

# Large artificial anisotropic growth rate in on-lattice simulation of obliquely deposited nanostructures

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On-lattice particle simulation is one of the most common types of Monte Carlo simulations used in studying the dynamics of film growth. We report the observation of a large artificial anisotropic growth rate variation owing to the fixed arrangement of particles in an on-lattice simulation of oblique angle deposition. This unexpectedly large anisotropy is not reported in previous literatures and substantially affects the simulation outcomes such as column angle and porosity, two of the most essential quantities in obliquely deposited nanostructures. The result of our finding is of interest to all on-lattice simulations in obliquely deposited films or nanostructures.

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## I. INTRODUCTION

Microstructure of thin films is of great interest from both scientific and practical points of views [1,2]. Using statistical physics and fractal concepts, it has been possible to quantify and predict the morphology and microstructure of seemingly random phenomena of films growth, such as the evolution of surface roughness of a film. Computer simulation is often used in aiding the advancement in this field of study. In particular, oblique angle deposition (OAD) has emerged in recent years as an increasingly important fabrication technique owing to its ability to create unique and useful film microstructures [3,4]. OAD can be used to tune the porosity of a given material easily, cost effectively, continuously, and over a wide range of values [3,4]. Porosity of a material is directly related to its physical properties such as the index of refraction, the dielectric constant, thermal conductivity, resistivity, and stiffness. Besides porosity tuning, another highly attractive feature of OAD is its ability to easily create a large array of complex nanostructures that cannot be practically fabricated using other techniques. Some examples are an array of helical nanosprings and chevron structures [4].

Despite the increasing popularity of OAD, predicting the outcome of an obliquely deposited nanostructure is still a challenging problem [5–7]. Monte Carlo simulation is a very attractive method of studying OAD because it offers unique insight into OAD. It is also useful for predicting the outcome of an experiment. Simulation has been able to match the geometry of nanostructures and morphology of film fabricated using OAD [8]. Simulation has also been a very valuable tool to study the growth dynamics of OAD films [9,10].

The most popular simulation approach uses discrete particles because it is relatively simple to construct and it mimics the behavior of particles during OAD. Shadowing and overhanging structures, two of the most crucial features in OAD, are straightforward to implement in particle simulation. These features are difficult to implement accurately in some other approaches (for example, in the continuum approach [11]).

Particle simulations can be categorized into two types: off-lattice and on-lattice simulation. The on-lattice simulation is popular owing to its simplicity and its low usage of computing resources. Low usage of computing resources is not a small advantage because simulation using a larger number of particles increases the accuracy of the simulation and in some cases is a necessity (e.g., for growth evolution of a thick film). Various versions of on-lattice simulation of OAD have been developed and used by different research groups [9,12–22].

Unfortunately, on-lattice simulation requires arranging the impinging particles according to the lattice (grid) system implemented in the simulation. This lattice or grid orientation has nothing to do with the actual orientation of atoms in the real life experiment, which can present important yet unobvious problems as we will describe in this paper.

In this work, we present our finding of how an on-lattice simulation in OAD can give highly anomalous and unrealistic results. Despite the wide use of computer simulations in OAD, and despite on-lattice particle simulation being the most common type of simulation, such a large artificial effect has not been reported before in literature. We discuss why and how this grid effect affects the outcome of OAD simulation. We also propose practical ways to detect the presence of grid effect in a simulation.

## II. EXPERIMENT AND SIMULATION

Imagine performing deposition on a floating seed (i.e., a seed without an underlying plane of substrate—see the schematic diagram in Fig. 1). This deposition yields fan structures [7,8]. For a perfectly symmetrical seed, deposition from any direction must yield fans of the same shape and size. If the seed is not perfectly symmetrical, deposition from different directions will not yield fans of the exact same shape and size. However, for fan dimensions several times larger than the seed size, it is expected that the initial seed geometry does not affect the final outcome much, and thus the fans deposited from various directions should be similar in size and shape if the deposition is long enough (as shown schematically in Fig. 1).

Figure 2 shows experimental results of deposition onto pillar seeds from two different flux angles. It can be seen that

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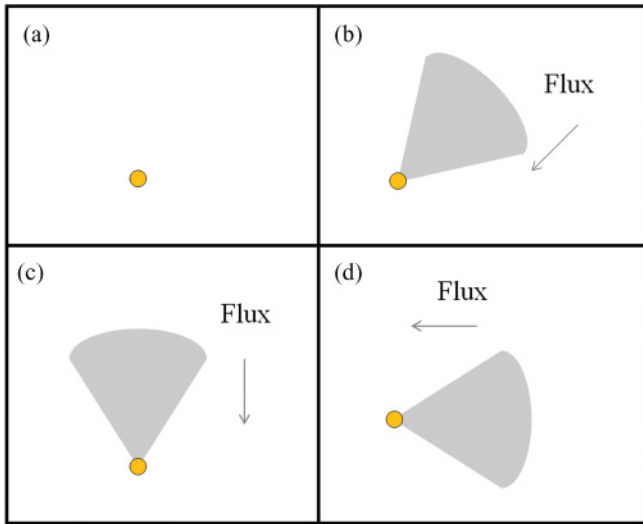


FIG. 1. (Color online) (a) Cross-sectional view of a line seed (yellow) with the length of the line going into the page. Flux of parallel beams of particles impinging at various configurations: (b), (c), and (d) perpendicular onto the line seed yield fan structures of the same size and shape.

the fan angles  $\phi$  are very close to each other, which confirms our expectation. The deposited material is Si at a 0.8 nm/s flux rate using *e*-beam thermal evaporation with a chamber base pressure at  $5 \times 10^{-7}$  Torr. The distance from source to substrate is  $\sim 40$  cm. The seeds are UV curable Polyset nanoimprinted structures [23] on a Si substrate. The substrate is at ambient chamber temperature (25–45 °C) during deposition.

Figure 3 shows an on-lattice simulation of depositions on line seeds from various directions perpendicular to the line seeds (the length of the line is into the page). The three-dimensional (3D) Monte Carlo (MC) simulation we use in this paper is based on cubic particles that move and rest in a simple cubic lattice configuration. Incoming particles are initiated at random locations above the substrate with uniform distribution and move toward the substrate in a straight line.

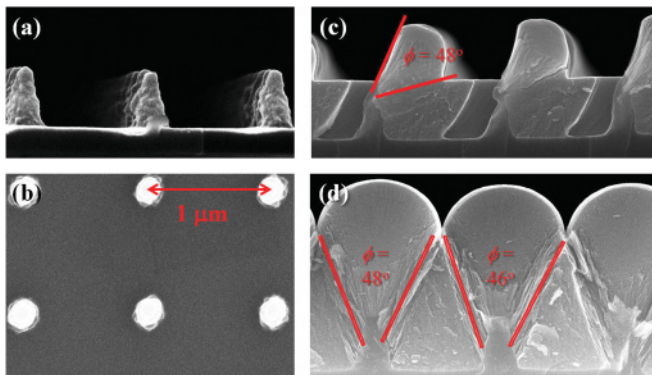


FIG. 2. (Color online) Scanning electron microscope (SEM) of (a) cross-sectional view of nanoimprinted Polyset pillar seeds, (b) top view of the same seeds, (c) cross-sectional view of 45° Si deposition on the pillar seeds, and (d) 0° (normal) Si deposition on the pillar seeds. The fan angle  $\phi$  is defined as the angle subtended by the fan. The fan angles obtained from the two samples are very close (both  $\sim 47^\circ$ ).

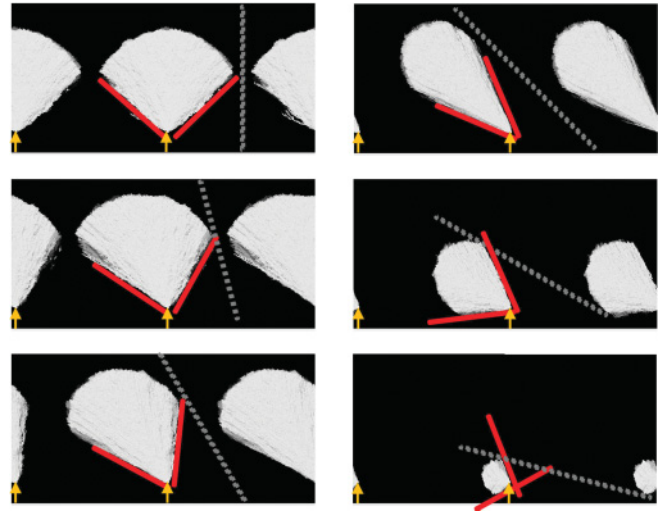


FIG. 3. (Color online) Fan structures obtained by simulation of deposition on line seeds. The simulation is a 3D MC simulation with  $D = 100$ . The deposition angles are 0°, 15°, 30°, 45°, 60°, and 75°, as shown by the dotted gray lines. In all simulation figures in this paper, the 0° deposition angle is defined as the vertical direction. Orange arrows indicate positions of line seeds (the length of the line goes into the page). The size of the seed is 25 particles. Red solid lines indicate the fan angles. The amounts of deposited materials at the various angles are not the same. The deposition thickness is adjusted in such a way that the global shadowing between adjacent fans either has not started or has just started.

An incoming particle sticks to the existing deposited particles if it moves into one of their nearest-neighbor locations. Surface diffusion is achieved by allowing translation of one randomly chosen particle (it can be the incoming particle itself) located within a certain distance from the incoming particle. The diffusion is repeated  $D$  number of times. The translation of the particle is allowed if it increases its number of nearest neighbors. A periodic boundary condition is implemented on all the vertical walls of the simulation. A more detailed explanation of the simulation is available in Ref. [9]. Figure 3 is obtained by running six simulations separately, each of size  $512 \times 512 \times 512$ , and each result displayed is a stitched image of two side-by-side simulation outputs (resulting in a  $512 \times 1024$  display).

As can be seen in Fig. 3, the result of the simulation deviates severely from expectations and certainly is not a small effect that can be ignored. As pointed out in our recent paper, the fan angle is directly related to the column angle of the columnar structures obtained by OAD [7]. The relationship between the fan angle and column angle is  $\beta = \alpha - \phi/2$  for a highly oblique deposition angle ( $\alpha > \phi$ ). Both the column angle and the deposition angle are defined with respect to the substrate normal.

The much smaller fan angle shown in Fig. 3 for 45° deposition is owing to the growth rate difference between the 0° and 45° depositions. This growth rate can be explained by an approximate analysis of the landing of the individual particles. As shown in Fig. 4(b), there are two types of growth for the 0° impinging particle. Each landing site results in its own growth thickness and direction. For 0° deposition the growths perpendicular and parallel to the flux are both  $1a$ ,

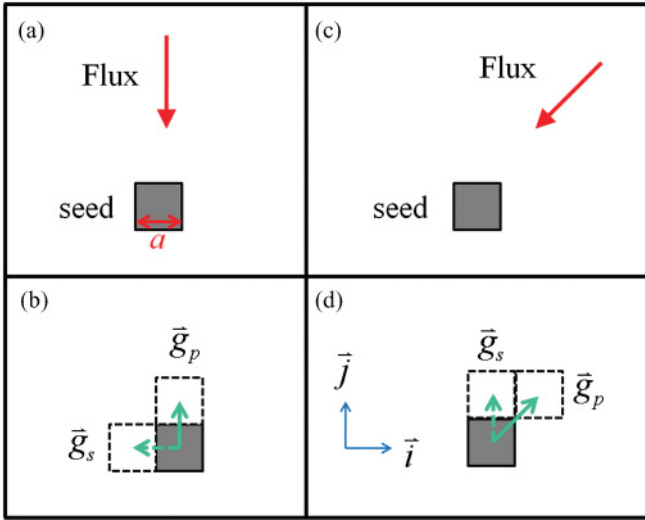


FIG. 4. (Color online) Explanation of the large difference in fan angles for depositions at (a)  $\alpha = 0^\circ$  and (c)  $\alpha = 45^\circ$  in an on-lattice simulation. For  $0^\circ$  deposition, the growth rates are determined by the two possible sites for deposition, as shown by the dotted cubes in (b). The growth rates perpendicular to the flux (dashed arrow) and parallel to the flux (solid arrow) are the same. Similarly, the growth rates for  $45^\circ$  deposition are determined by the two possible sites for deposition, as shown by the dashed cube in (d). The growth rate parallel to the flux and sideways with respect to the flux are not the same. The symbols shown are the notations used in the Appendix.

where  $a$  is the dimension of the cube. The resultant growth thickness is therefore  $\sqrt{2}a$ , and the direction is at  $45^\circ$  with respect to the flux. A 2D seed has two opposite sides for growth perpendicular to the flux (i.e., the left-hand side and right-hand side), each side with  $45^\circ$  growth with respect to the flux direction. This makes a fan angle of  $45^\circ \times 2 = 90^\circ$ . This estimated result is close to the fan angle obtained from simulation ( $\sim 100^\circ$ , Fig. 6).

For the  $45^\circ$  incident flux, the resultant growth thickness can be obtained by vector addition of the two possible growth

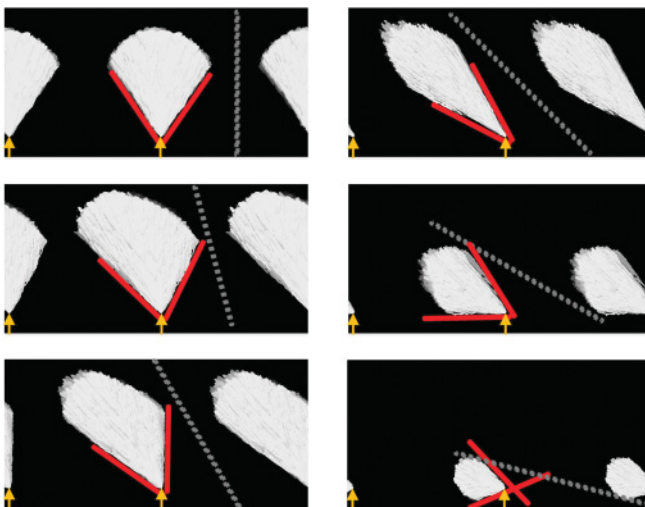


FIG. 5. (Color online) Simulation similar to Fig. 3, except with diffusion  $D = 100$ .

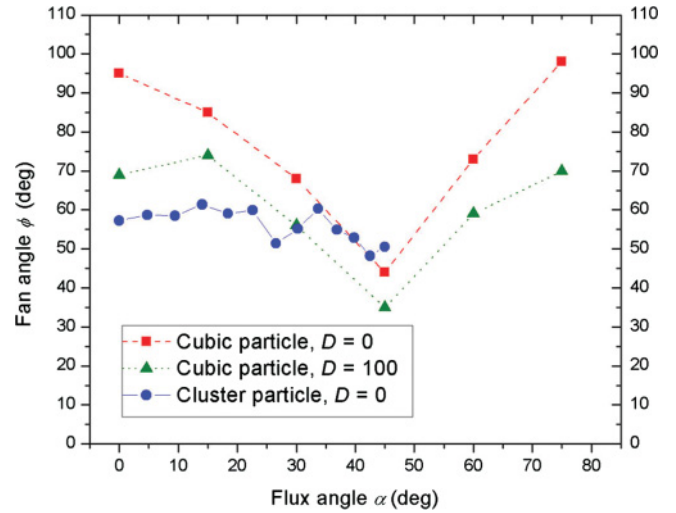


FIG. 6. (Color online) Comparison of fan angles obtained at various deposition angles using two different types of simulations: cubic particle and cluster particle. Some representative simulation output images are shown in Figs. 3, 5, and 11.

mechanisms, as shown in Fig. 4(d). The resultant growth thickness is  $\sqrt{5}a$  (see the Appendix). The angle between the resultant growth direction and the incoming flux is  $18.4^\circ$  (see the Appendix). Using similar argument as before, the expected fan angle is therefore  $2 \times 18.4^\circ = 36.8^\circ$ , also close to the simulation result ( $\sim 35^\circ$ , Fig. 6). The resultant growth thickness for  $45^\circ$  deposition is larger than the thickness for  $0^\circ$  deposition even though the mass of deposited material is the same. Therefore, the  $45^\circ$  deposition results in higher porosity structures and a smaller fan angle.

The degree of grid effect can be reduced by increasing the diffusion of the particles. The grid effect is caused by the large anisotropic growth rates. Diffusion reduces the grid effect because diffusion is nondirectional and thus smooths out the anisotropy. The fan structures obtained by MC simulation using  $D = 100$  are shown in Fig. 5. The plot of the fan angles obtained at various deposition angles is shown in Fig. 6. The

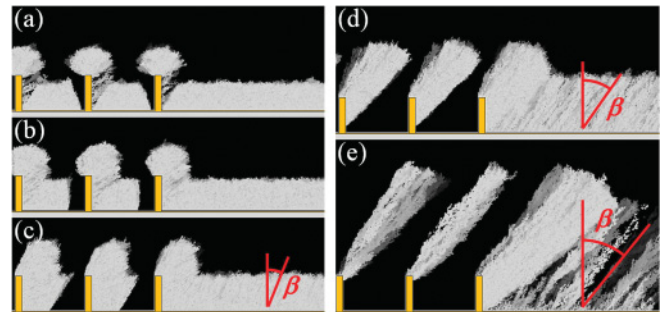


FIG. 7. (Color online) Columnar structures obtained using 3D MC simulation on seeded and unseeded surfaces (the orange-colored structures). Diffusion is turned off in the simulation. The flux angles  $\alpha$  are (a)  $5^\circ$ , (b)  $25^\circ$ , (c)  $45^\circ$ , (d)  $65^\circ$ , and (e)  $85^\circ$ . The simulation output image is trimmed in order to save space. The pitch of the pillars array is 100 cubic lattices, while the height of the pillars is 60 cubic lattices.



figure shows that for higher diffusion, the difference in the  $\phi$  angle for  $0^\circ$  and  $45^\circ$  deposition is reduced from  $\sim 50^\circ$  to  $\sim 38^\circ$ .

Figures 3 and 5 enable quantification of the amount of grid effect on the fan angle. Because the fan angle is related to the column angle in a known way [7], the amount of influence of the grid effect on column angle simulation can be calculated based on the data from Figs. 3 and 5. However, the relationships between the fan angle and other physical quantities (such as porosity) are not yet available. Therefore, although Figs. 3 and 5 are useful in showing the presence of a grid effect in a simulation, they do not necessarily provide an estimate of the amount of grid effect in quantities other than the fan angle. We propose that an estimation of the amount of grid effect on any given quantity of interest can be obtained by comparing simulation outcomes from a normal setup and a “rotated setup.” The “rotated setup” is a setup whereby the source and the substrate are rotated together with respect to the simulation lattice (or an equivalent point of view is that the lattice is

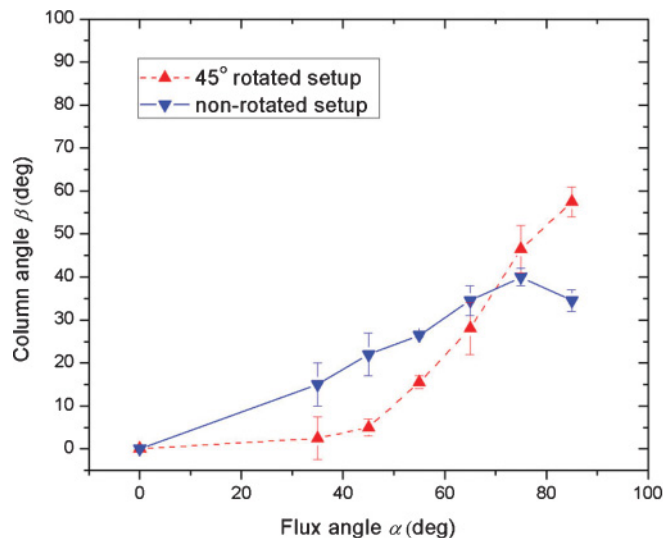


FIG. 9. (Color online) Plot of column angle vs flux angle for the simulation performed on a rotated setup and a nonrotated setup (Figs. 7 and 8).

rotated while fixing the substrate and source). The rotation is done in such a way that the source-to-substrate relative orientation and distance remains the same. The rotation angle is chosen so that the largest amount of grid effect is expected, based on Fig. 3. As an example, we performed the following simulations.

We created a substrate that consists of a seeded and unseeded area to enable the observation of columnar angles on both seeded and unseeded surfaces. We deposit particles onto the seed at various flux angles  $\alpha$  (Fig. 7). We then perform the same set of simulations, but in a rotated setup (Fig. 8). We rotate the substrate and the flux by  $45^\circ$  with respect to the simulation lattice. As can be seen from Fig. 9, the  $\beta$  vs  $\alpha$  from the nonrotated substrate and  $45^\circ$  rotated substrate are clearly different. The difference between the two results can be used as an estimate of the amount of grid effect on column angle simulation.

One way to remove the grid effect is to change the unit particle in the simulation. Off-lattice simulation should be free of grid effect; however, this type of simulation consumes more computing resources. We mitigate this problem by creating a simulation where the particle is a conglomerate or cluster of

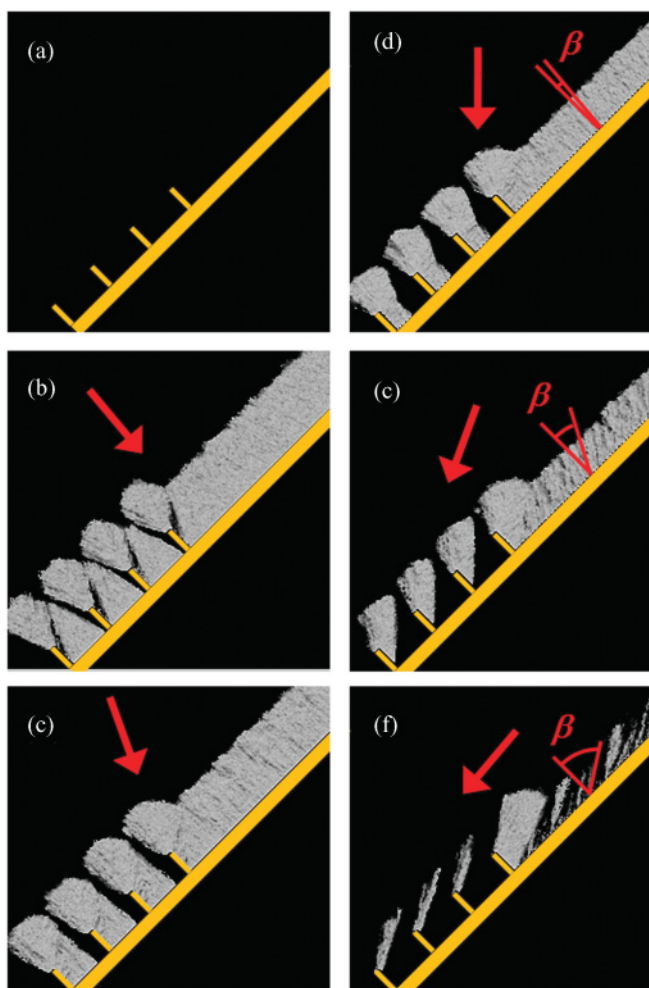


FIG. 8. (Color online) Columnar structures obtained using 3D MC simulation on a  $45^\circ$  rotated setup. The substrate is as shown by the orange structure in (a). It is the same substrate as the one in Fig. 7, with the exception that it is rotated  $45^\circ$ . Diffusion is turned off in the simulation. The flux angles  $\alpha$  are (b)  $5^\circ$ , (c)  $25^\circ$ , (d)  $45^\circ$ , (e)  $65^\circ$ , and (f)  $85^\circ$ . The simulation output image is trimmed in order to save space.

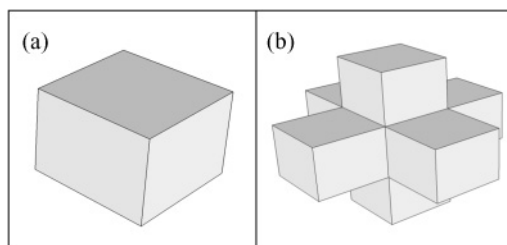


FIG. 10. (a) Cubic particle used in our 3D MC simulation. (b) The modified particle for the semi-off-lattice simulation. The cluster particle consists of six cubic particles (or seven if the center hidden cubic particle is counted) aggregated together into a single cluster. The number of possible stacking sites is 30, as opposed to six for a single cubic particle.

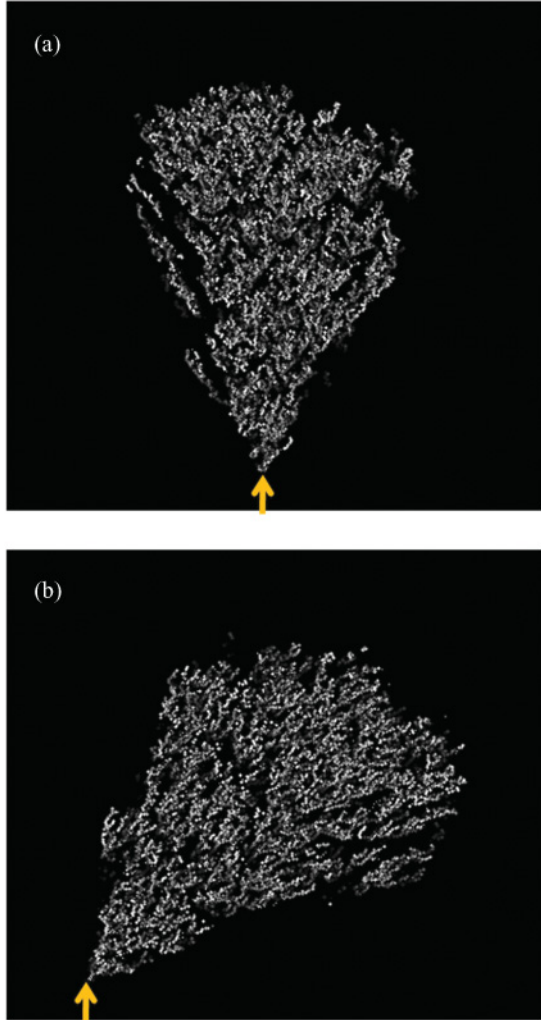


FIG. 11. (Color online) Semi-off-lattice simulation using a cluster particle as depicted in Fig. 10(b). There is no diffusion in the simulation. The size of the simulation is  $300 \times 300$  cubic lattices. The fan structures shown are (a)  $0^\circ$  deposition and (b)  $45^\circ$  deposition onto line seeds (length of the line is into the page). The locations of the line seeds are as indicated by the yellow arrows.

cubes (Fig. 10). The cubes that constitute the cluster still are confined in a simple cubic lattice, however, the cluster itself is not confined to any lattice arrangement. As can be seen from Figs. 6 and 11, a simulation using a cluster of cubes results in a dramatic reduction of the grid effect. Besides removing the grid effect, the cluster simulation also provides additional evidence that the so-called “grid effect” is indeed caused by the on-lattice stacking of the cubic particles. [Note that the use of a spherical particle in a simulation by itself does not imply that there is no grid effect. Some simulations use spheres as particles but the spheres still have to stack according to a certain lattice geometry (i.e., it is still an on-lattice simulation). In this case, the grid effect exists.]

### III. DISCUSSION AND CONCLUSION

We laid down two useful tests related to the grid effect. The first test is to determine whether a given simulation suffers grid effect. The second test is for estimating the amount of

error in a simulated quantity of interest (such as the column angle) caused by the grid effect. We tested our cubic lattice MC simulation for the grid effect. Fan-angle simulations were carried out at different orientations with respect to the lattice geometry. This test method offers easy and undisputable confirmation of the presence of the grid effect because it is clear that ideally (i.e., in the absence of grid effect) the fan angle should remain the same.

Likewise, any other simulated quantity of interest should ideally remain the same, independent of the lattice rotation. We used this fact as a method to estimate the amount of error introduced by the grid effect in any simulated quantity of interest. In this paper, we use the column angle as an example. Using the fact that a column-angle simulation outcome ideally should not be altered by lattice rotation, we propose that the amount of deviation from this ideal behavior can be estimated as the amount of error.

The grid effect is most serious when a simulation involves a comparison between depositions at various flux angles. As can be seen in Figs. 1 and 3, the grid effect creates large artificial changes in a quantity that is supposed to be constant with respect to the flux angle. For on-lattice simulations at  $0^\circ$  or near  $90^\circ$  that do not involve comparison with the intermediate flux angles, the grid effect is not a big concern. For example, the fan structure of Si can be simulated quite nicely by using an on-lattice simulation with the proper amount of surface diffusion [8]. The reason is because, for  $0^\circ$  or  $90^\circ$ , the manifestation of the grid effect can be removed by using an appropriate amount of surface diffusion. But one would not be able to remove the grid effect for all angles (including  $45^\circ$ ) simultaneously with any amount of diffusion. For this reason, an on-lattice simulation performed on a full range of deposition angles (such as column angle or porosity simulation) will suffer from the grid effect.

In summary, we demonstrated that the widely used method of on-lattice particle simulation in OAD suffers an anomalous anisotropic “grid effect.” The grid effect significantly modifies OAD simulation outcomes such as column angle and indirectly, porosity; thus this is not necessarily a small effect that can be ignored. This anomalous grid effect is not observed in a semi-off-lattice simulation we constructed, thus further verifying that the grid effect is caused by the fixed lattice arrangement.

### ACKNOWLEDGMENT

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### APPENDIX: CALCULATION OF GROWTH ANGLE

In Fig. 4(d), the growth parallel to the flux ( $\vec{g}_p$ ) and the growth sideways with respect to the flux ( $\vec{g}_s$ ) are given by

$$\begin{aligned}\vec{g}_s &= a\vec{j}, \\ \vec{g}_p &= a\vec{i} + a\vec{j}.\end{aligned}\quad (\text{A1})$$

We denote the resultant vector from addition of the two vectors above as  $\vec{g}_t$ ,

$$\vec{g}_t = a\vec{i} + 2a\vec{j}.\quad (\text{A2})$$

The magnitude of this vector is  $|\vec{g}_t| = a\sqrt{1^2 + 2^2} = a\sqrt{5}$ .

We denote the angle between the resultant vector and the flux direction as  $\gamma$ . This angle can be obtained by

$$\cos(\gamma) = \frac{\vec{g}_t \cdot \vec{f}}{|\vec{g}_t||\vec{f}|}, \quad (\text{A3})$$

where  $\vec{f}$  is a unit vector parallel to the flux direction,

$$\vec{f} = \frac{-\vec{i} - \vec{j}}{\sqrt{2}}. \quad (\text{A4})$$

Inputting Eqs. (A4) and (A2) into Eq. (A3), it can be shown that  $\gamma=18.4^\circ$ .

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