Random sequential adsorption of polydisperse mixtures on lattices

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Random sequential adsorption of linear and square particles with excluded volume interaction is studied numerically on planar lattices considering Gaussian distributions of lateral sizes of the incident particles, with several values of the average \( \mu \) and of the width-to-average ratio \( w \). When the coverage \( \theta \) is plotted as function of the logarithm of time \( t \), the maximum slope is attained at a time \( t_M \) of the same order of the time \( \tau \) of incidence of one monolayer, which is related to the molecular flux and/or sticking coefficients. For various \( \mu \) and \( w \), we obtain \( 1.5 \tau < t_M < 5 \tau \) for linear particles and \( 0.3 \tau < t_M < \tau \) for square particles. At \( t_M \), the coverages with linear and square particles are near 0.3 and 0.2, respectively. Extrapolations show that coverages may vary with \( \mu \) up to 20% and 2% for linear and square particles, respectively, for \( \mu \geq 64 \), fixed time, and constant \( w \). All \( \theta \times \log t \) plots have approximately the same shape, but other quantities measured at times of order \( t_M \) help to distinguish narrow and broad incident distributions. The adsorbed particle size distributions are close to the incident ones up to long times for small \( w \), but appreciably change in time for larger \( w \), acquiring a monotonically decreasing shape for \( w = 1/2 \) at times of order \( 100 \tau \). At \( t_M \), incident and adsorbed distributions are approximately the same for \( w \leq 1/8 \) and show significant differences for \( w \geq 1/2 \); this result may be used as a consistency test in applications of the model. The pair correlation function \( g(r,t) \) for \( w \leq 1/8 \) has a well defined oscillatory structure at \( 10^6M \), with a minimum at \( r \approx \mu \) and maximum at \( r \approx 1.5 \mu \), but this structure is not observed for \( w \geq 1/4 \).

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I. INTRODUCTION

Models of random sequential adsorption (RSA) describe real processes in which atoms or molecules sequentially adsorb on a substrate to form a monolayer or a multilayer [1, 2]. A broad range of applications include adsorption of colloidal particles [2, 3] and of proteins [4, 5] on various substrates, growth of atomic islands of metals or semiconductors [6], functionalization of semiconductor surfaces with molecular monolayers [7], etc. The RSA models may consider one or more species of adsorbing particles, different particle shapes, discrete or continuous size distributions, and include other surface processes such as diffusion and desorption [1, 2, 8–10].

Polydispersity of incident particle size is observed in a large number of processes, specially in (but not restricted to) colloidal particle and macromolecule deposition. The simplest RSA models that account for polydispersity effects are those with binary particle size distribution [11–15], which were already used to explain real system properties [16, 17]. Uniform distributions of particle size were also considered in continuum [18, 19] and lattice [20–22] models, showing interesting features such as the effects of particle shape on the maximal surface coverage and on the form of concentration decay. For some applications, models of polydisperse mixtures with power-law size distributions were also proposed [23–24]. Surface diffusion and desorption were neglected in most cases.

RSA of mixtures of spheres and disks with Gaussian size distributions were also studied in Refs. [23–27]. Some important conclusions from those works were the increase of the adsorption rate and the shift of the adsorbed particle size distribution peak as the width of the incident distribution increased. These results helped to interpret data for polystyrene nanoparticle adsorption on charged layers over silicon substrates [28]. Recent works also model adsorption of silver and hematite nanoparticles by RSA of polydisperse mixtures [24, 31].

The aim of the present work is to study related RSA problems on lattices, in which submonolayers are formed by adsorption of particles with sizes following discretized Gaussian distributions. Two limiting cases of particle shape are considered separately, namely linear segments and filled squares. Broad ranges of the average lateral size and of the width-to-average ratio are considered to model the incident flux. The evolution of the coverage shows that plots of this quantity as function of \( \log t \) have maximal slopes in narrow time ranges which are related to the incident flux, with weaker effects of particle shape, average size, and distribution width. This feature may be used, for instance, to estimate orders of magnitude of molecular flux or sticking coefficients. The adsorbed particle size distributions are also analyzed and the ranges of time and distribution widths in which they are similar to the incident ones are presented. For large widths and times not very long, the adsorbed distributions are monotonically decreasing. The pair correlation functions of the adsorbates are also analyzed and may be used to distinguish cases of narrow and broad incident size distributions.

The rest of this work is organized as follows. In Sec.
we present the RSA models, information on the simulations, and the quantities to be analyzed. In Sec. III we present results for RSA of polydisperse mixtures of linear particles. In Sec. IV we present results for RSA of polydisperse mixtures of squares. Sec. V summarizes our results and present our conclusions.

II. MODEL, SIMULATIONS, AND BASIC QUANTITIES

A. The RSA models

The substrate in which particles adsorb is a square lattice in the xy-plane. The edge of a lattice site is \(a\), with corresponding site area \(a^2\). Adsorption of two types of particles are separately considered, namely linear particles and filled squares, which are illustrated in Fig. 1a.

FIG. 1. (Color online) (a) Example of linear (left) and square (right) particles with indication of their dimensionless sizes \(s\) and of the size \(a\) of the lattice site. (b) Incidence of linear particles in a partially filled lattice showing cases of accepted and rejected adsorption trials.

The particles sequentially incide at randomly chosen surface positions, moving in the z direction. A particle attaches to the surface only if all target sites are empty, i.e. if all positions \((x, y)\) occupied by the incident particle correspond to empty sites at the substrate. Otherwise, the adsorption attempt is rejected. Accepted and rejected adsorption attempts on a line are illustrated in Fig. 1b.

The length of a linear particle is \(sa\), where \(s\) is the number of sites that it occupies. The size \(s\) is chosen from a Gaussian distribution of average \(\mu\) and width \(\sigma\):

\[
Q(s) = \frac{1}{\sqrt{2\pi\sigma^2}} \exp \left[-\frac{(s-\mu)^2}{2\sigma^2}\right].
\]

Note that \(s\), \(\mu\), and \(\sigma\) are dimensionless quantities; alternatively, they are lengths given in units of the lattice constant \(a\). Only integer values of \(s\) between \(s = 1\) and \(s = 2\mu\) are chosen in our simulations, thus the normalization factor is slightly different from that in Eq. (1). The width-to-average ratio

\[
w = \frac{\sigma}{\mu}
\]

is the main quantity to characterize the shape of \(Q(s)\) and consequently the degree of polydispersity. Hereafter, \(Q(s)\) is simply called incident distribution.

In the deposition of a square particle, a discretization of \(Q(s)\) is also used to choose the lateral size \(s\) of the incident square. This particle has \(s^2\) sites and area \(s^2a^2\).

The basic time unit \(\tau\) is the time necessary to fill the whole substrate if all adsorption attempts are accepted. The complete filling of the substrate would be achieved, for instance, if the incidence of particles was ordered instead of random, so that no holes remained between the adsorbed particles. In a lattice with lateral size \(L\) (in lattice units), there are \(L^2/\mu\) attempts of linear particle adsorption in the time interval \(\tau\), and \(L^2/\mu^2\) attempts of square particle adsorption. The maximal adsorption rate (in an empty lattice) is \(1/\tau\), in number of monolayers per second. Due to the rejection of adsorption attempts (excluded volume effect), the actual adsorption rate is smaller than this value and decreases in time.

The deposition time is denoted as \(t\), but the model results will be presented as function of the dimensionless time

\[
t_D = \frac{t}{\tau}
\]

\(t_D\) is the number of incident monolayers. Reference to real time \(t\) will be usually left to discussion of possible applications.

Our model does not consider diffusion of adsorbed particles nor desorption. This static RSA assumption is supported by works on submonolayer growth with collective diffusion of adatoms at low temperatures [32]. The assumption may be justified at higher temperatures if the linear or square particles represent large molecules or colloidal particles whose energy barriers for diffusion are much larger than those of metal or semiconductor adatoms. The energy barrier for desorption is usually larger than that for surface diffusion, thus the no-desorption condition is also reasonable. A recent work on electrostatic adsorption of silica nanoparticles onto Si wafers also supports the use of irreversible RSA models [33].

For possible experimental tests, the model parameters can be related to the average particle flux \(F\), which is
defined as the number of incident particles per unit time and unit area. The flux of linear particles is

$$F_{\text{lin}} = \frac{1}{\mu \tau a^2}. \quad (4)$$

For square particles, the flux is

$$F_{\text{sq}} = \frac{1}{\mu^2 \tau a^2}. \quad (5)$$

**B. Basic quantities and simulation procedure**

The simplest quantity to be compared with experimental data is the surface coverage \( \theta \), defined as the fraction of the surface covered with adsorbed particles. Letting \( m(\vec{r}, t) \) be the occupation number of a site at position \( \vec{r} \) at time \( t \), with \( m = 1 \) for occupied and \( m = 0 \) for unoccupied, we have

$$\theta(t) = \langle m(\vec{r}, t) \rangle, \quad (6)$$

in which the average is taken over all \( \vec{r} \) in the \( xy \)-plane and different realizations.

In experimental works, the surface coverage is usually given as an areal density of particles \( \rho \), which is the number of molecules adsorbed per unit area. For linear particles, it is given by

$$\rho_{\text{lin}} \equiv \frac{N}{A} = \frac{\theta}{\mu a^2}, \quad (7)$$

and for square particles, it is given by

$$\rho_{\text{sq}} \equiv \frac{N}{A} = \frac{\theta}{\mu^2 a^2}. \quad (8)$$

Information on the adsorption dynamics can also be extracted from the size distribution of adsorbed particles, \( P(s, t) \), which is defined as the fraction of adsorbed particles with linear size \( s \) at time \( t \). If the incident flux has no dispersion \( (w = 0) \), we have \( P(s, t) = Q(s) \); however, in the polydisperse case, those distributions are different. Hereafter, \( P(s, t) \) is simply called adsorbed distribution.

Another important quantity is the pair correlation function

$$g(r, t) = \langle m(0, t) m(\vec{r}, t) \rangle - \theta^2, \quad r = |\vec{r}|, \quad (9)$$

in which the average is taken over different origins 0 and different realizations; the vector \( \vec{r} \) is taken only along the \( x \) and \( y \) directions due to the symmetry of the square lattice. In off-lattice RSA, \( g(r, t) \) is called radial distribution function and averages are taken along all substrate directions. The probability of finding an occupied site at distance \( r \) from another occupied site is related to \( g(r, t) \), thus this quantity measures the inhomogeneity of adsorbed mass distribution. The pair correlation function is advantageous over the size distributions for the applications of RSA because it does not require the identification of the size of each adsorbed particle.

In our simulations, incident distributions with \( 4 \leq \mu \leq 64 \) and \( 1/16 \leq w \leq 1/2 \) were considered for linear and square particles. For each set of parameters, \( 10^5 \) different realizations were used to calculate average values.

The simulation results for \( w \leq 32 \) presented here were obtained in lattices with lateral size \( L = 4096 \) (in lattice units) and periodic boundary conditions. Some simulations in larger lattices \((L = 8192)\) were also performed and showed very similar time evolution of the coverage, which indicated that finite-size effects were negligible. Thus, the results in lattices with \( L = 4096 \) were representative of infinitely large lattices with good accuracy. For \( w = 64 \), we present results in lattices with \( L = 8192 \) because this was the size in which finite-size effects became sufficiently small for linear particles. The finite-size effects for square particle adsorption were always smaller than those for linear particles with the same \( \mu \) and \( \sigma \); however, results for the same lattice sizes are presented for both particle shapes.

Fig. 2 shows the coverage evolution for linear and square particles with \( \mu = 64 \) and different values of \( \sigma \) in lattices with \( L = 8192 \) and \( L = 16384 \). The agreement of results in these sizes indicates that the smaller one can provide representative results for all large lattices.

![FIG. 2. (Color online) Check of finite-size effects by comparison of the coverage evolution in lattices with \( L = 8192 \) and \( L = 16384 \) of linear particle RSA with \( \mu = 64 \) and \( w = 1/16 \) and square particle RSA with \( \mu = 64 \) and \( w = 1/2 \).](image-url)
III. ADSORPTION OF LINEAR PARTICLES

A. Adsorbate configurations and coverage evolution

Figs. 3a-c show snapshots of a part of the surface at three different times during adsorption of particles with $\mu = 16$ and $w = 1/16$ ($\sigma = 1$), which is a case of low polydispersity. At short times (Fig. 3a), spatial ordering can be observed at lengthscales of the same order of the average particle size $\mu$, since series of particles are aligned at neighboring rows or columns (constant $x$ or $y$). The formation of domains of aligned particles becomes clearer as time and coverage increase (Figs. 3b,c).

At $t_D \sim 1$, the coverage typically exceeds 20%, thus a particle adsorbed in a given direction creates a large zone of exclusion for adsorption in the perpendicular direction. On the other hand, adsorption of aligned particles is allowed in that zone, which leads to the short range ordering. In on-lattice RSA models, the domains of aligned particles were first observed by Manna and Svarkic [34] and were recently illustrated in Ref. [35]. They were also shown in studies of anisotropy effects [22, 36] and in off-lattice RSA [37, 38]. These configurations resemble the nematic ordering observed for high densities in thermodynamic equilibrium adsorption of linear particles [40–44]. However, no long-range order and no phase transition is present in the irreversible RSA models.

Figs. 3d-f show snapshots of a part of the surface during adsorption of particles with $\mu = 16$ and $w = 1/2$ ($\sigma = 8$), which is a case of high polydispersity. Due to the enhanced flux of small particles, the aligned particle domains are smaller. As time increases, this short-range ordering is not enhanced.

Figs. 4a and 4b show the time evolution of the coverage for $w = 1/16$ (low polydispersity) and $w = 1/2$ (high polydispersity), respectively, with several average sizes $\mu$ in each case. These plots show the typical downward curvature of irreversible RSA problems because the fraction of the surface available for adsorption of new particles decreases as $t$ (and $\theta$) increases.

The asymptotic coverages are $\theta_\infty = 1$ because the monomer flux in nonzero in all distributions, which will eventually lead to complete filling. However, at the maximum simulated time $t_D = 1000$, the coverage is near 1 only for the smallest $\mu$ ($= 8$) and the largest $w$ ($= 1/2$) because this condition provides a high monomer flux.
many adsorption attempts. For the increase of coverage is slower due to the rejection of fixed $\mu S$ in RSA of monomers, we obtain $t$ as function of $\log (\theta)$ different scaling regimes discussed above. The slope of $S$ shows the same regimes [1]. The coverage in monomer RSA is hidden in a very narrow region near the vertical axis.

FIG. 5. (Color online) Coverage evolution of linear particle RSA in log-linear scale with fixed $w$ and variable $\mu$ [(a), (b)] and fixed $\mu$ and variable $w$ [(c), (d)]. The insets show the time evolution of the slope $S$ of the main plots.

B. Time scaling of the coverage

For $t_D \ll 1$, the coverage is very small, thus almost all adsorption attempts are accepted. For $t_D \sim 1$, the coverage reaches values between 0.1 and 1; in this case, the increase of coverage is slower due to the rejection of many adsorption attempts. For $t_D \gg 1$, the coverage is large (of order 1), thus adsorption of new particles is rare and $\theta$ increases very slowly. The linear plots of Figs. 4a-b highlight the third regime; the first two regimes are rare and $\theta$ increases very slowly. The dimensionless time $t_\theta$ is defined as that of the maximal value of $S$. The insets of Figs. 5a-d confirm the conclusion that $t_\theta$ is always of order 1, similarly to the RSA of monomers. A careful inspection of the peaks of $S$ gives

$$0.2 < \log (t_\theta) < 0.7$$

for all values of $\mu$ and $w$.

The dimensionless time $t_\theta$ is defined as that of the maximal value of $S$. The extreme values of this range are $\theta_{\min} \approx 0.2$ and $\theta_{\max} \approx 0.5$. In most cases, the coverage at $t_\theta$ is near $\theta_{\min} \approx 0.3$.

The universal location of the peaks of the slope $S$ is a remarkable feature of these RSA models and may be explored in applications. For instance, consider an adsorption process in which the peak of $d\theta/dt_\theta$ is measured...
at (real) time \( t = t_M = \tau t_S \). Eq. (11) may be inverted to give an estimate of \( \tau \) as

\[
0.2 t_M < \tau < 0.7 t_M. \tag{12}
\]

Now \( \tau \) can be related to the molecular flux and to the sticking coefficient by Eq. (4). If the average size \( \mu \) and the lattice constant \( a \) are also known, then Eq. (4) gives an estimate of \( F_{lin} \).

If this estimate differs from the value of \( F_{lin} \) predicted by the properties of the surrounding gas or solution, a possible explanation is the existence of a sticking coefficient \( c < 1 \). This coefficient is the probability that the adsorption of the incident particle actually occurs when it is not forbidden by the excluded volume condition; in our simulations, \( c = 1 \) was assumed.

The estimate \( \theta_S \sim 0.3 \) can be used with Eq. (7) to find an order of magnitude of the adsorbed mass. From Eq. (7) the total number of adsorbed particles in a substrate area \( A \) is \( N \sim 0.3 A / (\mu a^2) \). Thus, if the total adsorbed mass is \( M \) and the average particle mass is \( M_p \), we obtain \( M \sim 0.3 M_p A / (\mu a^2) \) at \( t = t_M \).

Note that these results are valid for any average particle size \( \mu \) and relative width \( w \). Although they do not predict accurate values, the knowledge of orders of magnitude of the quantities involved may be a first step to improve experimental work or modeling of a given process.

C. Extrapolation of the surface coverage

The convergence to the asymptotic coverage \( \theta_\infty = 1 \) is expected to be exponential, similarly to other irreversible RSA problems on lattices \([1, 21, 46]\):

\[
\theta = 1 - C \exp (-t_D/t_R), \tag{13}
\]

where \( C \) and \( t_R \) are constants.

Fig. 6 shows \( \log (1 - \theta) \) as function of \( t_D \) for some values of \( \mu \) and \( w \). An approximately linear decrease of \( \log (1 - \theta) \) is observed at the longest times, typically starting at \( t_D \) between 500 and 700. We estimated the parameters \( t_R \) and \( C \) in Eq. (13) from linear fits and show the values of \( t_R \) in Table III for all values of \( \mu \) not shown are in the range \([0.276, 0.416]\).

| \( \mu \) | \( w \) = 1/16 | \( w \) = 1/8 | \( w \) = 1/4 | \( w \) = 1/2 |
|---|---|---|---|---|
| 8 | 9530 | 2790 | 450 |
| 16 | 22700 | 10500 | 1450 | 1270 |
| 32 | 23700 | 11100 | 5050 | 2260 |
| 64 | 23600 | 11400 | 5500 | 3090 |

TABLE I. Relaxation time \( t_R \) of linear particle RSA.

These data clearly show that the relaxation time \( t_R \) increases as \( w \) decreases and \( \mu \) increases. The constant \( C \) has the same dependence on \( w \) and \( \mu \), but with much smaller variation. In all cases, a faster relaxation is expected for a larger flux of monomers and other small particles, since they are able to fill the narrow gaps between the previously adsorbed particles. Also note that \( t_R \) is much larger than the maximal simulated time \( t_D = 1000 \) in most cases; this is consistent with the large differences from full coverage in most of our data. However, this also means that the uncertainties in the estimates in Table III become larger; this is the probable reason why the trend of \( t_R \) increasing with \( \mu \) apparently fails for the largest particle sizes with \( w = 1/16 \).

Better fits of \( 1 - \theta \) may be obtained with stretched exponential decays similar to those proposed in Refs. 21, 45. However, the present problem fits the theoretical approach of Ref. 46, which supports the simple exponential form in Eq. (13). For this reason, we understand that the deviations from the linear behavior in Fig. 6 are indicative of scaling corrections to Eq. (13). Such corrections may help to explain the deviations from the expected trends in the estimates of long times \( t_R \) discussed above.

For fixed \( w \), the average size \( \mu \) has a significant effect on the coverage at \( t_D \sim 1 \) or longer, as shown in Figs. 5a, b. At \( t_D \gg 1 \), the general trend is that \( \theta \) decreases as \( \mu \) increases. This effect is more pronounced for broad distributions (Figs. 5a; \( w = 1/2 \)).

For fixed \( t_D \) and \( w \), \( \lim_{\mu \to \infty} \theta = \theta_n \) is finite, where \( \theta_n \) is the coverage of infinitely long needles. This limit is not equivalent to off-lattice aggregation of needles because here the adsorption is restricted to the \( x \) and \( y \) directions. In order to estimate \( \theta_n (t) \), we assume that

\[
\theta = \theta_n + C' \mu^{-\alpha} \tag{14}
\]

for fixed \( w \) and \( t_D \).

In Figs. 7a and 7b, we show \( \theta \) as function of \( \mu^{-\alpha} \) for different values of \( w \) and \( t_D \), with exponents \( \alpha \) chosen to provide the best linear fits of each data set. Those fits give the coverage \( \theta_n \) in the limit \( \mu \to \infty \) (\( \mu^{-\alpha} \to 0 \)). Table III shows the estimates of \( \theta_n \) and the fitting exponents \( \alpha \) for various \( w \) and times \( t_D = 10 \) and \( t_D = 100 \).

The coverage for the maximal simulated size \( \mu = 64 \) is also shown in Table III for comparison with \( \theta_n \).
relative difference between them ranges from 5% to 20%. Since the above extrapolations considered a restricted range of values of $\mu$, the estimates of $\theta_n$ may also have a large uncertainty. Thus, the coverage for the largest simulated size, $\mu = 64$, may be very different from that of larger $\mu$.

On the other hand, in the region of the peaks of $S$ (Fig. 5), the changes in the coverage are much larger than 20%. Thus, the value of $\log t_S$ in Eq. (11) (and consequently the order of magnitude of $t_S$) is not expected to have significant change for other values of $\mu$ and $w$.

**D. Adsorbed particle size distributions**

Figs. 8a-c show the adsorbed distributions $P(s, t)$ as function of the particle size $s$ at several times for $\mu = 64$ and three values of $w$.

If the incident distribution has small width ($w = 1/16$; Fig. 8a), the difference from the adsorbed distribution is small up to long times. The coverage at $t_D = 1000$ is $\theta \approx 0.7$. Possibly there will be significant changes in $P(s, t)$ when $\theta$ is close to 1, but this regime is expected to be observed at times longer by several orders of magnitude.

For an intermediate distribution width ($w = 1/4$; Fig. 8b), a small shift of the adsorbed distribution peak to $s < \mu$ is observed at $t_D = 1$; at $t_D \approx 100$, broadening of the distribution begins, still accompanied by the shift of the peak to smaller $s$. For the largest width ($w = 1/2$; Fig. 8c), a significant shift of the distribution peak is observed at $t_D \approx 1$. Subsequently, a secondary peak at $s = 1$ (monomers) appears and the distribution acquires a monotonically decreasing shape at $t_D \geq 100$.

The shift of the peak to smaller sizes and the broadening of the distribution (here observed for $w \geq 1/4$) parallel the features reported by Meakin and Jullien [25] for RSA of disks and by Adamczyk et al. [26] for RSA of spheres with Gaussian distributions of incident sizes. Recently, Marques et al. [27] studied the RSA of polydisperse disks on patterned substrates, showing adsorbed distributions with a secondary peak in small $s$ at short times and a monotonically decreasing shape at long times. This is similar to our findings for $w = 1/2$. However, in lat-
and used to check the applicability of this model. How-
broadening and formation of a peak at small
in that time range. In real adsorption processes, incident
the peak to

FIG. 8. (Color online) Solid curves are adsorbed distributi ons
of linear particles with incident average size
µ = 64 and se-
veral values of width w and time tD. The dotted curves are
the incident distributions Q(s).

tice RSA, the monotonic decay was formerly observed
only with uniform incident distributions [18, 20, 28] and
was independent of the distribution width and deposition
time.

Size distributions with a peak at small sizes or show-
ing a monotonic decrease are frequently observed in
temperature-driven coarsening. This is illustrated, for
instance, in one-dimensional island coarsening without
deposition [47] and in submonolayer growth dominated
by surface diffusion [48]. In general, high temperature
favors those features, thus they may be interpreted as
disorder effects. In the athermal RSA models, disorder
is represented by the width w of the incident distribu-
tion.

Since the peak of the coverage derivative S is located
at the universal region 1.5 < ts < 5 (Eq. 11), it is
interesting to investigate the adsorbed distributions in this
time interval. For w ≤ 1/8, that distribution is still very
close to the incident one. For w = 1/4, P(s, tS) has an
approximately Gaussian shape, but with a small shift of
the peak to s < µ (Fig. 3c). For w = 1/2, significant
broadening and formation of a peak at small s is observed
in that time range. In real adsorption processes, incident
and adsorbed distributions at t = tM may be compared
and used to check the applicability of this model. How-
ever, estimating P(s, t) may be a difficult task because
it is necessary to measure the individual sizes of tightly
packed particles. Moreover, the size distribution statis-
tics is frequently poor due to the small number of samples
and small image sizes.

Our simulations are limited to tD ≤ 1000, but we
may speculate about the distributions at much longer
times. The jamming coverages θjam(µ) for RSA of linear
particles of fixed size µ [49] are helpful for this discus-
sion: θjam(2) ≈ 0.91, θjam(8) ≈ 0.75, θjam(16) ≈ 0.71,
θjam(32) ≈ 0.689, θjam(64) ≈ 0.68. Inspection of Figs. 4
shows that all these values have been exceeded in RSA
of our polydisperse mixtures at tD = 1000, thus it is
very difficult that particles with size s ≈ µ can adsorb
at longer times. Adsorption at longer times is conse-
quently dominated by small particles, with s ≪ µ, which
will cover the remaining empty sites (20% to 30%). Since
the jamming coverage for dimers (µ = 2) is ~ 10% below
the full coverage, we expect that full coverage occurs with
a monomer fraction of this order.

In cases of broad incident distributions, e. g. w = 1/2,
we expect that the monotonic decay shown in Fig. 8a is
enhanced at much longer times. In cases of narrow inci-
dent distributions, e. g. w = 1/16, the densities of large
adsorbed particles at tD = 1000 is large (P ≈ 0.1 and
half-width Δs ≈ 10). Thus, we expect that the peak of
the adsorbed distribution in Fig. 8a is slowly shifted
to smaller s as time increases, but it is not expected to
disappear. Instead, near full coverage, this peak is ex-
pected to exist together with a monotonically decreasing
region beginning at s = 1.

E. Pair correlation function

Figs. 8b-c show g(r, t)/g(0, t) as function of the scaled
distance r/µ for several times and several values of µ
and w. The results for µ = 8 are quantitatively similar,
thus the results in Figs. 4-8c are representative of linear
particles of all lengths. Those plots highlight features for
r on the same order of magnitude of µ, similarly to works
on models with continuous size distributions [2].

For w = 1/16 (Fig. 8b), g monotonically decreases
at short times and acquires a minimum at r ≈ µ at tD ≈ 10.
This minimum remains at longer times, up to coverages
near 70% that are obtained at tD = 1000. The typical
size of blocks of ordered particles is close to the average
length µ, as illustrated in Figs. 3b-c. This is the typical
distance between regions of filled and empty sites, thus
the minimum of g(r) is a consequence of the ordering
of adsorbed particles. The typical distance between the
first minimum of g and the subsequent maximum is Δr ∼ 0.5µ
because the depleted regions range from one lattice site
to the average incident size µ. Similar results are observed
in adsorption of monodisperse particles [36].

For w = 1/4 (Fig. 8c), the correlation function has
a very shallow minimum at tD ≈ 10. The shift of this
minimum to smaller r/µ is significant as time increases,
but the depth is still very small. For w = 1/2, shallow
minima of g with faster displacement to smaller r/µ are
However, there is no alignment. However, dispersity. The short-range structure differs from that of linear particles because there is no alignment. The coverage because it probes the spatial organization.

The study of the pair correlation function is suitable for this type of investigation because it does not require identification of sizes of individual adsorbed particles, in contrast to the comparisons of size distributions. $g(r,t)$ is also advantageous over the coverage because it probes spatial organization.

IV. ADSORPTION OF SQUARE PARTICLES

A. Adsorbate configurations

Figs. 10b-c show snapshots of a part of the surface at three different times during adsorption of particles with $\mu = 16$ and $w = 1/16 (\sigma = 1)$, which is a case of low polydispersity. The short-range structure differs from that of linear particles because there is no alignment. However, the inhomogeneity of mass distribution is similar: there are depleted regions with lateral sizes between 1 and $\mu$ in which particles with the average size cannot adsorb.

Figs. 10d-f show snapshots of a part of the surface at three different times during adsorption of particles with $\mu = 16$ and $w = 1/2 (\sigma = 8)$, which is a case of high polydispersity. The much higher flux of small particles fills the gaps between particles of average size, thus the adsorbate is more homogeneous, particularly for the longer times.

B. Coverage evolution

Figs. 12a and 12b show the time evolution of the coverage for $w = 1/16$ and $w = 1/2$, respectively, with various average sizes $\mu$ in each case. Figs. 12c and 12d show the time evolution of $\theta$ for $\mu = 8$ and $\mu = 64$, respectively, with various widths $w$ in each case. The plots with logarithmic time scale also show regions of maximal slopes for $t_D \sim 1$, similarly to the adsorption of linear particles. This is confirmed in the insets of Figs. 12a-d, which show the evolution of the slope $S$.

If $w$ is fixed and $\mu$ increases, a small shift of $t_S$ to shorter times is observed, in contrast with the linear case. The same shift is observed if $\mu$ is fixed and $w$ increases. However, the $S$ peaks are also located in a narrow range of $t_D$ in logarithmic scale; for all values of $\mu$ and $w$ studied here, we obtain

$$-0.5 < \log (t_S) < 0. \quad (15)$$

The coverages in this time interval range from $0.1$ to $0.3$, thus the typical value of the coverage at $t_S$ is of order $\theta_S \sim 0.2$.

If this model is applied to an adsorption process in which the peak of $d(\theta)/d(\log t)$ is measured at real time $t_M \equiv \tau t_S$, then Eq. (15) leads to $0.3 \tau < t_M < \tau$. This relation can be inverted to give the estimate

$$t_M < \tau < 3t_M. \quad (16)$$

The time $\tau$ can be related to the molecular flux by Eq. (8); if this flux is known, then a sticking coefficient may be estimated.

The above estimate of $\theta_S$ and Eq. (8) give the total number of adsorbed particles in a substrate area $A$ as $N \sim 0.2A/(\mu a)^2$ at $t = t_M$. If the total adsorbed mass is $M$ and the average particle mass is $M_P$, we obtain $M \sim 0.2M_P A/(\mu a)^2$. These results are valid for any $\mu$ and $w$, but again they relate only the orders of magnitude of those quantities.

Fig. 11 compares the coverage evolution with linear and square particles with the same incident size distributions $Q(s)$. At short times ($t_D \sim 1$), $\theta$ is larger with squares. In this regime, most of the substrate is empty, thus the adsorption of a single square of $s^2$ particles is highly probable and instantaneously blocks a region of lateral size $s$ for future adsorption.
C. Extrapolations of surface coverage

The simple exponential decay of Eq. (13) is also expected to describe the coverage variation at long times because the square particle RSA is consistent with the theoretical approach of Ref. [46]. However, the deviations are larger than those of linear particle adsorption up to $t_D = 1000$, which indicates the presence of huge scaling corrections to the form in Eq. (13).

Despite these concerns, we estimated the relaxation times $t_R$ from linear fits of $\log(1 - \Theta) \times t_D$ and show them in Table IV. C. We observe that $t_R$ increases with $\mu$ and decreases with $w$, which is again consistent with a faster relaxation when the flux of monomers and other small particles increases. However, all tabulated values of $t_R$ are larger than the maximal simulated time, which suggests the possibility of deviations at much longer times.

| $\mu \backslash w$ | 1/16 | 1/8 | 1/4 | 1/2 |
|------------------|------|-----|-----|-----|
| 8                | 12500| 5160| 2120|     |
| 16               | 25200| 13900| 7190| 4220|
| 32               | 25600| 15200| 8450| 5870|
| 64               | 27800| 15700| 9200| 6900|

TABLE III. Relaxation time $t_R$ of square particle RSA.

Figs. 12a-b show that the average size $\mu$ has a small effect on the coverage if the ratio $w$ is constant and $t_D \leq 10$. The general trend is $\Theta$ to decrease as $\mu$ increases, for fixed $t$ and $w$. Comparison of data for constant $\mu$ and varying $w$ (Figs. 12c,d) also show a small effect of $w$ up to $t_D \sim 100$. These results contrast with the RSA of
linear particles, in which a significant dependence of the coverage on \( \mu \) and \( w \) was observed at \( t_D \sim 1 \) or longer.

For fixed time and fixed \( w \), the dependence of \( \theta \) on \( \mu \) also fits Eq. (14), with \( \theta_n(t) \) interpreted as the coverage of infinitely large squares at time \( t \). Table IVC shows the estimates \( \theta_n \) obtained in the extrapolations performed for various \( w \) and times \( t_D = 10 \) and \( t_D = 100 \). The fitting exponents \( \alpha \) (Eq. (14)) are also shown in Table IVC. The small variation of \( \theta \) with \( \mu \) indicates that results for the largest size \( \mu = 64 \) represent quantitatively the RSA of squares with much larger sizes. This is an important result to justify the generalization of our estimates of \( t_S \) and \( \theta_S \) to any \( w \) and \( \mu \).

Estimates of jamming coverages in lattice RSA of squares of fixed size (monodisperse) are provided in Refs. 50–52: for size \( \mu = 30 \), it is \( \theta_{jam} = 0.574 \), and for infinitely large squares, extrapolations give \( \theta_{jam} = 0.564 \). This shows a small dependence on the size \( \mu \), similarly to our results. In RSA of parallel squares in the continuum, the jamming coverage is \( \theta_{cont} = 0.562 \). At \( t_D = 100 \), our estimates of \( \theta_n \) for \( w = 1/4 \) and \( w = 1/2 \) exceed the jamming limit of infinite squares in the lattice and of parallel squares in the continuum. For \( w = 1/16 \), our estimate is slightly smaller than that value, but the difference is below 2%. Thus, even with small polydispersity, a coverage near the jamming limits of lattice or continuum squares of fixed size is reached at times of order 100 \( \tau \).

### D. Adsorbed particle size distribution

Figs. 13a–c show the evolution of the adsorbed distribution for \( \mu = 64 \) and three values of \( w \). The distributions for smaller values of \( \mu \) are approximately the same.

For a small width (\( w = 1/16 \); Fig. 13a), the difference from the incident distribution is small up to long times. At \( t_D = 1000 \), only a small shift of the peak to \( s < \mu \) is

**TABLE IV. Estimated coverage \( \theta_n \) of infinitely large squares, fitting exponents \( \alpha \), coverage \( \theta (\mu = 64) \) of the largest simulated square particles, and relative difference \( \Delta \theta \) between those coverages for the indicated distribution widths \( w \) and times \( t_D \).**

| \( w \)  | \( t_D \) | \( \theta_n \) | \( \alpha \) | \( \theta (\mu = 64) \) | \( \Delta \theta \) (%) |
|--------|--------|------------|--------|----------------|-------------|
| \( 1/2 \) | 10     | 0.4634     | 1.01   | 0.4709         | 1.6         |
| \( 1/4 \) | 10     | 0.4815     | 1.06   | 0.4878         | 1.3         |
| \( 1/16 \) | 10    | 0.4840     | 0.99   | 0.4911         | 1.4         |
| \( 1/2 \) | 100    | 0.5719     | 1.05   | 0.5837         | 2.0         |
| \( 1/4 \) | 100    | 0.5823     | 1.04   | 0.5918         | 1.6         |
| \( 1/16 \) | 100   | 0.5550     | 0.98   | 0.5636         | 1.5         |

FIG. 12. (Color online) Coverage evolution of square particle RSA in log-linear scale with fixed \( w \) and variable \( \mu \) [(a), (b)] and fixed \( \mu \) and variable \( w \) [(c), (d)]. The insets show the time evolution of the slope \( S \) of the main plots.
observed; the coverage at this time is $\theta \approx 0.6$. Again, the shape of the adsorbed distribution may change at much longer times due to the very slow adsorption of small particles. For width $w = 1/4$ (Fig. 13b), a small shift of the distribution peak is observed at $t_D = 1$.

![Graph](image)

**FIG. 13.** (Color online) Solid curves are adsorbed distributions of square particles with incident average size $\mu = 64$ and several values of width $w$ and time $t_D$. The dotted curves are the incident distributions $Q(s)$.

The shift is enhanced at longer times and broadening of the distribution is clear at $t_D = 100$. For the largest width ($w = 1/2$; Fig. 13c), a significant shift of the distribution peak is observed at $t_D \approx 1$, but it still has a shape similar to a Gaussian; for $t_D \approx 10$, the monomer peak ($s = 1$) is formed, and for $t_D \sim 100$, the distribution is monotonically decreasing.

In RSA of disks with Gaussian radius distributions, a different shape of adsorbed distribution is observed for large width-to-average ratio. For instance, for $w = 0.175$ and long times, the initial peak is shifted to $s$ slightly smaller than the average radius ($R$) and a second, higher peak is developed at $s \sim R/3$. This peak is present because the available space between the first adsorbed disks can be filled by other disks whose radii are not much smaller than the average. This is a particular feature of particles with rounded shapes. On the other hand, in the RSA of squares on a lattice, the excluded volume condition has a much more drastic effect, so that only monomers ($s = a$) and other small squares can be adsorbed in a dense region. This preferential adsorption of the minimum-sized particles was formerly observed in continuum models with uniform incident distributions.

The adsorbed size distribution at $t_S$ is similar to the incident distribution for all values of $\mu$ and $w$ up to $w = 1/4$ (recall that $t_S < 1$ for squares; Eq. 15). Broadening and formation of the peak at the monomer size are observed only for times much longer than $t_S$ or for larger $w$ (e.g., $w = 1/2$; Fig. 13).

**E. Pair correlation function**

Figs. 14a-c show $g(r, t)/g(0, t)$ as function of the reduced distance $r/\mu$ for $\mu = 64$, three ratios $w$, and several times. The results for smaller values of $\mu$ are approximately the same.

![Graph](image)

**FIG. 14.** (Color online) Scaled pair correlation as function of the scaled distance for square particles with average incident size $\mu = 64$ and several values of width $w$ and time $t_D$.

For $w = 1/16$ (Fig. 14a), a minimum of $g$ begins to form at $t_D \approx 1$ and is deeper at $t_D = 10$, which is one order of magnitude longer than $t_S$. As $t$ increases, the depth of this minimum is reduced; this means that ordering of neighboring filled and empty regions is reduced. On
the other hand, the maximum of $g$ increases in time and is located at $r \approx 1.5\mu$; this occurs because squares of size $\approx \mu$ are separated by distances ranging from 0 to $\mu$, whose average is $\mu/2$, similarly to the case of linear particles.

For $w = 1/4$ (Fig. [14b]), a shallow minimum of $g$ is observed at $t_D = 1$. The maximum is also reduced due to the adsorption of particles of smaller sizes, particularly at long times. For $w = 1/2$, the oscillatory structure of $g$ disappears.

Since $t_S < 1$, a minimum of $g$ may be observed only for very small $w$ at $t_S$ (e. g. $w = 1/16$; Fig. [14]). The clear oscillatory structure of $g$ may observed for $w \leq 1/8$, but at times of order $10t_S$ and longer.

V. DISCUSSION AND CONCLUSION

We studied RSA of particles on square lattices with incident sizes following discretized Gaussian distributions and with conditions of no diffusion and no desorption.. The RSA of linear particles and square particles were separately considered.

We observed that plots of coverage as function of the logarithm of time are suitable to determine the order of magnitude of the monolayer deposition time $\tau$. Those plots have maximal slopes $S$ at real time $t_M \sim \tau$ (dimensionless time $t_S \sim 1$), similarly to the exactly solvable case of RSA of monomers. A detailed analysis of the peaks of $S$, including effects of particle size and polydispersity, shows that $1.5\tau < t_M < 5\tau$ for linear particles and $0.3\tau < t_M < \tau$ for square particles. These particle shapes may be viewed as limiting cases of the cross section of a large variety of nanostructures. From the estimates of $\tau$, the orders of magnitude of molecular fluxes and/or sticking coefficients may also be estimated.

Extrapolations of coverage data show that results obtained for average linear particle size $\mu = 64$ are qualitatively similar to those expected in much larger sizes, with possible discrepancies up to 20%. For square particles, results for the largest studied particle size $\mu = 64$ are quantitatively reasonable for any larger size. This suggests that square particle results may used as a first approximation in adsorption studies of particles with other compact shapes and aspect ratios close to 1.

The adsorbed particle size distributions slowly change in time for small relative widths $w$ of the incident distribution ($w \leq 1/8$) with both particle shapes. At long times ($t \sim 100\tau$ or longer) and $w = 1/4$, a significant shift of the distribution peak and broadening are observed.

For $w = 1/2$, a monotonically decreasing distribution is observed at $t \sim 100\tau$ because most adsorbed particles are small.

Comparison of incident and adsorbed distributions at $t_S$ (maximum of $S$) shows that they are similar for $w \leq 1/8$. For $w = 1/4$, the adsorbed distribution is slightly shifted to the left, and for $w = 1/2$ there are significant differences in those distributions even at short times.. The reliability of the model for a given application may be tested by checking the consistency with these features.

The pair correlation function $g(r,t)$ is also able to distinguish small and large widths $w$ in the RSA of linear and square particles. For small incident widths ($w \leq 1/8$), the minimum of $g$ is beginning to be formed at $t_S$. A clear oscillatory structure, with a minimum at $r \approx \mu$ and maximum at $r \approx 1.5\mu$, is observed at times typically of order $10t_S$. For linear particles, this structure is enhanced at much longer times due to alignment effects, but the opposite trend is observed with square particles.

Previous works have analyzed effects of polydispersity in RSA models. Some of them considered Gaussian distributions of incident particle size [25, 28] in off-lattice RSA. However, the present work is not a simple lattice extension of those RSA models of Gaussian mixtures. It also advances by showing how the properties of the coverage evolution can be combined with the study of other quantities (e. g. size distributions and correlation functions) to estimate characteristic times and sizes and, possibly, physico-chemical parameters such as molecular flux and sticking probabilities. For this purpose, our analysis focused on the model features at times of order $\tau$ instead of long time features.

We believe that our approach may be useful for future experimental work because it suggests a procedure to identify the characteristic time $\tau$ and shows how the adsorbate features at times of this order are related to polydispersity. Our results may also be useful in future RSA studies, for instance to models including particle interactions, particle mobility, and other particle shapes and substrate structures [54, 55]. The detailed study of features at times of order $\tau$ may also be interesting in off-lattice (continuum) RSA, for instance considering the variety of particle shapes studied in recent works for modeling compact and branched structures [56, 57].

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