#### Recent developments in auxiliary-field quantum Monte Carlo: magnetic orders and spin-orbit coupling

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- Shiwei Zhang







# Outline

- Introduction to AFQMC
  - Release constraint
  - Symmetry in trial wave function
  - Generalized Hartree–Fock (GHF) wave function
- Magnetic orders in 2D Hubbard model
  - Half-filling: restores symmetry
  - > Doped: more accurate results
- Rashba spin-orbit coupling in 2D Fermi gas
  - Interplay between SOC and interaction
  - Singlet triplet pairing wave function
- Conclusion

GHF trial wave function

GHF random walker

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## Auxiliary-Field Quantum Monte Carlo

- Random walks in non-orthogonal Slater determinat space
- Scales as N^3 : can simulate large systems
- Systematic error with constraint:
  - highly accurate even with Hartree-Fock trial wave function
- Recently, release constraint, symmetry, Generalized HF: systematically improvable QMC method.





Hubbard Model 4x4 7u 7d U=8

## Example

#### • CPMC



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## Example

#### • Release the constraint





• Symmetry for wave function Spin in z direction:  $S_z$ 

PhysRevB.88.125132(2013)

PhysRevB.89.125129(2014)

Symmetry for wave function
 Spin in z direction: S<sub>z</sub>
 Total number of particles: N

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 Linear Momentum: K

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Spin in z direction: S<sub>z</sub>
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Linear Momentum: K
Space group: rotation, mirror, ...

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Preserve symmetry in projection!

 $N_{\uparrow}$ 

 $N_{\perp}$ 

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### **Strongly Correlated Regime**



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• Large U, highly accurate results Strongly correlated



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• Large U, highly accurate results correlation energy~50%





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- Symmetry trial wave function: multi-determinant

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Release constraint: exponential scaling

up-spin

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down-spin

#### UHF

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UHF

Break symmetry in z direction. Preserve symmetry in xy direction.



GHF

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**UHF** walker

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Break symmetry in z direction. Preserve symmetry in xy direction.

Preserve symmetry in all directions.

- Half-filling Hubbard model:
  - no sign problem
  - add constraint deliberately
  - largest constraint bias



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#### More benchmark results: Emanuel Gull's talk!

























$$C'_{s}(l_{x}, l_{y}) \equiv (-1)^{l_{y}}C_{s}(l_{x}, l_{y})$$



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$$H = \sum_{\mathbf{k}\sigma} k^2 c^{\dagger}_{\mathbf{k}\sigma} c_{\mathbf{k}\sigma} + U \sum_{\mathbf{i}} n_{\mathbf{i}\uparrow} n_{\mathbf{i}\downarrow} + \sum_{\mathbf{k}} \lambda (k_y - ik_x) c^{\dagger}_{\mathbf{k}\downarrow} c_{\mathbf{k}\uparrow} + h.c.$$



Rashba SOC: Couples spin to momentum with strength  $\lambda$  allows for spin flips.

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**Sample GHF wave function in AFQMC!** 

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**Sample GHF wave function in AFQMC!** 

#### SOC and strong interaction in ultra-cold atom experiment.

$$H = \sum_{\mathbf{k}\sigma} k^2 c^{\dagger}_{\mathbf{k}\sigma} c_{\mathbf{k}\sigma} + U \sum_{\mathbf{i}} n_{\mathbf{i}\uparrow} n_{\mathbf{i}\downarrow} + \sum_{\mathbf{k}} \lambda (k_y - ik_x) c^{\dagger}_{\mathbf{k}\downarrow} c_{\mathbf{k}\uparrow} + h.c.$$



Particles in the box For details on FG w/o SOC, see arXiv:1504.00925

$$H = \sum_{\mathbf{k}\sigma} k^2 c_{\mathbf{k}\sigma}^{\dagger} c_{\mathbf{k}\sigma} + U \sum_{\mathbf{i}} n_{\mathbf{i}\uparrow} n_{\mathbf{i}\downarrow} + \sum_{\mathbf{k}} \lambda (k_y - ik_x) c_{\mathbf{k}\downarrow}^{\dagger} c_{\mathbf{k}\uparrow} + h.c.$$
discretization!

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Continuous limit: fix N, send L to infinite



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#### **Non-Interacting Limit**

$$H = \sum_{\mathbf{k}\sigma} k^2 c^{\dagger}_{\mathbf{k}\sigma} c_{\mathbf{k}\sigma} + U \sum_{\mathbf{i}} n_{\mathbf{i}\uparrow} n_{\mathbf{i}\downarrow} + \sum_{\mathbf{k}} \lambda (k_y - ik_x) c^{\dagger}_{\mathbf{k}\downarrow} c_{\mathbf{k}\uparrow} + h.c.$$

For U = 0 (i.e. non-interacting):


















 $\alpha = \lambda^2 / E_{FG}$  defines the spin-orbit coupling strength.

 $E_{FG} = \pi n$ 

### **Momentum Distribution and Spin State** $\alpha = 0.0$



• With no SOC  $\varepsilon(k)_+ = \varepsilon(k)_-$  the dispersion is the standard  $k^2$ .

# Momentum Distribution and Spin State $\alpha = 0.0^+$



- As SOC strength increases, the dispersion separates into two distinct bands:  $\varepsilon(k)_+$  and  $\varepsilon(k)_-$
- Spin rotates in momentum space

# Momentum Distribution and Spin State $\alpha = 0.5$



- As SOC strength increases, the region of k-space where  $\ \varepsilon(k)_+$  is occupied shrinks.

# Momentum Distribution and Spin State $\alpha = 2.0$



- As SOC strength increases, the region of k-space where  $\, \varepsilon(k)_+ \,$  is occupied shrinks.

# Momentum Distribution and Spin State $\alpha = 4.0$



Weak SOC to strong SOC transition

# **Momentum Distribution and Spin State** $\alpha = 6.0$



Eventually for strong enough SOC, only the ε(k) band is occupied.
With increasing SOC strength, the region where ε(k) is occupied moves away from k=0, and shrinks.

# **Momentum Distribution and Spin State** $\alpha = 8.0$



• With increasing SOC strength, the region where  $\varepsilon(k)_{-}$  is occupied moves away from k=0, and shrinks.

# **Momentum Distribution and Spin State** $\alpha = 8.0$



• With increasing SOC strength, the region where  $\varepsilon(k)_{-}$  is occupied moves away from k=0, and shrinks.

Effective 1D density of states, enhances quantum fluctuations!

#### **Momentum Distribution with Interaction**



- In weak SOC regime, both bands are occupied.
- As interaction strength increases, occupation spreads to higher k

L=625, N=56 
$$lpha=1.0$$



#### **Momentum Distribution with Interaction**



- In strong SOC regime, only the lower band is occupied.
- As interaction strength increases, occupation spreads to higher k and higher band.

L=625, N=56  $\alpha=7.0$ 



#### **Singlet and Triplet Paring**

• Singlet pairing

$$\Delta_s^{\dagger}(k) = \frac{1}{2} (c_{k\uparrow}^{\dagger} c_{-k\downarrow}^{\dagger} - c_{k\downarrow}^{\dagger} c_{-k\uparrow}^{\dagger})$$

• Triplet pairing

$$\Delta^{\dagger}_{\uparrow}(k) = c^{\dagger}_{k\uparrow}c^{\dagger}_{-k\uparrow} \quad \Delta^{\dagger}_{\downarrow}(k) = c^{\dagger}_{k\downarrow}c^{\dagger}_{-k\downarrow}$$

• Pairing matrix

$$M(k\sigma, k'\sigma') = \Delta^{\dagger}_{\sigma}(k)\Delta_{\sigma'}(k')$$

3Lx3L matrix

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### **Conclusion**

- Systematically improvable AFQMC method
  - Release constraint
  - Symmetry in trial wave function
  - Generalized Hartree–Fock (GHF) trial wave function
- Magnetic orders in 2D Hubbard model
  - GHF trial wave function restores symmetry at half-filling
  - GHF trial wave function gives more accurate result in the doped (magnetic), strongly correlated region.
- Rashba spin-orbit coupling in 2D Fermi gas Ongoing!
  - GHF random walkers
  - Interplay between SOC and strong interaction
  - Singlet and triplet pairing For details on FG w/o SOC, see arXiv:1504.00925