Diffusion-driven self-assembly of rodlike particles: Monte Carlo simulation on a square lattice

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(Received 6 February 2017; published 18 May 2017)

The diffusion-driven self-assembly of rodlike particles was studied by means of Monte Carlo simulation. The rods were represented as linear k-mers (i.e., particles occupying k adjacent sites). In the initial state, they were deposited onto a two-dimensional square lattice of size $L \times L$ up to the jamming concentration using a random sequential adsorption algorithm. The size of the lattice, L, was varied from 128 to 2048, and periodic boundary conditions were applied along both x and y axes, while the length of the k-mers (determining the aspect ratio) was varied from 2 to 12. The k-mers oriented along the x and y directions (k_x -mers and k_y -mers, respectively) were deposited equiprobably. In the course of the simulation, the numbers of intraspecific and interspecific contacts between the same sort and between different sorts of k-mers, respectively, were calculated. Both the shift ratio of the actual number of shifts along the longitudinal or transverse axes of the k-mers and the electrical conductivity of the system were also examined. For the initial random configuration, quite different self-organization behavior was observed for short and long k-mers. For long k-mers ($k \ge 6$), three main stages of diffusion-driven spatial segregation (self-assembly) were identified: the initial stage, reflecting destruction of the jamming state; the intermediate stage, reflecting continuous cluster coarsening and labyrinth pattern formation; and the final stage, reflecting the formation of diagonal stripe domains. Additional examination of two artificially constructed initial configurations showed that this pattern of diagonal stripe domains is an attractor, i.e., any spatial distribution of k-mers tends to transform into diagonal stripes. Nevertheless, the time for relaxation to the steady state essentially increases as the lattice size growth.

DOI: 10.1103/PhysRevE.95.052130

I. INTRODUCTION

Phase behavior and self-assembly in systems of elongated particles have attracted a great deal of attention for many years. Onsager developed a density expansion theory and showed that the excluded volume effect can produce a nematic-isotropic (NI) transition in such systems [1]. The density of the NI transition for systems of rigid ellipsoids and cylinders has been estimated [2]. A lattice model of holes and long rigid rods with a length-to-width ratio (aspect ratio) k = 100 has been analyzed [3]. Theory predicts that, below a certain concentration of holes, NI transition can occur. Similar behavior has also been observed for a system of noninteracting rods and holes for a simple cubic lattice [4]. The transition predicted by Onsager's theory has been confirmed using a cluster expansion approximation for three-dimensional (3D) systems of rods oriented in three mutually perpendicular directions [5]. The seven virial coefficients of the expansion of the free energy in powers of density were calculated, and it was shown that the system exhibits a van der Waals-like loop associated with the disorientation transition.

Scaled particle approaches have been tested against a fluid of rods with different aspect ratios k [6–8]. Monte Carlo (MC) simulations have predicted isotropic, nematic, smectic-A, and solid phases for the 3D systems with $k \ge 4$ [9,10]. A direct transition from the isotropic to the smectic-A phase for a system with k = 3.2 has been observed [10]. The critical density of the NI transition has been found to be inversely proportional to the aspect ratio k of the rods [2,11]. A statistical theory for describing the packing properties and phase behavior of a granular material composed of elongated grains has also been developed [12]. The theory predicts that the systems need not necessarily undergo a discontinuous first-order phase transition (even at minimum close-packing). A kinetic approach has been applied to study the dynamic ordering of rods [13]. At steady state, the nematic ordering was only observed at low diffusivities, whereas at large diffusivities, the system was disordered.

In two-dimensional (2D) systems, similar self-assembly and NI transition in systems of rodlike particles have been predicted. The reduction in spatial dimensionality from 3D to 2D influences the nature of the ordered phases. For example, a perfect long-range order for 3D systems is realized, whereas a quasi-long-range order with algebraic decay of the order-parameter correlation function is realized for 2D systems [14,15]. The existence of liquid crystalline order in

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2D systems has been discussed [16]. Note that the Mermin-Wagner-Berezinskii theorem forbids a long-range order in 2D systems with continuous symmetry; however, such an order may be possible for systems with the hard-core interactions between the particles [17].

By means of MC simulation, a 2D system of hard ellipses with the aspect ratio k = 6 has been studied [18]. The system exhibited two first-order phase transitions: a solid-nematic one (at high density) and an NI one (at a density 1.5 times smaller). These transitions were attributed to geometrical factors. The density-functional approximation has been used to study the phase behavior of hard ellipses in 2D [19]. A continuous NI transition was observed for the ellipses, whereas there was a first-order transition for the ellipsoids. No evidence for a firstorder NI transition was found using MC simulation of hard rods [14]. The nematic phase demonstrated algebraic order (quasi-long-range order) and the occurrence of a disclinationunbinding transition of the Kosterlitz-Thouless (KT) type has been suggested. MC simulations for hard ellipses with aspect ratios k = 2, 4, and 6 have been reported [20]. The NI transition was only observed for k > 2, while the transition was firstorder for k = 4 and continuous (via disclination unbinding) for k = 6. MC simulations of the gravitational pouring of elliptical particles with different aspect ratios k ($k \in [1,8]$) in 2D have been studied [21,22]. For $k \ge 2$, "amorphous" packings with no translational order were observed. However, the ellipses formed the packings with long-range orientational order and the ordering growing with increasing k. These states were named as the "nematic glasses."

Mean-field model predicts nematic, columnar, and crystalline order in dense systems of parallel hard rods in 2D systems [10]. Scaled particle theory has been applied to 2D fluids of ellipses and rectangles [23]. Theory predicts the presence of an isotropic-nematic transition that is strongly dependent on the details of particle geometry. A density-functional theory for the NI transition in a 2D system of rods has been developed [17]. The theory predicts the continuous (second order) NI transition of self-assembled rods in 2D systems.

MC simulations have been applied to study the phase behavior of continuous 2D fluid systems with spherocylinders (tapered cylinders) [15]. At high density for long rods with high aspect ratios $k \gtrsim 7$, a 2D nematic phase of the KT type occurs. Shorter rods exhibit a melting transition to an isotropically arranged phase dominated by chains of particles that align side-by-side.

The formation of piles in the 2D packing of acrylic rods (≈ 12) constrained between two Plexiglas sheets has been studied both experimentally and in MC simulations [24]. Orientational correlations with nematic ordering extending over two particle lengths were observed.

The different experimental studies for 2D systems of vertically vibrated rod-shaped particles have been extensively discussed [25]. For example, various shapes (cylinders with cut tips, tapered tips, and rice-like particles) with aspect ratios k ranging from 4 to 12.6 were experimentally tested [26]. The strictly cylindrical particles did not form ordered phases (smectic and nematic). Irrespective of the aspect ratio, a strong fourfold (tetratic) orientational order was always observed. Stacks with similarly oriented cylinders were formed in the tetratic arrangement. The range of tetratic order was

shorter (when the distance was scaled by cylinder length) for long cylinders. In a similar study, stainless steel rods with aspect ratios of k = 20,40, and 60 confined to 2D containers have been analyzed [27,28]. At high density, the distinct patterns reflected competition between bulk nematic and boundary alignments. In a container of circular geometry, this competition produced bipolar configuration with two diametrically opposed point defects. As density increased, the patterning shifted from bipolar to a uniform alignment [28]. The presence of large-scale collective swirl motions has been revealed in monolayers of vibrated granular rods (different rice species, mustard seeds, and stainless steel rods with aspect ratios from ≈ 1 to ≈ 8) [29]. It was speculated that the very strong sensitivity of swirling to the shape of the particles can be related to the formation of the tetratic structures.

In recent decades, much attention has been paid to the study of self-assembly in systems of linear k-mers (particles occupying k adjacent adsorption sites) deposited on 2D lattices. A linear k-mer represents the simplest model of an elongated particle with an aspect ratio of k. Computer simulations have been extensively applied to investigate percolation and jamming phenomena for the random sequential absorption (RSA) of k-mers [30–38]. Various anomalies in the properties of the systems' dependence on the length of the k-mers have been reported. For example, the jamming concentration decreases monotonically when approaching the asymptotic value of $p_i = 0.66 \pm 0.01$ at large values of k. The percolation threshold p_c is a nonmonotonic function of the length k, with a minimum at a particular length of the k-mers ($k \approx 13$) and, presumably, percolation is impossible for very long k-mers $(k \gtrsim 10^4)$ [35].

The irreversible RSA process leads to a nonequilibrium state of the system, and further self-organization in the deposited film is possible, owing to deposition-evaporation processes or the diffusion motion of the k-mers. Several problems related to such types of self-assembly of k-mers have previously been discussed [39–45]. Dynamic MC simulations using a deposition-evaporation algorithm for simulation of the dynamic equilibrium of k-mers on square lattices have been applied [39]. For long k-mers $(k \ge 7)$, two entropy-driven transitions as a function of density, p, were revealed: first, from a low-density isotropic phase to a nematic phase with an intermediate density at p_{in} , and second, from the nematic phase to a high-density disordered phase at p_{nd} . A lattice-gas model approach has been applied to study the phase diagram of selfassembled k-mers on square lattices [40]. It has been observed that the irreversible RSA process leads to an intermediate state with purely local orientational order and, in the equilibrium model, the nematic order can be stabilized for sufficiently long k-mers [44]. For example, for k = 7, $p_{in} \approx 0.729$ [44] and $p_{\rm nd} \approx 0.917$ [43].

On a square lattice, in the course of diffusion, the horizontal and vertical stacks of k-mers separated from one another and a characteristic coarsening was observed [45]. Such self-assembly of k-mers can significantly affect the properties of the films. The properties of electrically conductive films filled with elongated particles (e.g., carbon nanotubes) are of particular interest in the production of electrodes for super-capacitors, thin film transistors, and fuel cells [46,47]. Nevertheless, in spite of great interest in the problem, the impact of diffusion-driven self-assembly on the percolation and electrical conductivity of such films has never previously been discussed in the literature.

This paper analyzes the processes of diffusion-driven selfassembly of linear k-mers on a square lattice by means of kinetic MC simulation. The initial state was produced using RSA with isotropic orientations of the k-mers, after which the k-mers underwent translation diffusion. The kinetics of the changes of structure and electrical conductivity in different directions were analyzed.

The rest of the paper is constructed as follows. In Sec. II, the technical details of the simulations are described, all necessary quantities are defined, and some test results are given. Section III presents our principal findings. Section IV summarizes the main results.

II. COMPUTATIONAL MODEL

In the kinetic MC simulation, the RSA model was used to produce an initial homogeneous and isotropic distribution of linear *k*-mers (i.e., particles occupying *k* adjacent sites) in a 2D film [48]. The rodlike particles were deposited randomly and sequentially, and their overlapping with previously placed particles was forbidden.

The problem was approached using a square lattice of size $L \times L$. In the present work, almost all calculations were performed using L = 256. In some cases, scaling analysis for lattices of sizes up to L = 2048 was performed. Periodic boundary conditions were applied along both the *x* and *y* axes. The length of the *k*-mers (aspect ratio) was varied from 2 to 12. Isotropic orientation of the *k*-mers was assumed; i.e., *k*-mers oriented along the *x* and *y* directions (k_x -mers and k_y -mers, respectively) were equiprobably in their deposition.

For a random initial configuration (r configuration), the k_x -mers and k_y -mers were randomly deposited over the entire lattice. In some cases, we divided the lattice in two areas of a specific shapes. The initial states were generated by deposition of only k_x -mers inside one of these areas and only k_y -mers inside the other area. The areas were either (a) two stripes oriented in the vertical direction (v configuration) or (b) diagonal stripes (d configuration).

The concentration of the particles corresponded to the jamming state, p_j . In this state, no additional *k*-mer can be placed because the presented voids are too small or of inappropriate shape. Note that initial RSA jammed state is nonequilibrium and nonergodic. The values of p_j for different values of *k* have recently been calculated at the thermodynamic limit $(L \rightarrow \infty)$ [49], while our estimations of p_j for a particular lattice size L = 256 have also recently been presented in Ref. [45]. The total number of *k*-mers at the jamming state, N_k , was equal to $p_j L^2/k$.

The diffusion of k-mers was simulated using the kinetic MC procedure (see the Appendix). For fairly dense systems in the jamming state, rotational diffusion is impeded, especially for large values of k. This is the reason why only translational diffusion was taken into consideration in our simulation.

At each step, an arbitrary k-mer was randomly chosen. Then, a random order of four possible directions of shift was generated. A shift by one lattice unit along the first direction was attempted. When the attempt was successful, a next k-mer



FIG. 1. Examples of patterns at different times, $t_{\rm MC}$, from the videok6 in the Supplemental Material [50]. Here, L = 256, k = 6 and the initial *r* configuration were used. The concentration of *k*-mers corresponds to the jamming state, $p_j \approx 0.769$ [45].

was randomly chosen. When the attempt was unsuccessful, the next direction was chosen. Equal probabilities of such a translational shift along the longitudinal or transverse axes of the *k*-mers were assumed. One time step of the MC computation, which corresponds to an attempted displacement of the total number of *k*-mers in the system, N_k , was taken as the MC time unit. Time counting was started from the value of $t_{\rm MC} = 1$, being the initial moment (before diffusion), and the total duration of the simulation was typically 10^7 MC time units, although in some cases even up to 10^9 .

Figure 1 presents examples of the k-mer patterns at different moments in time, t_{MC} , for k = 6 and the initial r configuration. At the initial moment, at $t_{MC} = 1$, the deposited k-mers tend to align parallel to each other and stacks of the horizontally (x stacks) and, typically, vertically (y stacks) oriented k-mers were observed. These stacks can be represented as squares of size $\approx k \times k$. In the jamming state, small voids between the stacks were also present. These results fully correspond with previously reported data [31,45,49,51]. Comparison of the patterns at different times evidenced the possibility of diffusion-driven spatial segregation (self-assembly) in the systems (Fig. 1). Evident separation of domains of k_x -mers and k_{y} -mers was observed. This phase ordering resembles the coarsening (Ostwald ripening) in phase-separating systems, such as binary alloys or in the anisotropic ferromagnet (Ising model) [52]. At late stages ($t_{MC} \ge 10^6$), very large percolating domains of the horizontal and vertical stacks were formed.

For characterization of these processes, a range of parameters were calculated during the course of the simulation:

(1) the number of intraspecific contacts (per monomer) between the same sorts of k-mers (i.e., horizontal-horizontal or vertical-vertical), n;

(2) the number of interspecific contacts (per monomer) between the different sorts of *k*-mers (i.e., horizontal-vertical), n_{xy} ;

(3) the shift ratio of the actual number of shifts along the longitudinal axis to the one along transverse axis of the k-mers, R;



FIG. 2. Fragment of a square lattice with two deposited 3-mers of different orientations. The conductivities of the bonds for (a) conventional and (b) insulating ends models are indicated.

(4) the electrical conductivity.

Note, that the maximum value n or n_{xy} can attain is 2(1+1/k). For calculation of the electrical conductivity in the horizontal, σ_x , or vertical, σ_y , directions, the periodic boundary conditions were removed and two conducting buses were applied to the opposite borders of the lattice in the corresponding y or x directions. The electrical conductivities were calculated between these buses, and the mean value $\sigma =$ $(\sigma_x + \sigma_y)/2$ was evaluated. For the conventional model, the different electrical conductivities of the bonds between empty sites, σ_m , filled sites, σ_p , and empty and filled sites, $\sigma_{pm} =$ $2\sigma_p \sigma_m / (\sigma_p + \sigma_m)$ were assumed [Fig. 2(a)]. For the insulating ends model, the two ends of each k-mer were isolated and the electrical conductivities of the bonds were calculated as demonstrated in Fig. 2(b). Presumptively, interspecific contacts play a crucial role in the system connectivity and formation of a percolation cluster, especially for large value of k [35]. Insulating ends model allows examine effect of the end contacts on the electrical properties of the system under consideration. We put $\sigma_m = 1$ and $\sigma_p = 10^6$ in arbitrary units. The Frank-Lobb algorithm was applied to evaluate the electrical conductivity [53]. In the calculations, the logarithm of the effective conductivity was averaged over different runs (see Ref. [54] for the details).

Figure 3 presents examples of the evolution over time of the number of intraspecific, n, and interspecific, n_{xy} , contacts, the shift ratio, R, and the electrical conductivity for the conventional model, σ , for the same MC run that generated the for patterns presented in Fig. 1.

Comparison of the data presented in Figs. 1 and 3 allows the following preliminary conclusion to be drawn. We can identify several stages of the diffusion-driven spatial segregation (self-assembly) of the system under consideration.

Initial stage: During the initial stage, the system undergoes a drastic transition, namely, the jammed state turns into a nonjammed state. Upon this transition, the number of intraspecific contacts, n, goes through a maximum, while the values n_{xy} , R, and σ decrease noticeably. The duration of the transition mode is of the order 10^2 MC steps. Its end corresponds to the minimum of the curve $R(t_{MC})$.

Intermediate stage: In this stage ($t_{MC} = 10^2 - 10^6$), continuous cluster coarsening and labyrinth pattern formation can be observed. The labyrinth structures form during the



FIG. 3. Number of intraspecific, n, and interspecific, n_{xy} , contacts, the shift ratio, R, and electrical conductivity for conventional model, σ , versus the MC time t_{MC} . The data correspond to the same MC run as for the patterns presented in Fig. 1, L = 256, k = 6, with use of the initial r configuration. The concentration of the k-mers corresponds to the jamming state, $p_j \approx 0.769$ [45]. Here, all vertical axes are linear.

middle of the stage and then transform into the germs of the stripe domains toward its end (see Fig. 1). The values of *n* and *R* increase and the value of n_{xy} decreases almost proportionally to the time $\log_{10}(t_{\rm MC})$ (Fig. 3). The end of this stage corresponds to the inflection points in the curves $n(t_{\rm MC})$ and $n_{xy}(t_{\rm MC})$ in Fig. 3.

Final stage: During the third stage, regular patterns begin to form. These patterns appear as striped diagonal domains oriented at 45° to the lattice side. The stripe formation finishes at times in the order of $t_{MC} \approx 5 \times 10^6$. Later in the MC simulation, the system stabilizes in a steady state. The diagonal stripe domains on a plane correspond to a torus divided into two equal parts [50].

For each given value of k, the computer experiments were repeated 100 times, and then the data were averaged. The error bars in the figures correspond to the standard error of the mean. When not shown explicitly, they are of the order of the marker size.

III. RESULTS AND DISCUSSION

A. Initial r configuration

Figure 4 presents the patterns for different values of the length of *k*-mers for relatively long MC simulations, $t_{MC} = 10^7$. The initial *r* configuration (L = 256) was used. For short *k*-mers, cluster coarsening was observed. This self-assembly of rodlike particles became more evident and the clusters grew more in size with increase of *k*. Stripe domains were only observed in the case of long rods with high aspect ratios $k \ge 6$.

The values of the number of intraspecific, n^i , and interspecific, n_{xy}^i , contacts for different values of k-mers for the initial moment $t_{MC} = 1$ before diffusion began are presented in Fig. 5. The $n^i(k)$ dependence was weak and a minimal number of intraspecific contacts ($n^i \approx 1.407$) was observed at



FIG. 4. Examples of patterns at $t_{MC} = 10^7$ for different values of length of the *k*-mers. Here, L = 256 and the initial r configuration were used. The concentration of *k*-mers corresponds to the jamming state [45].

k = 4. The $n_{xy}^{i}(k)$ dependence was fairly strong and could be well-approximated by the following equation:

$$n_{xy}^{i} = (a/\sqrt{k} - b)^{2},$$
 (1)

where $a = 1.843 \pm 0.016$, $b = 0.2620 \pm 0.009$, and the coefficient of determination is $r^2 = 0.9998$.

Figure 6 compares the kinetics of the changes in the number of (a) intraspecific and (b) interspecific contacts for different values of *k*. Here, for the convenience of presentation, the data have been normalized to their initial values at $t_{MC} = 1$.

The normalized number of intraspecific contacts, n^* , grows during the time period $t_{MC} = 1-10$ for all values of k [Fig. 6(a)]. During the intermediate stage II and the final stage III, the time dependencies were different for different values of k. The most remarkable feature was the presence of steps at the boundary between stages II and III for k = 6,7, and 8



FIG. 5. Relationship between the initial number (i.e., at $t_{MC} = 1$) of intraspecific, n^i , and interspecific, n^i_{xy} , contacts versus the length of the *k*-mers. The normalized numbers of intraspecific contacts, n^*_f versus *k* at $t_{MC} = 10^7$ are also presented. Here, L = 256 and the initial *r* configuration were used. The concentration of *k*-mers corresponds to the jamming state [45].



FIG. 6. Normalized number of (a) intraspecific, $n^* = n/n^i$, and (b) interspecific, $n_{xy}^* = n_{xy}/n_{xy}^i$, contacts versus the time t_{MC} for different values of length of the *k*-mers. Here, n^i and n_{xy}^i are the corresponding initial values at $t_{MC} = 1$, while L = 256 and the initial *r* configuration were used. The concentration of *k*-mers corresponds to the jamming state [45]. The values of (a) n_f^* and (b) t_t correspond to the final values at $t_{MC} = 10^7$ and to the transition period, respectively.

and their absence for other values of k. The dependence of the normalized number of intraspecific contacts, n_f^* , versus k for relatively long kinetic MC simulations, $t_{\rm MC} = 10^7$, is presented in Fig. 5. The maximum value of n_f^* was observed at k = 6.

The kinetics of the changes in the normalized number of interspecific contacts, n_{xy}^* , were also different for various values of k [Fig. 6(b)]. These changes were insignificant for k = 2,3. For other values of k, the values of n_{xy}^* decreased during the initial period of time and then stabilized after a transition period, t_t . The transition periods were $t_t \approx 2 \times 10^3$ for k = 4, $t_t \approx 3 \times 10^4$ for k = 5, and $t_t \approx 3 \times 10^6$ for $k \ge 6$. The kinetics of changes in the shift ratios $R(t_{MC})$ and electrical conductivity $\sigma(t_{MC})$ for different values of k are presented in Figs. 7 and 8, respectively. For all values of k the values of R decreased significantly during the initial stage I (at $t_{MC} < 10^2$) (Fig. 7). In the initial jammed state, shifts along the transverse



FIG. 7. Shift ratio, *R*, versus the time t_{MC} for different values of length of the *k*-mers. Here, L = 256 and the initial *r* configuration were used. The concentration of *k*-mers corresponds to the jamming state [45].

axes of the *k*-mers are not possible (i.e., $R = \infty$) and the initial decrease of *R* evidently reflects a rapid transition of the system into a nonjammed state. For $k \leq 5$, the values of *R* stabilized at some level within the intermediate (II) and final (III) stages. For $k \geq 6$, distinct minima within stage II and the steps at the boundary between stages II and III were observed in the $R(t_{MC})$ dependencies. The observed steps correlate with the similar steps observed in the $n_{xy}^*(t_{MC})$ and $n_{xy}^*(t_{MC})$ dependencies (Fig. 6). These steps can be explained by the starting of the process of stripe domain formation. It is evident, that the formation of domains of similarly oriented *k*-mers accompanies the restriction of the shifts along the transverse axis.

The kinetics of the changes in the electrical conductivity, $\sigma(t_{\rm MC})$ were significantly different for the conventional [Fig. 8(a)] and insulating ends [Fig. 8(b)] models. Note that, for isotropic deposition, the mean geometric conductivity, $\sigma_g = \sqrt{\sigma_m \sigma_p} = 10^3$ approximately corresponds to the value of the electrical conductivity at the percolation threshold [54].

For the conventional model, the electrical conductivity, σ , during the diffusion evolution of the system, was noticeably greater compared with σ_g for all values of k [Fig. 8(a)]. This reflected the presence of percolation during the evolution. At the initial moment (in the jamming state), the percolation concentration, p_c , is always smaller than the jamming concentration, p_j , for the studied range $k \in [2,12]$ [35]. The temporal changes of electrical conductivity were insignificant for k < 5. For $k \ge 6$ the values of σ decreased noticeably during the initial stage I (for t < 100) and distinct minima at $t \approx 10^3$ were observed. For the insulating ends [Fig. 8(b)] model, significant changes of electrical conductivity, σ , with a sharp transition above σ_g were only observed at the boundary between stages II and III for relatively long k-mers ($k \ge 6$).

Figure 9 compares the electrical conductivity, σ , versus the *k* dependencies at the initial jamming state ($t_{MC} = 1$) and at the final state, after a relatively long time ($t_{MC} = 10^7$) for the conventional and insulating ends models. On the one hand, for the conventional model, the value of σ decreased with increase





FIG. 8. Electrical conductivity, σ , versus the time t_{MC} for different values of length of the *k*-mers for (a) conventional and (b) insulating ends models. Here, L = 256 and the initial *r* configuration were used. The concentration of *k*-mers corresponds to the jamming state [45].

of k, in both the initial and final states. This naturally reflected the decrease in the value of the jamming concentration for the longer k-mers [49]. The diffusion evolution also resulted in a decrease of σ . On the other hand, for the insulating ends model, during the initial stage, the value of σ decreased with increase of k but was always below the level of the mean geometric conductivity, σ_g . We can conclude that, during the initial stage, a suppression of the percolation for the insulating ends model is caused by the presence of insulating ends. So, the presence of the insulating ends has a significant impact on the connectivity between the x and y stacks. During the diffusion, the formation of the stripes for $k \ge 6$ resulted in a restoration of percolation through the system via the connectivity inside the large domains of similarly oriented k-mers.

B. Effects of the size of the system: L = 128-2048

Figure 10 presents examples of the patterns formed with a fixed length of k-mers, k = 12 and different sizes of the system, L = 128-2048 at $t_{MC} = 10^7$. The initial r configuration was



FIG. 9. Electrical conductivity, σ , versus the length of *k*-mers for different values of t_{MC} for conventional and insulating ends models. Here, L = 256 and the initial *r* configuration were used. The concentration of *k*-mers corresponds to the jamming state [45].

used. The fairly ideal stripe domains were only observed for L = 128 and L = 256. For larger lattices starting from L = 512, stacks consisting of *k*-mers of perpendicular orientation appeared inside the stripe domains and their concentration increased with increase of *L*. We believe that these alien stacks may be found to disappear when $t_{MC} \rightarrow \infty$. Unfortunately, we are not in a position to perform any direct verification of this suggestion because the simulation is very time-consuming.

The example of the evolution over time of the patterns for k = 12 and L = 2048 is presented in Fig. 11. In this case, an evident coarsening of clusters elongated along the diagonals of the lattice was observed at $t_{MC} = 10^5 - 10^6$.

The defects inside the stripe domains were strongly stabilized and did not disappear during diffusion evolution.



FIG. 10. Examples of patterns at $t_{MC} = 10^7$ for k = 12 and different sizes of the lattice L = 128-2048. Here the initial *r* configuration was used. The concentration of *k*-mers corresponds to the jamming state.



FIG. 11. Examples of patterns at different times, t_{MC} , from the video videok12L2048 in the Supplemental Material [50]. Here, L = 2048, k = 12, and the initial *r* configuration were used. The concentration of *k*-mers corresponds to the jamming state.

Figure 12 compares the kinetics of the changes in (a) the normalized number of interspecific contacts, $n_{xy}^* = n_{xy}/n_{xy}^i$, and (b) the shift ratio, *R*, for k = 12 and for different sizes of the system, *L*. The data evidenced the presence of fairly insignificant scaling within the studied range of *L*.

C. Comparison of the different initial configurations

In order to clarify the mechanism of formation of the diagonal stripe domains for $k \ge 6$, the effects of different initial configurations on such pattern formation were also studied. A strong impact of the initial configuration on the evolution of patterns and the kinetics of the main parameters of the system was observed. Figure 13 compares the time



FIG. 12. Normalized number of (a) interspecific contacts, $n_{xy}^* = n_{xy}/n_{xy}^i$, and (b) the shift ratio, *R*, versus the time t_{MC} for k = 12 and different sizes of the system, *L*. Here, n_{xy}^i is the initial value at $t_{MC} = 1$ and the initial *r* configuration were used. The concentration of *k*-mers corresponds to the jamming state.



FIG. 13. Examples of patterns at different times, t_{MC} , from the video videok12vd in the Supplemental Material [50]. Here, L = 256, k = 12, initial v configuration (upper row) and d configuration (bottom row) were used. Concentration of k-mers corresponds to the jamming state of r configuration [45].

evolution of the patterns for initial stripe configurations: v configuration (upper row) and d configuration (bottom row). Here, L = 256, k = 12, and the concentration of particles corresponds to the jamming concentration for the initial r configuration. It is clearly evident that the initial unstable v configuration gradually transforms to diagonal stripe patterns, whereas the initial stable d configuration remains almost unchanged. We can conclude that the pattern of diagonal stripe domains is an attractor, i.e., any spatial distribution of k-mers tends to transform into diagonal stripes when $k \ge 6$.

Figure 14 compares the kinetics of changes in (a) the number of intraspecific contacts, n, (b) the interspecific contacts, n_{xy} , (c) the shift ratio, R, and (d) the electrical conductivity, σ , for k = 12 and L = 256. It is remarkable that, for various initial configurations, the initial values and the evolution of all parameters were fairly different.

Their final values were almost the same irrespective of the initial configuration. Note that for the initial v and d configuration, for the insulation ends model, the electrical conductivity was above the mean geometric conductivity, σ_g . This reflected the presence of percolation along the stripe domains. It is also interesting that, for v configuration, some of the studied parameters illustrated extrema at $t_{\rm MC} \approx 5 \times 10^5$, i.e., just near the boundary between stages II and III. This corresponds to the critical transformation of the vertical stripe into the diagonal stripe (see pattern for initial v configuration at $t_{\rm MC} = 5 \times 10^5$, Fig. 13).

Similar effects were observed for other values of k in the range of 6–12. At smaller values of k, the choice of initial d configuration did not allow the diagonal stripe patterns to stabilize. Figure 15 presents examples of such patterns at $t_{\rm MC} = 10^7$ for different values of k.

The value of n_{xy} increased during the diffusion evolution of the system, and saturated for a long time at the level of n_{xy}^s . The inset in Fig. 16 shows the half-time $t_{1/2}$ required to attain $0.5n_{xy}^s$. The most rapid kinetics were observed for small *k*-mer lengths.



FIG. 14. Number of (a) intraspecific contacts, *n* (b) interspecific contacts, n_{xy} , (c) shift ratio, *R*, and (d) electrical conductivity, σ , versus time t_{MC} for k = 12. Here, L = 256 and different initial *r*, *v*, and *d* configurations were used. The concentration of *k*-mers corresponds to the jamming state of the *r* configuration [45].



FIG. 15. Examples of patterns at $t_{\rm MC} = 10^7$ for different values of length of the *k*-mers. Here, L = 256 and the initial *d* configuration were used. The concentration of *k*-mers corresponds to the jamming state for the initial *r* configuration [45].



FIG. 16. Number of interspecific, n_{xy} , contacts versus time t_{MC} for different values of k. Here, L = 256, and the initial d configuration were used. The concentration of k-mers corresponds to the jamming state for the initial r configuration [45]. Inset shows the half-time $t_{1/2}$ required to attain the level $0.5n_{xy}^{s}$.



FIG. 17. Number of interspecific, n_{xy} , contacts versus time t_{MC} for initial r, v, and d configurations, L = 2048, for (a) k = 6 and (b) k = 12. The concentration of k-mers corresponds to the jamming state for the initial r configuration [45]. The corresponding patterns at $t_{MC} = 10^7$ are also shown.

Finally, Fig. 17 compares the kinetics of changes in the number of intraspecific contacts, n, for initial r, v, and d configurations for large systems, L = 2048, (a) k = 6 and (b) k = 12. For k = 6, the systems with different initial configurations progressively changed. We can speculate that, for any initial configuration, the system presumably relaxed to the state of diagonal stripes [Fig. 17(a)]. However, an accurate estimation of this statement requires longer MC simulations and is not possible at present time.

For k = 12, the initial *d* configuration was stabilized and only point defects were observed after long MC simulations. The initial *r* configuration was seemed to tend to the defective stripe domains. The initial *v* configuration being destroyed very slowly and the final state is hardly to predict. So, for large systems such as L = 2048, different nonergodic steady states can be realized, with a dependence on the initial configurations and the value of *k*.

IV. CONCLUSION

The diffusion-driven self-assembly of rod-like particles (k-mers) oriented along x and y directions on a square lattice was studied by means of MC simulation. Isotropic orientations for the k-mers was assumed at the starting point. We considered only very dense systems, i.e., systems at the jamming concentration. The initial jamming state was produced by RSA, then, the k-mers were allowed to diffuse. The typical time of deposition was supposed to be much less than the typical time of relaxation. In such concentrated systems, only the translational diffusion of particles is possible, whereas rotational diffusion is completely inhibited. The length of the k-mers (and therefore their aspect ratio) was varied from 2 to 12. The size of lattice, L, was varied from 128 to 2048, and periodic boundary conditions were applied to the lattice along both the x and y directions. Particular attention was paid to the situation with L = 256. The systems under consideration exhibited the rich nonequilibrium patterning, typical for materials composed of shape-anisotropic particles [25]. The most striking was the formation of diagonal stripe domains for aspect ratios above a specific critical value, $k \ge 6$. For shorter k-mers ($k \leq 5$), the diagonal patterns did not ever occur for any of the initial distributions of k-mers used. Moreover, if the initial distribution of k-mers corresponded to diagonal stripe domains, it was unstable and the diffusion destroyed this diagonal configuration. As a result, the final distribution was homogeneous. Similar changes of deposition-evaporation driven self-assembly of k-mers on the square lattice were revealed, where the nematic order can only be stabilized for sufficiently long k-mers $(k \ge 7)$ [39]. The different selfassembly of elongated particles with dependence on their aspect ratio has also been observed in continuous systems [20]. We have observed very intriguing behavior reflecting the impact of the system size on self-assembly. For large-scale systems with initial random placement of the k_x -mers and $k_{\rm v}$ -mers over the whole lattice, the diagonal stripe domains became less ideal and contained more defects even for $k \ge 6$.

Moreover, different nonergodic steady states can be realized with dependence on the initial configurations. Different initial configurations were used for the placement of k-mers onto the lattice. For the initial r configuration, k_x -mers and k_y -mers were randomly placed on the whole lattice. For the initial v configuration and d configuration, k_x -mers and k_y -mers were randomly placed inside the two different vertically or diagonally oriented stripes, respectively. For the initial v configuration, the transformation of the vertical stripe domains into diagonal stripe domains was also observed when $k \ge 6$. For shorter k-mers ($k \le 5$) the diagonal stripe domains were not stable for all tested initial configurations. Although qualitatively similar effects were observed for different values of L (L = 128–2048), in the large scale systems, the diagonal stripe domains became more defected. Note that discussed diffusion-driven transformations of RSA jammed states can be also realized in less dense ensembles of rod-like particles and details of self-assembly can be dependent on initial concentration of particles

Finally, in the lattice adsorption of k-mers, the observed effects surely reflect the competition between different factors related to the discrete nature of the rods, the limited numbers of their possible orientations and the finite sample size. The relative importance of these factors still remains an open question.

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ACKNOWLEDGMENTS

We acknowledge the funding from the National Academy of Sciences of Ukraine, Project No. 43/17-H (N.I.L., N.V.V., and V.A.G.) and the Ministry of Education and Science of the Russian Federation, Project No. 3.959.2017 (Yu.Yu.T.).

APPENDIX: ALGORITHM

1:	$\{N_{MC} \text{ is the total number of Monte Carlo steps}\}$
2:	$\{N_k \text{ is the number of } k \text{-mers to be shifted}\}$
3:	for $i = 1$ to $N_{\rm MC}$ do
4:	{One Monte Carlo step}
5:	for $j = 1$ to N_k do
6:	Randomly select a k-mer
7:	Randomly select a shift direction
8:	Try to shift the <i>k</i> -mer in the chosen direction by one
	lattice site
9:	{ <i>k</i> -mers cannot pass through each other.}
10:	end for { <i>j</i> loop }
11:	end for {i loop}

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