Collective behavior of active molecules: Dynamic clusters, holes, and active fractalytes

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Recent experiments have led to active colloidal molecules, which aggregate from nonmotile building blocks and acquire self-propulsion through their nonreciprocal interactions. Here, we model the collective behavior of such active molecules and predict, besides dynamic clusters, the existence of a so-far unknown state of active matter made of "active fractalytes", which are motile crystallites featuring internal holes, gaps, and a fractal dimension. These structures could serve as a starting point for the creation of active materials with a low density and mechanical properties that can be designed through their fractal internal structure.

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Introduction. A general theme, which is shared by all fundamental forces in nature, from the strong force acting at the scale of elementary particles to gravity at intergalactical scales is the action-reaction symmetry. This symmetry, considered as the "cornerstone of physics" by Ernst Mach [1], is at the heart of the conservation laws for momentum and angular momentum expressing the homogeneity and isotropy of space itself. If action-reaction symmetry was broken, matter could spontaneously acquire a center of mass motion, provoking an obvious conflict with conservation laws. Accordingly, in equilibrium systems, the action-reaction symmetry applies also to effective interactions, from the interactions among nucleons in the core of all atoms to the broad variety of screened electrostatic and entropy-driven effective interactions governing the behavior of soft matter and biosystems. Interestingly, however, in nonequilibrium systems, effective interactions are in principle allowed to break action-reaction symmetry [2] through a subtle coupling of the system to its environment, which pays the energy and momentum bill for the spontaneous emergence of a directed motion [3,4].

To imagine a specific mechanism leading to nonreciprocal interactions, consider two spherical colloidal particles, one of which is isotropically coated with a catalyst that provokes a certain chemical reaction in the surrounding solvent. While the resulting concentration profile is essentially isotropic with respect to the catalytic colloid, the second colloid experiences a concentration gradient across its surface. This gradient drives a directed flow within the colloids interfacial layer by diffusio-osmosis or a similar mechanism [5–7]. Because momentum is conserved in the overall system, the second

colloid ballistically moves opposite to the osmatic solvent flow across its surface [5], while the catalytically coated colloid essentially rests. Remarkably, even if the second colloid approaches the catalytic one and both colloids are in close contact to form a "colloidal" dimer [5,8,9], the simplest realization of an active colloidal molecule [10], they persistently move ballistically as long as chemical reactions take place.

Recent years have made it possible to realize such ideas based on colloidal microparticles creating gradients, e.g., in concentration [11-15], electric potential [16-18], or temperature [19-25] inducing nonreciprocal attractions of tracer particles. In particular, recent experiments have realized binary mixtures of nonmotile isotropic colloids, which are driven by light [5,26] or ion-exchange processes [27] and exhibit nonreciprocal interactions among an "attractive" and a "responsive" particle species, which lead to directed motion of the emerging active molecules. While many theoretical [28-32] and experimental [5,26,27,33,34] studies on active colloidal molecules have focused on the formation, characterization and early-stage clustering of active molecules, theoretical studies [35-41] have recently started to also predict the possible large-scale behavior of many nonreciprocally interacting particles.

Here, we explore a model, which is directly inspired by recent experiments [5,26,27] and show that many interacting active molecules can self-organize into phases, which have not yet been reported in the literature. First, for relatively weak nonreciprocal interactions and/or a small amount of attractive particles in the system, we observe that active molecules self-organize into arrested, dynamic clusters with a self-limited characteristic size. This phase resembles dynamic clustering in self-propelled Janus colloids [42–52], but emerges from a different mechanism. Second, for stronger nonreciprocal interactions, we observe that individual active molecules self-assemble into macroscopic aggregates, which feature a persistent dynamics and a characteristic internal structure, which involves holes and gaps leading to a fractal (noninteger) dimension. Accordingly, we call these structures active fractalytes-a portmanteau of fractals and crystallites. These super structures exemplify a route towards the creation

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of amorphous, solid-like active materials, which are lighter than active systems in glassy or crystalline states and feature a density that can be tuned by the composition of the system or by the chemical (phoretic) activity of its components.

Model. Inspired by recent experiments [5,26,27] we define a minimal model, which consists of $N = N_a + N_p$ colloidal particles in two spatial dimensions N_a of which attract all particles via an effective Yukawa potential $U_P(r) = -Y \frac{e^{-\mu r}}{r}$, which represents attractive phoretic (far-field) interactions [28,29,53–55]. The remaining N_p particles interact purely repulsively with each other. Thus, the attractive particles attract the passive particles but not vice versa, leading to nonreciprocal interactions. The overdamped Langevin equation for particle *i* reads

$$\dot{\mathbf{r}}_i(t) = \frac{1}{\gamma} \mathbf{F}_i + \sqrt{2D_t} \boldsymbol{\eta}_i(t), \quad i = 1, \dots, N_a, \dots, N \quad (1)$$

with forces

$$\mathbf{F}_{i} = -\sum_{j=1\atop j\neq i}^{N} \nabla_{\mathbf{r}_{i}} U_{S}(r_{ij}) - \sum_{j=1\atop j\neq i}^{N_{a}} \nabla_{\mathbf{r}_{i}} U_{P}(r_{ij})$$
(2)

where $r_{ij} = |\mathbf{r}_i - \mathbf{r}_j|$ and γ is the Stokes drag coefficient. D_t is the translational diffusion coefficient and $\eta_i(t)$ is Gaussian white noise with zero mean and unit variance describing thermal Brownian motion. The steric repulsion is given by the Weeks-Chandler-Anderson (WCA) potential $U_S(r) =$ $4\epsilon[(\frac{\sigma}{r})^{12}-(\frac{\sigma}{r})^6]+\epsilon$ for $r \leq 2^{1/6}\sigma$ and $U_s(r)=0$ for r> $2^{1/6}\sigma$, where σ denotes the (soft) particle diameter. To reduce the parameter space, we now use σ , σ^2/D_t , and k_BT as length, time, and energy units, respectively. The remaining dimensionless parameters are the packing fraction $\Phi_0 =$ $N\pi\sigma^2/4L^2$, where L is the length of the quadratic simulation box, the fraction of attractive particles $p = N_a/N$, the effective inverse screening length $\mu^* = \mu \sigma$, the attraction strength $Y^* = Y/(k_B T \sigma)$, and the strength of the WCA potential $\epsilon^* = \epsilon/(k_B T)$ (see Supplemental Material, SM [56] for the reduced equations of motion). In experiments, it can be realized with nonreciprocally interacting colloidal mixtures [9,26], with ion-exchange driven particle-tracer mixtures [27] or possibly also with nonreciprocal dusty plasmas [2] or oil exchanging droplets [57]. To be generic, we disregard system specific ingredients, such as a possible binary nature of the solvent, which can in general lead to additional interesting phenomena [26]. Notably, as opposed to many other studies exploring nonreciprocal interactions such as [8,9,30,58], as in experiments [5,26], we consider isotropic particles, which just have spatial degrees of freedom but no orientational ones, so that the individual particles in our model move like passive Brownian particles, which acquire activity only through interactions with particles of the other species.

We perform Brownian dynamics simulations with up to 2.5×10^4 particles in a box of size $L \times L$ with periodic boundary conditions by using the software package LAMMPS [59]. Here, we mainly vary the key control parameters Y^* and p, fix $\Phi_0 = 0.1$ to stay at low packing fraction, $\epsilon^* = 100$ so that the particles can hardly overlap and also $\mu^* = 2$ so that the effective screening length of the phoretic attractions is roughly comparable to the particle size [9,54].

Activity-induced fragmentation arrests coarsening. For moderately strong attractions $Y^* < 20 (Y^* = 10 \text{ corresponds})$ to an interaction strength, which is comparable to the thermal energy at contact, i.e., $r^* = 2^{1/6}\sigma$), independently of p, the system ends up in a disordered uniform state. Choosing stronger attractive interactions $(Y^* > 20)$ at early times active molecules form with a huge variety in shape and dynamics, comprising ballistically moving dimers, trimers, and larger molecules following chiral trajectories (Fig. 1), similarly as observed in experiments [5,27]. The molecules move persistently since attractive particles undirectionally attract passive ones, which push the active ones forward due to the WCA-repulsions. At later times, active molecules aggregate and successively form larger and larger clusters, which coexist with a gas-like phase comprising individual nonattractive particles only [Fig. 1(a)]. Interestingly, at some time, despite the presence of attractions, the average cluster size stops to increase [green lines in Fig. 2(a)] and converges to a characteristic finite size. We have identified two different mechanisms, which can arrest coarsening and lead to finite cluster sizes. First, if the attractions are comparatively weak {e.g., $(Y^*, p) = (50, 0.85)$, Movie M1 in the SM [56]}, thanks to nonreciprocal forces acting on their components and thermal motion clusters split up from time to time leaving behind smaller cluster fragments, which self-propel into different directions [Fig. 1(c)]. This activity-induced cluster fragmentation arrests coarsening and leads to clusters with a self-limited size of ~ 10 particles [Fig. 2(a), light-green line], which look similar to those observed in experiments made of individually self-propelling Janus colloids [43]. In addition to cluster fragmentation processes also single particles frequently detach from existing clusters. Second, for a quite low percentage of attractive particles and a strong attraction {e.g. $(Y^*, p) = (300, 0.25)$, Movie M2 in the SM [56]} clusters tend to posses a layer of passive particles surrounding them [Figs. 1(a) and 1(d)], which prevents them from growing beyond a certain characteristic size [Fig. 2(a), dark-green line] because the attractions are effectively screened (Yukawa potential) and do no longer dominate over thermal motion at distances of two or more particle diameters. We now ask how the characteristic cluster size depends on the attraction strength Y^* and on the composition of the system p. For small values of p, where the collective dynamics of cluster fragments is rather unimportant, this length scale can be understood based on the competition between passive diffusion and attractions since clusters are expected to grow until both effects balance each other. In the SM [56] we determine the following relation for the mean number of particles in a cluster at late times: $\langle N_{cl} \rangle \propto W(aY^*)$. Here $W(\cdot)$ denotes the Lambert W function and a is a fit parameter. The corresponding fit to the data is shown in Fig. 3(a), which matches the simulation data very well for low p.

Active fractalytes. In mixtures where most particles are attractive (large p) and where Y^* is also large, as expected, at the early stages in our simulations we observe that all particles aggregate and form small rigid clusters such that no dilute gas remains. As time evolves, the aggregates move ballistically and self-rotate and once they meet, they typically stick together for very long times, ultimately leading to a (meta)stable macrocluster containing all particles in the system [Fig. 2(a),

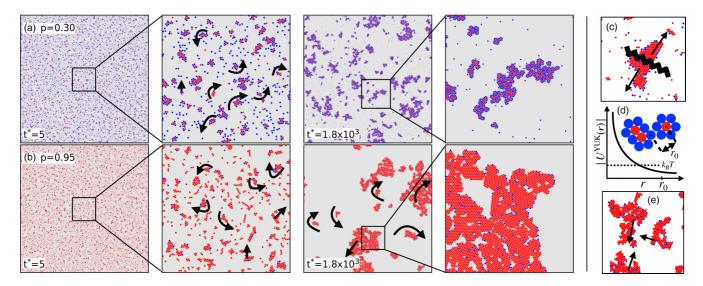


FIG. 1. Snapshots from simulations starting with a random, uniform initial state at times $t^* = tD_t/\sigma^2$ showing dynamic clusters with a self-limited size for p = 0.3 (a) and active fractalytes for p = 0.95 (b). Black arrows indicate self-propulsion and self-rotation of the aggregates. Mechanisms leading to finite cluster sizes [(c),(d)] and the emergence of holes within active fractalytes (e). Red particles are the attractive and blue ones the passive. Parameters: $N = 2.5 \times 10^4$, $Y^* = 300$.

red line]. Remarkably, this macrocluster is not closely packed but shows a characteristic internal structure comprising numerous holes and gaps {Fig. 1(b), Movie M3 in the SM [56]} leading to a noninteger (fractal) dimension [Fig. 2(d)], as we will further specify below. The fractal dimension decreases as p increases and ultimately transitions for $p \rightarrow$ 1.0, where all particles reciprocally attract each other, to a state resembling diffusion limited aggregation (DLA) [60]. What is the mechanism leading to active macroclusters with a fractal dimension for p < 1? The active molecules, which form at early times in our simulations typically have a rigid structure as well as a characteristic self-propulsion velocity and self-rotation frequency due to unbalanced nonreciprocal forces. The self-rotations provoke elongated cluster shapes, since the rotating clusters move faster at locations, which are far away from the center of rotation, leading to a more efficient recruitment of additional particles, which preferably attach to the outer parts of the rotating clusters. At later times, when two (or more) of these elongated motile structures approach each other [Fig. 1(e)], they stick together without significantly changing their shapes, which ultimately leads to clusters with significant gaps. Note that in contrast to DLA in passive systems, where individual particles successively bind to a growing structure, here activity promotes the formation of motile rigid building blocks, which grow ballistically rather than diffusively and lead to relatively large closed holes. In addition, active fractalytes break up and reform from time to time, so they are dynamic even after complete aggregation, whereas structures forming through DLA are typically stable. To further characterize active fractalytes, we have determined

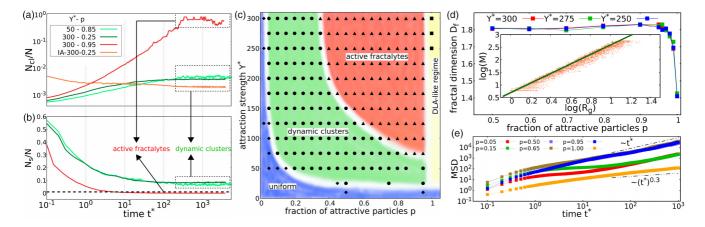


FIG. 2. Phase diagram, cluster sizes, and fractal dimension: Typical time-evolution (moving averages) of the mean cluster size $N_{cl}(t^*)/N$ (a) and the number of single particles $N_s(t^*)/N$ (b) for parameters shown in the key, where the additional "IA" refers to aggregated initial state as shown in the SM [56]. The black dotted line in panel (b) indicates the threshold of 0.01N. Nonequilibrium phase diagram (c). Panel (d) shows the dependence of the fractal dimension D_f on the fraction of attractive particles p for different attraction strengths Y^* and the inset shows one exemplary fit of Eq. (3) to the corresponding data for $(Y^*, p) = (300, 0.95)$. Mean-squared displacement (MSD) for $Y^* = 300$ and different p as shown in the key (e).

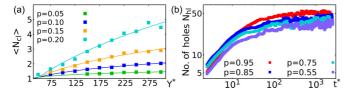


FIG. 3. (a) Characteristic cluster size $\langle N_{cl} \rangle$ as a function of the attraction strength Y^* for different *p*. Lines show fits to the predicted scaling. (b) Number of holes N_{hl} as a function of t^* .

the time-evolution of the number of holes and found that it converges (on average) to a constant value [Fig. 3(b)]. The oscillations stem from the ongoing dynamics of the fractalytes. That is, active fractalytes do not systematically "heal out" but feature a characteristic distribution of holes and gaps, which are persistently renewed by nonreciprocal forces acting on their components.

Fractal dimension. To see that the observed gaps and holes indeed lead to a fractal structure, we now analyze the fractal dimension D_f . To this end, we sample different cluster sizes and their corresponding radius of gyration R_g , which we calculate by using OVITO [61]. The connection between the number of particles M belonging to a cluster and R_g is given by [62–64]

$$M = k R_g^{D_f}.$$
 (3)

By plotting $\log(M)$ over $\log(R_g)$ and fitting a linear function to the data, the slope gives the fractal dimension [inset of Fig. 2(d)]. We observe that the fractal dimension strongly increases if nonreciprocal interactions are present. It rapidly increases from $D_f \approx 1.45$ [60,65] for p = 1.0 to values around 1.8 for $p \in [0.5, 0.95]$. This steep increase of D_f [Fig. 2(d)] is a clear evidence that the breaking of the action-reaction symmetry leads to fractals, which differ from structures emerging by DLA-like processes that have recently been studied also for active particles [66]. Note also that due to cluster-cluster aggregation for p = 1.0 we obtain $D_f \approx 1.45$ rather than $D_f = 1.74$ as for ordinary DLA.

Dynamical properties. To characterize the dynamics of the active fractalytes we calculate the mean-squared displacement [Fig. 2(e)], which reveals a diffusive behavior with an active diffusion coefficient $D_a = \lim_{t^* \to \infty} MSD(t^*)/t^* = 0.6$ both in the regime of dynamical clustering and in the gas-like phase [green and red line, Fig. 2(e)]. In both cases self-propulsion is unimportant at late times as most of the emerging aggregates are isotropic [Fig. 1(d)]. Notably, active fractalytes show a much larger active diffusion coefficient [$D_a \approx 7.3$ for p =0.95, blue line, Fig. 2(e)]. This is because of the persistent self-propulsion of the fractalytes, which increases with Y^* . In sharp contrast, for p = 1.0 (DLA-like regime), the dynamics is subdiffusive with MSD $\sim (t^*)^{0.3}$. In addition, for statistical reasons and for large N_0 , the self-propulsion speed v of active fractalytes is expected to decrease as $N_0^{-1/2}$, which is consistent with our results [Figs. 4(b) and 4(c)], where we find $v \sim N_0^{-0.56 \pm 0.06}$.

Phase diagram. To summarize our results in a nonequilibrium phase diagram, we calculate the mean cluster size $\langle N_{cl} \rangle$ and the number of single particles $\langle N_s \rangle$ to decide to which

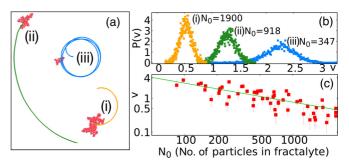


FIG. 4. (a) Typical center of mass trajectories of active fractalytes. (b) Speed distribution P(v) for the fractalytes shown in (a). (c) Self-propulsion speed as a function of the fractalyte size. Error bars are the standard deviation of P(v).

phase the system belongs. The criteria are summarized in Table I. In the state diagram [Fig. 2(c)], the transition from the uniform state (blue) to dynamic clustering (green) has the form $Y^* \propto 1/p$, which is plausible since $U_{tot} \propto \Phi_0 p Y^*$ measures the total potential energy in the system. That is, despite the complex phenomenology of the active molecules, which further evolve into dynamic clusters, the onset criterion for their formation can be simply understood from the consideration of the total potential energy, which competes with thermal motion. Next to the uniform regime, in the green domain, dynamic clustering shows up, and for even higher Y^* and p active fractalytes (red) occur. These do not necessarily take the form of one macrocluster, but near the transition line, e.g., at $(Y^*, p) = (200, 0.5)$ (Movie M4 in the SM [56]), smaller and more dynamic clusters may form that feature holes and almost no existing gas like phase, which distinguishes them from the dynamic clustering regime.

Conclusions. We found that active molecules can selforganize into dynamic structures, which have not yet been reported in the literature. First, our results exemplify a route towards dynamic clustering, which exploits nonreciprocal interactions to induce ongoing cluster fragmentation. Second, we have observed and characterized a state of active matter in the form of active fractalytes, which feature internal holes, gaps, and a fractal dimension. These results offer a route towards designing active materials with optical and mechanical properties, which can be controlled via the contained holes that can in turn be designed via the composition of the system.

TABLE I. Characteristics of the different phases.

	Uniform	Dynamic clusters	Active fractalytes	DLA- like
$\langle N_{cl} \rangle$	≈ 1	$\ll N$	$\rightarrow N$	$\rightarrow N$
$\langle N_s \rangle$	$\approx N$	>0.01N	$\leq 0.01N$	$\leq 0.01N$
D_f			≈ 1.8	≈ 1.4
D_a	≈ 0.6	≈ 0.6	\approx 7.3	
$MSD \sim (t^*)^b$	$b \approx 1$	$b \approx 1$	$b \approx 1$	$b \approx 0.3$

- E. Mach, *The Science of Mechanics*, edited by T. J. McCormack, *Cambridge Library Collection—Physical Sciences* (Cambridge University Press, Cambridge, 2013).
- [2] A. V. Ivlev, J. Bartnick, M. Heinen, C. R. Du, V. Nosenko, and H. Löwen, Statistical Mechanics where Newton's Third Law is Broken, Phys. Rev. X 5, 011035 (2015).
- [3] M. C. Marchetti, J. F. Joanny, S. Ramaswamy, T. B. Liverpool, J. Prost, M. Rao, and R. Aditi Simha, Hydrodynamics of soft active matter, Rev. Mod. Phys. 85, 1143 (2013).
- [4] J. Elgeti, R. G. Winkler, and G. Gompper, Physics of microswimmers-single particle motion and collective behavior: A review, Rep. Prog. Phys. 78, 056601 (2015).
- [5] F. Schmidt, B. Liebchen, H. Löwen, and G. Volpe, Lightcontrolled assembly of active colloidal molecules, J. Chem. Phys. 150, 094905 (2019).
- [6] S. Y. Reigh, P. Chupal, S. Thakur, and R. Kapral, Diffusiophoretically induced interactions between chemically active and inert particles, Soft Matter 14, 6043 (2018).
- [7] J. Stürmer, M. Seyrich, and H. Stark, Chemotaxis in a binary mixture of active and passive particles, J. Chem. Phys. 150, 214901 (2019).
- [8] D. P. Singh, U. Choudhury, P. Fischer, and A. G. Mark, Nonequilibrium assembly of light-activated colloidal mixtures, Adv. Mater. 29, 1701328 (2017).
- [9] F. Hauke, H. Löwen, and B. Liebchen, Clustering-induced velocity-reversals of active colloids mixed with passive particles, J. Chem. Phys. 152, 014903 (2020).
- [10] H. Löwen, Active colloidal molecules, Europhys. Lett. 121, 58001 (2018).
- [11] J. R. Howse, R. A. L. Jones, A. J. Ryan, T. Gough, R. Vafabakhsh, and R. Golestanian, Self-Motile Colloidal Particles: From Directed Propulsion to Random Walk, Phys. Rev. Lett. 99, 048102 (2007).
- [12] R. Golestanian, T. B. Liverpool, and A. Ajdari, Propulsion of a Molecular Machine by Asymmetric Distribution of Reaction Products, Phys. Rev. Lett. 94, 220801 (2005).
- [13] R. Golestanian, T. B. Liverpool, and A. Ajdari, Designing phoretic micro- and nano-swimmers, New J. Phys. 9, 126 (2007).
- [14] A. Würger, Self-Diffusiophoresis of Janus Particles in Near-Critical Mixtures, Phys. Rev. Lett. 115, 188304 (2015).
- [15] G. Rückner and R. Kapral, Chemically Powered Nanodimers, Phys. Rev. Lett. 98, 150603 (2007).
- [16] J. L. Moran, P. M. Wheat, and J. D. Posner, Locomotion of electrocatalytic nanomotors due to reaction induced charge autoelectrophoresis, Phys. Rev. E 81, 065302(R) (2010).
- [17] W. F. Paxton, K. C. Kistler, C. C. Olmeda, A. Sen, S. K. St. Angelo, Y. Cao, T. E. Mallouk, P. E. Lammert, and V. H. Crespi, Catalytic nanomotors: Autonomous movement of striped nanorods, J. Am. Chem. Soc. **126**, 13424 (2004).
- [18] W. F. Paxton, A. Sen, and T. E. Mallouk, Motility of catalytic nanoparticles through self-generated forces, Chem. Eur. J. 11, 6462 (2005).
- [19] D. Rings, R. Schachoff, M. Selmke, F. Cichos, and K. Kroy, Hot Brownian Motion, Phys. Rev. Lett. 105, 090604 (2010).
- [20] P. Gaspard and R. Kapral, The stochastic motion of selfthermophoretic Janus particles, J. Stat. Mech. (2019) 074001.

- [21] H.-R. Jiang, N. Yoshinaga, and M. Sano, Active Motion of a Janus Particle by Self-Thermophoresis in a Defocused Laser Beam, Phys. Rev. Lett. **105**, 268302 (2010).
- [22] A. Würger, Thermophoresis in Colloidal Suspensions Driven by Marangoni Forces, Phys. Rev. Lett. 98, 138301 (2007).
- [23] S. Auschra, A. Bregulla, K. Kroy, and F. Cichos, Thermotaxis of Janus particles, Eur. Phys. J. E 44, 90 (2021).
- [24] M. Fränzl and F. Cichos, Hydrodynamic manipulation of nano-objects by optically induced thermo-osmotic flows, Nat. Commun. 13, 656 (2022).
- [25] M. Braun and F. Cichos, Optically controlled thermophoretic trapping of single nano-objects, ACS Nano 7, 11200 (2013).
- [26] J. Grauer, F. Schmidt, J. Pineda, B. Midtvedt, H. Löwen, G. Volpe, and B. Liebchen, Active droploids, Nat. Commun. 12, 6005 (2021).
- [27] R. Niu, A. Fischer, T. Palberg, and T. Speck, Dynamics of binary active clusters driven by ion-exchange particles, ACS Nano 12, 10932 (2018).
- [28] R. Soto and R. Golestanian, Self-assembly of active colloidal molecules with dynamic function, Phys. Rev. E 91, 052304 (2015).
- [29] R. Soto and R. Golestanian, Self-Assembly of Catalytically Active Colloidal Molecules: Tailoring Activity Through Surface Chemistry, Phys. Rev. Lett. **112**, 068301 (2014).
- [30] H. D. Vuijk, S. Klempahn, H. Merlitz, J.-U. Sommer, and A. Sharma, Active colloidal molecules in activity gradients, Phys. Rev. E 106, 014617 (2022).
- [31] S. Gonzales and R. Soto, Directed assembly of active colloidal molecules, New J. Phys. 21, 033041 (2019).
- [32] A. Varma, T. D. Montenegro-Johnson, and S. Michelin, Clustering-induced self-propulsion of isotropic autophoretic particles, Soft Matter 14, 7155 (2018).
- [33] Z. Wang, Z. Wang, J. Li, C. Tian, and Y. Wang, Active colloidal molecules assembled via selective and directional bonds, Nat. Commun. 11, 2670 (2020).
- [34] R. Niu, T. Palberg, and T. Speck, Self-Assembly of Colloidal Molecules due to Self-Generated Flow, Phys. Rev. Lett. 119, 028001 (2017).
- [35] S. Saha, J. Agudo-Canalejo, and R. Golestanian, Scalar Active Mixtures: The Nonreciprocal Cahn-Hilliard Model, Phys. Rev. X 10, 041009 (2020).
- [36] M. Fruchart, R. Hanai, P. B. Littlewood, and V. Vitelli, Non-reciprocal phase transitions, Nature (London) 592, 363 (2021).
- [37] J. Agudo-Canalejo and R. Golestanian, Active Phase Separation in Mixtures of Chemically Interacting Particles, Phys. Rev. Lett. 123, 018101 (2019).
- [38] K. L. Kreienkamp and S. H. L. Klapp, Clustering and flocking of repulsive chiral active particles with non-reciprocal couplings, New J. Phys. 24, 123009 (2022).
- [39] S. A. M. Loss and S. H. L. Klapp, Irreversibility, heat and information flows induced by non-reciprocal interactions, New J. Phys. 22, 123051 (2020).
- [40] Z. You, A. Baskaran, and M. C. Marchetti, Nonreciprocity as a generic route to traveling states, Proc. Natl. Acad. Sci. USA 117, 19767 (2020).
- [41] S. A. M. Loos, S. H. L. Klapp, and T. Martynec, Long-Range Order and Directional Defect Propagation in the Nonreciprocal XY Model with Vision Cone Interactions, Phys. Rev. Lett. 130, 198301 (2023).

- [42] I. Theurkauff, C. Cottin-Bizonne, J. Palacci, C. Ybert, and L. Bocquet, Dynamic Clustering in Active Colloidal Suspensions with Chemical Signaling, Phys. Rev. Lett. 108, 268303 (2012).
- [43] I. Buttinoni, J. Bialké, F. Kümmel, H. Löwen, C. Bechinger, and T. Speck, Dynamical Clustering and Phase Separation in Suspensions of Self-Propelled Colloidal Particles, Phys. Rev. Lett. 110, 238301 (2013).
- [44] J. Palacci, S. Sacanna, A. P. Steinberg, D. J. Pine, and P. M. Chaikin, Living Crystals of Light-Activated Colloidal Surfers, Science 339, 936 (2013).
- [45] F. Ginot, I. Theurkauff, F. Detcheverry, C. Ybert, and C. Cottin-Bizonne, Aggregation-fragmentation and individual dynamics of active clusters, Nat. Commun. 9, 696 (2018).
- [46] H. Stark, Artificial Chemotaxis of Self-Phoretic Active Colloids: Collective Behavior, Acc. Chem. Res. 51, 2681 (2018).
- [47] O. Pohl and H. Stark, Dynamic Clustering and Chemotactic Collapse of Self-Phoretic Active Particles, Phys. Rev. Lett. 112, 238303 (2014).
- [48] G. Foffano, J. S. Lintuvuori, K. Stratford, M. E. Cates, and D. Marenduzzo, Dynamic clustering and re-dispersion in concentrated colloid-active gel composites, Soft Matter 15, 6896 (2019).
- [49] B. Liebchen, D. Marenduzzo, I. Pagonabarraga, and M. E. Cates, Clustering and Pattern Formation in Chemorepulsive Active Colloids, Phys. Rev. Lett. 115, 258301 (2015).
- [50] O. Pohl and H. Stark, Self-phoretic active particles interacting by diffusiophoresis: A numerical study of the collapsed state and dynamic clustering, Eur. Phys. J. E 38, 93 (2015).
- [51] M.-J. Huang, J. Schofield, and R. Kapral, Chemotactic and hydrodynamic effects on collective dynamics of selfdiffusiophoretic Janus motors, New J. Phys. 19, 125003 (2017).
- [52] Z. Ma, M. Yang, and R. Ni, Dynamic Assembly of Active Colloids: Theory and Simulation, Adv. Theory Simul. 3, 2000021 (2020).
- [53] B. Liebchen and H. Löwen, Modeling Chemotaxis of Microswimmers: From Individual to Collective Behavior, in *Chemical Kinetics* (World Scientific Europe, London, 2019), p. 493.

- [54] B. Liebchen and H. Löwen, Which interactions dominate in active colloids? J. Chem. Phys. 150, 061102 (2019).
- [55] B. Liebchen and A. K. Mukhopadhyay, Interactions in active colloids, J. Phys.: Condens. Matter 34, 083002 (2022).
- [56] See Supplemental Material at http://link.aps.org/supplemental/ 10.1103/PhysRevResearch.5.L032038 for details about simulations and data analysis.
- [57] C. H. Meredith, P. G. Moerman, J. Groenewold, Y.-J. Chiu, W. K. Kegel, A. nav Blaaderen, and L. D. Zarzar, Predatorprey interactions between droplets driven by non-reciprocal oil exchange, Nat. Chem. 12, 1136 (2020).
- [58] M. Knežević, T. Welker, and H. Stark, Collective motion of active particles exhibiting non-reciprocal orientational interactions, Sci. Rep. 12, 19437 (2022).
- [59] A. P. Thompson, H. M. Aktulga, R. Berger, D. S. Bolintineanu, W. M. Brown, P. S. Crozier, P. J. in 't Veld, A. Kohlmeyer, S. G. Moore, T. D. Nguyen, *et al.*, LAMMPS—A flexible simulation tool for particle-based materials modeling at the atomic, meso, and continuum scales, Comput. Phys. Commun. **271**, 108171 (2022).
- [60] B. M. Smirnov, The properties of fractal clusters, Phys. Rep. 188, 1 (1990).
- [61] A. Stukowski, Visualization and analysis of atomistic simulation data with OVITO—The Open Visualization Tool, Modelling Simul. Mater. Sci. Eng. 18, 015012 (2010).
- [62] T. A. Witten and L. M. Sander, Diffusion-limited aggregation, Phys. Rev. B 27, 5686 (1983).
- [63] T. A. Witten and L. M. Sander, Diffusion-Limited Aggregation, a Kinetic Critical Phenomenon, Phys. Rev. Lett. 47, 1400 (1981).
- [64] S. Jungblut, J. O. Joswig, and A. Eychmüller, Diffusion-limited cluster aggregation: Impact of rotational diffusion, J. Phys. Chem. C 123, 950 (2019).
- [65] M. Kolb, R. Botet, and R. Jullien, Scaling of Kinetically Growing Clusters, Phys. Rev. Lett. 51, 1123 (1983).
- [66] M. Paoluzzi, M. Leoni, and M. C. Marchetti, Fractal aggregation of active particles, Phys. Rev. E 98, 052603 (2018).