Anomalous Diffusion and Lévy Walks Distinguish Active from Inertial Turbulence

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Bacterial swarms display intriguing dynamical states like active turbulence. Now, using a hydrodynamic model, we show that such dense active suspensions manifest superdiffusion, via Lévy walks, which masquerades as a crossover from ballistic to diffusive scaling in measurements of mean-squared displacements, and is tied to the emergence of hitherto undetected oscillatory streaks in the flow. Thus, while laying the theoretical framework of an emergent advantageous strategy in the collective behavior of microorganisms, our Letter underlines the essential differences between active and inertial turbulence.

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Flowing active matter, resulting from the motility of organisms, cells, and particles, forms an intriguing class of nonequilibrium phenomena [1–[3\].](#page-4-4) Biological functions like foraging and evasion, that require active agents to both sample their neighborhoods and make large jumps to cover ground, become inextricably coupled with collective flow patterns in dense systems [\[4\]](#page-4-5). Active flow driven enhanced diffusion and mixing are also essential for feeding of microorganisms [5–[7\]](#page-4-6). Active agents, hence, profit from optimal processes like Lévy motion $[8-10]$ $[8-10]$ characterized by long-tailed, self-similar step-size distributions leading to anomalous diffusion [\[11\]](#page-4-8) and increased encounter rates [\[12\]](#page-4-9)—all of which can emerge from simple generative mechanisms [\[13\]](#page-4-10)—as opposed to inefficient meandering by random walks limited to classical diffusion. Interestingly, the motion of individual active entities in isolation often differs from when they are in large numbers [\[14\]](#page-4-11): Movements of a single swimming bacterium can be fundamentally different from the motion in a dense, fluidlike swarm [\[15\].](#page-4-12)

A remarkable feature of the collective behavior of dense active suspensions is the emergence of spatiotemporal structures strongly reminiscent of inertial turbulence [\[16](#page-4-13)–21]: Such two-dimensional suspensions are vortical [\[22\]](#page-4-14), chaotic [\[17\]](#page-4-15) with non-Gaussian distributions of velocity gradients [22–[24\],](#page-4-14) and a power-law kinetic energy spectrum [\[25,26\].](#page-4-16) These facets of low Reynolds number suspensions have led to a new class of phenomena known as "active turbulence" [\[27\]](#page-4-17).

However, does the similarity between high Reynolds number inertial turbulence and low Reynolds number active turbulence hold even for Lagrangian statistics? This is a fundamentally important question for two reasons. First, while for inertial turbulence, Lagrangian (tracer) trajectories, measured through mean-squared displacements (MSDs) have a universal behavior of purely diffusive self-separation [\[28\],](#page-4-18) experiments in active turbulence suggest nonuniversal signatures of Lévy walks and anomalous diffusion [\[15,29](#page-4-12)–31]. Second, if such effective biological strategies emerge in active suspensions, why have they remained theoretically undetected and experimentally inconclusive so far?

Using a continuum hydrodynamic model, now, we provide definitive answers to these questions. We show what appears as an inconsequential transition [see Fig. [1\(a\)\]](#page-1-0) between the ballistic and diffusive scaling regimes in MSD measurements is really an intermediate, anomalous diffusive regime leveraging the crucial biological advan-tages of Lévy walks [\[32\].](#page-4-19) Thus, while low Reynolds number active suspensions may well share features, at the level of equations and the resultant dynamics, with high Reynolds number inertial turbulence, active turbulence still allows for emergent behavior consistent with biological systems striving for efficient searching strategies. This, we discover, is facilitated by a synthesis of two basic flow patterns: Novel oscillatory "streaks" responsible for anomalous diffusion and unique to such systems, and vortical features reminiscent of inertial turbulence.

Dense, active suspensions lend themselves to a generalized hydrodynamic description, developed for bacterial swarms [\[17,36\]](#page-4-15)

$$
\partial_t \mathbf{u} + \lambda \mathbf{u} \cdot \nabla \mathbf{u} = -\nabla p - \Gamma_0 \nabla^2 \mathbf{u} - \Gamma_2 \nabla^4 \mathbf{u} - (\alpha + \beta |\mathbf{u}|^2) \mathbf{u},\tag{1}
$$

where the incompressible velocity field $\mathbf{u}(\mathbf{x}, t)$ (with $\nabla \cdot \mathbf{u} = 0$, is a coarse-grained description of the motility of dense, active (bacterial) suspensions. Here, $\lambda > 0$ corresponds to pusher-type bacteria and the Γ terms are responsible for quasichaotic pattern formation via stress-induced instabilities (when Γ_0 , $\Gamma_2 > 0$) in the bacterial system [\[17,25,37](#page-4-15)–39]. The last term adds Toner-Tu drive [\[40,41\]](#page-5-0), where β needs to be positive for stability, while the activity α can take both positive (Ekman friction) and negative (active injection) values. In our direct numerical simulations [\[33\],](#page-4-20) Γ_0 and Γ_2 are fixed according to experimental length and time scales [\[17\]](#page-4-15), while other parameters are varied to obtain the flow fields explored in this Letter [\[33\]](#page-4-20). The characteristic length and time scales associated [33]. The characteristic length and time scales associated with the linear instability in [\(1\)](#page-0-0) are $L_{\Gamma} = \sqrt{\Gamma_2/\Gamma_0}$ and $\tau_{\Gamma} =$ Γ_2/Γ_0^2 [\[17\]](#page-4-15), while the activity length and time scales are $\frac{1}{2}$ $\frac{1}{6}$ [1/], while the activity length and time scales are given by $\frac{1}{\sqrt{|\alpha|\beta}}$ and $\frac{1}{|\alpha|}$, respectively. In conformity with the previous studies using this model, we present our results in simulation units.

Figure [1\(a\)](#page-1-0) shows the MSD $\Delta x^2 = \langle ||\mathbf{x}(t) - \mathbf{x}(0)||^2 \rangle$ (where $\|\cdot\|$ and $\langle \cdot \rangle$ denote the Euclidean norm and ensemble averaging over all particles, respectively) for an active suspension with $\alpha = -1.0$. This scaling behavior seems consistent with inertial turbulence: A ballistic regime $\Delta x^2 \sim t^2$ crossing over to a diffusive regime $\Delta x^2 \sim t$ [\[42\]](#page-5-1). Individual trajectories [upper inset, Fig. [1\(a\)](#page-1-0)], similarly, show diffusive meandering.

However, some experiments [\[15,29\]](#page-4-12) on dense bacterial swarms provide strong evidence of anomalous diffusion $\Delta x^2 \sim t^{\xi}$, with $1 < \xi < 2$. This raises the question whether what is seen as a crossover from ballistic to diffusive behavior is actually masking an intermediate, anomalous diffusive regime.

To uncover the true behavior of such suspensions, we perform several simulations [\[33\]](#page-4-20) on domain sizes $20 \le$ L \leq 80 with −6 $\leq \alpha \leq$ 4, seeded with tracers that evolve as $d\mathbf{x}(t)/dt = \mathbf{u}(\mathbf{x}, t)$, and measure the associated MSDs as shown in Fig. [1\(b\).](#page-1-0) For $\alpha > 0$, corresponding to an Ekman friction effect, and for modest activity $-2 \le \alpha < 0$ (cases A–E), we see little evidence of anomalous diffusion. However, as we increase the activity further (case F), the first signatures of an intermediate regime appear. This observation is validated for case G where the Δx^2 shows a convincing superdiffusive regime, and local slope analysis [Fig. [1\(b\)](#page-1-0), inset] gives $\xi = (d\text{Log}\Delta x^2/d\text{Log}t)$ = $1.31 \pm 0.08 \approx 4/3$, for close to two decades before giving way to diffusion. This scaling, we recall, is not inconsistent with recent experimental measurements [\[15,29\]](#page-4-12) and simplified model predictions [\[43,44\]](#page-5-2) which suggest similar superdiffusion for dense suspensions of motile bacteria. It is important to alert the reader that whether these are, indeed, nontrivial fixed points in the renormalization group sense would require an exponent flow [\[45\]](#page-5-3) or more sophisticated data analysis through asymptotic extrapolation [46–[49\];](#page-5-4) given the high precision data required for such approaches to be beyond speculative, we refrain from this analysis here.

The emergence of anomalous diffusion, as suspensions become more active, ought to carry its signature in Lagrangian trajectories, providing a crucial link in understanding how bacterial colonies forage and avoid hostile environments. In Fig. [1\(c\)](#page-1-0), we show a representative trajectory of a tracer corresponding to a highly active suspension with $\alpha = -6$ which, in sharp contrast to trajectories in mildly active suspensions [Fig. [1\(a\)](#page-1-0), upper inset], shows short diffusive behavior punctuated by long "steps" indicative of anomalous diffusion. This is clearly illustrated in the movies of trajectories for different activities [\[33\].](#page-4-20)

Figure [1\(c\)](#page-1-0) shows a trajectory divided into segments (shown in different colors), that are identified every time the trajectory turns (points marked in black) by an angle θ

FIG. 1. MSDs of Lagrangian trajectories (a) for mild activity and (b) with increasing levels of activity (vertically staggered for clarity). Local slopes [(b), inset] of Δx^2 : While ξ continuously decreases from 2 to 1 for $\alpha \le -4$, it plateaus (between the vertical lines) at $\xi \approx 4/3$ for $\alpha = -6$. Representative trajectories for (a) $\alpha = -1$ (upper inset) and (c) $\alpha = -6$ (see text) reflecting the change from diffusive to anomalous behavior and, also, seen in snapshots of particle positions (initially localized within the small white disk) at $t \approx 10$ for $\alpha = -1$ [panel (a), lower inset] and (d) $\alpha = -6$; the brightness of the colors reflects the particle density (see movie in the Supplemental Material [\[33\]\)](#page-4-20).

greater than a threshold angle θ_c ; we choose $\theta_c = 30^\circ$ for illustration in Fig. [1\(c\).](#page-1-0) While trajectories evolve mostly with small variations in θ for mild suspensions, increasing activity makes sharper turns more probable [\[33\]](#page-4-20).

The changing nature of particle trajectories and transition from normal to anomalous diffusion is also reflected in the spreading of an initially localized puff of particles [\[33\].](#page-4-20) In Fig. [1\(d\),](#page-1-0) we show a snapshot of 20 000 particles, initially localized within the small white disk at the center, at time $t \approx 10$ for case G ($\alpha = -6$); the brightness of the colors is a measure of the local density of particles. The evolution of the puff in highly active suspensions is far more "irregular" than what is seen, under identical conditions, at low activity $[\alpha = -1,$ Fig. [1\(a\),](#page-1-0) lower inset] where they spread through diffusion [\[33\]](#page-4-20).

This inevitably leads to the question whether these visual cues are stemming from real Lévy walks, marked by power-law step size and, equivalently, because of an approximately constant velocity, waiting time distributions [\[50\]](#page-5-5). A convincing argument in favor of Lévy walks is the distribution $p(\tau)$ of waiting times τ , which ought to show a significant range of scaling of the form $p(\tau) \sim \tau^{-\gamma-1}$ for a reasonably large spread in the choice of the threshold angle θ_c which determines a "turn." Figure [2](#page-2-0) confirms the existence of such a power law, and a local slope analysis $\gamma = -1 - \left[d \text{Log} p(\tau) / d \text{Log} \tau \right]$ (Fig. [2](#page-2-0), lower inset) shows scaling for about a decade with $\gamma = 1.7 \pm 0.3$. Similarly, the probability distribution $p(d)$ of step sizes, for the more

FIG. 2. For highly active suspensions (case G), probability distributions $p(\tau)$ of the waiting time τ with a $\tau^{-8/3}$ scaling (dashed line), as a guide to the eye, for different θ_c [\[33\].](#page-4-20) (Lower inset) Local slope analysis of $p(\tau)$ and $p(d)$ (x axis rescaled for visualization) yields $\gamma = 1.7 \pm 0.3$ and $\gamma = 1.6 \pm 0.2$, respectively, consistent with Lévy walk estimates, showing a scaling range (between dashed $[p(\tau)]$ and dotted $[p(d)]$ vertical lines) for about a decade. (Upper inset) Joint probability distribution of d and τ confirming a finite velocity through the near linear relationship between the two.

active suspensions, follow a scaling $p(d) \sim d^{-\gamma-1}$. Hence, in the same inset, we also show local slopes obtained from $p(d)$ (with the x axis rescaled to $d/5$ for ease of comparison), showing a comparable extent of scaling, from which we obtain $\gamma = 1.6 \pm 0.2$. Importantly, this scaling exponent $\gamma \approx 5/3$, when coupled with the anomalous MSD exponent $\xi \approx 4/3$, satisfies the Lévy walk constraint $\gamma + \xi = 3$ [\[51\]](#page-5-6). Finally, the joint distribution of flight lengths d and waiting times τ between turns in the trajectories for active suspensions (Fig. [2,](#page-2-0) upper inset) shows an almost linear scaling reflecting a constant system velocity. All of these are clear, unambiguous indicators of Lévy walks [\[52\].](#page-5-7)

Does the emergence of (Lagrangian) anomalous scaling carry telltale signs in the vorticity field $\mathbf{\omega} = \nabla \times \mathbf{u}$? Figure [3](#page-2-1) (see Ref. [\[33\]](#page-4-20) for movies of evolving fields) shows slices of the vorticity field, for cases D and G. While the vorticity fields appear, overall, disorganized—active turbulence—a closer inspection reveals a pattern hitherto undetected. With increasing activity, the dense packing of diffused vortices [\[33\]](#page-4-20), which mainly appear as spots, gives way to sharper spots with trailing wisps of vorticity streaks (case D). For highly active suspensions (case G), there is an equal preponderance of spots and streaks. Curiously, these streaks appear with alternating signs in a periodic fashion with a characteristic length scale δ .

The probability distribution of vorticity $p(\omega)$ is non-Gaussian (similarly to inertial turbulence) with fat tails which fall off as a power law, becoming more pronounced with increasing activity [\[33\].](#page-4-20) This analogy with inertial turbulence extends to the energy spectrum scaling as $k^{-5/3}$ scaling at high activity [\[33,55,56\]](#page-4-20).

Is there a causal link between the alternating streaks and the anomalous diffusion that we observe? Careful measurements certainly suggest so. While a definitive answer is beyond the scope of this Letter, the instantaneous, jetlike velocity and elongated streamlines, orthogonal to the streaks,

FIG. 3. Representative snapshots of vorticity fields (and their magnified sections with velocity vectors as arrows and instantaneous streamlines as solid lines) for (a) case D ($\alpha = -1$), and (b) case G ($\alpha = -6$). In the latter, highly active suspensions, a new feature shows up: The vorticity field is now populated by oscillatory streaks (see, also, Fig. [4](#page-3-0) and Ref. [\[33\]](#page-4-20)).

FIG. 4. Extremely active suspensions show that (a) the vorticity field is dominated by streaks interspersed with fewer vortical spots [magnified view in panel (b) with velocity vectors as arrows and instantaneous streamlines as solid lines] and is associated with (c) robust anomalous diffusion $\Delta x^2 \sim t^{4/3}$, reflected in a representative trajectory (inset).

(Fig. [3](#page-2-1) insets) would, in the absence of dynamics, ensure the persistence of trajectories, often over lengths $\mathcal{O}(L/2)$ [consistent with the scaling extent in $p(d)$, while the vortical patches serve to reorient trajectories. Naively, this suggests streak regions as origins of anomalous diffusion, while their absence (low activity) leads to classical diffusion. Importantly, these streaks are distinct from the "laning" phenomena in some active suspensions [\[57\]](#page-5-8). In order to further test the role of streaks, we push the system to an extreme case (with $\alpha = -16.66$ and $\beta = 22.22$), which shows that the emergence of more distinct, pattern forming streaks [Fig. [4\(a\)](#page-3-0), with a magnified view in panel (b)] is accompanied by a robust superdiffusive $\Delta x^2 \sim t^{4/3}$ regime [Fig. [4\(c\)\]](#page-3-0). Unsurprisingly, the trajectories reflect this anomalous diffusion through clear Lévy walks [see inset in Fig. [4\(c\)\]](#page-3-0), and are also found to have power-law distributions of d and τ . Thus, we show that active systems are actually superdiffusive, and what may be mistaken as a crossover from ballistic to diffusive behavior masks the most important and nontrivial aspects of such systems.

While the origin of the oscillatory streaks remains to be established, it seems reasonable to assume that the length scale δ , determining the alternating pattern of streaks, is influenced by the activity which sets the characteristic influenced by the activity which sets the characteristic
velocity for global polar ordering $v_0 = \sqrt{|\alpha|/\beta}$ [\[17\].](#page-4-15) Since velocity for global polar ordering $v_0 = \sqrt{|\alpha|/\beta}$ [17]. Since
the dominant timescale is set by activity, $\delta \simeq 1/\sqrt{|\alpha|\beta}$. Given the heuristic nature of this argument, we made careful measurements of the "wavelength" of the oscillations for a range of parameters and found that they are in reasonable agreement with our conjectured estimate. Why the system senses this length scale will, perhaps, be found when the origins of these oscillatory streaks are systematically known, and the question of universality (or not) of such oscillatory patterns for different classes of active systems is an important one. While the specific model [\[58\]](#page-5-9) studied in this Letter seems to allow for an instability that triggers spatiotemporal chaotic states with bands of opposite polarities which show up as spots and streaks [\[59\]](#page-5-10), the precise mechanisms involved are left for future work.

Nature exploits Lévy movements and anomalous diffusion, across scales, ranging from the microscopic to ecological [\[60\]](#page-5-11), and across taxa, from systems comprising individual agents like midge swarms [\[61\],](#page-5-12) migrating metastatic cancer cells [\[62\]](#page-5-13), living cancer cells [\[63\]](#page-5-14) and intracellular DNA transport [\[64\]](#page-5-15), foraging marine predators [\[65\]](#page-5-16), and expanding colonies of seemingly immobile beach grasses [\[66\]](#page-5-17), to dense systems with collective flow states like swimming bacteria [\[15\]](#page-4-12). Yet, detecting Lévy walks theoretically in active turbulence has remained elusive, despite some experimental results strongly suggestive of their existence. While recent work using a particle-based active model [\[32\]](#page-4-19) reconciles some of these findings, the lack of consistency with the most general hydrodynamic framework to describe active suspensions is surprising. We uncover why this is, showing that, while it is true that anomalous diffusion is hardly detectable (though incipient in the light of our results) for mildly active suspensions, such systems exhibit distinct Lévy walks and superdiffusion when nudged to higher levels of activity.

Our observations of the vorticity spots and streaks, a basis of future theories of emergent anomalous diffusion, provide a template for clearly identifiable structures experimentally. Thus, experiments would be able to probe how universal these patterns are, aiding a more robust understanding of why they emerge and whether they are central to the superdiffusive behavior of such systems. Recent works, which derive the hydrodynamic model presented here from microswimmer dynamics, show that the activity is related, among other factors, to their individual motility [\[67,68\]](#page-5-18). Thus, high activity might be achieved by tuning the motility. A potential candidate for an experiment is a spermatozoa suspension [\[69\],](#page-5-19) which also exhibit a turbulent phase [\[70\]](#page-5-20) and whose motility can be controlled by changing the ambient temperature [\[71\].](#page-5-21)

Finally, we underline what sets active turbulence apart from inertial fluid turbulence and, thus, the limitations of drawing equivalences between the two. The Lagrangian picture, arising from our work, marks a crucial departure in the analogy in a rather counterintuitive way. This is because for Eulerian statistics, increasing activity results in a more intermittent vorticity field and accompanying power-laws of energy spectra [\[33\]](#page-4-20) like in two-dimensional fluid turbulence. However, this "increasingly turbulent state" in active systems is paradoxically accompanied by persistent superdiffusion, Lévy walks, and structural changes in the vorticity field which have no known counterparts in inertial turbulence. It would be interesting, however, to see how this distinction manifests itself in other measurements such as pair-particle dispersion [\[72\].](#page-5-22)

Before concluding, we recall that our MSD exponent $\xi \approx 4/3$ (at high activity) is consistent with those predicted for 1D Hamiltonian systems [\[73\]](#page-5-23). Whether this suggests a possible underlying universality is unclear. Recent theoretical studies of the walk time distribution [\[74,75\]](#page-5-24) show that local dynamics are central to superdiffusion with $\gamma = 3/2$. While we detect $\gamma \approx 5/3$, it is possible that this exponent is one of intermediate asymptotics (in α) which may converge to $3/2$ for sufficiently high activity and diffusive behavior appears as a preasymptotic correction to the asymptotic superdiffusive regime [\[76\]](#page-5-25) that we report.

Our Letter suggests that activity is geared for manifesting optimality: Yet another way biological systems continue to defy bounds on inanimate matter, now in a turbulencelike flow state. This gives new direction to the assessment of what is truly turbulent, and universal, in low Reynolds number active flows.

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