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Nonequilibrium self-organization of colloidal particles on substrates: adsorption, relaxation, and annealing

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Abstract
Colloidal particles are considered ideal building blocks to produce materials with enhanced physical properties. The state-of-the-art techniques for synthesizing these particles provide control over shape, size, and directionality of the interactions. In spite of these advances, there is still a huge gap between the synthesis of individual components and the management of their spontaneous organization towards the desired structures. The main challenge is the control over the dynamics of self-organization. In their kinetic route towards thermodynamically stable structures, colloidal particles self-organize into intermediate (mesoscopic) structures that are much larger than the individual particles and become the relevant units for the dynamics. To follow the dynamics and identify kinetically trapped structures, one needs to develop new theoretical and numerical tools. Here we discuss the self-organization of functionalized colloids (also known as patchy colloids) on attractive substrates. We review our recent results on the adsorption and relaxation and explore the use of annealing cycles to overcome kinetic barriers and drive the relaxation towards the targeted structures.

Keywords: nonequilibrium dynamics, self-organization, adsorption on substrates, relaxation dynamics, annealing

(Some figures may appear in colour only in the online journal)
equilibrium conditions. Experimentally, this assumption would imply that the characteristic time of the external perturbations is much larger than the necessary time to relax towards equilibrium. Such studies benefit from a well-established theoretical framework and provide valuable information on the system free energy, self-healing mechanisms, and aging. However, in practice, equilibrium is an exception rather than the rule. Real structures are typically obtained under nonequilibrium conditions and the kinetics of growth and relaxation cannot be neglected. In particular, colloidal particles usually self-organize into mesoscopic kinetic structures much larger than the individual constituents. Their relaxation involves concerted moves and thus, the lifetime of each state increases strongly with the number of constituents. When such structures span the entire system, for example, a gel, the lifetime may diverge with the system size and the access to the thermodynamic structures is strongly compromised [14–16]. The probability of observing a given kinetic structure is not necessarily dependent on its absolute free energy, but mainly on the size and accessibility of its basin of attraction in the energy manifold. For very corrugated energy landscapes, the system explores the energy manifold through thermally activated processes, hoping from basin to basin, where the mean residence time in each state depends on the possible paths to leave it and their corresponding energy barriers. New numerical and theoretical tools are then needed to investigate how competing timescales take the system away from equilibrium and to provide insight on the feasibility of the thermodynamic structures.

As an example, we consider the self-organization of colloidal particles on attractive substrates when relaxation is slower than aggregation, so the emerging kinetically trapped (percolating) structures prevent the evolution towards equilibrium. Studies of self-assembly have focused on the bulk, neglecting boundary effects. Yet, the presence of a surface or interface improves the control over aggregation [17–24]. For example, in the limit of irreversible binding, the assembled structures differ dramatically from the thermodynamic ones [25–28]. We also consider colloidal particles with limited valence, known as patchy colloids. The absence of directional links in isotropic colloids limits the control of the final structure [5, 29]. In contrast, patchy colloids, decorated with \( n \) attractive patches on their surface, permit a fine control of colloidal valence and of the local arrangements. They are a powerful tool for engineering the assembly of target structures and give the possibility of obtaining very-low-density networks of connected particles, which form gels [30, 31]. In the last years, experimental and theoretical studies have investigated how the number, type, and distribution of patches can affect the aggregation process and, consequently, the assembled structures [32–39]. It has been reported that controlling the valence, allows tuning the density and temperature of both the gas–liquid and sol–gel transitions [36, 40]. Patchy models with \( n \) lower than 12 have been shown to disfavor dense local configurations, broadening the region of stability of the liquid phase in the temperature-density plane [41]. More recently, a new class of patchy colloids was proposed, combining limited valence with flexibility in the patch positions, leading to even richer phase diagrams [42].

The manuscript is organized in the following way. We discuss the limit of irreversible adsorption in section 2 and the dynamics of relaxation in section 3. The possibility of using annealing cycles to relax kinetically trapped structures is discussed in section 4. We make some final remarks in section 5.

### 2. Irreversible adsorption

The dynamics of colloidal particles on substrates results from a balance between the adsorption/desorption of particles and the aggregation/relaxation of the colloidal structures. Let us consider strongly attractive substrates, such that desorption is practically negligible within the timescale of interest. Thus, the number of colloidal particles on the substrate increases monotonically in time. The relevant timescale is the inter-arrival time (inverse flux), which corresponds to the typical time between two adsorption events and should depend on the concentration and mobility of the colloidal particles in solution (bulk). The aggregation/relaxation is a more complex process. Initially, it depends only on the number and diffusion coefficient of the particles on the substrate. As the dynamics evolves, aggregates of different size and shape are formed leading to a hierarchy of relaxation times. While diffusion of individual particles occurs in the Brownian timescale (of the order of a second), the relaxation of aggregates might take hours or even days.

To study the role of limited valence and the directionality of interactions on the adsorption of patchy particles on substrates, we have considered, as a first approximation, the limit of irreversible adsorption [43–50]. The inter-arrival time is much shorter than any relaxation timescale and thus the particles are considered immobile once adsorbed on the substrate. To address this limit, we have proposed a discrete kinetic model for aggregation that is a generalization of the well-known ballistic deposition model to include the directionality of interactions [51]. Accordingly, particles are considered spherical with \( n \) patches equally spaced on their surface. The particle–particle interaction is pairwise and it is described as an excluded volume interaction. The patch–patch interaction is short range and described in a stochastic way, as explained next. We assume that patches of two different colloids can form bonds only upon collision. We define an interaction range on the surface of the colloidal particle, surrounding each patch, parameterized by an angle \( \theta \). When two particles collide, if the contact point is within the interaction range of their patches, then the two particles form an irreversible bond mediated by these patches. In the simulation, since only one colloid moves at a time, the formation of a bond occurs stochastically with probability \( p \), when the moving particle collides within the interaction range of a patch of the immobile one, \( p \) corresponds to the fraction of the surface of the moving particle covered by the interaction range of all \( n \) patches.

Particles are sequentially released from a random position above the growth front and move ballistically (vertically) towards the substrate. If they hit the substrate without overlapping any previously adsorbed particle, they immediately stick to it irreversibly with a random orientation. However, if they
collide first with a previously adsorbed particle, the pairwise interaction described previously is considered. If the formation of a bond is not successful, the particle is discarded and a new one is released from a random position above the growth front.

By neglecting any relaxation, it is possible to access very large length and timescales. Performing kinetic Monte Carlo simulation, we were able to show that the kinetic structures are significantly different from the thermodynamic ones and that they depend strongly on the number of patches [27, 52], patch–patch correlations [28, 53, 54], and mechanism of mass transport [51]. We have also identified a very rich critical behavior of the interfacial properties. In the simplest case of three-patch particles, we have found two new absorbing phase transitions depending on the opening angle between the patches [53]. A careful scaling analysis reveals that one of these absorbing phase transitions changes from discontinuous to continuous at a tricritical flexibility of the bonds [55]. We have also extended our stochastic model to study particles with distinct patch–patch interactions [28, 54]. For particles with two types of patches, we reported a crossover of the patch interactions [28, 54]. For particles with distinct patch behavior of the interfacial properties. In the simplest case of three-patch particles, we have found two new absorbing phase transitions depending on the opening angle between the patches [53]. A careful scaling analysis reveals that one of these absorbing phase transitions changes from discontinuous to continuous at a tricritical flexibility of the bonds [55].

### 3. Relaxation dynamics

For sufficiently weak particle–particle interactions or long timescales, the non-equilibrium structures discussed in the previous section are expected to relax and eventually reach equilibrium. To study such relaxation dynamics, we consider now a three-dimensional system of spherical colloidal particles, with three patches equally distributed along the equator. To follow the individual particles, we performed Langevin dynamics simulations using LAMMPS [56]. As we proposed in [14], colloidal particles are described as spheres of radius $R$ and mass $m$, with three patches fixed at a distance $R$ from the center, forming an opening angle of $2\pi/3$. The particles representing the patches are of zero diameter and mass $10^{-3} m$, which is practically negligible for the dynamics. Their relative position to the center of the core is fixed at all times. The interaction between colloids is repulsive, described by the potential,

$$V_{\text{rep}} = \frac{A}{k} \exp\{-k[r-(R_i+R_j)]\},$$

where $r$ is the distance between the center of the particles, $R_i$ and $R_j$ are the effective radii of the two interacting particles, $A = 1$ is the interaction strength (in units of $k_B T/2R$) and $k = 40$ the inverse of the screening length (in units of the inverse particle diameter $(2R)^{-1}$); the interaction between patches is described by an attractive inverted Gaussian potential [14, 57], defined as,

$$V_{\text{att}} = -\epsilon \exp(-\sigma r^2),$$

where $\epsilon = 40$ (in units of $k_B T$) is the interaction strength and $\sigma = 10^3$ in units of the inverse squared particle diameter.

The isotropic particle–substrate interaction is obtained from the Hamaker theory for two spheres [58] in the limit where the radius of one of the particles diverges. This gives an attractive $V_{\text{att}}$ and a repulsive $V_{\text{rep}}$ potential, defined as,

$$V_{\text{att}} = -\frac{A_H}{6} \left[ \frac{2R}{D} \frac{R+D}{D+2R} + \ln \left( \frac{D}{D+2R} \right) \right],$$

and

$$V_{\text{rep}} = \frac{A_H\sigma^6}{7560} \left( \frac{6R-D}{D^2} + \frac{D+8R}{(D+2R)^2} \right),$$

respectively, where $A_H$ is the Hamaker’s constant and $D$ is the distance between the surface of the particle and the substrate.

To resolve the stochastic trajectories of the particles, we integrated the corresponding Langevin equations of motion for the translational and rotational degrees of freedom,

$$m\ddot{\mathbf{r}}(t) = -\nabla_{\mathbf{r}} V(\mathbf{r}, \mathbf{\theta}) - \frac{m}{\tau} \dot{\mathbf{v}}(t) + \sqrt{\frac{2mk_B T}{\tau}} \mathbf{\xi}(t),$$

and

$$I\dot{\mathbf{\omega}}(t) = -\nabla_{\mathbf{\theta}} V(\mathbf{r}, \mathbf{\theta}) - \frac{I}{\tau} \dot{\mathbf{\omega}}(t) + \sqrt{\frac{2k_B T}{\tau}} \mathbf{\xi}(t),$$

where $\mathbf{\mathbf{v}}$ and $\mathbf{\omega}$ are the translational and angular velocities, $m$ and $I$ are the mass and inertia of the colloidal particles, $V$ is the pairwise potential, and $\mathbf{\xi}(t)$ is the stochastic term drawn from a random distribution with zero mean. We considered a relation between damping times $\tau = 10\tau_B/3$. For the sake of generality, time is given in units of the Brownian time, defined as $\tau_B = (2R)^2/D$, where $D = k_B T/\gamma m$, is the translational diffusion coefficient.

The initial structures were obtained with the stochastic model described in the previous section. They consist of 5120 particles adsorbed on a substrate of lateral size $L = 16$, in units of the particle diameter. For the dynamics, we considered $\gamma = 0.1$ and $k_B T = 1$. Figure 1 shows, for different instants of time, (a) the particle density $\rho(z)$, defined as the number of particles per unit volume, and (b) the bond density $\eta(z)$, as a function of the distance to the substrate $z$. While the particle density profile does not change significantly in time, the bond density does increase by more than 40%. Figure 2 depicts snapshots at the same instants, where the number of bonds per particle is indicated by the particle color. For the thermostat temperature considered, no bond breaking is observed within the time scale of the simulation ($10^3\tau_B$). Rather, the relaxation dynamics is driven by the formation of new bonds, maximizing the number of bonds per particle. As one starts from a singly connected, tree-like structure, loops are formed every time a new bond is established, which is expected to affect the mechanical properties of the colloidal network.

To characterize the initial stage of adsorption, in [14], we focused on the submonolayer regime, where the number of adsorbed particles is not enough to completely cover the substrate. We found that, even in this case, the relaxation towards thermodynamic phases is hindered by the formation of kinetically trapped structures that are stable over long timescales (see figure 3). From the time evolution of the number of different aggregates $N_i$, we identified two relaxation regimes.
To explore this possibility, we consider now the same system, but start from a number of adsorbed patchy particles that correspond to the coverage of the honeycomb lattice, $\pi l / [3 \tan(\pi/3)]$. Figure 5(a) shows a snapshot obtained after relaxing for $10^3 t_B$. Figure 5(b) is the radial distribution functions, defined as,

$$N(r, \delta r) = \sum_{i,j \geq 1} g(r_{ij} - r, \delta r) r_f,$$

where, $N_p$ is the total number of particles, $r_{ij}$ is the distance between each pair of particles and $g(r_{ij} - r, \delta r)$ is one, if $|r_{ij} - r| < \delta r$, and zero, otherwise. For a honeycomb lattice we expect two peaks: at $r = 1$ and $r = \sqrt{3}$, corresponding to the dashed lines $p_1$ and $p_2$, respectively. Instead, we observe a much broader distribution. Figure 5(c) is an angular distribution function for the patch–patch bond orientation, where $\alpha$ is the angle between two bonds of the same particle. A honeycomb lattice is characterized by a peak ($p_3$) at $\alpha = 2/\pi$. Clearly, due to thermal fluctuations and practically irreversible bonds, the obtained structure differs significantly from the honeycomb lattice.

To illustrate the advantage of annealing cycles, after an initial relaxation for $10^3 t_B$ we performed annealing cycles for an additional period of 2000$t_B$. Accordingly, the patch–patch interaction is switched off for periods of $(2f)^{-1}$, followed by a period of the same length where the patch–patch interaction is on. Thus, $f$ is the frequency of the annealing cycle in units of $t_B^{-1}$. Figures 6(d) and (e) show the dependence of the peaks of the radial and angular distribution functions on $f$. We find an optimal value of $f \approx 60$, where the intensity of the peaks is maximized.

We hypothesize that the optimal frequency results from two competing mechanisms: the rotational and the translational diffusions. While the former dominates at higher frequencies; the latter is the dominant one at lower ones. At high frequencies, the time interval for which the interaction is off is not long enough for the orientation of two previously connected patches to decorrelate or two new patches to align. This alignment is indeed a key mechanism for a particle with only two bonds to form a third one, since the spatial constraints imposed by the two connections significantly hinder relaxation. At low frequencies, the particle–particle correlations decay drastically before bonds are switched on again and, at every bond-on period of the cycle the dynamics resembles that at the initial relaxation time.

5. Final remarks

The dynamics of adsorption and relaxation of patchy particles on substrates is very rich, involving a hierarchy of processes occurring at different (length and time) scales. With a stochastic model of aggregation, it is possible to access the very long scales necessary to observe critical interfacial phenomena. Studies of the stochastic (Langevin) dynamics revealed a fast and slow relaxation. The latter stems from the formation of mesoscopic kinetic structures, the very slow
relaxation of which involves concerted moves, and thus compromises the feasibility of the thermodynamic structures.

To overcome these kinetically arrested structures and relax the system towards the target structures, we have explored the use of annealing cycles of switching patch–patch interactions on and off. The numerical results reveal the existence of an intermediate optimal frequency at which the target structural properties are maximized in a given time. Future work should explore further this possibility. It is important to characterize how this optimal frequency depends on the number of patches and on the number of adsorbed particles. Also, exploring the efficiency of annealing protocols on other colloidal systems, such as heterogeneously charged particles on substrates [62], will elucidate on how the protocol should depend on the nature of the particle–particle, patch–patch, and particle–substrate interaction potentials.

Studies of colloidal particle adsorption on substrates are of scientific and technological interest. From the theoretical

Figure 2. Snapshots for 5120 patchy particles on a substrate of lateral size $L = 16$, in units of the particle diameter. Snapshots are at different instants of time, namely, $t = \{0, 1, 10, 10^2, 10^3\}$, in units of the Brownian time $\tau_B$. The color of each particle indicates its number of bonds.

Figure 3. Snapshots for 614 patchy particles adsorbed on a substrate of lateral size $L = 32$, in units of the particle diameter, at different instants of time, namely, $t = \{0, 1, 10, 10^2, 10^3\}$, in units of the Brownian time $\tau_B$. Different colors are different aggregates of connected particles.

Figure 4. (a) Time evolution of the number of aggregates $N_s$ for different initial coverages $\theta = N \pi/4$, defined as the ratio of the total area of the cross-section of all adsorbed particles and the area of the substrate, with $N = \{0.1, 0.2, 0.6, 0.7\}$. (b) Approach to the asymptotic value $N_s(\infty) = 1$. Results are averages over 10 samples on substrates of lateral size $L = 64$, in units of the particle diameter.
perspective, they are prototypical examples of collective
dynamics under confinement and involve non-trivial phe-
omena such as competing time and length scales, important
many-body correlation, percolation and aging. For practi-
tioners, they provide valuable information on this feasibility of
thermodynamic structures and on how to design protocols to
effectively drive colloidal self-organization towards the target structures. Since new theoretical and numerical models are needed, which require coarse graining of the local interactions, a synergy with experimental groups is of paramount significance. This synergy is essential to validate and parameterize the theoretical models and test the relevant predictions.

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