

# Algorithms for frustrated spin models

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# Antiferromagnetism in Mott insulators:

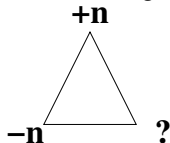
- ▶ Antiferromagnetic exchange interactions of magnetic ions in insulators:

$$E = J \sum_{\langle ij \rangle} \mathbf{S}_i \cdot \mathbf{S}_j \quad J > 0$$

- ▶ When is  $J > 0$ , large? Difficult (quantum chemistry) question, with thumb-rule answer: **Goodenough-Kanamori-Anderson rules**  
J.B. Goodenough, *Magnetism and the Chemical Bond* (1963)  
(exceptions known, e.g. Oles *et al.* 2006)
- ▶ Sometimes possible to “measure”  $J$ : Inelastic neutron scattering in high field.  
e.g.  $\text{Yb}_2\text{Ti}_2\text{O}_7$  Ross *et al.* PRX 2011

# Triangles on my mind: Frustration and spin liquid behaviour

- ▶ Triangles → *frustrated* antiferromagnetism



Competing interactions frustrate Neel order

- ▶ 'Quenching' of exchange allows new physics to take center-stage: Spin liquids
- ▶ Macroscopic degeneracy of *classical* minimum energy configurations.
- ▶ At intermediate  $T_f < T < JS^2$ , spin correlations reflect this macroscopic degeneracy:  
**No Bragg peaks in structure factor → correlated liquid state**

# Frustration and entropic interactions

- ▶ Frustrated magnets: Large degeneracy of minimum energy configurations
- ▶ At  $T \ll J$ : system samples minimally frustrated subspace  
(Or falls out of equilibrium...)
- ▶ Fluctuations generate entropic interactions

## Order by disorder:

- ▶ Low temperature physics dominated by entropic interactions
- ▶ Characteristic signatures in structure factor
- ▶ More dramatic cases: Order-by-thermal/quantum disorder

# Sign problem in Quantum Monte Carlo

- ▶  $Z = \sum_{\mathcal{C}} W(\mathcal{C})$
- ▶ In classical stat. mech.  
 $W \propto \exp(-E/k_B T) > 0$
- ▶ For quantum systems  $Z = \text{Tr}(e^{-H/k_B T})$   
**Berry phase effects:  $W$  need not be positive**  
→ Exponentially deteriorating error bars

# Sign problem and frustration

- ▶ Hamiltonian written as sum over links:  $H = \sum_l H_l$
- ▶  $Z = \text{Tr}[\exp(-H/T)] = \sum_{\alpha_0} \langle \alpha_0 | \exp(-H/T) | \alpha_0 \rangle$
- ▶ High-temp expansion:

$Z =$

$$\sum_{n=0}^{\infty} \frac{1}{n! T^n} \sum_{S_n} \langle \alpha_0 | (-H_n) | \alpha_{n-1} \rangle \langle \alpha_{n-1} | (-H_{n-1}) | \alpha_{n-2} \rangle \dots \langle \alpha_1 | (-H_1) | \alpha_0 \rangle$$

Stochastic series expansion (SSE): Sample sum over *operator-strings*  $S_n$  of length  $n$  with weight above.  
(Sandvik 1991)

- ▶ Every  $J > 0 \rightarrow$  minus sign

# Periodicity, closed-loops and the overall sign

- ▶ Overall sign insensitive to  $|\alpha\rangle \rightarrow e^{i\gamma(\alpha)}|\alpha\rangle$   
no quick fix...
- ▶ Diagonal matrix elements can always be shifted to make sign positive
- ▶ Off-diagonal “hops” control sign
- ▶ Constrained by periodicity in  $\tau$  and lattice structure



# (Sign) Problems and “Solutions”...

- ▶ Notorious problems:

$$H = \sum_{\langle rr' \rangle} \vec{S}_r \cdot \vec{S}_{r'}$$
 on Kagome, triangular lattices

$d = 2$  square lattice Hubbard model away from half-filling

- ▶ Some “solutions”:

1. Looking under the (Ising) streetlamp: Frustrated exchange couplings only involving one component of spins
2. Clever change of simulation basis...?
3. Finessing the problem: Effective field theory/Hamiltonian description of low-energy physics can be numerically tractable
4. Identifying symmetries that cancel -ve signs in pairs

# Very difficult even if sign-free!

- ▶ Quantum and thermal fluctuations determine nature of low temperature phase & excitations
- ▶ Computational scheme needs to be ergodic within macroscopically degenerate minimally frustrated subspace
- ▶ Also needs to capture thermal fluctuations out of minimally frustrated subspace

# Ideas that help: Clusters, worms, and loops.

- ▶ **Cluster constructions** (Wolff, Swendsen & Wang) identify and update large regions that “want to” move together  
(Accurately capture the physics of large correlation lengths associated with ferromagnetic criticality)
- ▶ **Worm constructions** (Evertz & Wiese; Prokofev & Svistunov) identify a one-dimensional cascade of moves that take system out of physical (constrained) configuration space  
(When worm closes on itself, system returns to physical subspace, but with large changes in configuration)
- ▶ **Dual (loop) representations** Bond-variables often more convenient (Hitchcock, Sorensen, Alet . . .)

# Issues

- ▶ **Key challenge for clusters and worms:**  
Are clusters rejected with significant probability?  
Do worms/clusters reflect underlying physics?
- ▶ **Composition of clusters should reflect long-wavelength correlations of the system...**  
Algorithm needs to “know” of the physics of geometric frustration?

# Example of sign-free but challenging models

- ▶ Ising models of quantum frustration (Moessner-Sondhi 2000)

Triangular lattice Ising antiferromagnet in a transverse field

$$H_{\text{TFIM}} = J \sum_{\langle ij \rangle} \sigma_i^z \sigma_j^z - \Gamma \sum_i \sigma_i^x + \dots$$

- ▶ Quantum cluster algorithm available in SSE representation for unfrustrated quantum Ising models (Sandvik 2003)

# Challenge: Low but not zero temperatures

- ▶ Classical frustrated Ising models:  
Thermal fluctuations need to be captured in efficient way  
Standard (Wolff-inspired) classical cluster constructions accurately reflect long-wavelength physics of ferromagnetic correlations, but not of frustration  
Coddington & Han 1994, Zhang and Yang 1994
- ▶ Frustrated transverse field Ising models  
Quantum cluster algorithm reduces to variant of Swendsen-Wang clusters in  $\Gamma = 0$  limit  $\rightarrow$  frustrated  $J_{ij}$  again cause problem at low temp.  
Need to “teach” cluster algorithms structure of minimally frustrated landscape(?)

# Difficult even in classical case

- ▶ Dual worm construction (Wang, Sterck & Melko 2012)  
Uses worms to update dual variables (*a la* Hitchcock, Sorenson, Alet 2004)
- ▶ Works when  $T = 0$  limit is dual to non-interacting dimers
- ▶ Involves rejection of significant fraction of worms

# Our recent progress

- ▶ Quantum cluster construction for *frustrated* TFIM  
(Sounak Biswas, R. Geet, & KD, unpublished)
- ▶ Stochastic Series Expansion Quantum Monte Carlo in basis of total spin eigenstates of clusters of spins  
(F. Alet, KD, & S. Pujari, unpublished)
- ▶ Cluster algorithm for frustrated two-dimensional  $H_{\text{Ising}}$  with up to third neighbour interactions  
(KD & R. Geet, unpublished)



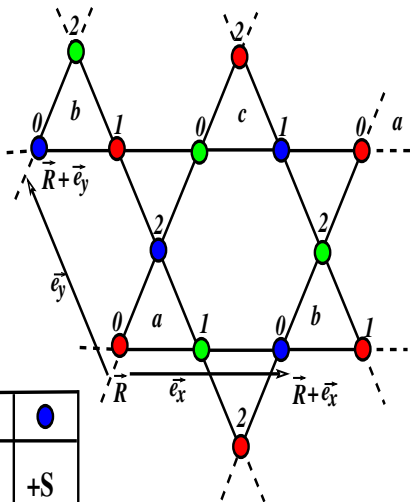
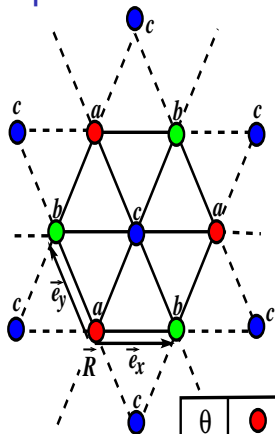
# Ingredients

- ▶ Cluster constructions
- ▶ (Dual) “loop-like” (dimer) representations
- ▶ Directed worm constructions

# Quantum cluster algorithm for frustrated TFIM

- ▶ Example: Transverse field Ising antiferromagnet on triangular lattice (also with further neighbour  $(J_2, J_3)$  couplings...)
- ▶ Interesting physics questions
  - Thermodynamic signature of two-step melting of three-sublattice order
  - Transition from plaquette to columnar three-sublattice order

# Order parameter



$\theta$	<span style="color: red;">●</span>	<span style="color: green;">●</span>	<span style="color: blue;">●</span>
0	-S	+S	+S
$\frac{\pi}{6}$	-S	0	+S

For triangular lattice:  $\Psi = \sum_r e^{i\mathbf{Q}\cdot\mathbf{r}} \sigma_r^z$

# Columnar vs Plaquette type orders

$$\Psi = |\Psi|e^{i\theta}$$

$\theta = 2\pi m/6$ : Columnar three-sublattice order ( $m = 0, 1, 2 \dots 6$ )

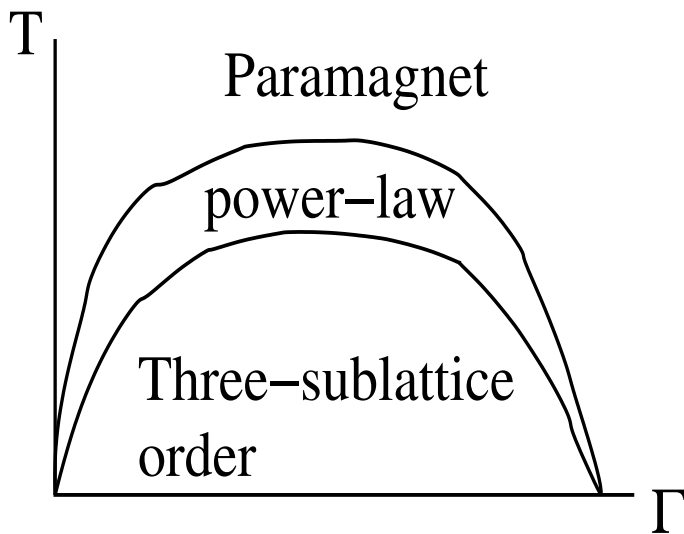
$\theta = (2m + 1)\pi/6$ : Plaquette three-sublattice order ( $m = 0, 1, 2 \dots 6$ )

In ordered state:  $\theta$  pinned to these values

Columnar phase is ferrimagnetic  $m \propto \cos(3\theta)$

In power-law phase:  $\theta$  has gaussian fluctuations with no pinning

## Physics summary



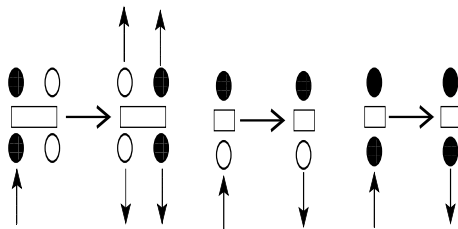
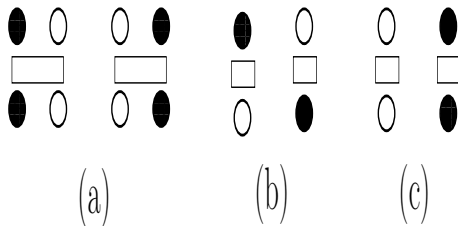
(Isakov & Moessner 2003) for  $J_2 = 0$   
(D. P. Landau 1985) for  $J_2$  ferromagnetic

# Conventional quantum cluster algorithm

$$H_{\text{TFIM}} = \sum_{\text{link}} H_{\text{link}} + \sum_{\text{sites}} H_{\text{sites}}$$

trick:  $H_{\text{site}} = -\Gamma\sigma_{\text{site}}^x - \Gamma\mathbf{1}_{\text{site}}$

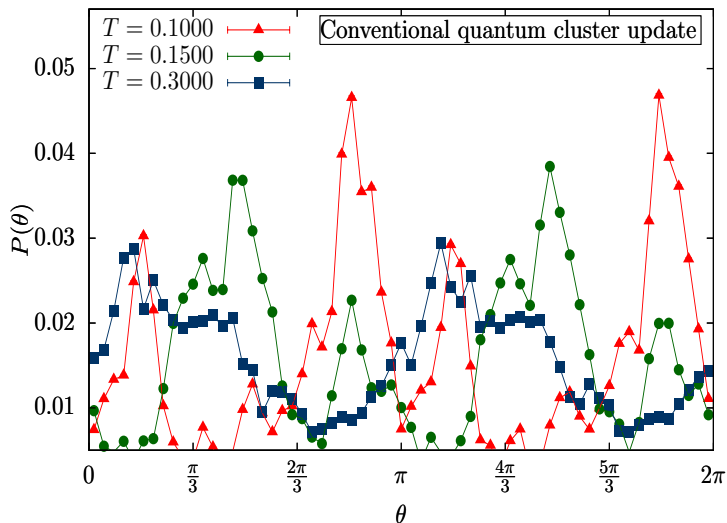
# Conventional quantum cluster algorithm



: Also add or remove diagonal operators to change length of operator string

# Loss of ergodicity in conventional approach

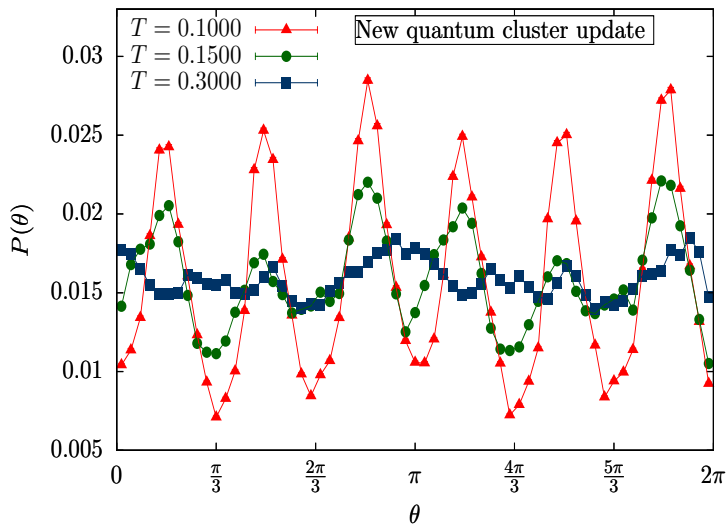
$$L = 48, \Gamma = 0.8, J_1 = 1.0, J_2 = 0.0$$





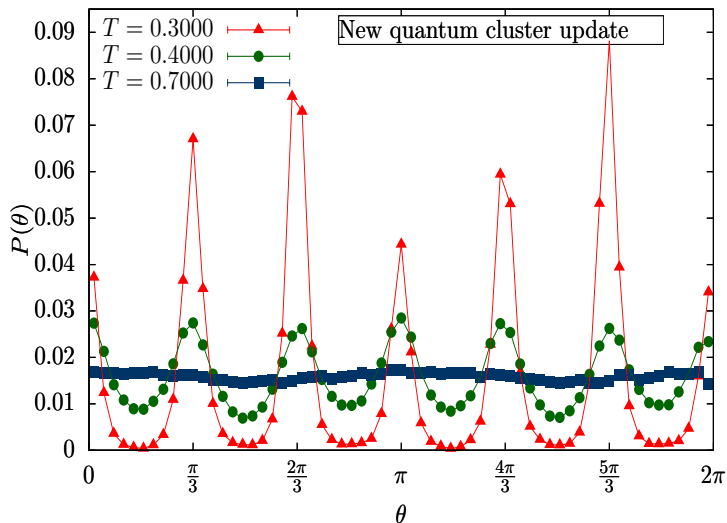
# Improvement achieved:

$$L = 48, \Gamma = 0.8, J_1 = 1.0, J_2 = 0.0$$

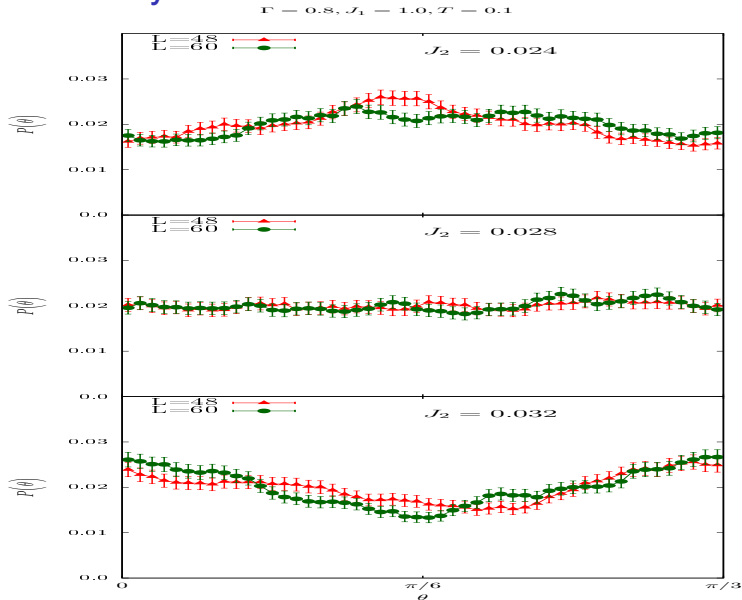


# Clean signature of ferrimagnetic phase

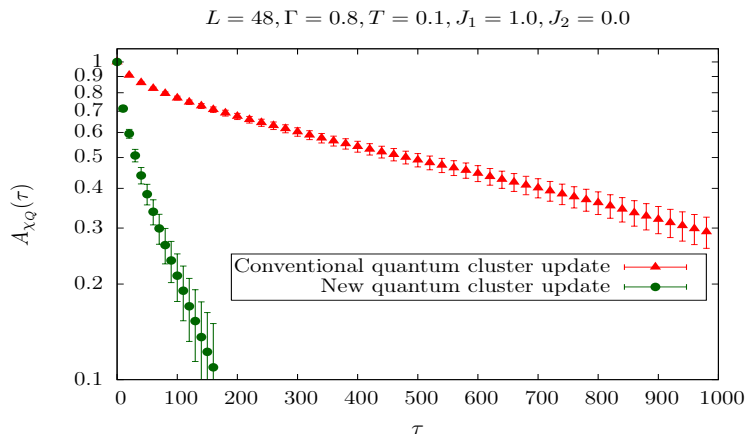
$$L = 48, \Gamma = 0.8, J_1 = 1.0, J_2 = -0.1$$



# Pinpointing transition to ferrimagnetic phase algorithmically

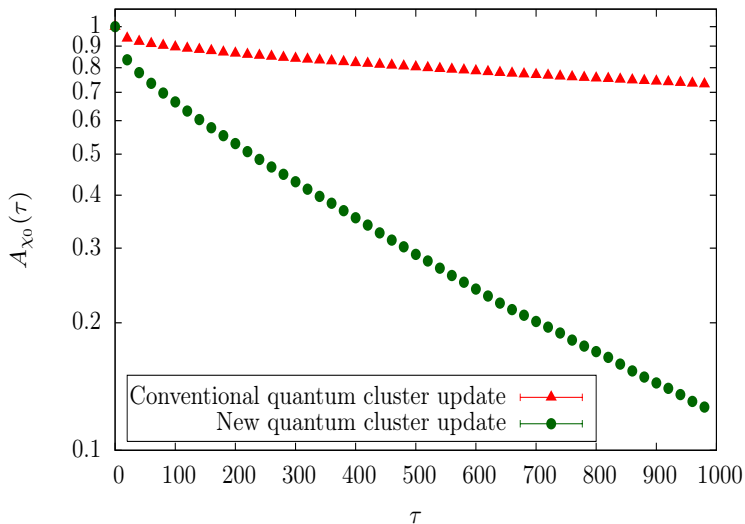


# Improvement achieved:



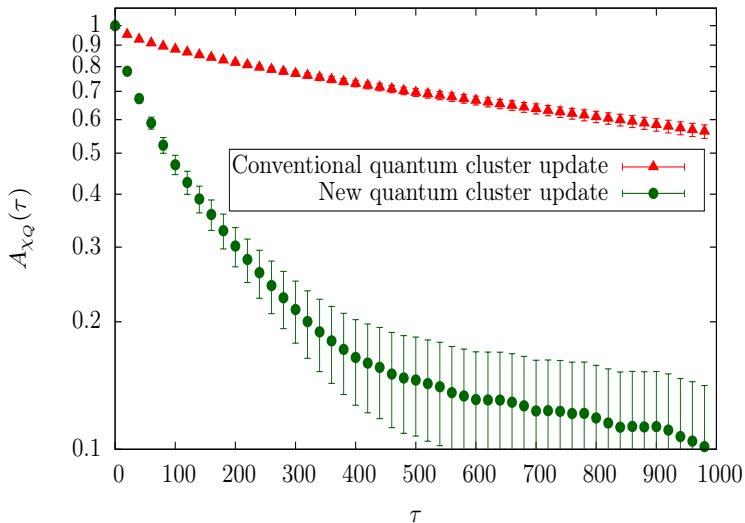
# Improvement achieved:

$$L = 48, \Gamma = 0.8, T = 0.1, J_1 = 1.0, J_2 = 0.0$$



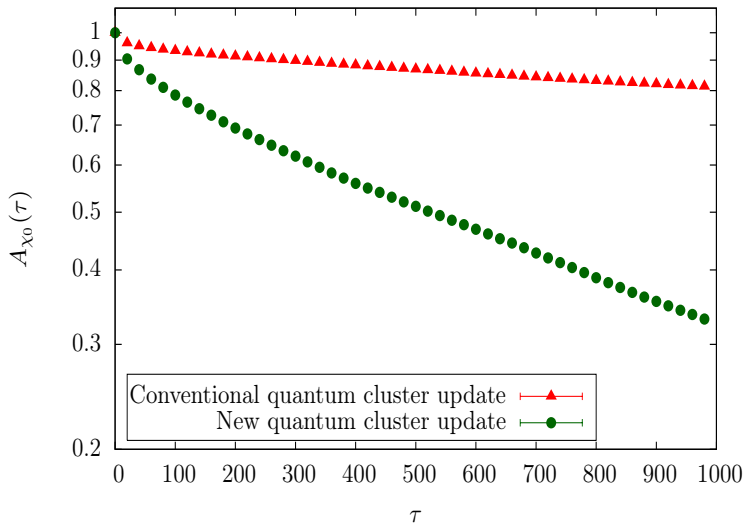
# Improvement achieved:

$$L = 72, \Gamma = 0.8, T = 0.1, J_1 = 1.0, J_2 = 0.0$$



# Improvement achieved:

$$L = 72, \Gamma = 0.8, T = 0.1, J_1 = 1.0, J_2 = 0.0$$



# How: Our approach

$$H_{\text{TFIM}} = \sum_{\Delta} H_{\Delta} + \sum_{\text{link}} H_{\text{link}} + \sum_{\text{sites}} H_{\text{sites}}$$

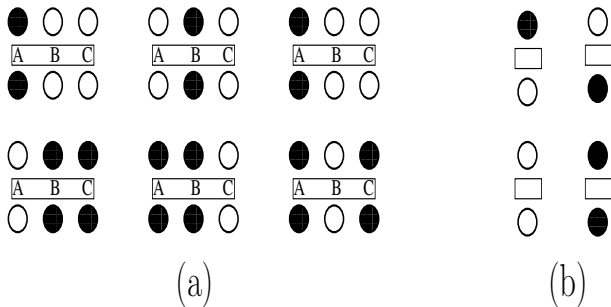
$H_{\Delta}$ : Triangle decomposition of all antiferromagnetic couplings

$H_{\text{Link}}$ : Bond decomposition of all ferromagnetic couplings

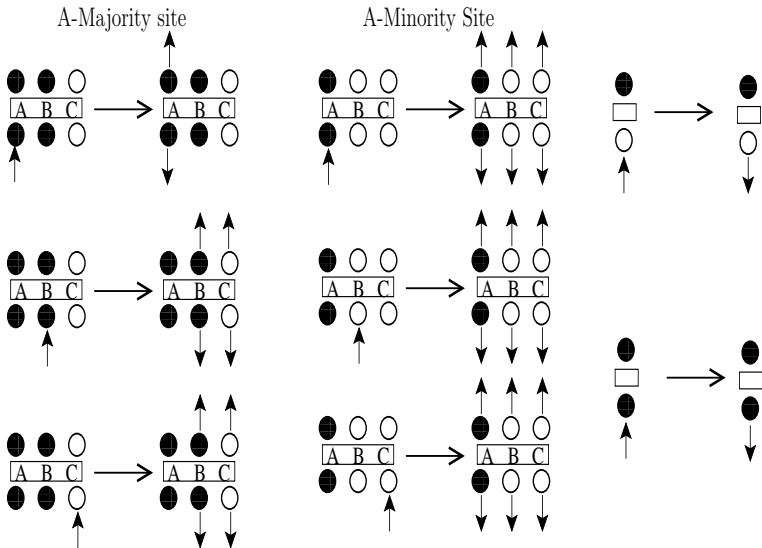
$H_{\text{sites}}$ : site decomposition of transverse field term



# Quantum-cluster construction for frustrated TFIM



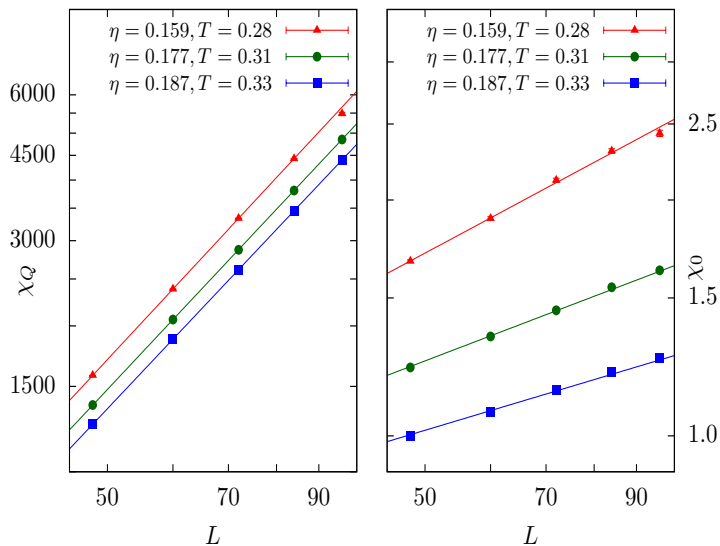
# Quantum-cluster construction for frustrated TFIM



'A' Update

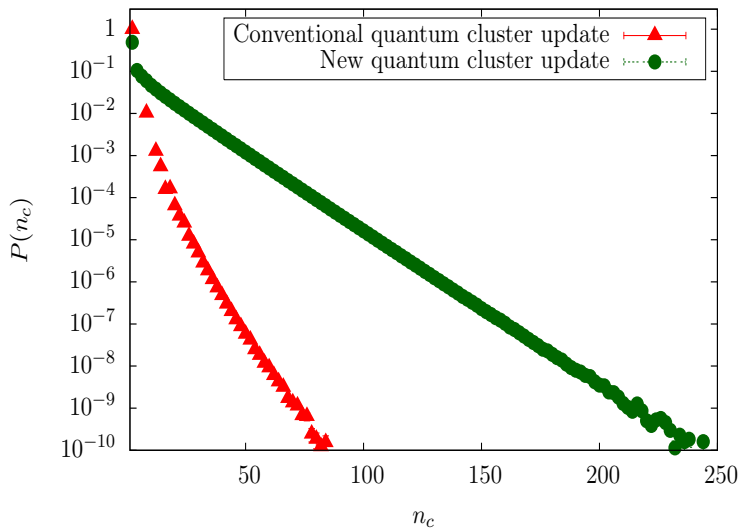
# Physics: Divergent ferromagnetic susceptibility of antiferromagnet

$$\Gamma = 0.8, J_1 = 1.0, J_2 = 0.0$$



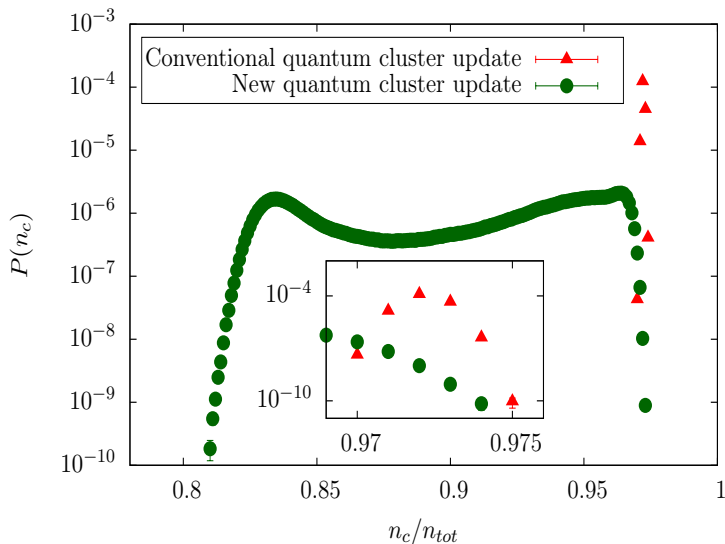
# Why does it work?

$$L = 48, \Gamma = 0.8, T = 0.1, J_1 = 1.0, J_2 = 0.0$$

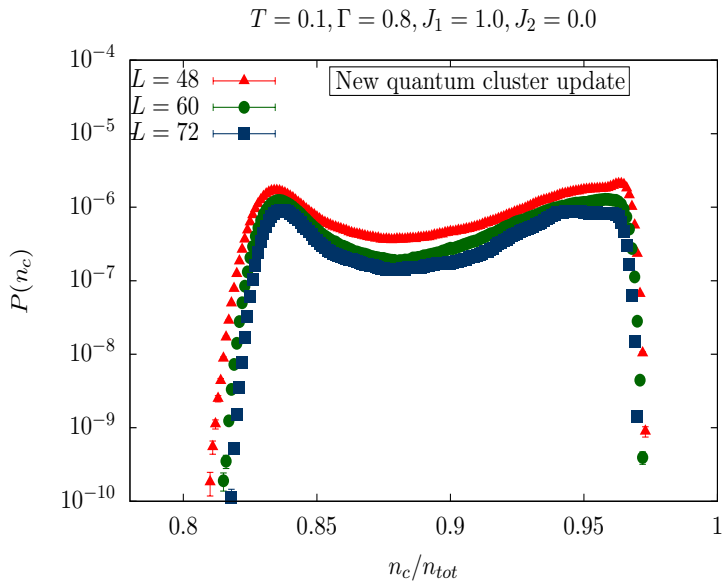


# Why does it work?

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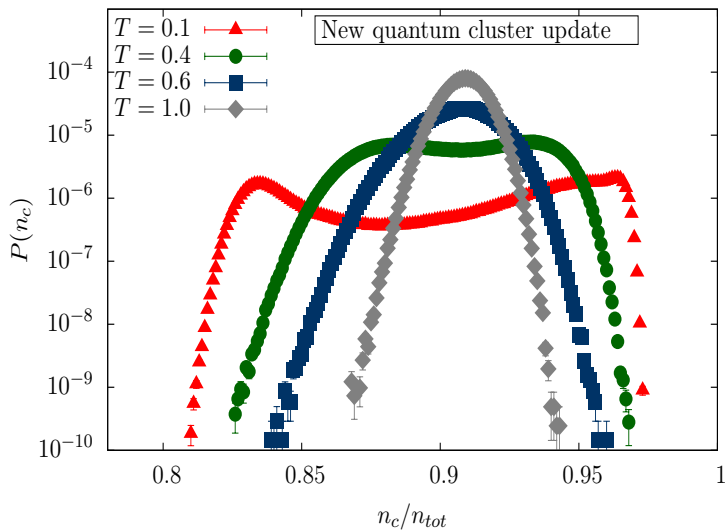


# Why does it work?



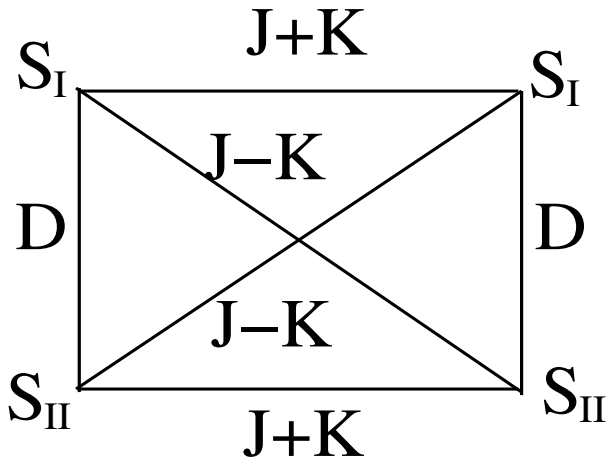
# Why does it work?

$$L = 48, \Gamma = 0.8, J_1 = 1.0, J_2 = 0.0$$



# Solution of sign problem for frustrated bilayer magnets

- ▶  $\vec{S}_{I_r}$  and  $\vec{S}_{II_r}$  located on the two *layers* at sites  $r$  of a bipartite Bravais lattice in any spatial dimension





# General frustrated bilayer Hamiltonian

$$H_{\text{bilayer}} = \sum_r \mathcal{D}_z S_{I_r}^z S_{II_r}^z + \mathcal{D}_\perp \vec{S}_{I_r}^\perp \cdot \vec{S}_{II_r}^\perp + \sum_{\langle r_a r_b \rangle} (\mathcal{J}_z S_{I_{r_a}}^z S_{I_{r_b}}^z + \mathcal{J}_\perp \vec{S}_{I_{r_a}}^\perp \cdot \vec{S}_{I_{r_b}}^\perp + \text{I} \leftrightarrow \text{II}) + \sum_{\langle r_a r_b \rangle} (\mathcal{K}_z S_{I_{r_a}}^z S_{II_{r_b}}^z + \mathcal{K}_\perp \vec{S}_{I_{r_a}}^\perp \cdot \vec{S}_{II_{r_b}}^\perp + \text{I} \leftrightarrow \text{II})$$

# Severe sign problem for conventional SSE

- ▶ Triangles in lattice structure

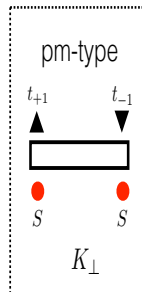
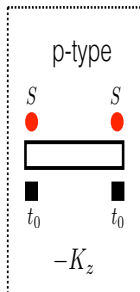
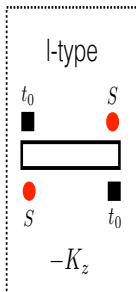
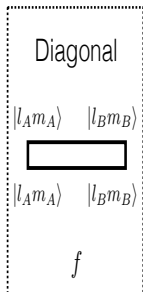
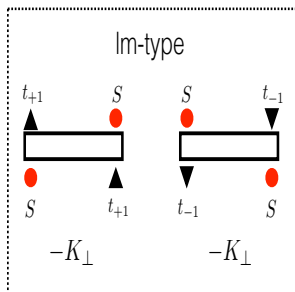
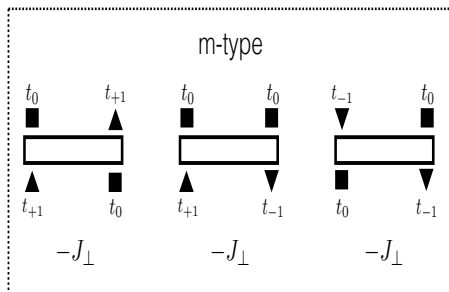


- ▶ Severe sign problem in  $z$  basis for SSE

# Basic idea

- ▶ Stochastic Series Expansion in basis of total spin eigenstates of two spins at Bravais lattice site  $r$

# Vertices and weights

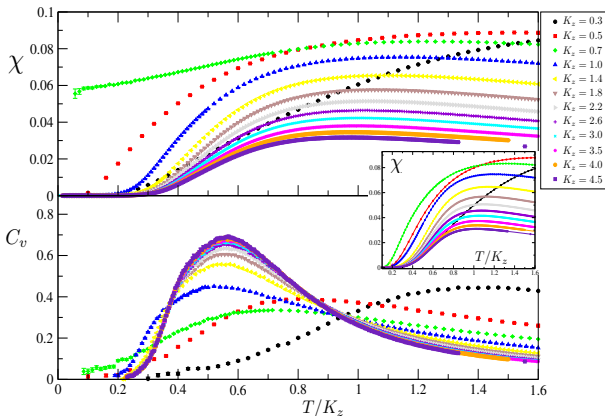


# Proof of sign-free nature

## Periodicity and bipartiteness implies constraints

- ▶  $\mathcal{N}_p + \mathcal{N}_{pm}$  must at least be even.
- ▶  $\mathcal{N}_m + \mathcal{N}_{pm} + \mathcal{N}_{lm}$  must also be even.
- ▶  $\mathcal{N}_l + \mathcal{N}_{lm}$  must also be even.
- ▶ If  $K_{\perp} = 0$ , we have  $\mathcal{N}_{lm} = \mathcal{N}_{pm} = 0$ .  
No sign problem
- ▶ If  $K_z = 0$ , we have  $\mathcal{N}_l = \mathcal{N}_p = 0$ .  
No sign problem

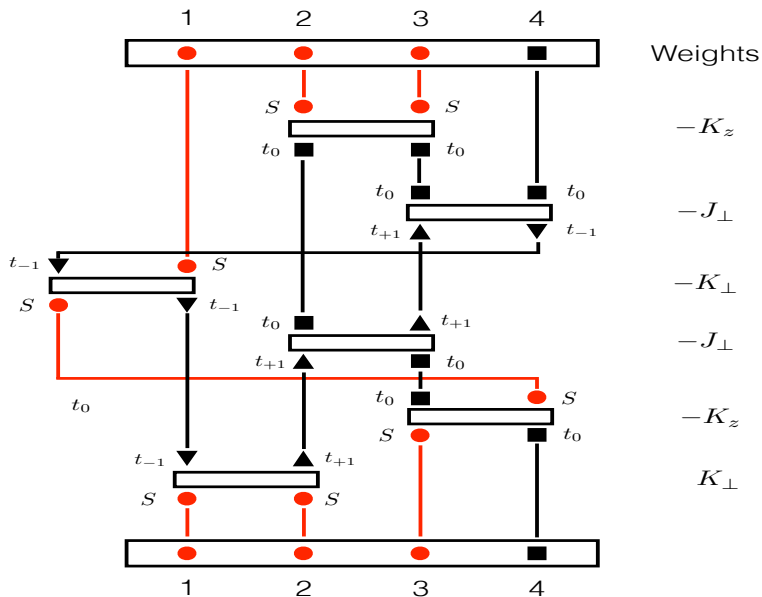
# Illustration: Fully frustrated ladder with $K_z \neq 0$



$H_{\text{bilayer}}$  in  $d = 1$  with  $\mathcal{D}_z = \mathcal{D}_\perp = 1$ ,  $\mathcal{J}_\perp = \mathcal{K}_\perp = 1$ ,  $\mathcal{J}_z = 1 + K_z$ ,  $\mathcal{K}_z = 1 - K_z$ , as a function of rescaled temperature  $T/K_z$  with linear size (number of unit-cells)  $L = 64$ .

The inset shows the perfect agreement between QMC data (symbols) and exact diagonalization results (lines) for a system of linear size  $L = 6$ .

# Can we access SU(2) symmetric frustrated bilayers?

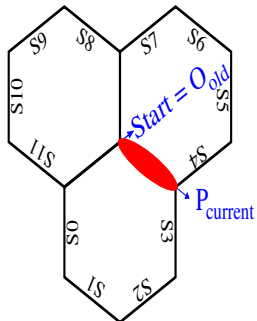
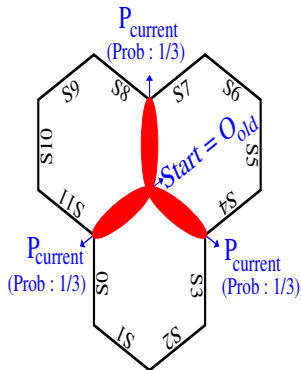


# Cluster algorithm for classical frustrated Ising models

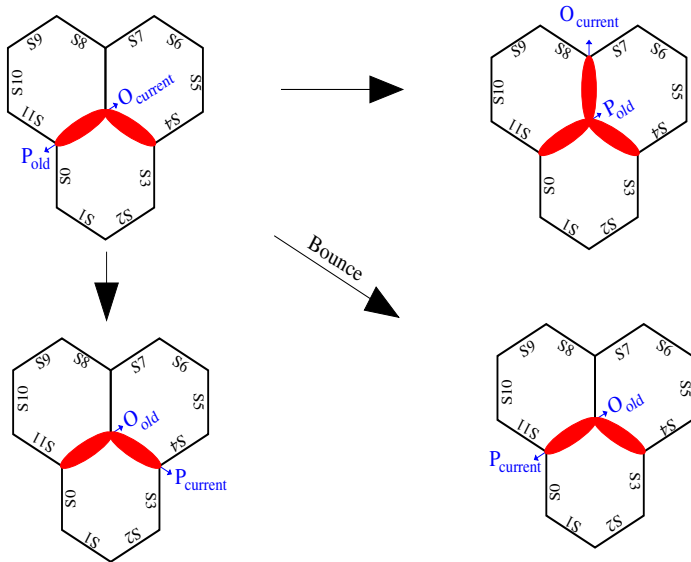
- ▶ Map configuration to dual (bond-energy) representation.  
“Generalized dimer model”
- ▶ Devise a rejection-free worm algorithm to update bond-energies  
Subtlety: Allowing for excursions outside minimally frustrated subspace with correct weight
- ▶ Transform back to spins



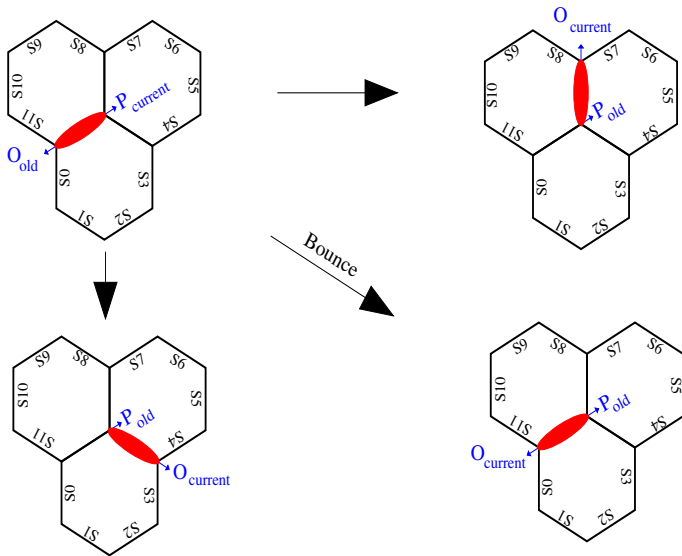
# Algorithm for $H_{\text{Ising}}$ on triangular lattice



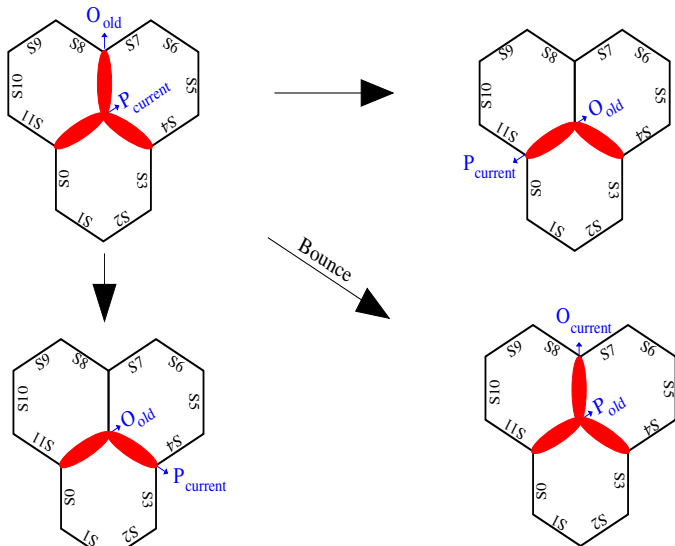
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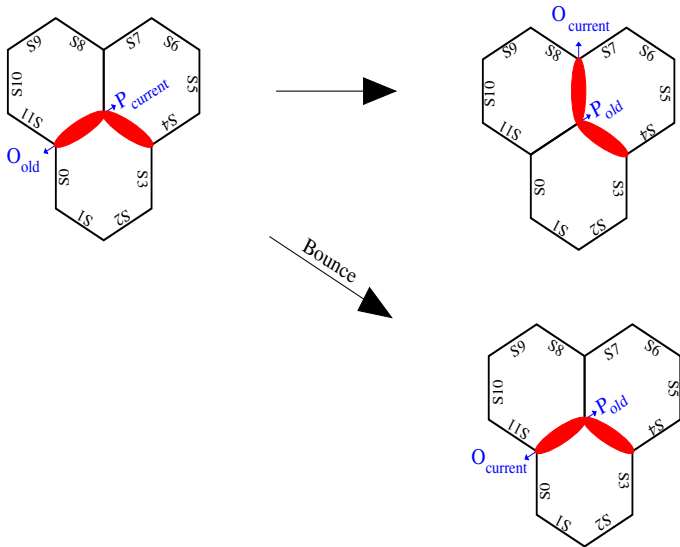
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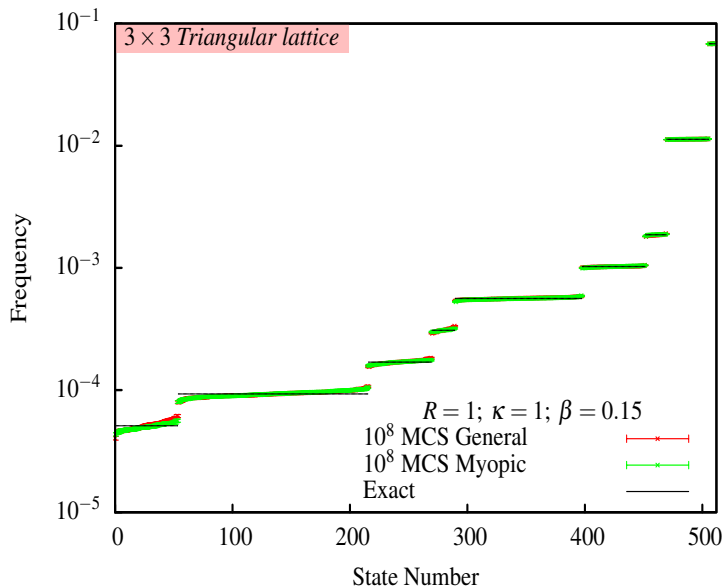
# Algorithm for $H_{\text{Ising}}$ on triangular lattice



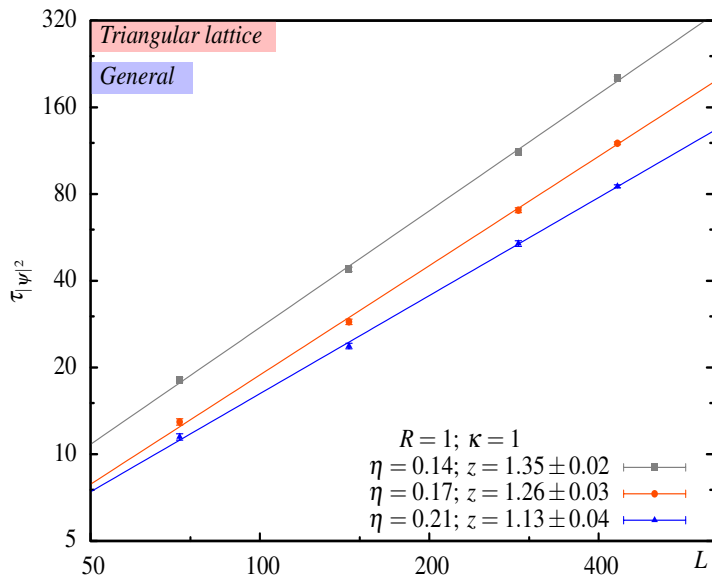
# Algorithm for $H_{\text{Ising}}$



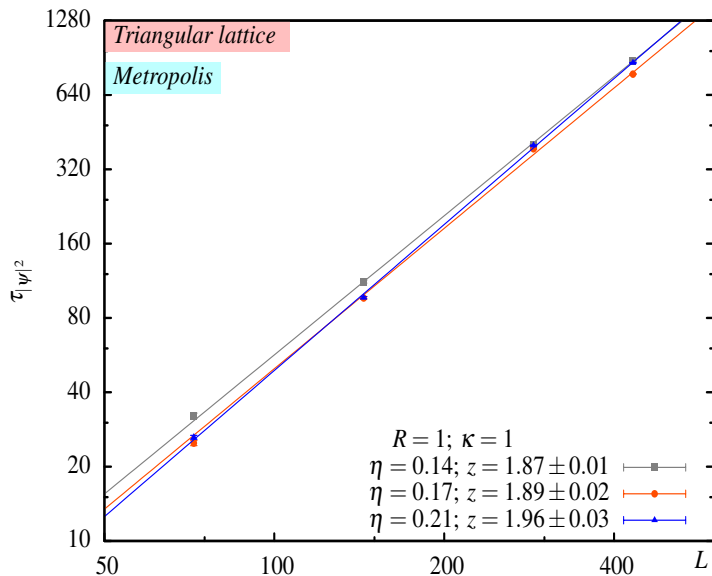
# Test against exact enumeration



# In power-law three-sublattice ordered phase

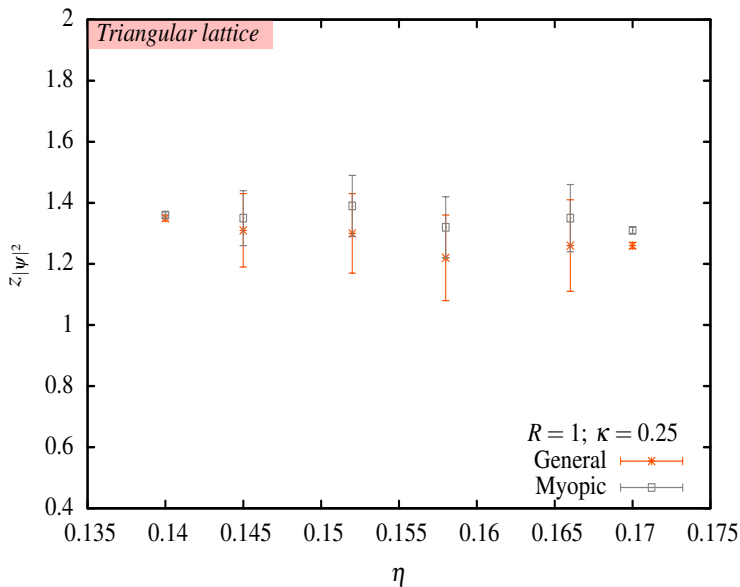


# In power-law three-sublattice ordered phase





# In power-law three-sublattice ordered phase



# Acknowledgements

- ▶ Collaborators:



Sounak Biswas, R. Geet, S. Pujari, & Fabien Alet

- ▶ Computational resources: DTP TIFR & DST
- ▶ CEFIPRA funding