# Applying the Worldvolume Hybrid Monte Carlo method to the (1+2)-dim Hubbard model

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#### Introduction

Sign problem is an obstacle to 1st-principles calculations of important physics, such as finite density QCD

We utilize Wolrdvolume Hybrid Monte Carlo (WV-HMC) method

Fukuma, Matsumoto (2020), Fukuma, Matsumoto, YN (2021)

- Feature : WV-HMC solves the sign and the ergodicity problems simultaneously at low cost
- Group manifolds
   Dynamical fermion systems
   Talk by Masafumi Fukuma
   This talk Fukuma and YN (in prep)
   (Hubbard model as a testbed)

cf. full QCD = pure Yang-Mills theory + dynamical quarks

# Previous works on Hubbard model with thimble approach

- (Generalized) thimble method with dominant thimble approx. Mukherjee and Cristoforetti (2014), Ulybyshev et al. (2020, 2023), Ulybyshev and Assaad (2024)
  - Calculated only dominant thimbles, avoiding ergodicity problem

WV-HMC needs no dominant thimble approx., because WV-HMC has already solved the ergodicity problem

- Tempered Lefschetz thimble method Fukuma, Matsumoto, Umeda (2019)
  - Solved sign and ergodicity problems simultaneously
  - High cost limits the lattice size to  $N_t \times N_s \times N_s = 5 \times 2 \times 2$

WV-HMC cost is significantly smaller than that of tempered Lefschetz thimble method

cf. non-Monte Carlo approach

 Tensor RG method D=1+1 Akiyama, Kuramashi (2021), D=2+1 Akiyama et al. (2021) 2024/08/02 Lattice 2024 Yusuke Namekawa

### WV-HMC algorithm (1 / 3)



(3) accept / reject test 2024/08/02

#### WV-HMC algorithm (2 / 3)

Projections and RATTLE are composed of flow equations

- config flow eq : map  $x \in \mathbb{R}^N \to z = z_t \in \mathbb{C}^N$  $\dot{z}_t = \overline{\partial S(z_t)}$ ,  $z_{t=0} = x$
- vector flow eq : map of vector  $u \rightarrow v = v_t$  $\dot{v}_t = \overline{(\partial \partial S(z_t)) v_t}$ ,  $v_{t=0} = u$



See next page for computational cost of the flow eq.

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#### WV-HMC algorithm (3 / 3)

ex. config flow eq. in the presence of fermion

 $Z = \int dA \det D(A) e^{-S} = \int dA e^{-S_{eff}(A)}, \qquad S_{eff}(A) = \frac{1}{2}A^2 - \log \det D(A)$ 

$$\dot{z}_t = \overline{\partial S_{eff}(z_t)}, \quad \partial S_{eff}(A) = A - \operatorname{tr}\left(D^{-1} \frac{D(A)}{\partial A}\right)$$

Solver is needed for each flow eq.

- Direct solver costs  $O(N^3)$   $N \equiv$  Degrees of Freedom
- CG-type solver costs  $O(N^2)$  Fukuma and YN (in prep)
- cf. BiCGStab-type solver costs O(N), but suffers from non-convergence

### Hubbard model (1 / 4)

A model for electrons in a solid Hubbard (1963)

Hamiltonian in spatial *d*-dim

K

$$H = -\kappa \sum_{\substack{,s}} c_{x,s}^{\dagger} c_{y,s} - \mu \sum_{x} (n_{x,\uparrow} + n_{x,\downarrow}) + U \sum_{x,s} n_{x,\uparrow} n_{x,\downarrow} , n_{x,s} \coloneqq c_{x,s}^{\dagger} c_{x,s}$$
  
Nearest neighbor  
electron pairs Sign problem occurs at  $\mu \neq U/2$   
(away from half filling)

#### Hubbard model (2 / 4)

Partition function in (1 + d)-dim

 $Z = \operatorname{tr} e^{-\beta H} \qquad \beta = N_t \epsilon = \text{inverse temperature} \\ = \operatorname{tr} \widehat{T}^{N_t} \qquad \widehat{T} = \text{transfer matrix} \\ = \int d\overline{\psi} \, d\psi \, e^{-S(\overline{\psi}, \psi)}$ 

$$S(\bar{\psi},\psi) = \sum_{x} \left[ \bar{\psi}_{x} \left( \psi_{x+\hat{0}} - \psi_{x} - \epsilon \kappa \sum_{i=1}^{d} (\psi_{x+\hat{i}} + \psi_{x-\hat{i}}) - \epsilon \mu \psi_{x} \right) + \frac{\epsilon U}{2} (\bar{\psi}_{x} \psi_{x})^{2} \right]$$
  
Apply Hubbard-Stratonovich transformation  
 $\rightarrow$  Next page

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#### Hubbard model (3 / 4)

Generalized Hubbard-Stratonovich transformation Beyl et al. (2018)

$$(\hat{n}_{x,\uparrow} - \hat{n}_{x,\downarrow})^2 = \alpha \ (\hat{n}_{x,\uparrow} - \hat{n}_{x,\downarrow})^2 - (1 - \alpha)(\hat{n}_{x,\uparrow} + \hat{n}_{x,\downarrow} - 1)^2 + (1 - \alpha)(\hat{n}_{x,\uparrow} - \hat{n}_{x,\downarrow})^2 - (1 - \alpha)(\hat{n}_{x,\uparrow} - \hat{n}_{x,\downarrow})^2 + (1 - \alpha)(\hat{n}_{x,\downarrow} - \hat{n}_{x,\downarrow})^2 + (1 - \alpha)(\hat{n}_{x$$

$$Z = \int d\bar{\psi} \, d\psi \, e^{-S(\bar{\psi},\psi)}$$
  

$$= \int dA \, d\bar{\psi} \, d\psi \, e^{-\frac{1}{2}\sum_{x,a=1,2}A_{x,a}^2} - \sum_{x,y,f}(\bar{\psi}_f)_x(D_f)_{xy}(\psi_f)_y$$
  

$$= \int dA \, e^{-\frac{1}{2}\sum_{x,a=1,2}A_{x,a}^2} \, \det D_a \, \det D_b$$

### Hubbard model $(4 / 4)^{1\times 1}$

We can further introduce pseudofermions: Fukuma and YN (in prep)

$$Z = \int dA \ e^{-\frac{1}{2}\sum_{x,a=1,2}A_{x,a}^2} \ \det D_a \ \det D_b$$
$$= \int dA \ d\varphi \ e^{-S(A,\varphi)} \qquad \qquad M_f \equiv D_f(A)D_f^T(A)$$
$$S(A,\varphi) = \frac{1}{2}\sum_{x,a}A_{x,a}^2 + \frac{1}{2}\sum_{x,y,f}(\varphi_f)_x^T (M_f)_{xy}^{-1}(\varphi_f)_y$$

- This rewriting is justified when (Re det *M*)>0 and (Re *M*<sup>-1</sup>)>0
- CG-type solver is then applicable
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#### Setup 1 : choice of $\alpha$ Fukuma and YN (in prep)

Redundant parameter  $\alpha$  affects the sign and the ergodicity problems We choose  $\alpha$  at an intermediate value which avoids the ergodicity problem and a less sign problem than that at  $\alpha = 1$ .

Remaining sign problem is solved by WV-HMC.



#### Setup 2 : choice of flow time Fukuma and YN (in prep)

We set the target flow time T to the minimum value among those flow times that solve the remaining sign problem.



## Result 1 : computational cost scaling

We evaluate the computational cost of RATTLE using <u>GT-HMC</u> (fixed flow time version of WV-HMC) with tuned  $\alpha$  Alexandru@Lattice2019, Fukuma et al. (2019)



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#### Result 2 : number density Fukur

Fukuma and YN (in prep)

We measure number density  $\langle n \rangle$  with naïve reweighting and WV-HMC

- Naïve reweighting suffers from large errors
   Tuning of α reduces sign problem, but does not completely resolve it
- WV-HMC gives small errors and is consistent with ALF

ALF is an established MC code in condensed matter physics



#### Result 3 : energy density Fukuma and YN (in prep)

We measure energy density  $\langle e \rangle$  with naïve reweighting and WV-HMC

- Naïve reweighting suffers from large errors
   Tuning of α reduces sign problem, but does not completely resolve it
- WV-HMC gives small errors and is consistent with ALF

ALF is an established MC code in condensed matter physics



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#### Results 4: larger lattice and lower temperature (ongoing)

Fukuma and YN (in prep)

We move on to a larger lattice  $(6 \times 6)$  and a lower temperature  $(\beta = 6.4)$ , where it becomes harder to evaluate observables with other algorithms



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#### Summary

We applied WV-HMC to the sign problem in (1+2)-dim Hubbard model as a step toward finite density QCD Fukuma and YN (in prep)

- Computational cost scaling
  - Direct solver :  $O(N^3)$   $N \equiv$  Degrees of Freedom
  - CG-type solver :  $O(N^2)$
- Estimates of observables
  - WV-HMC give consistent results with those of well-established ALF code with small statistical errors in the parameter region where the sign problem is severe