# Critical Behavior of Ising Models with Random Long-Range (Small-World) Interactions

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The critical scaling behavior of Ising models with long range interactions is studied. These long-range interactions, when imposed in addition to interactions on a regular lattice, lead to small world graphs. Large-scale Monte Carlo simulations, together with finite-size scaling, is used to obtain the critical behavior of a number of different models. These include the *z*-model introduced by Scalettar, standard small-world bonds superimposed on a square lattice, and physical small-world bonds superimposed on a square lattice. These scaling results provide further evidence to support the existence of physical (quasi-) small-world nanomaterials.

Keywords: Monte Carlo; Nanomaterials; Small world

#### I. INTRODUCTION

The critical behavior, as well as the transport properties, of a particular material depend on a number of factors, in particular the effective dimensionality of the system. Thus one-dimensional (or quasi-one-dimesional) materials [1] behave differently than thin films, both of which have different properties than bulk (three dimensional) materials. In general, constraining the geometry of a system leads to effective dimensions [2, 3] less than the bulk dimension. In the two-body interaction approximation, all materials reduce to a 'ball-andstick' model, with atoms as the 'balls' and the bonds between atoms as the 'sticks'. This leads from a particular material to a given graph [4], with atoms at the nodes and chemical bonds (two-body interactions) along the edges.

Recently there has been a great deal of interest in graphs which are neither regular graphs (as are the graphs of materials with perfect crystal structures) nor random graphs. One type of such graph is the small-world (SW) graph [5]. Such graphs have been used, for example, to improve scalability of parallel computer algorithms [6–10]. Furthermore, the critical behavior of models of materials, such as the Ising model, Heisenberg model, and random-walker models have been studied on SW graphs [11–21]. The result of these studies is that models on SW graphs exhibit mean-field scaling, namely they have an effective dimension at or above the upper critical dimension of the model (which for the Ising model without disorder is d=4).

Unfortunately, the study of such materials models on SW networks is not of interest to experimental researchers in materials. The reason is that certain constraints due to the fixed size of atoms and atomic bonds, as well as the necessity of embedding the 'ball-and-stick' graph in three dimensional space, restricts the types of SW graphs that are of interest to materials researchers. SW graphs with such constraints are called physical SW graphs [22–24], and the critical behavior of Ising models on physical SW graphs has been studied. This study started with a linear graph, with added SW bonds. In this article, a study of Ising critical behavior on graphs starting with a square lattice and with added SW bonds, is reported.



FIG. 1: An example of a lattice studied for L=4 (with periodic boundary conditions) showing both the regular square-lattice interactions (light lines, interaction strength  $J_1$ ) and a realization of the small world (random) interactions (heavy dashed lines). This corresponds to the z=5 lattice since every lattice site has four  $J_1$  interactions and one SW interaction of strength  $J_2$ . (Color online.)

## II. MODEL AND METHODS

The models studied here are Ising models with  $N=L^2$  Ising spins with  $s_i=\pm 1$  on a  $L\times L$  square lattice with periodic boundary conditions, and with a nearest-neighbor ferromagnetic interaction of strength  $J_1$ . A fixed number of SW bonds with interaction strength  $J_2$  are added to the square-lattice (see Fig. 1), by randomly picking pairs of atoms and connecting them with a bond. Note that once the pair of atoms is picked, these atoms are not allowed to be picked again until all atoms have been picked. In other words, every node will have a coordination number z between  $z_{max}$  and  $z_{max} - 1$ . The Ising Hamiltonian is given by

$$\mathcal{H} = -J_1 \sum_{\langle i,j \rangle} s_i s_j - J_2 \sum_{SW} s_i s_j - J_3 \sum_{SW++} s_i s_j \,. \tag{1}$$

We use either 'normal' SW bonds of strength  $J_2$ , or else given a SW bond of length  $\ell$  between the randomly chosen atoms we string a chain of  $\ell+1$  atoms with interaction strength  $J_3$ between these chosen square-lattice atoms. We always set either  $J_2$  or  $J_3$  equal to zero.

We will first study here in detail scaling of a model with z SW bonds per atom with  $J_2=1$  and  $J_1=J_3=0$ . We will call this model the z-model. It was first introduced by Scalettar [25] in 1991, before the introduction of SW networks. Nevertheless, it corresponds to a particular SW lattice. In particular, it can be mapped onto a one-dimesional lattice with z-2 SW interactions. This model is studied to determine whether the scaling for it is that of [25] or of another form predicted by Brézin and Zinn-Justin [26] and utilized to study Ising systems with long-range interactions [27–30].

We utilized standard Monte Carlo (MC) simulations [31], with the site for an attempted update chosen at random. We utilized a Glauber flip probability and the SPRNG [32] random number generator. In particular, if the next random number is r the spin is flipped if

$$r \le \frac{\exp^{-E_{\text{new}}/k_{\text{B}}T}}{\exp^{-E_{\text{old}}/k_{\text{B}}T} + \exp^{-E_{\text{new}}/k_{\text{B}}T}}$$
(2)

where  $E_{old}$  is the current energy and  $E_{new}$  is the energy if the chosen spin is flipped. The temperature is T and  $k_{\rm B}$  is Boltzmann's constant (in our units  $k_{\rm B}=1$ ). For a system with N Ising spins, the units of time are Monte Carlo Steps per Spin (MCSS), which corresponds to N spin flip attempts. We measured a number of quantities, and report here on the order parameter  $|M| = \frac{1}{NK} \sum_{j=1}^{K} |\sum_{i=1}^{N} s_i|_j$ , as well as the integer moments of the magnetization  $\langle M^b \rangle = \frac{1}{K} \sum_{j=1}^{K} \left( \frac{1}{N} \sum_{i=1}^{N} s_i \right)_j^b$ The summation index j runs over the K different configurations generated in the Monte Carlo simulation. From these moments the susceptibility  $\chi T = \frac{N}{k_{\rm B}T} \left( \langle M^2 \rangle - |M|^2 \right)$  and the Binder fourth-order cumulant  $U_4 = 1 - \frac{\langle M^4 \rangle}{3 \langle M^2 \rangle^2}$  were calculated. Simulations were performed using up to 128 processing elements using trivial parallelization. Obtaining points for the z-model for the largest system size  $N=256^2$  took about 52 hours per data run. Averages for all runs used between  $K=10^6$ and  $10^8$  MCSS per point. The crossings for different N values for  $U_4$  give the critical temperature  $T_c$  for each model [31]. These values are listed in Table I.

#### III. RESULTS AND SCALING: z-MODEL

In this section we present results for the z-model  $(J_1=J_3=0, J_2=1)$  where every node has z random links. There are no square-lattice interactions, and consequently this model maps onto a linear chain with every spin having one random (small-world) link if z=3. This model also corresponds to the model introduced by Scalettar [25]. We studied the model for z values between 3 and 8, and simulated system sizes up to

$J_1$	$J_2$	$J_3$	Z	T <sub>c</sub>	model
1	0	0	4	2.2691	square lattice
0	1	0	2	0.0	z-model (linear chain)
0	1	0	3	1.821	z-model
0	1	0	4	2.885	z-model
0	1	0	5	3.914	z-model
0	1	0	6	4.933	z-model
0	1	0	7	5.942	z-model
0	1	0	8	6.950	z-model
1	1	0	5	3.791	SW-model
1	1	0	6	4.872	SW-model
1	4	0	5	5.391	SW-model
1	4	0	6	8.835	SW-model

TABLE I: Table 1. Values of the critical temperature  $T_c$  for the various models described in the text. All values are accurate within  $\pm 0.005$ . See the text for a full description of the models.



FIG. 2: The Binder Cumulant  $U_4$  (a) and  $\chi T/N$  (b) is shown for the *z*-model ( $J_1=J_3=0$ ,  $J_2=1$ ) for  $N=64^2$ ,  $128^2$ , and  $256^2$ . In (a) the horizontal line is  $U_{4,\infty}^{(mf)}$ . The legend holds for both graphs. (Color online.)

 $N=256^2=65536$  (although the starting square-lattice structure is unimportant for the *z*-model, we will still report the system size as  $N=L^2$ ).

Fig. 2 shows the values for  $U_4$  and  $\chi T$  for the *z*-model. These figures also allow one to read off the value for  $T_c$ . The order parameter for the *z*-model is shown in Fig. 3 for various values of *z*. Also shown is the mean-field (mf) value given by



FIG. 3: The magnetization per spin is shown for the *z*-model with  $N=256^2$ . The solid line is the mean-field result of Eq. 3. (Color online.)

the solution of the equation

$$M(T) = \tanh\left(\frac{T_{\rm c}}{T}M(T)\right).$$
(3)

Note that as z increases the curves for |M| approach that of the mean-field result.

The general form for scaling at a second order phase transition as a function of the reduced temperature

$$t = \left| \left( T - T_{\rm c} \right) / T_{\rm c} \right| \tag{4}$$

is given by [31]

$$\chi = L_{\rm eff}^{-\gamma/\nu} f\left(L_{\rm eff}^{1/\nu} t\right) \tag{5}$$

with  $\gamma$  the critical exponent for  $\chi$  and  $\nu$  the critical exponent for the correlation length. Here the effective length that enters scaling,  $L_{\text{eff}}$ , depends on the dimension of the system. For a regular *d*-dimensional lattice  $L_{\text{eff}} = N^{\frac{1}{d}}$ . However, this type of scaling does not hold for systems at or above the upper critical dimension. These systems behave in a mean-field fashion, such as the *z*-model. Scalettar showed that the average separation of spins in the *z*-model is

$$\ell_{\text{sep}} = \tilde{a}(z) + \tilde{b}(z)\ln(N), \qquad (6)$$

and suggested that scaling for the *z*-model should scale as in Eq. 5 with  $L_{\text{eff}} \sim \ell_{\text{sep}} \sim \ln(N)$ . His fit parameters (compare Fig. 5 of ref. [25]) used  $T_c = 1.87$  and fits of a=2 and b=1.887in plots of  $\chi/[\ln(N)]^a$  versus  $(T - T_c)[\ln(N)]^b$ . Our data for the same parameters are shown in Fig. 4(a). Note that the crossing of  $U_4$  with different system sizes actually gives a lower value for  $T_c$  (Table I). Using the best fit parameters *a* and *b* for data collapse scaling of our data for z=3 and the value of  $T_c$ from the  $U_4$  crossings gives the fit shown in Fig. 4(b). In neither case in Fig. 4 does the scaling look very good. Note that with the additional computer power available today, our system sizes and statistics are much greater than that of ref. [25].



FIG. 4: Scaling as in ref. [25] for the z=3 model, with the attempted scaling form of Eq. 5 with  $L_{eff}=\ln(N)$ . In (a) the parameters of ref. [25] are used:  $T_c=1.870$ , a=2.0, b=1.8868. In (b) the best-fit parameters for the scaling form are used, with  $T_c=1.821$  given by the crossing of the Binder cumulant and the fit parameters a=4.1 and b=3.58. (Color online.)

In summary, the *z*-model does not scale as was proposed in 1991 in ref. [25]. To ensure that these results were accurate, each author developed independently a code for the z=3 model using different random number generators. Both codes gave comparable results, leading to a belief that our Monte Carlo data are indeed correct for this model.

At and above the upper critical dimension, Brézin and Zinn-Justin in 1985 [26] predicted that the Ising model should scale such that for infinite system sizes the value of the Binder cumulant at  $T_c$  should be equal to  $U_{4,\infty}^{(mf)} \approx 0.2705$ . As expected, this value is different from the d=2 Ising result of  $U_{4,\infty}^{(d=2)} \approx 0.615$  [31]. Furthermore, Brézin and Zinn-Justin predicted that the mean-field systems should exhibit finite size scaling for small values of the reduced temperature *t* with

$$U_4(t) = f_U\left(tN^{\frac{1}{2}}\right) \tag{7}$$

and taking derivatives with respect to t gives

$$\frac{\partial U_4(t)}{\partial t} = N^{\frac{1}{2}} f'_U\left(tN^{\frac{1}{2}}\right). \tag{8}$$



FIG. 5: The Binder 4th-order cumulant  $U_4$  scaling for the *z*-model as given by Eq. 7 and 8. (a) z = 3 for various *N* values. (b)  $N=256^2$  for various *z* values. (c) for various *z* values  $\frac{dU_4}{dT}$  evaluated at the predicted value of  $U_{4,\infty}^{(\text{mf})}$ . (Color online.)

They also predicted for small t the finite-size scaling form

$$\chi T = N^{\frac{1}{2}} f_{\chi} \left( t N^{\frac{1}{2}} \right) . \tag{9}$$

Although not stated explicitly in their paper, their scaling form for the order parameter is

$$|M(t)| = N^{-\frac{1}{4}} f_M\left(tN^{\frac{1}{2}}\right) \tag{10}$$

for  $T < T_c$ . The predicted scaling for  $U_4$  and its derivative with respect to *t* works extremely nicely for all values of *z* from *z*=3 to our largest studied value *z*=8, as shown in Fig. 5. It

should be stressed that this scaling plot has *no adjustable parameters*, since the value for  $T_c$  is obtained by the crossings of  $U_4$  for various values of N. Similarly, The exact mean-field (mf) value for  $U_4$  for the infinite lattice [26] is shown as the horizontal lines. Fig. 6 shows the predicted scaling for various values of N and z from Eq. 9 for  $\chi T$  and from Eq. 10 for |M|, again with no adjustable parameters since  $T_c$  is taken from the crossings of  $U_4$ . Again the scaling is very good. The asymptotic slopes for small t and large N with large  $tN^{\frac{1}{2}}$  for |M| in Fig. 6(a) is  $\frac{1}{2}$ . This value can be seen since the scaling function gives

$$|M| = N^{-\frac{1}{4}} f_M\left(tN^{\frac{1}{2}}\right) \to N^{-\frac{1}{4}}\left(tN^{\frac{1}{2}}\right)^{\frac{1}{2}} = t^{\frac{1}{2}} = t^{\beta}$$
(11)

with the mean field value for this exponent is  $\beta = \frac{1}{2}$ . Similarly, since the mean field value of the susceptibility exponent is  $\gamma = 1$  the asymptotic slope in Fig. 6(b) should be -1. Most of the spread in the scaling in Fig. 6 is a vertical shift of the curves for various values of *z*. This may be due to one or more of several reasons. One possibility would be slight errors in the values of *T*<sub>c</sub>, perhaps caused by different convergence rates with different *z* to the infinite lattice values. Another possibility would be that the prefactor for |M| and  $\chi T$  at *T*<sub>c</sub> for finite *N* is slightly different. Our data at this point is not of a sufficient quality to decide among these possible alternatives. Nevertheless, the scaling predicted by Brézin and Zinn-Justin [26] is seen to hold.

# IV. RESULTS AND SCALING: SW-MODEL

This section presents results for scaling for the normal small-world model (SW-model). This has  $J_1=1$ ,  $J_3=0$ , and a non-zero positive value for  $J_2$ . Every spin has four nearestneighbor ferromagnetic interactions  $J_1$  due to the underlying square-lattice structure. We will study the case where every spin has one SW bond and hence z=5, and the case where every spin has two SW bonds and hence z=6. From the crossings of  $U_4$  for various values of N we obtain the values of the critical temperature listed in Table I. Fig. 7 shows that the anticipated form for the scaling of  $U_4$  from Eq. 7 and of the derivative of  $U_4$  with respect to t from Eq. 8 provides excellent data collapse scaling for various values of z and N and for both the studied values of  $J_2$ :  $J_2=1$  and  $J_2=4$ . The thickness of the region of data collapse seems to be more from the statistical properties of the data, or from small errors in  $T_c$ , than from a lack of scaling or of corrections to scaling. Fig. 8(a) shows the scaling predicted from Eq. 10 for the order parameter |M|, and Fig. 8(b) shows the data collapse scaling for  $\chi T$ from Eq. 9. In both cases the data collapse is very good for both values of  $J_2$ , for both z=5 and z=6, and for both system sizes shown of  $N=128^2$  and  $N=256^2$ . The scaling for smaller



FIG. 6: Scaling versus  $tN^{\frac{1}{2}}$  for the *z*-model for various values of *z* and  $N=128^2$  and  $256^2$ . (a) Magnetization:  $MN^{\frac{1}{4}}$ . (b) Susceptibility:  $\chi TN^{-\frac{1}{2}}$ . Both legends list symbols for data in both graphs. (Color online.)

system sizes demonstrates corrections to scaling, and consequently only our largest two system sizes are shown in these scaling figures. Again, it must be emphasized that since the value for  $T_c$  is taken from the crossings of  $U_4$  the curves in Fig. 7 and Fig. 8 have *no adjustable parameters*.

The underlying scaling behavior of the SW model with z=5 and z=6 is consistent with other studies of Ising models with SW interactions (usually starting from d=1) models [11–13, 15, 16, 18, 20, 22–24]. Consequently, these models have a critical behavior with mean-field critical exponents  $\gamma=1$ ,  $\beta=\frac{1}{2}$ ,  $\alpha=0$ , and  $\nu=\frac{1}{2}$  (but as in the comment to Ref. [13] with  $\bar{\nu}=2-\alpha=2$ ).

There is also a prediction [17] that in the  $N \rightarrow \infty$  limit the order parameter should scale for  $T < T_c$  as

$$|M| = \tilde{A}\sqrt{T_{\rm c} - T} \tag{12}$$

with the mean field amplitude  $\tilde{A} \propto p^{\frac{\beta_{d=2}-\beta_{mf}}{\gamma_{d=2}}}$  diverging as the strength of the SW couplings *p* approaches zero. In [17] it is argued that this behavior will also be seen as the number of SW bonds becomes small, *i.e.* when  $z=4+p\rightarrow4$  for our square-lattice model. We have simulated our square-lattice model for z=5 with weak  $J_2=0.01, 0.05, 0.1, 0.5$  for system sizes up to  $N=384^2$ . However, we were not able to obtain the



FIG. 7: The Binder 4th-order cumulant  $U_4$  scaling for the SW-model  $(J_1=1, J_3=0)$  for z=5 and z=6 for various N values and for both  $J_2=1$  and  $J_2=4$ . (a)  $U_4 = f_U(tN^{\frac{1}{2}})$  from Eq. 7 with  $N=128^2$  and  $N=256^2$ . The horizontal line the theoretical prediction for  $U_{4,\infty}^{(mf)}$  and (b)  $\frac{dU_4}{dT}$  evaluated at the predicted value of  $U_{4,\infty}^{(mf)}$  from Eq. 8. (Color online.)

predicted scaling. To see this scaling requires that the width of the mean field region, which is [17] within

$$|T_{\rm c} - T| \propto p^{\frac{1}{\gamma_{d=2}}} \propto |T_{\rm c} - \bar{T}_{{\rm c},d=2}|,$$
 (13)

be sufficiently probed by the system size that finite size effects are negligible. It would be interesting to have a prediction for how finite N would manifest itself in this scaling. Computer simulations for SW systems with varying strengths  $J_2$  have also recently been reported [20].

We have also investigated the case where the number of SW connections goes to zero as *N* increases. This study is motivated by physical small-world networks [22–24] where the number of short-cut bonds (which are SW bonds) cannot grow as fast as *N*. In [22, 23] it was shown that the properties of such systems for small *N* can nevertheless show some of the mean field properties of a full small-world system. Fig. 9 shows  $U_4$  for both the pure square-lattice Ising model (*z*=4) and the SW model with  $z=4+\frac{2}{\sqrt{N}}$ . For the SW model with  $z=4+\frac{2}{\sqrt{N}}$  as  $N\rightarrow\infty$  the pure square lattice results with  $T_c=T_{c,d=2}$  must be recovered. As seen in Fig. 9 even for



FIG. 8: The scaling versus  $tN^{\frac{1}{2}}$  for the for the SW-model for z=5 and z=6, for  $J_2=1$  and  $J_2=4$ , for N values of  $128^2$  and  $256^2$ . (a) Magnetization:  $MN^{\frac{1}{4}}$  from Eq. 10. (b) Susceptibility:  $\chi TN^{-\frac{1}{2}}$ . from Eq. 9. Both legends list symbols for data in both graphs. (Color online.)

256 SW bonds of strength  $J_2=4$  for  $N=256^2=65536$  spins the temperature value where  $U_4$  changes from about  $\frac{2}{3}$  to zero is shifted by about 5%. This indicates that even a vanishing fraction of SW bonds can have effects on the behavior of the system. This is demonstrated in the scaling of |M| in [23].

### V. RESULTS AND SCALING: PHYSICAL SW-MODEL

There are two ways to obtain physical SW networks [22–24] to study the effect of SW bonds that can be built from physical building blocks. These physical SW networks must satisfy certain constraints so that they can be built from physical building blocks. These building blocks may be atoms, beads necklaces [23], or ball-and-stick models of atoms. One way to obtain physical SW networks is to have a vanishing number of SW bonds (short-cuts) as *N* increases. This was discussed in the previous section. The second way to obtain a physical SW network is to build the SW bonds from the underlying building blocks. This was done in [22] starting from a d=1 chain. Each SW bond is then composed of a string of spins with ferromagnetic coupling constant  $J_3$ , with the number of spins along the chain equal to the Euclidean distance between the randomly chosen sites. In [23] it was shown that



FIG. 9: The Binder 4th-order cumulant  $U_4$  for the SW-model ( $J_1=1$ ,  $J_3=0$ ). This is both with no small-world interactions (pure squarelattice Ising model) ( $J_2=0$ ), and with *L* small-world interactions with  $J_2=4$  ( $z=4+\frac{2L}{N}$ ). The horizontal line is  $U_{4,\infty}^{(d=2)}$  for the d=2 Ising model (dashed). (a) shows  $U_4$  versus *T* and (b) shows the predicted scaling with the d=2 value of v=1. Both legends list symbols for data in both graphs. (Color online.)

the total number of spins in the d=1 case starting with  $N_0$  spins goes as  $N_{\text{tot}} \propto N_0^2$ . For a d=2 model on a  $L^2$  lattice the total number of spins needed for every initial spin to also have a SW bond is expected to be  $N_{\text{tot}} \propto L^3$ . This severely limits the system size that can be simulated. We studied only system sizes up to  $L^2=96^2=9216$  in this section, which corresponds to  $N_{tot}=185635$  total Ising spins.

Here we present results for the physical SW model with  $J_2=0$  and  $J_1=J_3=1$ . Fig. 10 shows  $U_4$  and the scaling of  $U_4$ . The SW bonds are built from linear chains of Ising spins. The linear Ising model does not have a finite temperature critical point. Consequently, one expects from renormalization group arguments that the critical exponents should be those of the d=2 Ising model. Furthermore, one expects that the critical temperature should be the same as for the square lattice Ising model,  $T_c = \frac{2J_1}{\ln(1+\sqrt{2})} \approx 2.269 J_1$ . Fig. 10(a) shows that indeed the SW bonds built from linear chains of spins do not significantly affect the behavior of the system. This is also evident in the scaling of  $U_4$  shown in Fig. 10(b). The scaling uses the d=2 Ising exponent v=1.



FIG. 10: The Binder 4th-order cumulant  $U_4$  for the physical-SWmodel  $(J_1=1, J_2=0, J_3=1)$  with  $\frac{N}{2}$  physical-small-world interactions. (a) Values of  $U_4$  versus T. The horizontal lines are the predicted values for  $U_{4,\infty}^{(mf)}$  for the mean-field model (solid) and of  $U_{4,\infty}^{(d=2)}$  for the d=2 Ising model (dashed). (b) The predicted scaling of  $U_4$  with the square-lattice Ising exponent v=1 and the square lattice Ising value (z=4) of  $T_c$ . Both legends list symbols for data in both graphs. (Color online.)

# VI. DISCUSSION AND CONCLUSIONS

The Ising ferromagnet on models starting from the square lattice Ising model has been studied. The first conclusion, which has also been reached by other researchers, is that the Ising model with 'normal' small world (SW) bonds exhibits mean field scaling [Fig. 7 and Fig. 8].

We have investigated in detail the *z*-model of ref. [25], and found that the scaling form for  $\chi T$  is given by Eq. 9 from

[26] [Fig. 6(b)] rather than Eq. 5 with  $L_{\text{eff}}=\ln(N)$  postulated in [25] [Fig. 4]. The scaling of ref. [26] [Eq. 7 through Eq. 10] also works without any adjustable parameters for the z-model for other quantities such as the Binder cumulant  $U_4$  [Fig. 5] and the order parameter |M| [Fig. 6(a)]. Scaling as predicted for  $N \rightarrow \infty$  predicted in ref. [17] for a low density or for weak SW bonds could not be seen in our data. This most likely is because the finite size effects for the N values we studied obscured the predicted scaling.

We have also investigated the Ising model on physical SW networks starting from an underlying  $N=L^2$  square lattice. The physical SW networks either have a number of SW bonds that vanish as  $N \rightarrow \infty$  (here  $z=4+\frac{2}{\sqrt{N}}$ ), or are constructed from a linear chain of spins with the number of spins along the chain equal to the Euclidean distance between the randomly chosen spins on the square lattice. The study here can be compared to physical SW studies in [22-24], as well as the study with power-law SW bond strengths [18]. The summary is twofold. First, physical SW bonds do not change the critical properties of the model as  $N \rightarrow \infty$ . Second, the physical SW bonds have some effect on the scaling properties. They lead to much slower approaches to the  $N \rightarrow \infty$  results. They also show a regime near the effective  $T_{c,N}$ , given by the temperature where for finite N the value of  $U_4$  quickly changes between  $\frac{2}{3}$  and zero, which shows some properties of mean field behavior. This is illustrated in [Fig. 9 and Fig. 10] and seen in [22, 23]. These type of SW connections have been used as models of liquid and amorphous selenium [33]. Consequently, the current study provides further evidence that physical (quasi-) SW nanomaterials may exhibit mean field properties in both their critical behavior and in their transport properties.

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