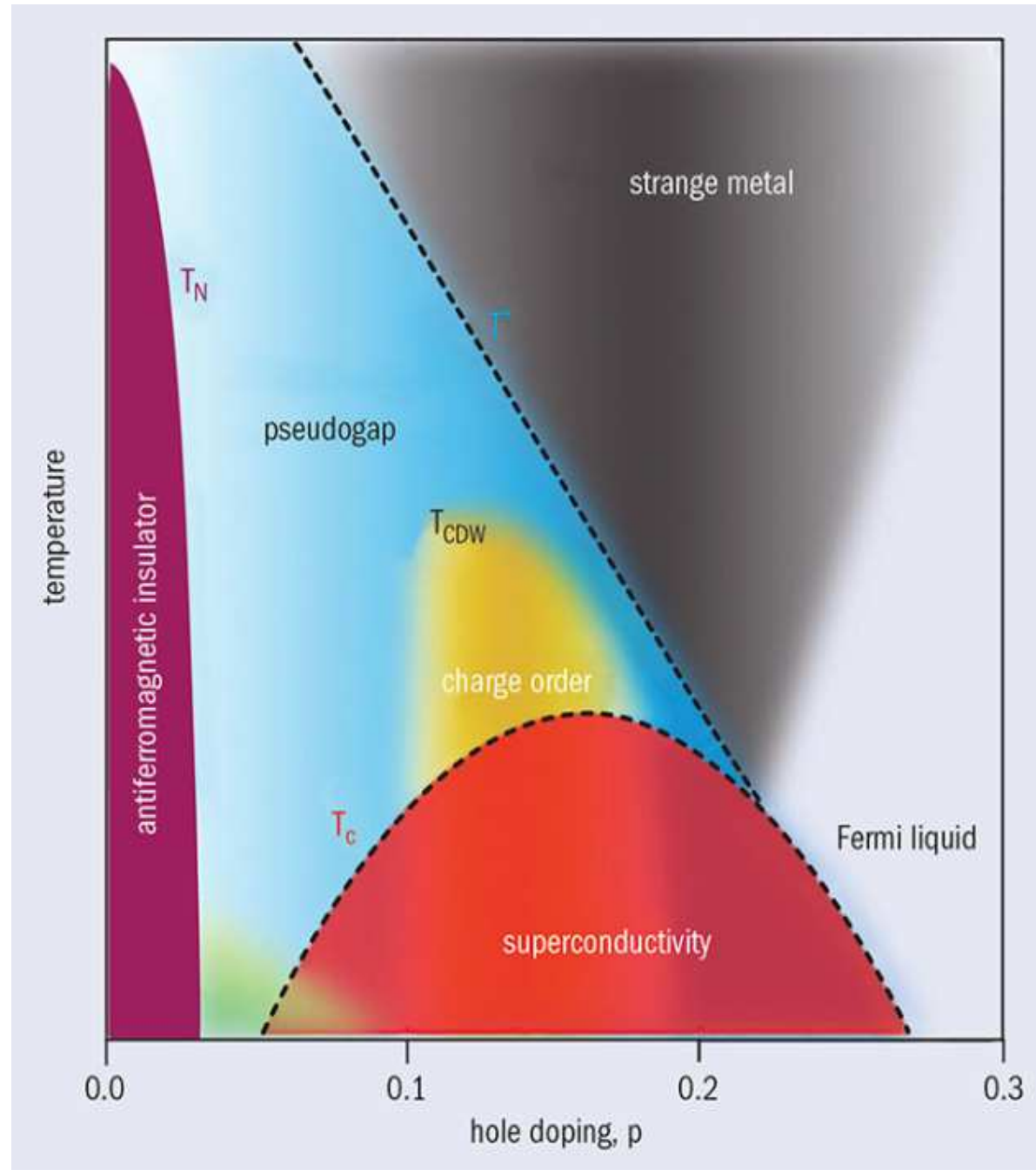
Example 3:

Spinless fermions on
honeycomb lattice, intersite V

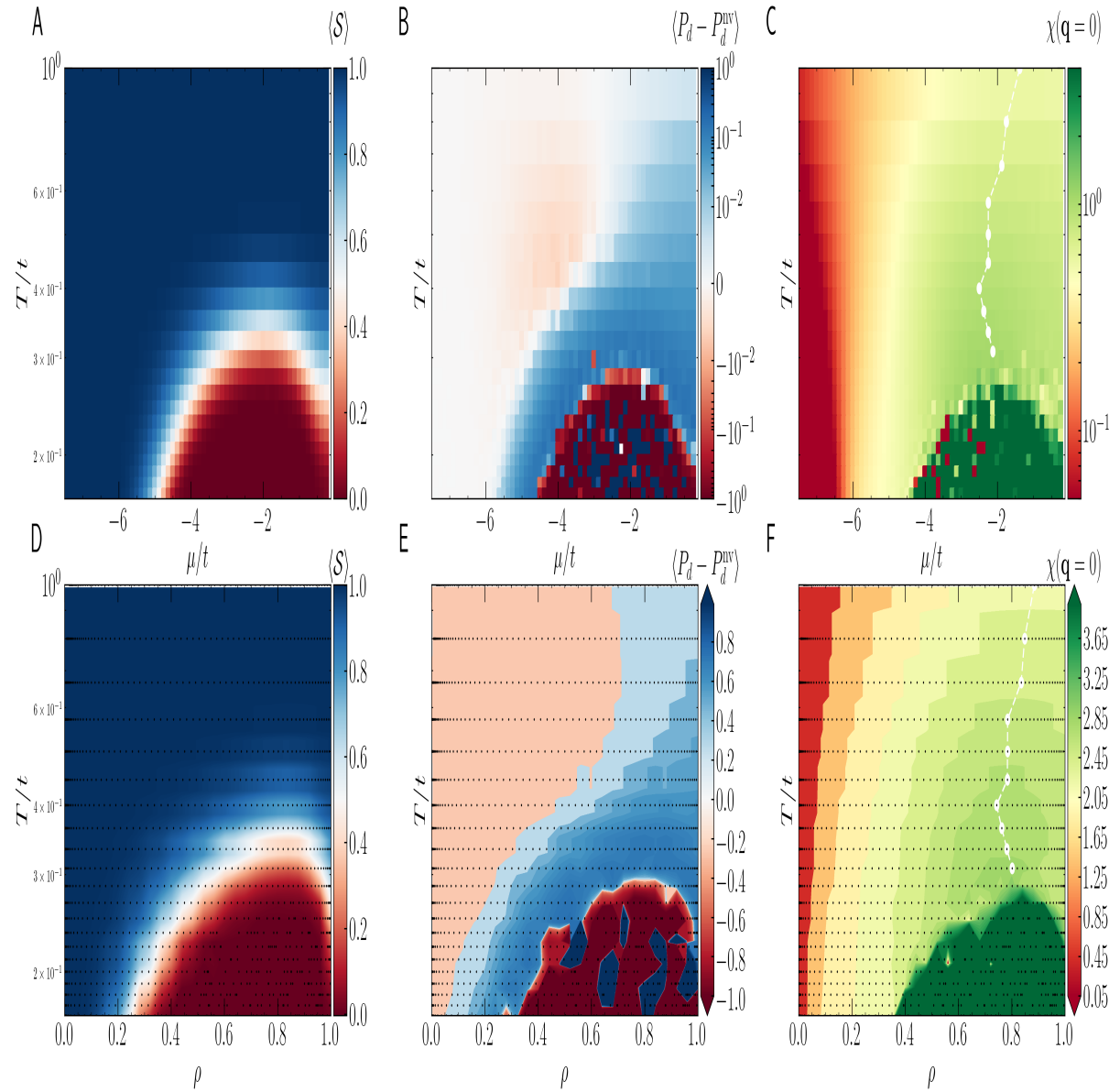
Transition from Metal
to charge density wave
 $V_c/t = 1.35$

Z.X. Li, Y.F. Jiang, and H. Yao,
Phys. Rev. B91, 241117 (2015).

Example 4: Square Lattice– Cuprate Phase Diagram



Example 4 (cont'd): Square lattice Hubbard model

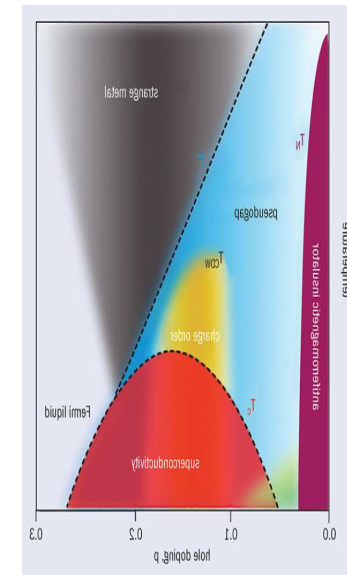


A: $\langle S \rangle$ in T - μ plane

B: Enhancement of d -wave pairing.

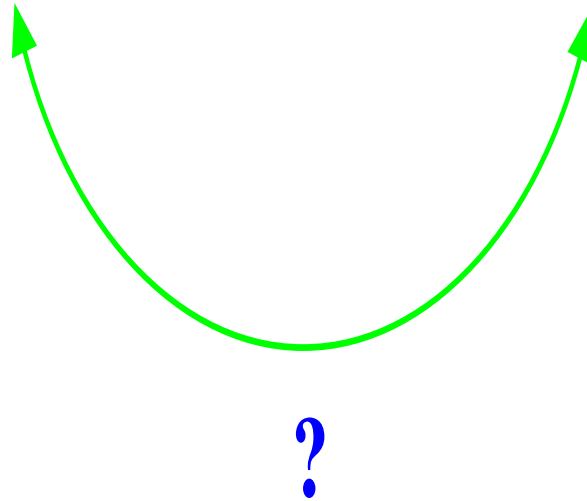
C: Magnetic susceptibility.

D, E, F: Same quantities in T - ρ plane.



5. Simplified Materials

Complex Materials	Quantum Monte Carlo
MnO, YBaCuO, etc	requires simple models.
	Hubbard Hamiltonian



The direct simulation of quantum systems on classical computers is very difficult because of the huge amount of memory required to store the explicit state of the quantum system. This is due to the fact that quantum states are described by a number of parameters that grows exponentially with the system size.

Iulia Buluta and Franco Nori, “Quantum Simulators” Science 326 pp.108-111, (2009). DOI: 10.1126/science.1177838

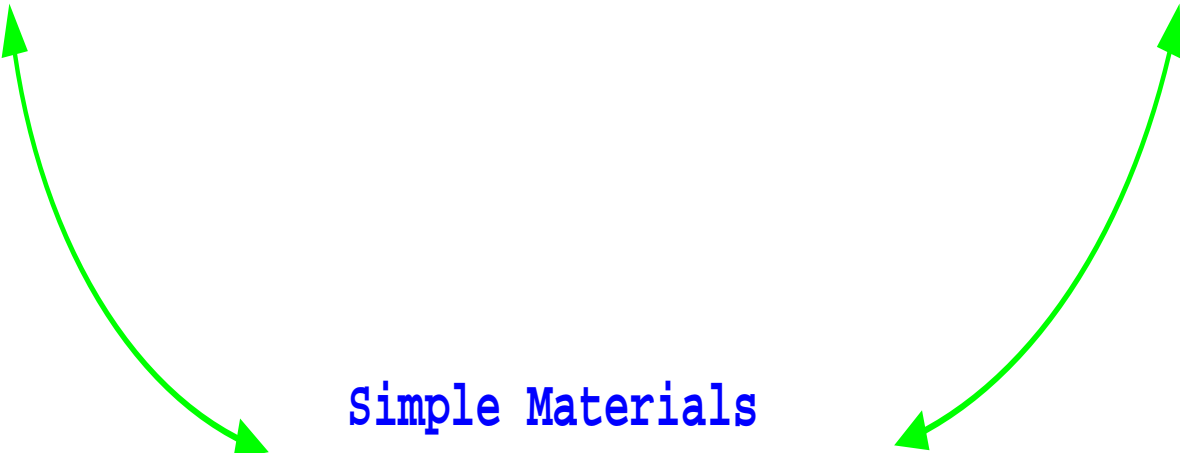
Complex Materials

MnO, YBaCuO, etc

Quantum Monte Carlo
requires simple models.

Hubbard Hamiltonian

Simple Materials
"Quantum Simulators"



Quantum simulators are controllable quantum systems that can be used to simulate other quantum systems.

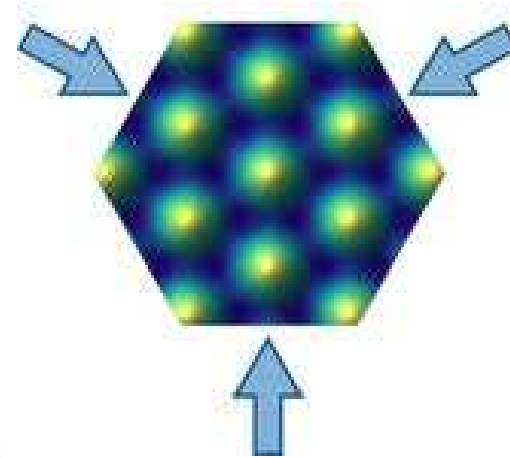
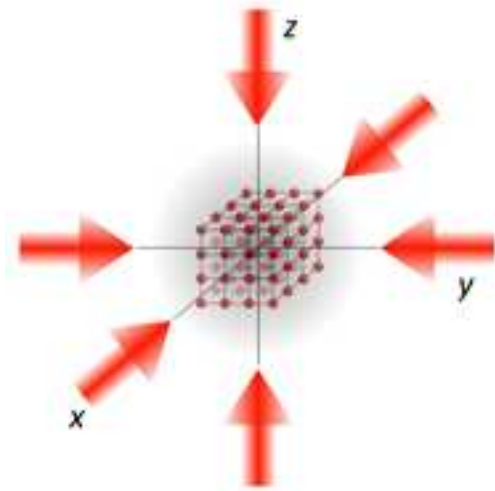
Iulia Buluta and Franco Nori, "Quantum Simulators" Science 326 pp.108-111, (2009). DOI: 10.1126/science.1177838

i: Optical Lattices

Lattice formed by interference of counterpropagating laser beams.

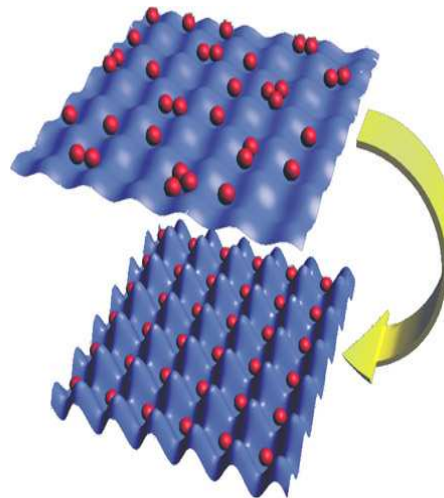
Atoms ($\sim 10^5$) trapped by Stark shift. Cool evaporatively \dots

Different geometries accessible (e.g. cubic, honeycomb, \dots)



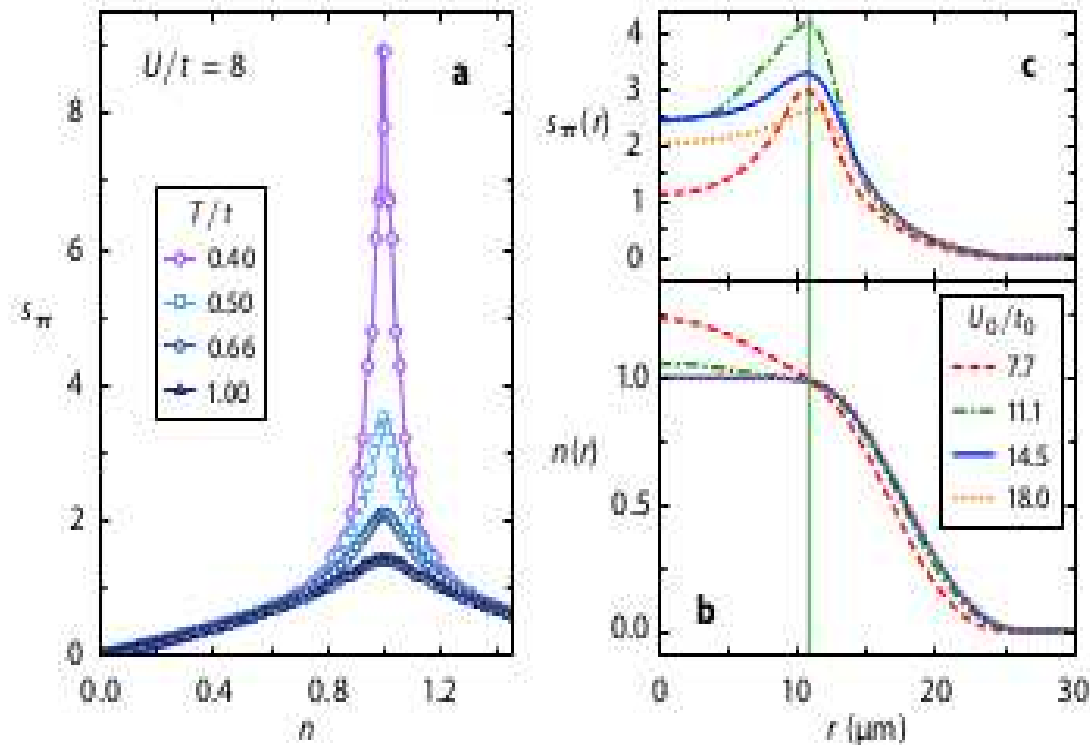
Control hopping t , interactions U
much more easily than solids.

Use, e.g. to drive Mott insulator.



Tune laser wavelength
or Feshbach resonance.

Quantum Monte Carlo Simulations of Hubbard Model with Confining potential.



Illustrates first challenge: Confining potential leads to **inhomogeneous density**.

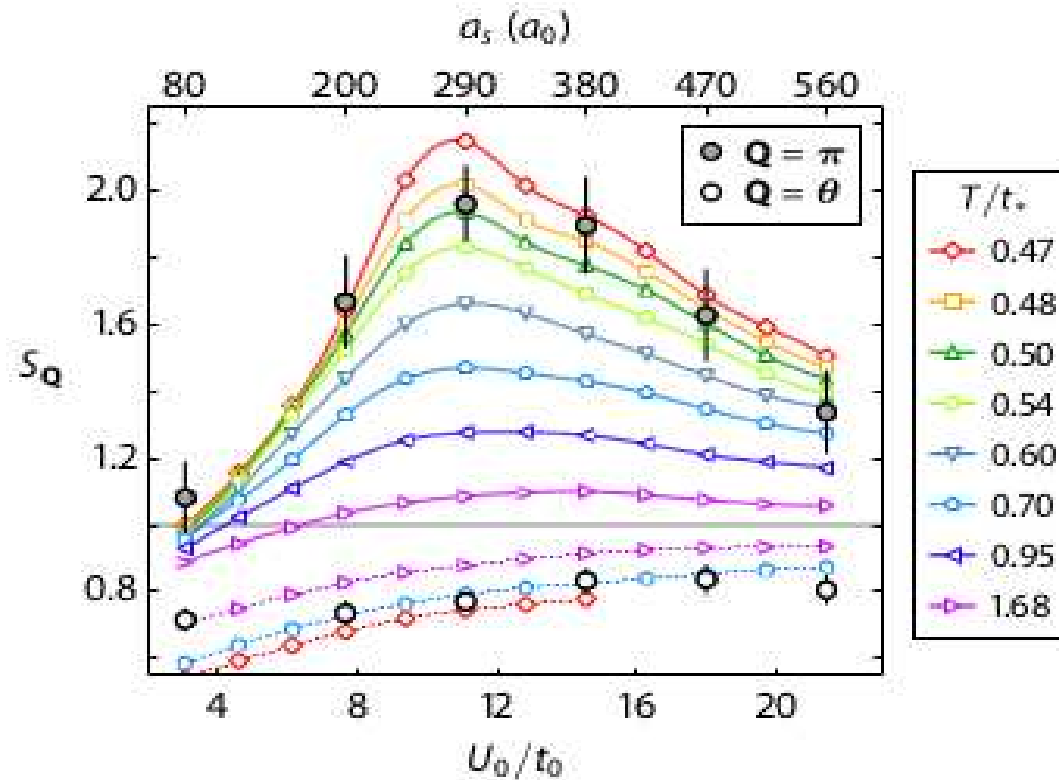
Local Mott/AF regions coexist with paramagnetic metal.

How to disentangle?

“Observation of antiferromagnetic correlations in the Hubbard model with ultracold atoms”, R.A. Hart, P.M. Duarte, T. Yang, X. Liu, T. Paiva, E. Khatami, RTS, N. Trivedi, D.A. Huse and R.G. Hulet, Nature 519, 211 (2015).

“Compressibility of a fermionic Mott insulator of ultracold atoms,” P.M. Duarte, R.A. Hart, T-L. Yang, X. Liu, T. Paiva, E. Khatami, RTS, N. Trivedi, and R.G. Hulet, Phys. Rev. Lett. 114, 070403 (2015).

Comparison of experiment and Quantum Monte Carlo



Illustrates second challenge:

Limitations on ability to cool.

Temperatures: nanoKelvins, but so are hopping t and interaction U :

Comparison with QMC provides thermometer.

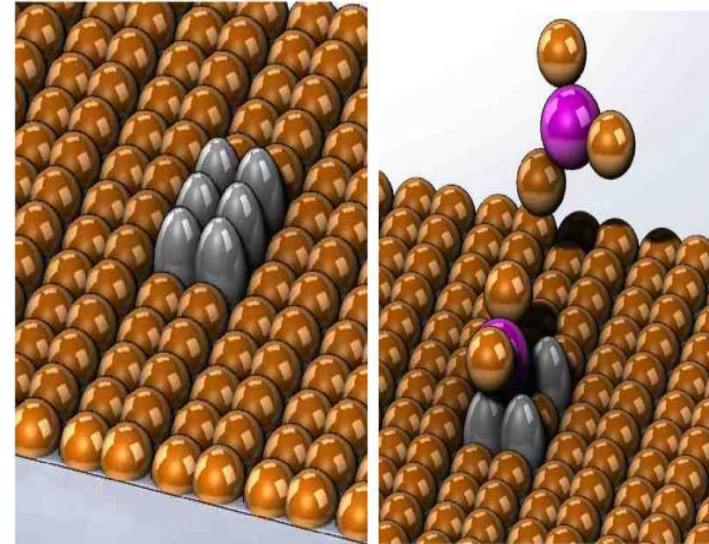
$\Rightarrow T/t$ is not small!

ii: Engineered Silicon

Arrays of dopants in semiconductors,
placed with atomic precision.

Procedure:

- Silicon surface terminated with atomically-ordered layer of H.
- STM tip selectively removes surface H: patterned chemically active sites.
- Dopants chemisorb to lithographically patterned regions.
- Silicon is overgrown to protect atomically-patterned layer.



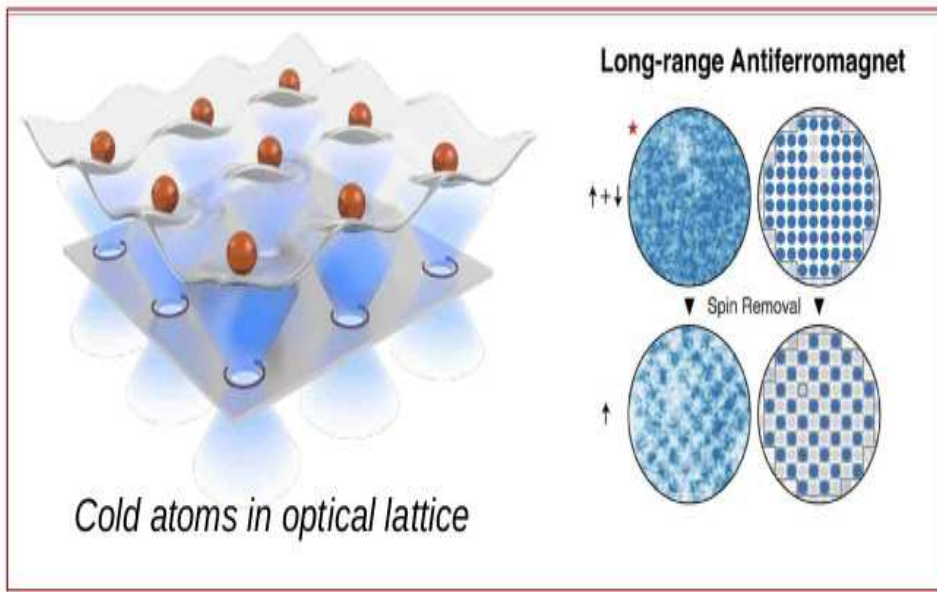
Like optical lattices:

- Control over array symmetry, spacing, carrier density, bandwidth and filling.
- Manipulation of the number of dopants in a node controls interaction strength.

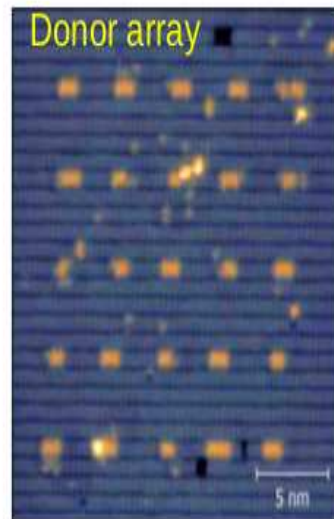
⇒ Basic ingredients for a tunable Fermi-Hubbard system.

Temperatures (much) lower than optical lattice systems!

J. Randall, J. Owen, W. Kirk, R. Moheimani, R. Silver, J. Lyding, I. Kuljanishvili, D. Natelson, S. Misra

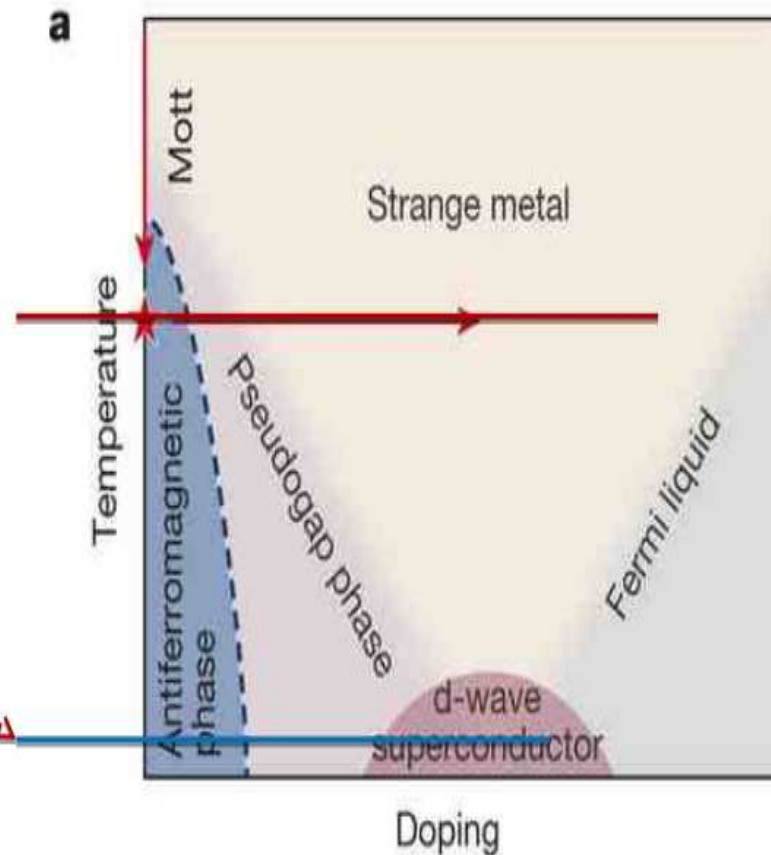


Fermi-Hubbard in Li
 $U/t \sim 7$ (strongly interacting)
 $T/t \sim 0.25$ (moderate temperature)



Donors

- Strongly interacting
 $U/t \sim 5-100$
- Low temperature
 $T/t \sim 0.02$

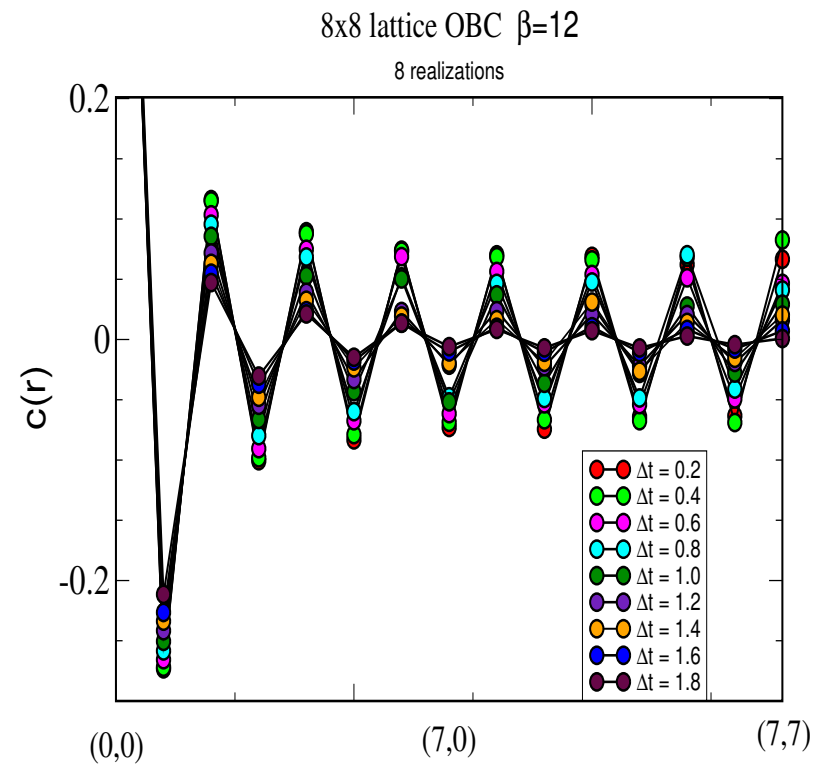
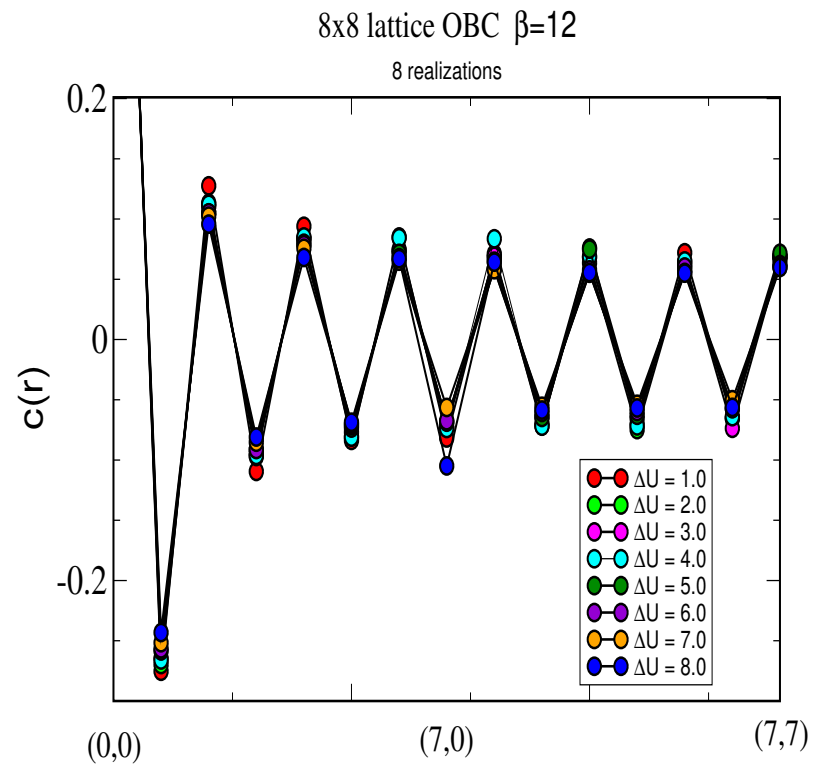


Despite 'precision,' the disorder can be pronounced.
 (Unclear, as yet, what other obstacles will arise.)

Quantum Monte Carlo tests of effect of disorder on AF.

Left: Disorder in interaction strength U

Right: Disorder in hopping t



6. Some Conclusions

- **Hubbard Model**: a way to understand many-body effects in solids
Mott insulators, magnetic order, exotic superconductivity ...
- **But**: Sign Problem is show-stopper for low T QMC in most situations.
“The Hubbard model cannot be solved”
- This has opened up the field of quantum emulators:
Ultracold atoms; Engineered Silicon
- It is possible to exploit the sign problem to investigate quantum criticality.

