### Fermion Bag Approach to Hamiltonian Lattice Field Theories

Shailesh Chandrasekharan (Duke University)

work done in collaboration with Emilie Huffman

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Develop non-perturbative approaches to study them!

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So new models have become accessible and some old models can now be solved more efficiently!

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Determination of critical exponents have remained unsatisfactory. Room for improvement.

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Biggest spatial lattices studied:

- es studieu.
- 2600 sites (honeycomb lattice)
- 1600 sites (square lattice)

Otsuka, Yunoki, Sorella, (2016)

Are there examples of unsolved problems, where progress would be useful?

"Repulsive Hubbard (t-U) Model" for graphene

$$H = -t \sum_{\langle ij \rangle, \sigma} c^{\dagger}_{i,\sigma} c_{i,\sigma} + U \sum_{i} \left( n_{i,\uparrow} - \frac{1}{2} \right) \left( n_{i,\downarrow} - \frac{1}{2} \right)$$

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Can we reproduce the physics close to U<sub>c</sub> with staggered fermions?

Staggered fermion approach:  $(N_f = 2, 4 \text{ component massless Dirac fermions})$ 

$$S = \frac{1}{2} \sum_{x,y,i=1,2} \psi_{x,i} M_{x,y} \psi_{y,i} - U \sum_{\langle xy \rangle} \psi_{x,1} \psi_{x,2} \psi_{y,1} \psi_{x,2}$$

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Fermion Bag Approach, $\nu$ above model (403 lattices):Today we can go to bigger lattices

 $u = 0.82(2), \eta = 0.65(2)$ SC and A.Li, 2012

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$$\nu = 0.84(4), \eta = 0.69(8)$$
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No lattice field theory results with staggered fermions due to sign problems. Wipf et. al., Lattice (2017)

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commute

$$\operatorname{Tr}(\exp(-\beta H)) = \sum_{[\phi]} \left( \operatorname{Pf}(G[\phi]) \right)^2$$

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This structure is not obvious  
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$$u=$$
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Large scale calculations should help resolve such disputes!

The lattice QCD community could bring its expertise to the field!

- Use HMC algorithms to go to large lattices ?

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Our motivation is to bring the idea of fermion bags to solve lattice Hamiltonian problems.

Idea: Divide the system into smaller regions (bags), so that the fermion dynamics within each region gives a positive weight.

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- Domain decomposition Luscher, 2003
- Local factorization Ce, Giusti and Schaefer, 2016

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Can we extend the idea to Hamiltonian systems?

## **Continuous Time (CT) Approach**

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In Hamiltonian fermion systems the partition function can be expanded in powers of the interaction in continuous time

$$Z = \operatorname{Tr}\left(e^{-\beta H}\right) = \int dt_1 dt_2 \dots dt_k \operatorname{Tr}\left(e^{-\beta H_0} H_{int}(t_1) H_{int}(t_2) \dots H_{int}(t_k)\right)$$
  
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Fermion Bag Idea:  $H_0 = 0$   $H_{int} = \sum_{\langle ij \rangle} H_{ij}$ 

$$H_{ij} = -\delta e^{\alpha(i\overline{\xi}_i\xi_j+i\overline{\xi}_j\xi_i)/2} = -\delta e^{\alpha(c_i^{\dagger}c_j+c_j^{\dagger}c_i)}$$

$$Z = \sum_{[b]} \int dt_1 dt_2 \dots dt_k \operatorname{Tr} \Big( H_{i_1 j_1}(t_1) H_{i_2, j_2}(t_2) \dots H_{i_k j_k}(t_k) \Big)$$






Naive fermion bag approach is equivalent to Diagrammatic Determinantal MC, which is very inefficient

#### Idea: Fermion Bags split up at high T

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Similar to the local factorization algorithm:

#### Ce, Giusti and Schaefer, 2016

Fermion bag size as a function of spatial volume



Fermion bag size as a function of spatial volume



Fast updates possible within time slices! A similar update is used in auxiliary field MC, but here there is a bigger gain.

Equilibration on 100 x 100 lattice,  $\beta = 4$ 



Equilibration on 100 x 100 lattice,  $\beta = 4$ 



Fakher Assaad (Sign 2017): This may be impossible with auxiliary field MC, due to stabilization issues!





#### Scaling of the algorithm: $L^6 \beta$



β

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Explore ways to accelerate to do even L=100 (10,000 sites) at low T.

### **Results** $\beta = L$

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density-density correlation ratio

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density-density correlation ratio

$$R = \left\langle \left( n_0 - \frac{1}{2} \right) \left( n_{L/2} - \frac{1}{2} \right) \right\rangle$$

symmetric phase: (semi-metal)  $R \sim \frac{1}{I^4}$ 

broken phase: (charge density wave)  $R \sim \text{Const.}$ 

critical point: 
$$R \sim rac{1}{L^{1+\eta}}$$





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Stay Tuned for more results on large lattices!

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Ideas based on fermion bags offer an alternate method. In some cases they seem to allow us to study large lattices that seemed difficult earlier.