

# Annual Review of Physical Chemistry An Active Approach to Colloidal Self-Assembly

# Stewart A. Mallory,<sup>1</sup> Chantal Valeriani,<sup>2</sup> and Angelo Cacciuto<sup>1</sup>

<sup>1</sup>Department of Chemistry, Columbia University, New York, NY 10027, USA; email: ac2822@columbia.edu

<sup>2</sup>Departamento de Física Aplicada I, Facultad de Ciencias Físicas, Universidad Complutense de Madrid, 28040 Madrid, Spain

Annu. Rev. Phys. Chem. 2018. 69:59-79

First published as a Review in Advance on November 6, 2017

The Annual Review of Physical Chemistry is online at physchem.annualreviews.org

https://doi.org/10.1146/annurev-physchem-050317-021237

Copyright © 2018 by Annual Reviews. All rights reserved



#### Keywords

active matter, self-assembly, complex fluids, colloidal science, statistical mechanics

### Abstract

In this review, we discuss recent advances in the self-assembly of selfpropelled colloidal particles and highlight some of the most exciting results in this field, with a specific focus on dry active matter. We explore this phenomenology through the lens of the complexity of the colloidal building blocks. We begin by considering the behavior of isotropic spherical particles. We then discuss the case of amphiphilic and dipolar Janus particles. Finally, we show how the geometry of the colloids and/or the directionality of their interactions can be used to control the physical properties of the assembled active aggregates, and we suggest possible strategies for how to exploit activity as a tunable driving force for self-assembly. The unique properties of active colloids lend promise to the design of the next generation of functional, environment-sensing microstructures able to perform specific tasks in an autonomous and targeted manner.

# **1. INTRODUCTION**

The way nature generates functional structures at the microscale is, in principle, extremely simple. This autonomous construction process is called self-assembly and can be qualitatively understood with the following analogy. Imagine placing a number of different Lego bricks into a cardboard box. Now shake that box for a sufficiently long time. Finally, open the box to find a perfectly assembled structure. This seemingly outrageous idea works at the microscale and nanoscale because, unlike the Lego bricks, which lie motionless unless an external force is applied (i.e., shaking), microscopic components freely and aimlessly diffuse via thermal motion across the space made available to them. Given enough time, they will eventually find each other. The process of self-assembly leverages this thermal motion to generate microstructures at practically no external cost. As such, this bottom-up approach to materials engineering is considered to be a major competitor to other, more expensive, top-down fabrication methods.

Unfortunately, the drawback of having to rely on random motion, as opposed to deliberate motion, is that microcomponents will indiscriminately find each other without necessarily matching to the correct partners to form the desired microstructure. This typically leads to a malformed final structure. For self-assembly to be successful, a very intricate game of labeling must be played. Each component must be encoded with its own local blueprint of where it will reside in the final structure. Clearly, the complexity of the rules (i.e., how the Lego bricks should fit and stick together) increases with the complexity of the desired final structure. As such, self-assembly is a delicate process, and the formation of defect-free structures is hardly achievable unless a careful design of the building blocks is performed beforehand.

In this review, we discuss recent advances in the field of active matter, with a specific focus on the self-assembly of active colloids. We discuss ways in which self-propulsion can be exploited to form robust macroscopic and mesoscopic structures whose properties can be tuned by the degree of activity. Prior to delving into this topic, it is instructive to provide a brief overview of the field of active matter.

Over the past decade, active matter has transformed and energized the fields of statistical mechanics and soft condensed matter. All active systems share the hallmark feature of being composed of self-driven units capable of converting stored or ambient energy into systematic movement. Examples of active systems permeate both the macroscopic and microscopic worlds and include human crowds, flocks and herds of animals, living cells and tissues, active colloids, and synthetic microswimmers. Active matter represents a fundamentally new nonequilibrium regime within statistical mechanics. In contrast to traditional nonequilibrium systems, where directional driving forces emerge as a result of global changes in the thermodynamic variables or boundary conditions (such as temperature and pressure), active systems are intrinsically out of equilibrium at the single-particle level. The combination of these unique nonequilibrium driving forces and the inherently stochastic nature of active systems has endowed these systems with remarkable collective behavior that ranges from bacterial turbulence (1, 2) to self-regulation (3) and, more generally, leads to large spatial correlations that are typically observed only near critical points in equilibrium systems. For a thorough discussion of these properties, we direct the reader to a number of comprehensive reviews recently written on the subject (see, for instance, References 4–19 and the references therein).

The current rise in popularity of colloidal active matter results in large part from recent advances in colloidal synthesis. Through the pioneering work of synthetic chemists and materials scientists, there are now various experimental realizations of synthetic microswimmers and active colloids. These active particles can be thought of as synthetic analogs of swimming bacteria. However, a major benefit of these synthetic variants is that, unlike bacteria, it is possible to systematically tailor interparticle interactions and modulate their swimming velocity. For details about the growing library of synthetic microswimmers and their associated propulsion mechanisms, we direct the reader to several recent reviews on the subject (4, 5, 14, 17).

The functionality of these active colloids and synthetic microswimmers makes them the ideal tool to manipulate matter at the microscale. A synthetic microswimmer's ability to autonomously navigate complex microfluidic environments conjures up a host of appealing applications, which include targeted drug delivery to specific cells (20), information storage and computation (21), clean-up and neutralization of environmental pollutants (22), self-propelled nanotools (23), and massive parallel assembly of microscopic structures (24). These potential applications are built around the unique self-driven nature of the microswimmers and their ability to manipulate, sense, and transport material at the microscale.

Broadly speaking, it is fair to say that the field of self-assembly is still in its infancy. Many aspects of the process are still not well understood, and we have yet to reach the stage where we can make reliable robust predictions for materials engineering (9, 25–34). However, there is now clear evidence that the formation of defect-free structures in nonactive systems is most probable when the rate of association of the particles from the bulk into the target aggregate is comparable to that of their dissociation from it, making the process tediously slow. Given the circumstances, the question of whether self-propulsion can be used as an extra handle to control and speed up the self-assembly of colloidal particles becomes extremely relevant. There are two open research areas within active self-assembly: finding ways to impart dynamic functionality to self-assembled structures and using activity to improve self-assembly. From the vast amount of phenomenology that has recently been reported, we attempt to extract key features that may be important for improving self-assembly.

#### 2. ACTIVE COLLOIDS

At the microscale, in the absence of external forces, the motion of a passive colloid is driven by equilibrium thermal fluctuations originating from the solvent. The dynamics can be described by the theory of Brownian motion, and much of the collective behavior can be explained within the framework of equilibrium statistical mechanics. In contrast, active colloids autonomously convert energy available in the environment, be it chemical (35), electromagnetic (36), acoustic (37), or thermal (27) energy, into directed mechanical motion. In this case, the swimming direction is not determined by an external force at a global level but is an intrinsic local property of the individual swimmers. Thus, it is often noted that active fluids are driven out of equilibrium at the single-particle level.

Active colloids, and more generally all colloidal particles, move in an environment with a low Reynold's number (i.e., viscous forces from the surrounding fluid dominate over any inertia forces) (38), making it very challenging to develop propulsion mechanisms for active colloids. Since inertia does not contribute to the motion of the colloid, a constant force must be applied to the colloid to maintain its swimming velocity. A common scheme to achieve this is creating and sustaining some sort of gradient across the colloid. This gradient-driven motion is known as phoretic transport, and the current belief is that, if a particle can generate its own local field or gradient (be it chemical, electromagnetic, or thermal), then the particle will be propelled forward via self-phoresis (17, 35, 39, 40).

Here we briefly introduce one of the simplest propulsion mechanisms for active colloids. This particular type of active colloid is Janus in nature; i.e., the colloid itself is composed of two different materials. As shown in **Figure 1***a*, the active colloid synthesized by Howse et al.



(*a*) Sketch of the propulsion mechanism for the active colloid synthesized by Howse et al. (35). The platinum cap (*red*) decomposes hydrogen peroxide (with oxygen atoms colored *yellow*) into water (*light blue*) and oxygen (*dark blue*), resulting in an oxygen gradient across the particle. Panel *a* adapted from Reference 41 with permission from the Royal Society of Chemistry. (*b*) Typical trajectories of the active colloid synthesized by Howse et al. at various hydrogen peroxide fuel concentrations. Panel *b* adapted from Reference 35 with permission from the American Physical Society.

(35) consists of a spherical polystyrene bead with a thin layer of platinum deposited on one hemisphere. Platinum was chosen for the catalytic cap as it readily decomposes the aqueous hydrogen peroxide fuel source into water and oxygen. As the hydrogen peroxide is decomposed by the catalytic cap, a concentration gradient of oxygen is generated and sustained across the colloid, resulting in its self-propulsion. Although the exact details of the propulsion mechanism, even in this simple case, are not fully understood, and competing mechanisms of propulsion have been suggested (42), there is consensus that sustaining a gradient across the particle is required to propel these building blocks. For additional details on a variety of self-propelling mechanisms, we direct the reader to several comprehensive reviews in this field (4, 5, 12, 14, 17, 22).

Much of the existing work on active matter has relied on simplified or minimal models. One of the most heavily studied is the Vicsek (43) model. The Vicsek model has garnered considerable interest because of its applicability to a wide range of biological systems involving flocking, clustering, and migration (see, for instance, References 6, 18, 44, 45). With the recent proliferation of synthetic microswimmers, a new model, often referred to as the active Brownian particle (ABP) model (4, 46–54), has recently achieved great popularity and is the main focus of this review. In the context of the ABP model, active colloids are described as Brownian particles under the additional influence of a constant self-propelling force applied along a fixed particle axis. While this simple representation captures many features of the basic motion of active particles, it neglects hydrodynamic interactions that are often crucial (38, 55–63). The ABP model is a dry model of active matter, in contrast to wet models, where the momentum exchanged between active particles and the surrounding solvent is considered explicitly (16, 64).

A spherical active colloid in the ABP model is described as a sphere of mass m and diameter  $\sigma$  that undergoes Brownian dynamics at a constant temperature T and is subject to an axial propelling velocity of magnitude  $v_p$ . The dynamics of the ABP model evolves according to the coupled overdamped Langevin equations for the translational and rotational motion, which are,

respectively,

$$\dot{\mathbf{r}}(t) = \frac{1}{\gamma} \mathbf{F}(\{r_{ij}\}) + v_{\mathrm{p}} \mathbf{n} + \sqrt{2D} \xi(t), \qquad 1.$$

$$\dot{\mathbf{n}}(t) = \frac{1}{\gamma_{\rm r}} \mathbf{T}(\{r_{ij}\}) + \sqrt{2D_{\rm r}} \xi(t) \times \mathbf{n}.$$
 2.

Here  $v_p$  is directed along a unit vector **n** of predefined orientation that passes through the origin of each particle and connects its poles. The translational diffusion coefficient D is related to the temperature T and the translational friction  $\gamma$  via the Stokes–Einstein relation  $D = k_B T/\gamma$ . It is typical to assume that the rotational diffusion coefficient  $D_r$  satisfies the relation  $D_r = 3D/\sigma^2$ , which holds true for spherical particles at low Reynolds numbers. The solvent-induced Gaussian white-noise terms for both the translational and rotational motion are characterized by  $\langle \xi_i(t) \rangle = 0$ and  $\langle \xi_i(t) \xi_j(t') \rangle = \delta_{ij} \delta(t - t')$ . The conservative interparticle forces and torques acting on the colloid are indicated as  $\mathbf{F}(\{r_{ij}\})$  and  $\mathbf{T}(\{r_{ij}\})$ , respectively, and can be computed as

$$\mathbf{F}(\{r_{ij}\}) = \sum_{j} \mathbf{F}_{ij} = -\sum_{j} \frac{\partial U_{ij}}{\partial \mathbf{r}_{ij}}$$
3.

and

$$\mathbf{T}(\{r_{ij}\}) = \sum_{j} \mathbf{T}_{ij} = -\sum_{j} \nabla_{\mathbf{n}_{ij}} U_{ij}, \qquad 4.$$

where  $U_{ij}$  is the interaction potential between the colloids.

A very important length scale in these systems is the persistence length of the active drive, defined as  $l_{\rm p} = v_{\rm p}\sigma/D_{\rm r}$ . This can be related to the Peclet number: Pe =  $v_{\rm p}\sigma/D = \frac{1}{3}l_{\rm p}/\sigma$ . For a passive colloid, the motion is completely Brownian and the mean square displacement in two dimensions is given by  $\langle \mathbf{r}^2(t) \rangle = 4Dt$ . For an active colloid, the mean square displacement includes an additional term and is given by  $\langle \mathbf{r}^2(t) \rangle = 4Dt + 2l_p^2(D_rt + 1 - e^{-D_rt})$  (65). For sufficiently large  $v_{\rm p}$ , the motion of the active colloid becomes increasingly ballistic at short timescales. However, because of the colloid's stochastic rotation, the motion is always diffusive at longer timescales. Typical trajectories of a single active colloid at different fuel concentrations are given in **Figure 1***b*. Much of the interesting behavior in active systems arises when  $l_{\rm p}$  is significantly larger than the colloidal diameter. For instance, one of the most important features of active particles is their ability to exert a unique force or pressure on their surroundings. This is an area of research that has received considerable interest, and a number of analytical, numerical, and experimental results have been published on the subject (12, 66–75). In fact, it has been shown that active fluids not only can generate a pressure on a boundary, but also can induce exotic (depletion-like) effective forces between passive particles (tracers), with range and strength controlled by  $l_p$ , that can be orders of magnitude larger than what is expected for passive systems (73, 76-84). These results suggest ways of designing microstructures to perform specific tasks when immersed in an active suspension. Most notably, work on how to drive microscopic gears and motors (85–88), transport colloidal cargos (89), capture and rectify the motion of active particles (90-92), and use active suspensions to propel wedge-like carriers (93-97) has been carried out. In all these instances, the local geometry of these microdevices is crucial for effective focusing of the random active motion of the colloids into directed mechanical work (67, 98-101).

# 3. SELF-ASSEMBLY WITH ACTIVE BROWNIAN PARTICLES

In this section, we provide an overview of the various contributions to the field of active colloidal self-assembly. Special attention is paid to the different types of colloidal interactions and how they

lead to a variety of ordered and disordered structures. Most of the discussion is framed within the context of the ABP model. The discussion is mainly confined to 2-dimensional and quasi-2-dimensional systems, as most experiments are performed under these conditions. The aim of this section is to provide insight into the interplay between activity and particle interactions, as well as into how this relates to the successful self-assembly of a wide range of passive and active microstructures.

We begin by reviewing the self-assembly behavior of purely repulsive active colloids. After that, we consider a few cases where active colloids interact via a generic isotropic attraction. We conclude this section by considering nonisotropic potentials and discussing recent work on the self-assembly of dipolar Janus ABPs and amphiphilic Janus ABPs.

#### 3.1. Isotropically Purely Repulsive Active Brownian Particles

Self-assembly of passive spherical colloids with short-range isotropic interactions is typically limited, in terms of structural variety, to close-packed hexagonal crystals. The isotropic nature of the interaction potential does not allow for any close control in either the relative location or the orientation of the colloids in a particular aggregate, precluding the formation of more complex structures. The situation is even more drastic for colloids that interact solely through excluded volume interactions. In fact, at low densities, a suspension of purely repulsive spheres exists only in the fluid phase, and when the density becomes sufficiently large, an ordered phase develops as a result of increased configurational entropy.

The behavior becomes much richer whenever some degree of activity is introduced. One of the most interesting and heavily studied phenomena, which appears to be ubiquitous in colloidal active systems, is giant, long-lived density fluctuations and anomalous clustering. A passive suspension of N colloids in a volume V exhibits number fluctuations that scale as  $\Delta N \sim \sqrt{N}$  for  $N \to \infty$ . Interestingly, in a variety of active systems,  $\Delta N$  can become very large and scales as  $\Delta N \sim N^a$ , where a is an exponent predicted to be as large as 1 in 2-dimensional systems (6, 102). This scaling prediction has been verified experimentally (103–105) and in agent-based simulations (18, 106). In these earlier works, the focus was on elongated active particles (inspired by swimming bacteria and animal flocking), and the associated giant number fluctuations were believed to be induced by the broken orientational symmetry of the particle. More recently, it has been shown that this is a more general phenomenon, and it has been observed in suspensions of purely repulsive spheres with no alignment interaction (107, 108).

A related phenomenon observed in suspensions of purely repulsive ABPs is the existence of an athermal motility-induced phase separation (MIPS) (7, 10, 49, 109–115). Here, the system is able to undergo a transition from a dilute fluid to a macroscopic dense phase; this transition takes place at densities much lower than those expected for the configurational entropydriven transition of the passive parent system. **Figure 2** illustrates this novel phase transition in a simulation of purely repulsive ABPs. The discovery of MIPS has led to extensive theoretical, experimental, and numerical studies, which are discussed in detail in References 4, 7. This phase transition differs significantly from the ordered states of nematic and polar active systems, which are intimately linked to the broken orientational symmetry of the particle, because spheres lack a mutual alignment mechanism and thus are unable to exchange angular momentum. This phase separation is strikingly similar to the vapor–liquid spinodal decomposition observed in many equilibrium systems, and there is now a significant amount of evidence supporting the hypothesis of Cates and collaborators (46, 110, 116–118) that MIPS is a generic feature of systems that are driven out of equilibrium by a persistent local energy input that breaks detailed balance.



Simulation snapshots of purely repulsive active Brownian particles at two different volume fractions,  $\phi = 0.39$  (*top row*) and  $\phi = 0.7$  (*bottom row*). (*Left column*) Snapshots from a system of passive particles. (*Right column*) The corresponding phase in the limit of very large self-propulsions. Particles are colored according to cluster size. Figure adapted from Reference 108 with permission from the American Physical Society.

The physical mechanism responsible for giant number fluctuations and MIPS can be easily contextualized within a simple kinetic model (107, 108) that focuses on the local dynamics at the interface of a forming cluster. At any given time, the size of a cluster is determined by the flux balance of incoming and outgoing particles. The time required for an active colloid to leave the surface of a cluster is independent of the propelling velocity  $v_p$  and is completely determined by its average rotational diffusion time  $t_r \sim 1/D_r$ ; the collision rate between free colloids and the forming cluster increases linearly with the particle density and propelling speed  $v_p$  (119).

By modulating the value of  $D_r$ , it is possible to control the size of the number fluctuations and retard or promote particles' aggregation (120). This is an often overlooked aspect of active systems, but developing methods to systematically control the rotational dynamics of the active colloids has important implications for directed self-assembly. Interestingly, hydrodynamic interactions between active colloids have been shown to have major effects on their rotational dynamics, and the local field inducing the particle's propelling forces (pushers versus pullers) plays a central role in MIPS (55, 57, 60, 121–125).

The notion that activity alone can generate giant number fluctuations and induce phase separation has important implications for self-assembly. In many colloidal self-assembly processes, the growth of a particular target structure requires the formation of a critical nucleus of a characteristic size. By introducing activity, it is then feasible to generate large density fluctuations that could be systematically exploited to extend the region in parameter space where self-assembly will successfully occur. In addition, self-propulsion will improve the kinetics of self-assembly, as the local dynamics becomes inherently faster and, in general, can make it easier for the system to escape local kinetic traps. These issues are discussed in greater detail in Section 4.

#### 3.2. Isotropically Attractive Active Brownian Particles

The simplest extension from purely repulsive interactions is to consider spherical active colloids interacting via a short-range isotropic attraction. Interestingly, and somewhat controversially (118), the interplay between attraction and self-propulsion gives rise to new phenomenological behavior observed neither in the passive parent system nor in an active system with purely repulsive interactions. In a recent article, Redner et al. (119) consider a 2-dimensional suspension of attractive active particles at an area fraction of  $\phi = 0.4$ . The short-range isotropic interaction is realized by allowing the ABPs to interact via a Lennard-Jones potential (126). At this density, the phase diagram for this system exhibits reentrant behavior as a function of activity (119). The phase diagram is given as a collection of simulation snapshots in **Figure 3***a*. Self-propulsion can now



#### Figure 3

(*a*, *Top*) Phase behavior of isotropically attractive active Brownian particles (ABPs) at an area fraction  $\phi = 0.4$  presented as a function of interparticle attraction strength *U* and Peclet number  $Pe = (v_p \sigma)/D$ , where  $v_p$  is the magnitude of the axial propelling velocity,  $\sigma$  is the particle diameter, and *D* is the translational diffusion coefficient. Colors distinguish different phases: near-equilibrium gel states (*green*), single-phase active fluids (*red*), and motility-induced phase separation (MIPS) states (*blue*). (*a*, *Bottom*) Detailed snapshots at fixed interaction energy  $U = 4k_BT$ . At Pe = 4 (*left*), the system forms a kinetically arrested attractive gel. At Pe = 20 (*middle*), the attraction suppresses phase separation and produces a homogeneous fluid characterized by transient large density fluctuations. At Pe = 100 (*rigbt*), MIPS is observed. Panel *a* adapted from Reference 119 with permission from the American Physical Society. (*b*) Snapshots of spherical ABPs interacting via a short-range attractive and a long-range repulsive potential at two different volume fractions ( $\phi = 0.24, 0.55$ ) and three different values of Pe (Pe = 0, 10, 20). At Pe = 10, mesophases of living crystals are observed at lower densities, and living stripes are seen at higher densities. (*c*) Snapshots of self-propelled dumbbells interacting via a short-range attractive and a long-range repulsive potential at  $\phi = 0.24$ . From left to right, we observe static clusters (at Pe = 0), rotating clusters (at Pe = 5), living clusters (at Pe = 15), and a fluid phase (at Pe = 40). Panels *b* and *c* adapted from Reference 127 with permission from the Royal Society of Chemistry.

either compete with the interparticle attractions to suppress phase separation or act cooperatively to enhance it. At low levels of activity, the isotropic attraction between colloids dominates and the suspension phase separates in a manner similar to that expected in the parent equilibrium system. In this regime, self-propulsion has little to no relevance. At moderate levels of activity, the suspension melts into a single-phase active fluid. As the activity is increased even further, phase separation driven by the self-trapping mechanism of MIPS occurs. Here, energetic attractions act cooperatively with self-trapping to enable phase separation at lower propelling velocities than would be possible in the corresponding system with purely repulsive interactions.

Interestingly, experimental studies of active colloids (71, 114, 128, 129) at lower densities than the one discussed above (119) observe the formation of dynamic clusters (living crystals), finitesized clusters that continually break, merge, dissolve, and reform. This peculiar finding has also been observed in 2-dimensional numerical simulations of self-propelled hard disks using kinetic Monte Carlo simulations (130), in self-phoretic ABPs (131), and in a recent numerical study of a low-density suspension of 3-dimensional attractive active colloids (120, 132). These living aggregates appear to form whenever attractive and propelling forces are comparable in magnitude. A recent study of attractive squirmers (which account for explicit hydrodynamic interactions) has also observed system coarsening or clustering depending on the ratio between attraction and propulsion strength (58).

Living clusters are a beautiful example of self-assembly into structures that can themselves be active. Unfortunately, it is not easy to control the size of these clusters using exclusively short-range attractions; however, it is possible to overcome this problem by adding a weak but long-range repulsion to each particle. Doing so creates a pair of competing forces at different distances and is known to drive microphase separation into ordered structures of controllable size in passive suspension. A well-studied case is that of a short-range attraction (typically induced by depletion forces) coupled to a long-range repulsion (obtained, for instance, by giving the colloids a net charge). The result is the formation of a variety of self-assembled structures whose morphologies depend on the balance between the attractive and repulsive interactions. At equilibrium and at relatively low densities, this interplay can lead to the formation of isotropic clusters arranged into hexagonal arrays (or stripes at larger densities) whose size is, to some degree, tunable via the interaction parameters (133–136).

As far as we are aware, there are no experimental realizations of active systems of this variety. Nevertheless, two recent theoretical studies of 2-dimensional suspensions of ABPs interacting via a long-range potential that induces microphase separation have been carried out (127, 137). The potential consisted, apart from the excluded volume, of two generic parts: a short-range attraction to induce clustering and a long-range soft repulsion to guarantee microphase separation. These studies have shown that, for the appropriate choice of interparticle interactions and for a range of active forces, the living crystals of spherical ABPs can be size-stabilized (**Figure 3b**). Tung et al. (127) studied the behavior of active dumbbells using the interparticle potential discussed above, showing that it is possible to create mesoscopic crystalline structures that behave as microrotors (with definite, but tunable, angular velocity). This occurs because of the particles' geometry (**Figure 3c**). The dumbbells tend to exhibit local nematic ordering upon aggregation, causing the mesoscopic lattice sites to spin with a characteristic angular velocity. A similar behavior has also been observed in a 2-dimensional dilute suspension of self-propelled dumbbells interacting via a short-range attraction (138).

These results allow us to make an interesting comparison between spherical and nonspherical active colloids. For spherical colloids interacting through an isotropic potential, the aggregates that develop are intrinsically plastic, i.e., each particle within a structure is able to freely rotate, and this key feature is mainly responsible for the emergent active behavior of the resulting mesoscopic

aggregates (e.g., living crystals). A rather different phenomenology is observed when considering particles endowed with directional interactions, as illustrated for dumbbells in the previous example. These can develop either because of a nonspherical geometry of the particle or as a result of explicit anisotropic interaction potentials. A significant amount of work has been done on the former case, with specific focus on isotropic self-propelled rods. The literature on the subject is extensive and focuses heavily on the behavior of swimming bacteria and active nematics (see, for instance, Reference 16 and the references therein). In what follows, we review exciting recent results obtained on the self-assembly of spherical active Janus particles, which represent the simplest system with anisotropy in interparticle interactions.

#### 3.3. Dipolar Janus Active Brownian Particles

Dipolar Janus colloids consist of spherical particles coated with two oppositely charged hemispheres. The directional interactions between these particles depend on the salt concentration in the solution and allow for self-assembly of complex structures. Kaiser et al. (139) recently studied the clustering behavior of a small number of dipolar ABPs. The model they considered is similar to the ABP model introduced in Section 2 with the addition of a point dipolar potential at the center of each colloid aligned with the self-propelling axis. Kaiser et al. allowed a small number of dipolar ABPs (N = 1-5) to self-assemble under equilibrium conditions and then introduced self-propulsion to understand its effect on the clusters' dynamics. This approach provides some intuition on how activity induces structural changes in small clusters.

Several interesting features having potentially important applications in colloidal self-assembly have been observed. For instance, dynamic structures that are not stable at equilibrium develop when the particles are activated, and it is possible to either stabilize or destabilize particular configurations by careful choice of the propelling velocity  $v_p$ . Interestingly, the stability of the equilibrium clusters is dependent on the ramp rate at which the self-propelling force is applied. If self-propulsion is applied instantaneously, the clusters undergo a permanent fission process in which they either experience significant internal rearrangements or completely break. However, if self-propulsion is slowly ramped to its final value (adiabatic switching), no fission is observed and the equilibrium cluster configuration is retained. This sensitivity to the ramp rate offers a unique handle for modulating self-assembly. Kaiser et al. (139) illustrate a high level of control over the selection of a particular cluster configuration by both tuning the system parameters and selecting an adequate choice of how self-propulsion is applied to the particle. In a more recent paper, Guzmán-Lastra et al. (140) further characterize the dynamical properties of these dipolar Janus ABP clusters.

Using a combination of numerical simulations and experiments, Yan et al. (141) have shown how multiple modes of collective behavior can be encoded into Janus dipolar ABPs. In their work, each of the two hemispheres of the colloids carries its own electric charge, and a colloid is propelled along the axis perpendicular to the particle's equator. The experimental realization of this system consists of silica spheres with one hemisphere coated with a metal and the other covered with a thin SiO<sub>2</sub> protective layer. The two hemispheres of the colloid polarize differently when an alternating-current electric field is applied perpendicular to system. This mismatched frequency-dependent dielectric response is exploited to both control the motility of the colloids and modulate colloid–colloid interactions. As shown in **Figure 4**, it is possible to self-assemble several distinct active structures by modulating the magnitude and sign of the electric charge on each hemisphere of the colloid. When the charge on the two hemispheres has the same sign and magnitude, the system exhibits behavior similar to that of purely repulsive ABPs, and since the density considered is below the onset for the MIPS transition, the system remains in a fluid state



(*a*) Dipolar Janus active Brownian particles, where both the sign and magnitude of the charge on each hemisphere can be controlled to impose different collective behavior. Positive or negative charge sign is indicated by color (*red* or *blue*), relative magnitude of charge is indicated by dot size, and propelling direction is indicated by black arrows. (*b*–*d*) Typical snapshots for the different phases, including (*b*) active chains, (*c*) swarms, and (*d*) clusters. White hemispheres represent leading sides and red hemispheres represent trailing sides. The yellow arrow in panel *c* marks the global direction of the swarm. Figure adapted from Reference 141 with permission from Nature.

(Figure 4*a*). More interestingly, when there is a charge imbalance between the two hemispheres, the system develops various forms of nontrivial self-organization. Particles with equal and opposite charges on the two hemispheres spontaneously assemble into active chains (Figure 4*b*). When a large charge imbalance between the two hemispheres is enforced, the colloids induce large torques on one another when coming in close proximity, and two distinct cases emerge. In the first case, when the propelling force is set to point toward the hemisphere with greater charge, the torques tend to align two colloidal swimmers in the same direction. This angular alignment produces large-scale coherent swarms with phenomenology reminiscent of the Vicsek model (43) (Figure 4*c*). In the second case, when the propelling force is set to point away from the hemisphere with greater charge, the induced torques tend to rotate the colloids so that the more charged hemispheres are pushed apart as far apart from each other as possible. In this case, the colloids tend to align with their propelling axes facing one another, resulting in the formation of jammed clusters with high local density (Figure 4*d*). These studies provide an excellent example of how angular interactions can be tuned to induce self-assembly of complex structures, and they indicate how the interplay between torques and self-propelling forces can facilitate the formation of active aggregates.

### 3.4. Amphiphilic Janus Active Brownian Particles

We now shift our focus to the self-assembly behavior of amphiphilic Janus ABPs. This type of Janus particle consists of two distinct hemispheres, one hydrophobic and the other hydrophilic. An experimental realization of amphiphilic Janus ABPs consists of silica microspheres passivated with a hydrophobic ligand [octadecyltrichlorosilane (OTS)], whose hemisphere is then covered



(a,i) Schematic of the assembly of octadecyltrichlorosilane (OTS)-modified amphiphilic Janus active Brownian particles (ABPs), with the hydrophobic OTS sides (*gray*) facing one another. (a,ii) Typical configurations of a pair of amphiphilic Janus ABPs (scale bar = 1 µm). (a,iii) Typical assemblies of amphiphilic Janus ABPs' triplet assemblies: movement of triplet assemblies with different orientations (scale bar = 1 µm). Panel *a* adapted from Reference 142 with permission from the American Chemical Society. (*b*) Plot representing the angular speed of possible dimer conformations. The intensity of the shaded regions shows counterclockwise (*red*) and clockwise (*blue*) rotations of the dimers. Redundant information contained in the four regions bordered by diagonal lines (*solid* and *dashed*) can be mapped into a single triangular quadrant marked by the letter I (for more details, see Reference 143). Panel *b* adapted from Reference 143 with permission from the American Physical Society.

by a platinum cap. These amphiphilic Janus ABPs experience a short-range attraction between the hydrophobic domains, whereas the interaction between the platinum-capped hemispheres is purely repulsive. In essence, the platinum cap restricts the interparticle attraction to the hydrophobic hemisphere, which gives rise to well-defined assemblies (**Figure 5**). By tuning the size of the hydrophobic domain and that of the platinum cap, it is possible to control the angular range of the interaction, and thus the number of colloids that can simultaneously stick to each other and the degree of self-propulsion of the colloid.

Gao et al. (142) have experimentally investigated the formation and dynamics of small clusters of amphiphilic Janus ABPs. For a pair of colloids, they find that the motion is governed by the relative orientation of the two self-propelling forces. **Figure 5***b* shows the possible orientations for a pair of amphiphilic Janus ABPs. When the two propelling vectors are aligned with the interparticle axis, so that the particles directly push against each other, the pair becomes essentially passive. The two active forces cancel each other, and the motion of the pair is purely Brownian. However, when the propelling vectors are both perpendicular to the interparticle axis, the pair behave as a colloidal rotor with a characteristic angular velocity determined by the magnitude of the self-propelling force. The self-propelling force in this case contributes only to the rotation of the pair. The translational dynamics of the pair are effectively Brownian when this configuration is

adopted. When the location of the Janus balance is altered so that the size of the hydrophobic patch becomes smaller, the rotational speed of the pair decreases and it revolves with a larger radius. Although it is straightforward to estimate the degree of translational and rotational motion for a particular configuration of a pair of Janus amphiphilic ABPs (as shown in some detail in Reference 143), the situation becomes much more complex when dealing with aggregates of a large number of particles.

One of the biggest challenges in active self-assembly is designing a building block in which the interparticle interactions and the self-propulsion of the particles work in conjunction to bias the formation of a particular target structure. Section 4 is dedicated to this topic.

# 4. CAN ACTIVITY IMPROVE SELF-ASSEMBLY?

So far, we have discussed some of the exciting new behavior observed in suspensions of active colloids, with a specific focus on the new properties, morphological or dynamical, of the aggregates formed under the influence of propelling forces. In this section, we shift our focus and consider whether activity can be exploited to speed up the complex self-assembly dynamics of colloids designed to (passively) form desired target structures. For this purpose, we consider activity as a new, tunable dimension in the colloidal parameter space. This new variable, self-propulsion, as already illustrated in the previous sections, can profoundly affect the dynamical behavior of a system. When implemented in a synergistic manner, it can be exploited to bias the formation of a particular desired microstructure against any malformed or competing microstructures.

As discussed in Section 1, it is clear that, even when the interactions between building blocks are chosen so that a particular ordered structure is stable, the self-assembly of that structure may not be possible because of the presence of competing metastable states. Successful self-assembly usually requires a delicate balance between entropic and dispersion forces, and the formation of defect-free structures demands that the rate of association of the building blocks to the forming assembly be comparable to the rate of dissociation from it, leading to rather slow timescales for the completion of the self-assembly process. Obviously, because of their enhanced translational motion, selfpropelled particles can explore a given volume and find a large slow target (the assembly) much faster than their passive counterparts. However, the same propelling forces, when sufficiently large, can alter the morphology or the structural properties and can even break down the target structure by exerting unbalanced inner forces and torques. Thus, on the one hand, self-propulsion can speed up the kinetics of particle association, but on the other hand it can affect the stability of the desired target structure. As such, one should not expect that adding self-propulsion to any colloidal particle will necessarily be advantageous, unless the self-propelling forces themselves organize within the target assembly in such a way that its stability is not compromised. This can be achieved by judiciously pairing the propelling forces and the interparticle interactions.

As a simple illustration, we review the self-assembly of active triangular colloidal particles discussed in Reference 24. Although there is nothing particularly special about the shape of this building block, the pathway associated to its self-assembly presents all the generic features observed in a typical self-assembly process. (*a*) There is a clearly defined target structure. Equilateral triangles with one side hard and the other two attractive are designed to passively self-assemble into hexagonal structures of exactly six triangles (capsids) (**Figure 6b**). (*b*) There exists an ensemble of structures with a larger degree of orientational entropy (**Figure 6c**) that can directly compete with the formation of the target structure as soon as the interparticle interaction becomes sufficiently large. This high level of competition generates a scenario in which the success of self-assembly of the hexagonal structures is highly dependent on the strength of attraction between colloids and is expected to occur only for a narrow energy range. (*c*) Starting from a low-density suspension, the typical times required for self-assembly become exceedingly long.



(*a*) Schematic of a triangular building block with two attractive sides. The white arrow indicates the direction of self-propulsion. (*b*) The target structure to be self-assembled is a hexagonal capsid composed of six colloidal building blocks. (*c*) Typical disordered aggregate formed when the attraction between the triangles is too strong. (*d*) Percentage yield of target structure as a function of the strength of the attractive interaction for passive colloids. (*e*) Anti-aligned (*top*) and aligned (*bottom*) configurations of a pair of triangular particles.

The percent yield of the target structure as a function of the strength of the attractive interaction is given in **Figure 6d**. As expected, successful self-assembly in the passive system is limited to a narrow range in the binding energy. In this window, the maximum yield observed is  $\sim$ 90%. For smaller values of the binding energy, the colloids do not aggregate. For larger values, the formation of large, disordered aggregates is favored (**Figure 6c**). How can one endow these particles with self-propulsion to improve the overall rate and yield of self-assembly?

The general strategy in implementing this approach is to design the colloidal building blocks so that the particle interactions and the direction of self-propulsion work in conjunction to form and stabilize the desired structure. In this simple example system, the solution is fairly straightforward. By choosing the direction of self-propulsion to be perpendicular to the repulsive face of the colloid, as illustrated in **Figure 6***a*, one can improve the stability of the final hexagonal aggregate. Furthermore, this choice biases the formation of the target structure early on in the self-assembly process. Indeed, as illustrated in **Figure 6***e*, there are only two ways for a pair of colloids to bind to each other. In the first configuration, the propelling axes are anti-aligned, whereas in the second configuration the self-propelling axes are partially aligned. In the former case, activity tends to destabilize and separate the pair, whereas in the latter case the bond between the two particles is strengthened by the contributions of the active force. Biasing the system away from binding configurations that lead to the formation of misaligned structures leads to a significant increase in the likelihood of a robust self-assembly process. Thus, the selection of the final structure begins already at an early stage, as partially aligned configurations are favored and are compatible with the target geometry.

A critical requirement of the target microstructure is that the vectorial sum of the self-propelling forces in its interior be equal to zero. This creates a focal point in the center of the compact aggregate at which each colloid can exert a force that strengthens their mutual attractive interactions through the cooperative arrangement of the propelling forces. These emergent interactions stabilize the hexagonal structure even in the absence of explicit attractive forces and behave essentially as active bonds of tunable strength. Any compact aggregate for which this vectorial condition is not satisfied will experience large active torques and shear forces that can break it apart. One can think of self-propulsion in these systems as a very selective filter that allows for the stabilization of only certain structures. We believe that this strategy should work for all compact target structures satisfying the vectorial condition discussed above.

We stress that this behavior also suggests ways of using activity as a tool to separate both time and energy scales in multistage self-assembly problems (144). In fact, given that the aggregation rate and the strength of the active bonds are completely controlled by the particles' self-propulsion, it is possible to use activity to quickly self-assemble compact structures with zero net propulsion, such as the hexagonal capsids described above, that would function as new passive mesoscopic building blocks. These could then be made to slowly self-assemble even further, exploiting standard dispersion or weak solvent-induced interactions. The ability to efficiently separate time and energy scales within the same sample may be greatly beneficial for the fabrication of ever more complex microscopic architectures.

Although this strategy appears to be effective for compact but finite-sized structures, there is evidence (145) that it can also be applied to other systems. For instance, low levels of activity can be used to improve the self-assembly of macroscopic crystals and open-lattice structures. It has been shown (146) that passive triblock Janus particles, which have two attractive patches located at the opposite poles of each particle, spontaneously form macroscopic kagome lattices for sufficiently large patch areas and attraction strengths. Our preliminary results (145) indicate that the formation of the kagome lattice structure greatly benefits from the introduction of a small amount of self-propulsion along the pole-to-pole axis of these particles. The reason behind this is that the active forces in this case act to destabilize the competing elongated structures that tend to form early on in the self-assembly process. Clearly, more work in this direction needs to be done to understand the intricacies of how activity may affect the stability or the dynamic pathway of the self-assembly process; nevertheless, this is a very promising direction in the field.

# 5. CONCLUSIONS

In this review, have we recapitulated some of the most exciting phenomenological behavior observed in suspensions of active colloids. We have also discussed some of the strategies that can be deployed to exploit activity to more efficiently self-assemble target structures. To conclude, we remark that apart from a few exceptions (see, for instance, References 147, 148 and the references therein), most of the work in this area has been carried out under the assumption that the active forces are constant with respect to time. However, the newest generation of active colloids can be activated by light (128, 149, 150) (i.e., their self-propulsion can be turned on and off by exposure to an external light source). This is achieved, for instance, by inserting a piece of hematite on one side of the colloids and shining light of a specific frequency on the suspension: It is only in the illuminated regions that the hematite catalyzes the hydrogen peroxide (128). This is an incredibly useful feature for self-assembly, as it makes it feasible to create regions in the sample where particles become active under light exposure and regions where particles behave as purely Brownian objects. Another interesting feature of light-induced activity is that it allows the strength of the active forces to be easily modulated over time either by tuning the intensity of the light source or by switching it on and off at different frequencies. This simple feature opens the way to experimental studies of stochastic Brownian ratchets and adds yet another handle that could be exploited to create new functional materials, allowing one to directly intervene and dynamically affect the pathway of structure formation.

# **DISCLOSURE STATEMENT**

The authors are not aware of any affiliations, memberships, funding, or financial holdings that might be perceived as affecting the objectivity of this review.

#### ACKNOWLEDGMENTS

We thank Clarion Tung, Joseph Harder, and Francisco Alarcón for insightful discussions and helpful comments. A.C. acknowledges financial support from the National Science Foundation under grant DMR-1408259. C.V. acknowledges financial support from a Ramón y Cajal tenure-track contract, the Spanish Ministry of Education (MINECO, FIS2016-78847-P), and UCM-Santander (PR26/16-10B-3). S.A.M. acknowledges financial support from the National Science Foundation Graduate Research Fellowship.

#### LITERATURE CITED

- Dunkel J, Heidenreich S, Drescher K, Wensink HH, Bär M, Goldstein RE. 2013. Fluid dynamics of bacterial turbulence. *Phys. Rev. Lett.* 110:228102
- Wolgemuth CW. 2008. Collective swimming and the dynamics of bacterial turbulence. *Biophys. J.* 95:1564–74
- Gopinath A, Hagan MF, Marchetti MC, Baskaran A. 2012. Dynamical self-regulation in self-propelled particle flows. *Phys. Rev. E* 85:061903
- Bechinger C, Di Leonardo R, Löwen H, Reichhardt C, Volpe G, Volpe G. 2016. Active particles in complex and crowded environments. *Rev. Mod. Phys.* 88:045006
- Wang W, Duan W, Ahmed S, Sen A, Mallouk TE. 2015. From one to many: dynamic assembly and collective behavior of self-propelled colloidal motors. Acc. Chem. Res. 48:1938–46
- 6. Toner J, Tu Y, Ramaswamy S. 2005. Hydrodynamics and phases of flocks. Ann. Phys. 318:170-244
- 7. Cates ME, Tailleur J. 2015. Motility-induced phase separation. Annu. Rev. Condens. Matter Phys. 6:219-44
- 8. Ramaswamy S. 2010. The mechanics and statistics of active matter. *Annu. Rev. Condens. Matter Phys.* 1:323–45
- Klapp SHL. 2016. Collective dynamics of dipolar and multipolar colloids: from passive to active systems. Curr. Opin. Colloid Interface Sci. 21:76–85
- Marchetti MC, Fily Y, Henkes S, Patch A, Yllanes D. 2016. Minimal model of active colloids highlights the role of mechanical interactions in controlling the emergent behavior of active matter. *Curr. Opin. Colloid Interface Sci.* 21:34–43
- Bialké J, Speck T, Löwen H. 2015. Active colloidal suspensions: clustering and phase behavior. *J. Non-Cryst. Solids* 407:367–75
- 12. Zöttl A, Stark H. 2016. Emergent behavior in active colloids. J. Phys. Condens. Matter 28:253001
- 13. Dey KK, Sen A. 2017. Chemically propelled molecules and machines. J. Am. Chem. Soc. 139:7666-76
- Wang W, Duan W, Ahmed S, Mallouk TE, Sen A. 2013. Small power: autonomous nano- and micromotors propelled by self-generated gradients. *Nano Today* 8:531–54
- 15. Menzel AM. 2015. Tuned, driven, and active soft matter. Phys. Rep. 554:1-45
- Marchetti MC, Joanny JF, Ramaswamy S, Liverpool TB, Prost J, et al. 2013. Hydrodynamics of soft active matter. *Rev. Mod. Phys.* 85:1143–89
- 17. Ebbens SJ, Howse JR. 2010. In pursuit of propulsion at the nanoscale. Soft Matter 6:726-38
- Chaté H, Ginelli F, Grégoire G, Peruani F, Raynaud F. 2008. Modeling collective motion: variations on the Vicsek model. *Eur. Phys. J. B* 64:451–56
- Romanczuk P, Bär M, Ebeling W, Lindner B, Schimansky-Geier L. 2012. Active Brownian particles. Eur. Phys. J. Spec. Top. 202:1–162
- Din MO, Danino T, Prindle A, Skalak M, Selimkhanov J, et al. 2016. Synchronized cycles of bacterial lysis for in vivo delivery. *Nature* 536:81–85

- Woodhouse FG, Dunkel J. 2017. Active matter logic for autonomous microfluidics. Nat. Commun. 8:15169
- 22. Ebbens SJ. 2016. Active colloids: progress and challenges towards realising autonomous applications. *Curr. Opin. Colloid Interface Sci.* 21:14–23
- Solovev AA, Xi W, Gracias DH, Harazim SM, Deneke C, et al. 2012. Self-propelled nanotools. ACS Nano 6:1751–56
- 24. Mallory SA, Cacciuto A. 2016. Activity-assisted self-assembly of colloidal particles. Phys. Rev. E 94:022607
- Sacanna S, Korpics M, Rodriguez K, Colón-Meléndez L, Kim SH, et al. 2013. Shaping colloids for self-assembly. *Nat. Commun.* 4:1688
- Glotzer S, Solomon M, Kotov NA. 2004. Self-assembly: from nanoscale to microscale colloids. *AIChE j.* 50:2978–85
- Jiang S, Chen Q, Tripathy M, Luijten E, Schweizer KS, Granick S. 2010. Janus particle synthesis and assembly. *Adv. Mater.* 22:1060–71
- 28. Ravaine S, Duguet E. 2017. Synthesis and assembly of patchy particles: recent progress and future prospects. *Curr. Opin. Colloid Interface Sci.* 30:45–53
- Sacanna S, Pine DJ. 2011. Shape-anisotropic colloids: building blocks for complex assemblies. Curr. Opin. Colloid Interface Sci. 16:96–105
- Yi GR, Pine DJ, Sacanna S. 2013. Recent progress on patchy colloids and their self-assembly. *J. Phys. Condens. Matter* 25:193101
- Chen Q, Yan J, Zhang J, Bae SC, Granick S. 2012. Janus and multiblock colloidal particles. *Langmuir* 28:13555–61
- Pawar AB, Kretzschmar I. 2010. Fabrication, assembly, and application of patchy particles. *Macromol. Rapid Commun.* 31:150–68
- 33. Sacanna S, Irvine W, Chaikin PM, Pine DJ. 2010. Lock and key colloids. Nature 464:575-78
- Whitelam S, Feng EH, Hagan MF, Geissler PL. 2009. The role of collective motion in examples of coarsening and self-assembly. *Soft Matter* 5:1251–62
- 35. Howse JR, Jones RAL, Ryan AJ, Gough T, Vafabakhsh R, Golestanian R. 2007. Self-motile colloidal particles: from directed propulsion to random walk. *Phys. Rev. Lett.* 99:048102
- Bricard A, Caussin JB, Desreumaux N, Dauchot O, Bartolo D. 2013. Emergence of macroscopic directed motion in populations of motile colloids. *Nature* 503:95–98
- Ahmed S, Gentekos DT, Fink CA, Mallouk TE. 2014. Self-assembly of nanorod motors into geometrically regular multimers and their propulsion by ultrasound. ACS Nano 8:11053–60
- 38. Lauga E, Powers TR. 2009. The hydrodynamics of swimming microorganisms. *Rep. Prog. Phys.* 72:096601
- Golestanian R, Liverpool TB, Ajdari A. 2005. Propulsion of a molecular machine by asymmetric distribution of reaction products. *Phys. Rev. Lett.* 94:220801
- Golestanian R, Liverpool TB, Ajdari A. 2007. Designing phoretic micro- and nano-swimmers. New J. Phys. 9:126
- Archer RJ, Campbell AI, Ebbens SJ. 2015. Glancing angle metal evaporation synthesis of catalytic swimming Janus colloids with well defined angular velocity. *Soft Matter* 11:6872–80
- Brown A, Poon W. 2014. Ionic effects in self-propelled Pt-coated Janus swimmers. Soft Matter 10:4016– 27
- 43. Vicsek T, Czirók A, Ben-Jacob E, Cohen I, Shochet O. 1995. Novel type of phase transition in a system of self-driven particles. *Phys. Rev. Lett.* 75:1226–29
- Ginelli F, Peruani F, Bär M, Chaté H. 2010. Large-scale collective properties of self-propelled rods. *Phys. Rev. Lett.* 104:184502
- 45. Chaté H, Ginelli F, Grégoire G, Raynaud F. 2008. Collective motion of self-propelled particles interacting without cohesion. *Phys. Rev. E* 77:046113
- 46. Cates ME, Tailleur J. 2013. When are active Brownian particles and run-and-tumble particles equivalent? Consequences for motility-induced phase separation. *Europhys. Lett.* 101:20010
- 47. Khatami M, Wolff K, Pohl O, Ejtehadi MR, Stark H. 2016. Active Brownian particles and run-andtumble particles separate inside a maze. *Sci. Rep.* 6:37670

- Solon AP, Cates ME, Tailleur J. 2015. Active Brownian particles and run-and-tumble particles: a comparative study. *Eur. Phys. J. Spec. Top.* 224:1231–62
- Stenhammar J, Marenduzzo D, Allen RJ, Cates ME. 2014. Phase behaviour of active Brownian particles: the role of dimensionality. *Soft Matter* 10:1489–99
- Speck T. 2016. Collective behavior of active Brownian particles: from microscopic clustering to macroscopic phase separation. *Eur. Phys. J. Spec. Top.* 225:2287–99
- Stenhammar J, Tiribocchi A, Allen RJ, Marenduzzo D, Cates ME. 2013. Continuum theory of phase separation kinetics for active Brownian particles. *Phys. Rev. Lett.* 111:145702
- Richard D, Löwen H, Speck T. 2016. Nucleation pathway and kinetics of phase-separating active Brownian particles. Soft Matter 12:5257–64
- Toner J, Löwen H, Wensink HH. 2016. Following fluctuating signs: anomalous active superdiffusion of swimmers in anisotropic media. *Phys. Rev. E* 93:062610
- Bialké J, Siebert JT, Löwen H, Speck T. 2015. Negative interfacial tension in phase-separated active Brownian particles. *Phys. Rev. Lett.* 115:098301
- Matas-Navarro R, Golestanian R, Liverpool TB, Fielding SM. 2014. Hydrodynamic suppression of phase separation in active suspensions. *Phys. Rev. E* 90:032304
- Matas-Navarro R, Fielding SM. 2015. Clustering and phase behaviour of attractive active particles with hydrodynamics. Soft Matter 11:7525–46
- Zöttl A, Stark H. 2014. Hydrodynamics determines collective motion and phase behavior of active colloids in quasi-two-dimensional confinement. *Phys. Rev. Lett.* 112:118101
- Alarcón F, Valeriani C, Pagonabarraga I. 2017. Morphology of clusters of attractive dry and wet selfpropelled spherical particle suspensions. Soft Matter 13:814–26
- Delfau JB, Molina J, Sano M. 2016. Collective behavior of strongly confined suspensions of squirmers. Europhys. Lett. 114:24001
- Theers M, Westphal E, Gompper G, Winkler RG. 2016. Modeling a spheroidal microswimmer and cooperative swimming in a narrow slit. *Soft Matter* 12:7372–85
- Thutupalli S, Seemann R, Herminghaus S. 2011. Swarming behavior of simple model squirmers. New *J. Phys.* 13:073021
- Elgeti J, Winkler RG, Gompper G. 2015. Physics of microswimmers—single particle motion and collective behavior: a review. *Rep. Prog. Phys.* 78:056601
- 63. Gompper G, Ihle T, Kroll DM, Winkler RG. 2009. Multi-particle collision dynamics: a particle-based mesoscale simulation approach to the hydrodynamics of complex fluids. In Advanced Computer Simulation Approaches for Soft Matter Sciences III, ed. PC Holm, PK Kremer, pp. 1–87. Berlin: Springer
- Steffenoni S, Falasco G, Kroy K. 2017. Microscopic derivation of the hydrodynamics of active-Brownianparticle suspensions. *Phys. Rev. E* 95:052142
- ten Hagen B, van Teeffelen S, Löwen H. 2011. Brownian motion of a self-propelled particle. J. Phys. Condens. Matter 23:194119
- Solon AP, Fily Y, Baskaran A, Cates ME, Kafri Y, et al. 2015. Pressure is not a state function for generic active fluids. *Nat. Phys.* 11:673–78
- Lee CF. 2013. Active particles under confinement: aggregation at the wall and gradient formation inside a channel. New J. Phys. 15:055007
- Mallory SA, Šarić A, Valeriani C, Cacciuto A. 2014. Anomalous thermomechanical properties of a selfpropelled colloidal fluid. *Phys. Rev. E* 89:052303
- Takatori S, Yan W, Brady J. 2014. Swim pressure: stress generation in active matter. *Phys. Rev. Lett.* 113:028103
- Solon AP, Stenhammar J, Wittkowski R, Kardar M, Kafri Y, et al. 2015. Pressure and phase equilibria in interacting active Brownian spheres. *Phys. Rev. Lett.* 114:198301
- Ginot F, Theurkauff I, Levis D, Ybert C, Bocquet L, et al. 2015. Nonequilibrium equation of state in suspensions of active colloids. *Phys. Rev. X* 5:011004
- 72. Smallenburg F, Löwen H. 2015. Swim pressure on walls with curves and corners. Phys. Rev. E 92:032304
- Ni R, Cohen Stuart MA, Bolhuis PG. 2015. Tunable long range forces mediated by self-propelled colloidal hard spheres. *Phys. Rev. Lett.* 114:018302

- 74. Speck T, Jack RL. 2016. Ideal bulk pressure of active Brownian particles. Phys. Rev. E 93:062605
- Marconi UMB, Maggi C, Melchionna S. 2016. Pressure and surface tension of an active simple liquid: a comparison between kinetic, mechanical and free-energy based approaches. *Soft Matter* 12:5727–38
- Leite LR, Lucena D, Potiguar FQ, Ferreira WP. 2016. Depletion forces on circular and elliptical obstacles induced by active matter. *Phys. Rev. E* 94:062602
- Li H-s, Zhang B-k, Li J, Tian W-d, Chen K. 2015. Brush in the bath of active particles: anomalous stretching of chains and distribution of particles. *J. Chem. Phys.* 143:224903
- 78. Parra-Rojas C, Soto R. 2014. Casimir effect in swimmer suspensions. Phys. Rev. E 90:013024
- Ray D, Reichhardt C, Olson Reichhardt CJ. 2014. Casimir effect in active matter systems. Phys. Rev. E 90:013019
- Angelani L, Maggi C, Bernardini ML, Rizzo A, Di Leonardo R. 2011. Effective interactions between colloidal particles suspended in a bath of swimming cells. *Phys. Rev. Lett.* 107:138302
- 81. Kaiser A, Löwen H. 2014. Unusual swelling of a polymer in a bacterial bath. J. Chem. Phys. 141:044903
- Harder J, Valeriani C, Cacciuto A. 2014. Activity-induced collapse and reexpansion of rigid polymers. *Phys. Rev. E* 90:062312
- Harder J, Mallory SA, Tung C, Valeriani C, Cacciuto A. 2014. The role of particle shape in active depletion. *7. Chem. Phys.* 141:194901
- Valeriani C, Li M, Novosel J, Arlt J, Marenduzzo D. 2011. Colloids in a bacterial bath: simulations and experiments. *Soft Matter* 7:5228–38
- Sokolov A, Apodaca MM, Grzybowski BA, Aranson IS. 2010. Swimming bacteria power microscopic gears. PNAS 107:969–74
- Di Leonardo R, Angelani L, DellArciprete D, Ruocco G, Iebba V, et al. 2010. Bacterial ratchet motors. PNAS 107:9541–45
- Angelani L, Di Leonardo R, Ruocco G. 2009. Self-starting micromotors in a bacterial bath. *Phys. Rev. Lett.* 102:048104
- Maggi C, Simmchen J, Saglimbeni F, Katuri J, Dipalo M, et al. 2016. Self-assembly of micromachining systems powered by Janus micromotors. *Small* 12:446–51
- Koumakis N, Lepore A, Maggi C, Di Leonardo R. 2013. Targeted delivery of colloids by swimming bacteria. *Nat. Commun.* 4:2588
- Lambert G, Liao D, Austin RH. 2010. Collective escape of chemotactic swimmers through microscopic ratchets. *Phys. Rev. Lett.* 104:168102
- Pototsky A, Hahn AM, Stark H. 2013. Rectification of self-propelled particles by symmetric barriers. *Phys. Rev. E* 87:042124
- Wan MB, Olson Reichhardt CJ, Nussinov Z, Reichhardt C. 2008. Rectification of swimming bacteria and self-driven particle systems by arrays of asymmetric barriers. *Phys. Rev. Lett.* 101:018102
- Kaiser A, Sokolov A, Aranson IS, Lowen H. 2015. Mechanisms of carrier transport induced by a microswimmer bath. *IEEE Trans. NanoBiosci.* 14:260–66
- Kaiser A, Sokolov A, Aranson IS, Löwen H. 2015. Motion of two micro-wedges in a turbulent bacterial bath. *Eur. Phys. J. Spec. Top.* 224:1275–86
- Mallory SA, Valeriani C, Cacciuto A. 2014. Curvature-induced activation of a passive tracer in an active bath. *Phys. Rev. E* 90:032309
- Mallory SA, Valeriani C, Cacciuto A. 2015. Anomalous dynamics of an elastic membrane in an active fluid. *Phys. Rev. E* 92:012314
- Angelani L, Leonardo RD. 2010. Geometrically biased random walks in bacteria-driven micro-shuttles. New J. Phys. 12:113017
- Wensink HH, Kantsler V, Goldstein RE, Dunkel J. 2014. Controlling active self-assembly through broken particle-shape symmetry. *Phys. Rev. E* 89:010302
- Fily Y, Baskaran A, Hagan MF. 2014. Dynamics of self-propelled particles under strong confinement. Soft Matter 10:5609
- Fily Y, Baskaran A, Hagan MF. 2015. Dynamics and density distribution of strongly confined noninteracting nonaligning self-propelled particles in a nonconvex boundary. *Phys. Rev. E* 91:012125
- 101. Elgeti J, Gompper G. 2013. Wall accumulation of self-propelled spheres. Europhys. Lett. 101:48003

- Toner J, Tu Y. 1995. Long-range order in a two-dimensional dynamical XY model: how birds fly together. *Phys. Rev. Lett.* 75:4326–29
- Narayan V, Ramaswamy S, Menon N. 2007. Long-lived giant number fluctuations in a swarming granular nematic. Science 317:105–8
- 104. Deseigne J, Dauchot O, Chaté H. 2010. Collective motion of vibrated polar disks. *Phys. Rev. Lett.* 105:098001
- 105. Peruani F, Starruß J, Jakovljevic V, Søgaard-Andersen L, Deutsch A, Bär M. 2012. Collective motion and nonequilibrium cluster formation in colonies of gliding bacteria. *Phys. Rev. Lett.* 108:098102
- Chaté H, Ginelli F, Montagne R. 2006. Simple model for active nematics: quasi-long-range order and giant fluctuations. *Phys. Rev. Lett.* 96:180602
- Redner GS, Hagan MF, Baskaran A. 2013. Structure and dynamics of a phase-separating active colloidal fluid. *Phys. Rev. Lett.* 110:055701
- Fily Y, Marchetti MC. 2012. Athermal phase separation of self-propelled particles with no alignment. *Phys. Rev. Lett.* 108:235702
- Stenhammar J, Wittkowski R, Marenduzzo D, Cates ME. 2015. Activity-induced phase separation and self-assembly in mixtures of active and passive particles. *Phys. Rev. Lett.* 114:018301
- Tailleur J, Cates ME. 2008. Statistical mechanics of interacting run-and-tumble bacteria. *Phys. Rev. Lett.* 100:218103
- Barré J, Chétrite R, Muratori M, Peruani F. 2015. Motility-induced phase separation of active particles in the presence of velocity alignment. *J. Stat. Phys.* 158:589–600
- Gonnella G, Marenduzzo D, Suma A, Tiribocchi A. 2015. Motility-induced phase separation and coarsening in active matter. C. R. Phys. 16:316–31
- 113. Speck T, Bialké J, Menzel AM, Löwen H. 2014. Effective Cahn–Hilliard equation for the phase separation of active Brownian particles. *Phys. Rev. Lett.* 112:218304
- 114. Buttinoni I, Bialké J, Kümmel F, Löwen H, Bechinger C, Speck T. 2013. Dynamical clustering and phase separation in suspensions of self-propelled colloidal particles. *Phys. Rev. Lett.* 110:238301
- Wysocki A, Winkler RG, Gompper G. 2014. Cooperative motion of active Brownian spheres in threedimensional dense suspensions. *Europhys. Lett.* 105:48004
- Aranson IS, Snezhko A, Olafsen JS, Urbach JS. 2008. Comment on "Long-lived giant number fluctuations in a swarming granular nematic." *Science* 320:612–12
- 117. Cates ME, Marenduzzo D, Pagonabarraga I, Tailleur J. 2010. Arrested phase separation in reproducing bacteria creates a generic route to pattern formation. PNAS 107:11715–20
- 118. Ball P. 2013. Particle clustering phenomena inspire multiple explanations. Phys. Online J. 6:134
- Redner GS, Baskaran A, Hagan MF. 2013. Reentrant phase behavior in active colloids with attraction. *Phys. Rev. E* 88:012305
- Prymidis V, Samin S, Filion L. 2016. State behaviour and dynamics of self-propelled Brownian squares: a simulation study. *Soft Matter* 12:4309–17
- Li S, Jiang H, Hou Z. 2015. Effects of hydrodynamic interactions on the crystallization of passive and active colloidal systems. *Soft Matter* 11:5712–18
- 122. Dünweg B, Ladd AJC. 2009. Lattice Boltzmann simulations of soft matter systems. In Advanced Computer Simulation Approaches for Soft Matter Sciences III, eds. PC Holm, PK Kremer, pp. 89–166. Berlin: Springer
- 123. Blake JR. 1971. A spherical envelope approach to ciliary propulsion. J. Fluid Mech. 46:199–208
- Lighthill MJ. 1952. On the squirming motion of nearly spherical deformable bodies through liquids at very small Reynolds numbers. *Commun. Pure Appl. Math.* 5:109–18
- Alarcón F, Pagonabarraga I. 2013. Spontaneous aggregation and global polar ordering in squirmer suspensions. J. Mol. Liquids 185:56–61
- 126. Jones JE. 1924. On the determination of molecular fields. II. From the equation of state of a gas. Proc. R. Soc. Lond. A 106:463–77
- 127. Tung C, Harder J, Valeriani C, Cacciuto A. 2016. Micro-phase separation in two dimensional suspensions of self-propelled spheres and dumbbells. *Soft Matter* 12:555–61
- Palacci J, Sacanna S, Steinberg AP, Pine DJ, Chaikin PM. 2013. Living crystals of light-activated colloidal surfers. Science 339:936–40

- 129. Theurkauff I, Cottin-Bizonne C, Palacci J, Ybert C, Bocquet L. 2012. Dynamic clustering in active colloidal suspensions with chemical signaling. *Phys. Rev. Lett.* 108:268303
- 130. Levis D, Berthier L. 2014. Clustering and heterogeneous dynamics in a kinetic Monte Carlo model of self-propelled hard disks. *Phys. Rev. E* 89:062301
- Pohl O, Stark H. 2014. Dynamic clustering and chemotactic collapse of self-phoretic active particles. *Phys. Rev. Lett.* 112:238303
- Mognetti BM, Šarić A, Angioletti-Uberti S, Cacciuto A, Valeriani C, Frenkel D. 2013. Living clusters and crystals from low-density suspensions of active colloids. *Phys. Rev. Lett.* 111:245702
- Sciortino F, Mossa S, Zaccarelli E, Tartaglia P. 2004. Equilibrium cluster phases and low-density arrested disordered states: the role of short-range attraction and long-range repulsion. *Phys. Rev. Lett.* 93:055701
- Imperio A, Reatto L. 2006. Microphase separation in two-dimensional systems with competing interactions. J. Chem. Phys. 124:164712
- 135. Fernandez Toledano JC, Sciortino F, Zaccarelli E. 2009. Colloidal systems with competing interactions: from an arrested repulsive cluster phase to a gel. *Soft Matter* 5:2390–98
- 136. Lu PJ, Zaccarelli E, Ciulla F, Schofield AB, Sciortino F, Weitz DA. 2008. Gelation of particles with short-range attraction. *Nature* 453:499–503
- 137. Mani E, Löwen H. 2015. Effect of self-propulsion on equilibrium clustering. Phys. Rev. E 92:032301
- Suma A, Gonnella G, Marenduzzo D, Orlandini E. 2014. Motility-induced phase separation in an active dumbbell fluid. *Europhys. Lett.* 108:56004
- Kaiser A, Popowa K, Löwen H. 2015. Active dipole clusters: from helical motion to fission. *Phys. Rev. E* 92:012301
- 140. Guzmán-Lastra F, Kaiser A, Löwen H. 2016. Fission and fusion scenarios for magnetic microswimmer clusters. *Nat. Commun.* 7:13519
- Yan J, Han M, Zhang J, Xu C, Luijten E, Granick S. 2016. Reconfiguring active particles by electrostatic imbalance. *Nat. Mater.* 15:1095–99
- 142. Gao W, Pei A, Feng X, Hennessy C, Wang J. 2013. Organized self-assembly of Janus micromotors with hydrophobic hemispheres. *7. Am. Chem. Soc.* 135:998–1001
- 143. Johnson JN, Nourhani A, Peralta R, McDonald C, Thiesing B, et al. 2017. Dynamic stabilization of Janus sphere *trans*-dimers. *Phys. Rev. E* 95:042609
- Patteson AE, Gopinath A, Arratia PE. 2016. Active colloids in complex fluids. Curr. Opin. Colloid Interface Sci. 21:86–96
- 145. Mallory S, Valeriani C, Cacciuto A. 2017. *Improving self-assembly of kagome crystals using self-propulsion*. Unpublished manuscript
- Chen Q, Bae SC, Granick S. 2011. Directed self-assembly of a colloidal kagome lattice. *Nature* 469:381– 84
- 147. Stenhammar J, Wittkowski R, Marenduzzo D, Cates ME. 2016. Light-induced self-assembly of active rectification devices. *Sci. Adv.* 2:e1501850
- 148. Bianchi S, Pruner R, Vizsnyiczai G, Maggi C, Di Leonardo R. 2016. Active dynamics of colloidal particles in time-varying laser speckle patterns. *Sci. Rep.* 6:27681
- Buttinoni I, Volpe G, Kümmel F, Volpe G, Bechinger C. 2012. Active Brownian motion tunable by light. *J. Phys. Condens. Matter* 24:284129
- Palacci J, Sacanna S, Kim SH, Yi GR, Pine D, Chaikin P. 2014. Light-activated self-propelled colloids. *Philos. Trans. R. Soc. Lond. A* 372:20130372