

Article

# Phase Transitions in Equilibrium and Non-Equilibrium Models on Some Topologies

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**Abstract:** On some regular and non-regular topologies, we studied the critical properties of models that present up-down symmetry, like the equilibrium Ising model and the nonequilibrium majority vote model. These are investigated on networks, like Apollonian (AN), Barabási–Albert (BA), small-worlds (SW), Voronoi–Delaunay (VD) and Erdős–Rényi (ER) random graphs. The review here is on phase transitions, critical points, exponents and universality classes that are compared to the results obtained for these models on regular square lattices (SL).

**Keywords:** nonequilibrium; phase transition; Monte Carlo simulations

## 1. Introduction

Some equilibrium and non-equilibrium models were studied on regularity and non-regularity with a scale-free (SF) and small-worlds (SW) networks [1–15] to understand the critical properties of these models on some networks.

According to the criterion of Grinstein *et al.* [16], non-equilibrium spin systems with two states ( $\pm 1$ ) on square lattices (SL) may present the same critical exponents of the Ising model (IM) on SL [3]. This criterion was confirmed in some non-equilibrium models [17–22] on regular lattices, such as the majority vote (MV) model with states ( $\pm 1$ ) [17]. This presents a continuous phase transition with critical exponents  $\beta$ ,  $\gamma$ ,  $\nu$ , similar to those of the IM [3] in agreement with the criterion of Grinstein *et al.* [16]. Lima *et al.* [6] have studied MV on Voronoi–Delaunay (VD) random lattices. There, the obtained exponents differ from those on SL, in disagreement with the criterion by Grinstein *et al.* [16].

For a decade, the IM has been investigated on *undirected* Apollonian networks (UAN) [23,24] and *directed* Barabási–Albert networks (DBA) [14,15], and it has been shown that, on these networks, the IM does not display a phase transition.

In this review, we discuss the Ising and MV model on normal (UBA, USW, undirected Erdős–Rényi (UER) and UAN), DBA, directed small-worlds (DSW) [10,25] and directed Erdős–Rényi (DER) graphs [26,27], undirected and directed Voronoi–Delaunay (UVD and DVD) random lattices [28,29] and directed Apollonian networks (DAN) [30]. Through Monte Carlo (MC) simulations, it was found that the MV model on these networks presents a continuous phase transition showing that the MV and the IM belong to different universality class, therefore contradicting the Grinstein criterion [16]. Here, we study the models mentioned above only through MC simulations. However, important analytical results may be found in [31–34].

## 2. Model

The MV model dynamics' evolution is as follows. Initially, we have a spin variable  $\sigma = \pm 1$  at each node or site of the network. At each MC time step, we try to spin flip a site. This is accepted with probability:

$$w_i(\sigma) = \frac{1}{2} \left[ 1 - (1 - 2q)\sigma_i S \left( \sum_{\delta=1}^{k_i} \sigma_{i+\delta} \right) \right], \tag{1}$$

$S(x)$  is a sign function with  $S(x) = \pm 1$  of  $x$  if  $x \neq 0$ ;  $S(x) = 0$  if  $x = 0$ . In the  $w_i$  probability, the sum runs over the number  $k_i$  of neighbors of the  $i$ -th spin. The control parameter  $0 \leq q \leq 1$  plays a role of the "social temperature", similar to the temperature in IM; the smaller the  $q$ , the greater is the probability of parallel aligning with the local majority.

To study the properties critical for the MV model, we define the variable  $m = \sum_{i=1}^N \sigma_i / N$ . Here, we are interested in the magnetization  $M$ , susceptibility  $\chi$  and the reduced fourth-order cumulant  $U_4$ :

$$M = \langle |m| \rangle_{av}, \tag{2}$$

$$\chi = N \left( \langle m^2 \rangle_{av} - \langle m \rangle_{av}^2 \right), \tag{3}$$

$$U_4 = 1 - \langle m^4 \rangle_{av} / 3 \langle m^2 \rangle_{av}^2, \tag{4}$$

where  $\langle \dots \rangle$  stands for a thermodynamics average. The results are averaged over the  $R$  (av) networks' independent realizations. These physical quantities are functions of  $q$  and obey the finite-size scaling relations (FSS):

$$M = N^{-\beta/\nu} f_m(t), \tag{5}$$

$$\chi = N^{\gamma/\nu} f_\chi(t), \tag{6}$$

$$\frac{dU}{dq} = N^{1/\nu} f_U(t), \tag{7}$$

where  $1/\nu$ ,  $\beta/\nu$  and  $\gamma/\nu$  are the critical exponents' ratios, and  $f_i(t)$  are the FSS functions with:

$$t = (q - q_c) N^{1/\nu}, \tag{8}$$

being the scaling variable. From this scaling relation, we obtained the exponents  $\beta/\nu$  and  $\gamma/\nu$ , respectively. Moreover, the value of  $q^*$  for which  $\chi$  has a maximum is expected to scale with the system size as:

$$q^* = q_c + b N^{-1/\nu}, \tag{9}$$

where  $b = 1$ . The relation Equations (7) and (9) may be used to obtain the exponent  $1/\nu$ . The MV model has also been studied in complex structures. Some of these structures will be described in the next section.

## 3. Lattices, Graphs and Networks

- UAN and DAN

The AN have  $N = 3 + (3^n - 1)/2$  nodes ( $N$ ), and  $n$  represents the generation number [23,24]. On these AN, we redirect a fraction  $p$  of the links. This procedure results in a *directed* network, keeping the outgoing node of the *redirected* link, but changing the incoming node. If  $p = 0$ , we have the standard AN, and for  $p = 1$ , we have random networks [7]. However, there is the reciprocity of the *redirected* link in the *undirected* case, *i.e.*, if Node  $A$  selects Node  $B$  as the incoming neighbor, then  $A$  is also an incoming neighbor of  $B$ .

- USW and DSW networks

The DSW networks in two dimensions, studied here, were generated from an SL [10] and the other irregular triangulation (Delaunay triangulation) [29]. The disorder introduced on these SW networks is the same used on AN networks.

- UBA and DBA networks

To generate the DBA networks [14], each new node added to the network selects, with connectivity  $z$ , already existing nodes as neighbors influencing it; the recently-added node does not influence these neighbors. In the case of the UBA networks [13], the recently-added node does influence these neighbors.

- UER and DER random graphs

The ER random graphs [7] are constructed by connecting pairs of randomly-selected nodes with a probability  $p = 2k/N(N - 1)$  with  $N$  nodes and  $k$  links (bonds). The connectivity of a node  $k_i = \sum_j l_{ij}$ , where  $l_{ij} = 1$  or  $0$ , is defined as the total number of links connected to it. These links can be *undirected* or *directed*, as well.

- UVD and DVD random lattices

The construction of the UVD random lattice [28] for a given set of points in the plane is given as follows. For each point, we first determine the polygonal cell consisting of the region of space nearer to that point than to any other point. Whenever two such cells share an edge, they are considered as neighbors. From the Voronoi diagram, we can obtain the dual lattice by the following procedure. When two cells are neighbors, one draws a link between the two points located in the center of each cell. From the links, one obtains the triangulation of space that is called the Delaunay triangulation. The Delaunay triangulation is dual to the Voronoi diagram, in the sense that points correspond to cells, links to edges and triangles to the vertices of the Voronoi tessellation. The DVD random lattices [29] are constructed in the same way as the DAN.

## 4. Results and Discussion

### 4.1. Apollonian Networks

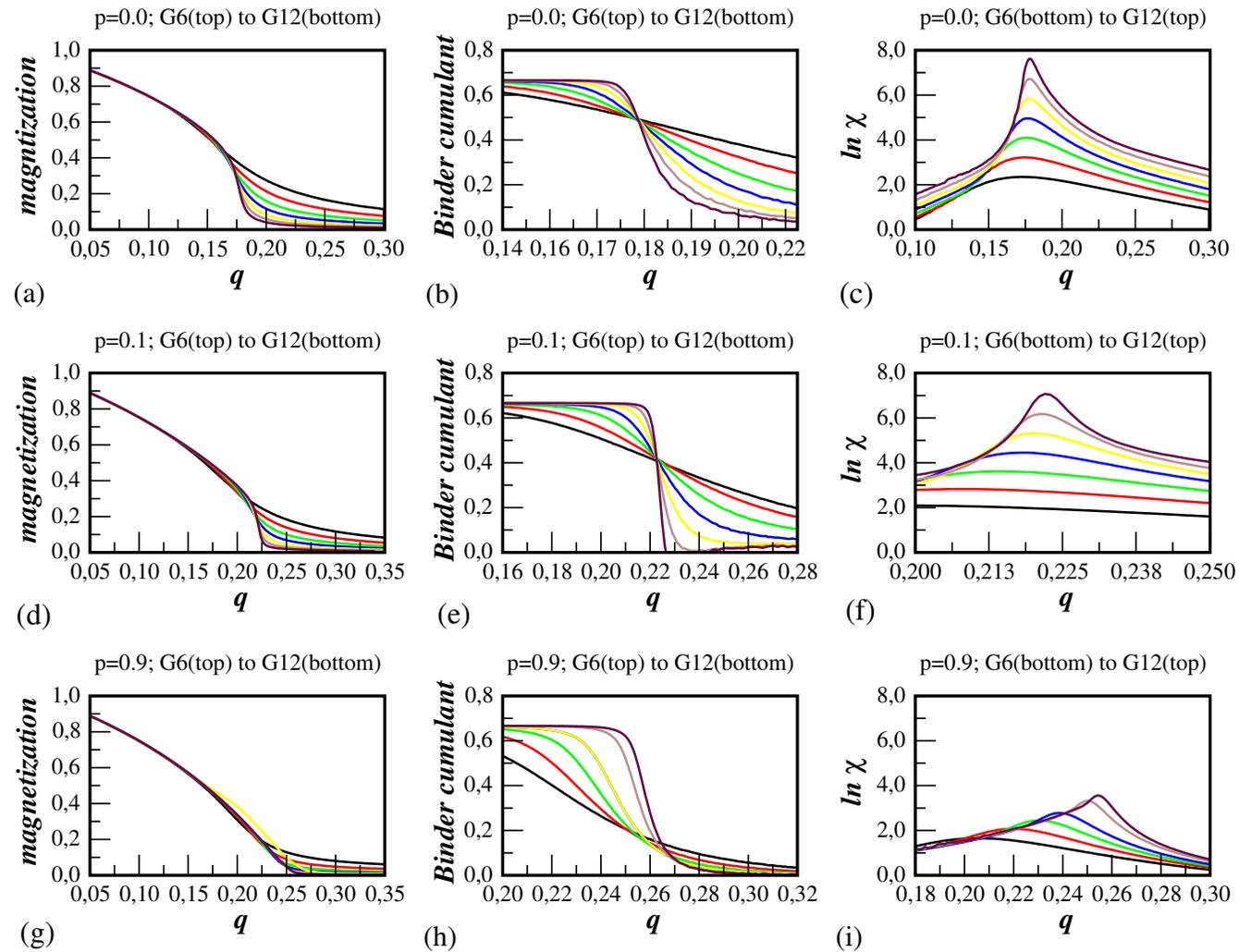
- The IM

Andrade *et al.* [23,24] studied the IM on the UAN. They obtained the thermodynamic and magnetic properties, but they found no evidence of a phase transition on UAN for the IM.

- The MV model

The MV model was studied on triangular AN networks by Lima *et al.* [30]. We found a continuous phase transition. The effect of the reconnection of the links of the network with a probability  $p$  were also studied. Through MC simulations, the exponents' ratios  $\gamma/\nu$ ,  $\beta/\nu$  and  $1/\nu$  were obtained for values of reconnection probability  $p = 0.0, 0.1, 0.2, 0.3, 0.4, 0.5, 0.6, 0.7, 0.8$  and  $0.9$ . The critical noise  $q_c$  and  $U^*$  were also determined. Here, the effective dimensionality of the system was observed to be independent of  $p$ , and its value  $D_{\text{eff}} = 2\beta/\nu + \gamma/\nu \approx 1.0$  is observed for these networks.

Figure 1 displays the magnetization  $M$ , Binder's cumulant  $U_4$  and susceptibility *vs.*  $q$ , obtained from MC simulations on AN for  $N = 367, 1096, 3283, 9844, 29,527, 88,576$  and  $265,723$  sites and for  $g_n$  generation ( $n = 6, 7, 8, 9, 10, 11$  and  $12$ ). The shape of the quantities' curves suggests the existence of the continuous phase transition in these networks. The values of  $q_c$  is estimated as the point where the curves for different system sizes  $N$  intercept each other [35]. In Table 1, we summarize the values of  $q_c$  from  $p = 0.0$  to  $0.9$ .

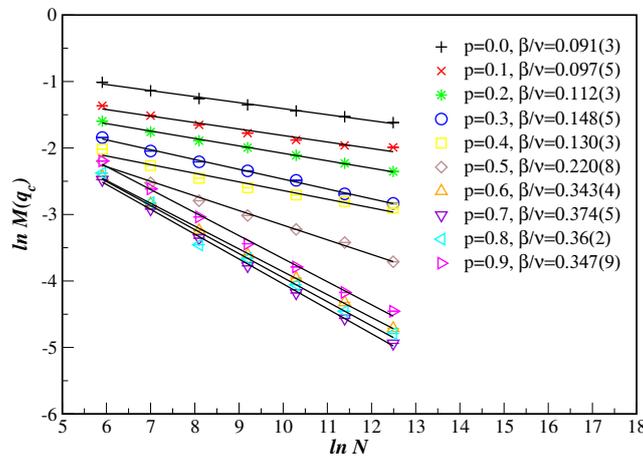


**Figure 1.** The magnetization  $M$  (a, d, g), Binder's cumulant  $U_4$  (b, e, h) and susceptibility (c, f, i) vs. noise parameter  $q$  for  $N = 367, 1096, 3283, 9844, 29,527, 88,576$  and 265,723 sites and for  $g_n$  generations ( $n = 6, 7, 8, 9, 10, 11$  and 12) on an Apollonian (AN) network. We use reconnection probability from  $p = 0.0$  (undirected AN (UAN)) (a, b, c),  $p = 0.1$  (d, e, f) and  $p = 0.9$  (directed AN (DAN)) (g, h, i).

**Table 1.** The critical noise parameter  $q_c$  and the critical exponents, for AN with reconnection probability  $p$  [30]. Error bars are statistical only.

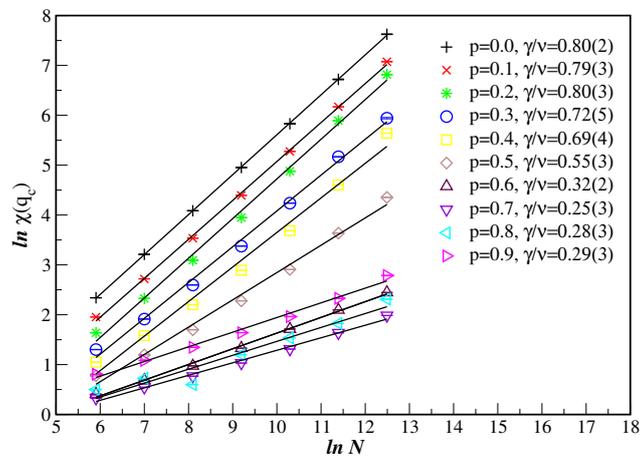
$p$	$q_c$	$1/\nu$	$\beta/\nu$	$\gamma/\nu$	$D_{\text{eff}}$
0.0	0.178(3)	0.53(4)	0.091(3)	0.80(2)	0.98(3)
0.1	0.223(5)	0.48(2)	0.097(5)	0.79(3)	0.98(3)
0.2	0.249(3)	0.66(3)	0.112(3)	0.80(3)	1.02(2)
0.3	0.271(5)	0.61(8)	0.148(5)	0.72(5)	1.02(3)
0.4	0.284(5)	0.71(7)	0.130(3)	0.69(4)	0.95(6)
0.5	0.296(4)	0.44(5)	0.220(8)	0.55(3)	0.99(5)
0.6	0.313(3)	0.23(3)	0.343(4)	0.32(2)	1.01(3)
0.7	0.311(5)	0.21(5)	0.374(5)	0.25(3)	1.01(4)
0.8	0.290(5)	0.27(3)	0.36(2)	0.28(3)	1.00(2)
0.9	0.2629(3)	0.29(6)	0.347(9)	0.29(2)	0.98(5)

In Figure 2, we plot the magnetization  $M^* = M(q_c)$  vs.  $N$ . The fits of the curves correspond to the exponents' ratio  $\beta/\nu$  according to relation Equation (5); see Table 1.



**Figure 2.** Plot of the  $\ln M(q_c)$  vs.  $\ln N$  for  $p$ -values from  $p = 0.0$  to  $0.9$ .

In Figure 3, we plot the susceptibility  $\chi(N)$  at  $q = q_c$  vs.  $N$  for AN obtained from the relation Equation (6). The exponents' ratio  $\gamma/\nu$  is obtained from the slopes of the straight lines for several values of the reconnection probability from  $p = 0.0$  to  $0.9$ .



**Figure 3.** Plot of  $\ln \chi(N)$  vs.  $\ln N$  for some values of the reconnection probability from  $p = 0.0$  to  $0.9$ .

In Figure 4, we used the scaling relation Equation (9) and obtain the exponents' ratio  $1/\nu$ . The estimated values of the exponents  $1/\nu$  are in Table 1. The results obtained by Andrade *et al.* [23,24] on the IM in UAN have shown no phase transition existence. However, the results presented for the MV model on UAN demonstrate that this belongs to a different universality class than the IM on UAN; see Table 1.

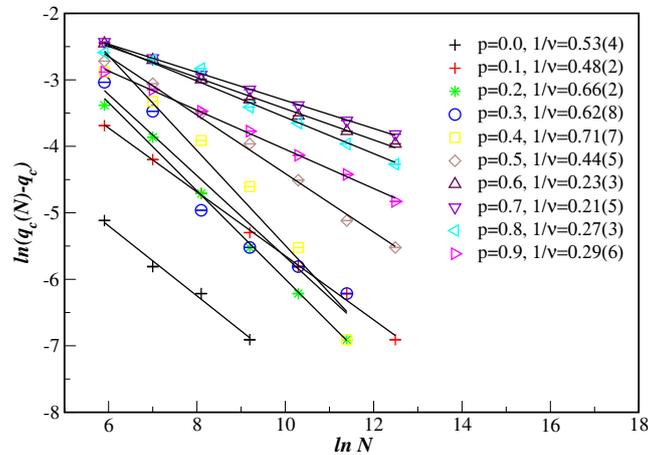


Figure 4. The exponents  $1/\nu$  obtained from the relation Equation (9) for AN.

#### 4.2. ER Random Graphs

- The IM

The IM was studied on independent ER graphs and different connectivities through MC simulations [26]. This model exhibits a phase transition-like mean-field, and the critical exponents on both DER and UER graphs are identical to the mean-field.

- The MV model

Through MC Simulation, the MV model was studied with noise on UER and DER random graphs [27,36]. Unlike IM, it presents a continuous phase transition on both DER and UER random graphs. The points  $q_c$  and critical exponents' ratios  $\beta/\nu$ ,  $\gamma/\nu$  and  $1/\nu$  as a function of the connectivity  $z$  of the random graphs have been obtained; see Table 2.

Table 2. The noise  $q_c$  and the critical exponents, for directed Erdős–Rényi (DER) random graphs with connectivity  $z$  [27].

$z$	$q_c$	$\beta/\nu$	$\gamma/\nu^{q_c}$	$\gamma/\nu^{q_c(N)}$	$1/\nu$	$D_{\text{eff}}$
4	0.175(4)	0.230(5)	0.530(6)	0.516(2)	0.545(26)	0.990(7)
6	0.238(3)	0.243(4)	0.509(4)	0.511(2)	0.488(16)	0.995(5)
8	0.274(3)	0.238(4)	0.512(4)	0.504(2)	0.548(14)	0.988(5)
10	0.299(2)	0.268(4)	0.473(5)	0.495(1)	0.487(10)	1.009(6)
20	0.359(2)	0.280(4)	0.451(4)	0.485(2)	0.510(10)	1.011(5)
50	0.412(2)	0.282(3)	0.441(2)	0.466(5)	0.484(11)	1.005(3)
100	0.438(2)	0.286(2)	0.428(3)	0.440(8)	0.520(19)	1.000(3)

#### 4.3. BA Networks

- The IM

The IM on UBA was first studied by Aleksiejuk *et al.* [13]. Through MC simulations [13], they showed that the critical temperature increases logarithmically with increasing system size  $N$ . Later, Sumour *et al.* [14,15] studied the IM on a DBA network. Unlike the results found by

Aleksiejuk *et al.* [13], they showed that the IM on a DBA network does not present a phase transition.

- The MV model

The MV model was studied on DBA and UBA through MC simulations by Lima [21]. Their results obtained on DBA for the MV model show a clear transition continuous phase for values of  $q_c$  dependent on  $z$  neighbors; see Tables 3 and 4.

**Table 3.** The connectivity  $z$ , critical noise parameter  $q_c$ , the critical exponents ratio, and the effective  $D_{\text{eff}}$  for directed Barabási–Albert (DBA) networks [21].

$z$	$q_c$	$\beta/\nu$	$\gamma/\nu^{q_c}$	$\gamma/\nu^{q_c(N)}$	$D_{\text{eff}}$
2	0.434(3)	0.477(2)	0.897(12)	0.895(10)	1.018(9)
3	0.431(4)	0.444(1)	0.905(15)	0.904(12)	0.999(2)
4	0.431(3)	0.447(1)	0.889(3)	0.888(9)	0.998(3)
6	0.438(2)	0.435(2)	0.863(5)	0.861(3)	1.008(6)
8	0.444(5)	0.431(1)	0.860(7)	0.851(5)	1.000(2)
10	0.446(3)	0.421(2)	0.831(5)	0.834(7)	1.000(5)
20	0.458(4)	0.412(1)	0.793(13)	0.795(11)	1.002(2)
50	0.467(2)	0.375(4)	0.715(11)	0.735(17)	0.999(11)
100	0.474(3)	0.363(4)	0.654(13)	0.674(23)	0.999(9)

**Table 4.** The connectivity  $z$ , critical noise parameter  $q_c$ , the critical exponents ratio and the effective  $D_{\text{eff}}$  for UBA networks [37].

$z$	$q_c$	$\beta/\nu$	$\gamma/\nu^{q_c}$	$\gamma/\nu^{q_c(N)}$	$1/\nu$	$D_{\text{eff}}$
2	0.167(3)	0.036(8)	0.828(6)	0.805(11)	0.76(3)	0.90(1)
3	0.259(2)	0.133(21)	0.713(18)	0.655(31)	0.83(7)	0.979(27)
4	0.306(3)	0.231(22)	0.537(8)	0.519(17)	0.43(2)	0.999(23)
6	0.355(2)	0.283(8)	0.445(15)	0.423(3)	0.35(5)	1.011(17)
8	0.380(6)	0.323(2)	0.358(7)	0.405(6)	0.39(5)	1.004(7)
10	0.396(3)	0.338(2)	0.324(2)	0.380(3)	0.324(5)	1.000(2)
20	0.428(2)	0.334(2)	0.305(2)	0.350(2)	0.307(5)	0.993(2)
50	0.456(3)	0.366(2)	0.255(2)	0.341(3)	0.30(1)	0.987(2)
100	0.471(3)	0.373(2)	0.218(5)	0.330(3)	0.308(3)	0.964(5)

#### 4.4. SW Networks

- The IM

The one-dimensional IM was studied, via MC simulations, on SW networks by Jeong *et al.* [38]. Their results are different from [39–44]. Their critical exponents are smaller than the exponents of the IM at two dimensions. However, for two- and three-dimensional models [45,46] by MC simulations, it has been verified that the phase transition presents a mean-field behavior [47].

- The MV model

Through MC simulations, Luz and Lima [25] studied the MV model with noise  $q$  on DSW networks, please see the Fortran program for the majority vote on small-world networks (2D) in Appendix. They calculated the critical noise parameter  $q_c$  for reconnection probability  $p = 0.1, 0.3, 0.5, 0.8$  and  $1.0$  of the DSW networks. Table 5 shows the reconnection probability,  $q_c$ , the exponents' ratio  $\beta/\nu$ ,  $\gamma/\nu$  and  $1/\nu$  for the DSW network. The results obtained show that the critical exponents of the MV model belong to different universality classes from Oliveira [17] on SL, of Pereira *et al.* [48] for UER random graphs, Lima [49] and Campos *et al.* [36] on USW networks.

**Table 5.** The critical noise parameter  $q_c$ , the critical exponents ratio and probability  $p$  for directed small-worlds (DSW) networks [25].

$p$	$q_c$	$\beta/\nu$	$\gamma/\nu^{q_c}$	$\gamma/\nu^{q_c(L)}$	$1/\nu$
0.1	0.122(3)	0.423(17)	1.178(13)	1.214(39)	0.837(223)
0.3	0.149(3)	0.419(21)	1.148(5)	1.152(28)	1.059(208)
0.5	0.160(2)	0.441(12)	1.116(5)	1.120(25)	1.010(52)
0.8	0.164(2)	0.436(9)	1.149(5)	1.117(23)	1.248(158)
1.0	0.165(2)	0.415(18)	1.139(8)	1.122(25)	1.032(81)

#### 4.5. VD Random Lattices

- The IM

The IM has been studied, via MC simulations, on UVD random lattices by Espriu *et al.* [50] using the local update algorithms, like Metropolis. Their results showed evidence that IM on UVD random lattices has the same critical behavior of the IM on SL. Posteriorly, Janke *et al* [28,51], using a global MC update algorithm [52], reweighting techniques [53] and finite size scaling analysis, studied the IM on UVD random lattices. Their results were similar to those found by Espriu *et al.* [50], showing that the IM on UVD random lattices belongs to the universality same class of the IM on SL. Thereafter, Lima *et al.* [54] have also studied this model with an exchange coupling  $J(r) = J_0 e^{-\alpha r}$  that varies with the distance  $r$  between the first neighbors for  $\alpha \geq 0$  and  $J_0 = 1$ . Their results showed that this random system also falls in the same universality class as the IM on SL.

The IM on a *directed* small-world Voronoi–Delaunay (DSWVD) network was also studied by Sousa and Lima [29]. These results show a strong indication that the IM on DSWVD random lattices is in a different universality class than the model on an SL. The exponents obtained are independent of  $p$  ( $0 < p < 1$ ) and different from the IM on SL; see Table 6.

**Table 6.** The critical exponents, for spin 1/2 on a small-world Voronoi–Delaunay (DSWVD) random lattice with probability  $p$  [29]. The  $\gamma/\nu^{max}$  are the results from the maximum of the magnetic susceptibility.

$p$	$\beta/\nu$	$\gamma/\nu$	$\gamma/\nu^{max}$	$1/\nu$
0.1	0.489(8)	1.003(11)	1.001(13)	1.036(49)
0.2	0.538(68)	1.016(11)	1.016(5)	1.098(82)
0.3	0.463(4)	0.924(98)	1.012(3)	1.009(49)
0.4	0.491(9)	1.017(14)	1.012(8)	0.886(8)
0.5	0.494(10)	0.998(18)	1.005(66)	0.987(64)
0.6	0.486(10)	1.042(13)	1.004(7)	0.927(92)
0.7	0.486(10)	1.016(13)	1.003(10)	1.107(60)
0.8	0.493(16)	1.018(23)	1.021(7)	0.972(57)
0.9	0.471(12)	1.038(16)	0.991(69)	1.032(66)

- The MV model

Lima *et al.* [6] studied the MV model on VD random lattices. These present a quenched disorder in their links. They investigated whether only this type of disorder is relevant to obtain critical exponents different from those found for the MV model on SL that have the same exponents of the IM on SL. They found the critical exponents' ratios  $1/\nu=0.99(8)$ ,  $\beta/\nu = 0.112(4)$  and  $\gamma/\nu = 1.51(04)$ . Therefore, they showed that critical exponents' ratios  $\beta/\nu$  and  $\gamma/\nu$  are different from the exact values of the IM and MV model on SL.

## 5. Conclusions

We presented results for the equilibrium Ising and non-equilibrium MV models on AN, BA and SW networks, ER random graphs and the VD random lattice. On these networks, the non-equilibrium MV model shows a continuous phase transition. On the other hand, the IM does not have a phase transition on UAN and DBA networks [14,15,23,24]. Therefore, these results demonstrate that the MV model on UBA, DBA, UAN, DAN, DSW, UER, DER and DSWVD networks belongs to different universality classes, in disagreement with the criterion of Grinstein *et al.* [16]. A possible explanation for this different behavior may be attributed to the behavior of the critical points of these models,  $q$  and  $T$ . In the IM, the flip probability of a spin (highly connected) against your neighborhood is smaller than for a less connected spin. Therefore, in the IM, the variation of energy is higher for a more connected spin. However, in the MV model, the flip probability of a spin against your neighborhood is always given by  $q$ , and it does not depend on the neighborhood of this spin. Interestingly, the effective dimensionality of the MV on DAN, UAN, UBA, DBA, UER and DER networks, defined as  $D_{\text{eff}} = 2\beta/\nu + \gamma/\nu$ , is always a value close to 1.0, independent of the reconnection probability  $p$ , as seen in Tables 1–4.

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**Conflicts of Interest:** The authors declare no conflict of interest.

## Appendix: MV Fortran Program for DSW Starting from a Square Lattice

This is the Fortran program for the majority vote on small-world networks (2D) (11/02/2011).

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Majority-vote on small-world Stauffer Way 11/02/2011 (2D)
parameter(idim=2,L=6,L2=L**idim,Lmax = L2+2*(L**(idim-1)))
parameter(k=2*idim,nsamp=4, itmax=1200, p=0.1 )
character*40 FILE1,FILE2,FILE3
real*8 ex,dt,T,beta,factor
integer*8 ibm,ip,iex(-1:+1,-k:+k)
byte is
dimension is(Lmax), neighb(Lmax,10)
ip=2147483648.0d0*(2.d0*p-1)*2147483648.0d0
factor=(0.25d0/2147483648.0d0)/2147483648.0d0
iseed=1
ibm=2*iseed-1
anorma=dfloat(L2)
T=0.60d0
c
c  boundary contourn
c
Lp1=L**(idim-1)+1
L2pL=L**(idim)+L**(idim-1)
do i=Lp1,L2pL
neighb(i,1)=i-1
neighb(i,2)=i+1
neighb(i,3)=i-L
neighb(i,4)=i+L
enddo
do i=1,L

```

```

do j=1,k
  ibm=ibm*16807
  if(ibm.Lt.ip)then
  40 ibm=ibm*16807
  new=1.0+(0.5+factor*ibm)*L2
  if(new.gt.L2.or.new.le.0) goto 40
  neighb(i,j)=new
  do k0=1,k
  if(neighb(new,k0).eq.i)neighb(new,k0)=neighb(i,j)
  enddo
  endif
  enddo
  enddo
  enddo
  mcstep=50000
  itrelax=25000
  dt=0.002D0
  do 3 it=1,itmax
  beta=1.d0/t
  dq=tanh(beta)
c
c  probability table
c
  do i=-1,1
  do j=-k,k
  ie=j*i
  isgn=0
  if(ie.gt.0) isgn=+1
  if(ie.lt.0) isgn=-1
  ex=0.5d0*(1.d0 - dq*isgn)
  iex(i,j)=2147483648.0d0*(4*ex-2)*2147483648.0d0
  enddo
  enddo
  dt=0.002D0
  if(t.gt.1.64.and.t.lt.2.1)then
  dt=0.001
  mcstep=300000
  itrelax=100000
  endif
c
c  Initial configuration is(i)=1
c
  do 5 i=Lp1,L2pL
5  is(i)=1
  do 6 j=1,L**(idim-1)
  is(j)=is(j+L2)
6  is(j+L2pL)=is(j+L**(idim-1))
  icount=0
  do 1 mc=1, mcstep
  do 3 i=Lp1,L2pL
  isi=is(i)

```

```

    ibm=ibm*16807
    ie=0
    do 4 j=1,k
4   ie=ie+is(neighb(i,j))
3   if(iex(isi,ie).gt.ibm) is(i)=-isi
    do 7 j=1,L**(idim-1)
    is(j)=is(j+L2)
7   is(j+L2pL)=is(j+L**(idim-1))
    if(mc.GT.itrelax)then
    icount=icount+1
    mag=0
    do i=1,L2
    mag=mag+is(i)
    enddo
    endif
1   continue
    t=t+dt
3   continue
    stop
    end

```

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