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# Taylor dispersion of bubble swarms rising in quiescent liquid

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(Received 31 March 2025; revised 22 May 2025; accepted 28 May 2025)

We study the dispersion of bubble swarms rising in initially quiescent water using three-dimensional Lagrangian tracking of deformable bubbles and tracer particles in an octagonal bubble column. Two different bubble sizes (3.5 mm and 4.4 mm) and moderate gas volume fractions (0.52 % - 1.20 %) are considered. First, we compare the dispersion inside bubble swarms with that for single-bubble cases, and find that the horizontal mean squared displacement (MSD) in the swarm cases exhibits oscillations around the asymptotic scaling predicted for a diffusive regime. This occurs due to wake-induced bubble motion; however, the oscillatory behaviour is heavily damped compared to the single-bubble cases due to the presence of bubble-induced turbulence (BIT) and bubblebubble interactions in the swarm. The vertical MSD in bubble swarms is nearly an order of magnitude faster than in the single-bubble cases, due to the much higher vertical fluctuating bubble velocities in the swarms. We also investigate tracer dispersion in BIT, and find that concerning the time to transition away from the ballistic regime, larger bubbles with a higher gas void fraction transition earlier than tracers, consistent with Mathai et al. (2018, Phys. Rev. Lett., vol. 121, 054501). However, for bubble swarms with smaller bubbles and a lower gas void fraction, they transition at the same time. This differing behaviour is due to the turbulence being more well-mixed for the larger bubble

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case, whereas for the smaller bubble case, the tracer dispersion is highly dependent on the wake fluctuations generated by the oscillating motion of nearby bubbles.

Key words: mixing, turbulent flows, gas/liquid flow

### 1. Introduction

Turbulent dispersion is relevant for understanding many natural and engineered flows, e.g. the spreading of plankton in aquatic ecosystems, the transmission of hazardous aerosols in the atmosphere, and the mixing of components in process engineering, to name a few (Toschi & Bodenschatz 2009; Bourgoin & Xu 2014; Brandt & Coletti 2022; Huang *et al.* 2025). When the particles cannot be approximated as tracers, their inertia and the buoyancy forces to which they are subject greatly complicate the dispersion under the influence of the turbulence. One important case is that of bubbles, and understanding the dispersion of bubbles in turbulent flows is crucial for practical multiphase systems, and provides fundamental insights into the Lagrangian dynamics of buoyant particles in general (Lohse 2018; Mathai, Lohse & Sun 2020).

A simple metric for quantifying particle dispersion is the mean squared displacement (MSD) of a particle along its trajectory. In the present work, we denote the particle position by the vector  $\mathbf{x}(t)$  with Cartesian components x(t), y(t), z(t). For the component x(t), the MSD is

$$\sigma^{2}(\Delta_{\tau}x) \equiv \langle (\Delta_{\tau}x - \langle \Delta_{\tau}x \rangle)^{2} \rangle, \tag{1.1}$$

where the displacement is  $\Delta_{\tau} x \equiv x(t_0 + \tau) - x(t_0)$ ,  $\tau$  is the time lag,  $t_0$  is the initial time, and  $\langle \cdot \rangle$  denotes an average over particles (assuming a homogeneous flow so that the initial position does not matter). Note that throughout this paper, the notation  $\sigma(\xi)$  is used to denote the standard deviation of the arbitrary variable  $\xi$ , such that  $\sigma(\Delta_{\tau} x)$  is the standard deviation of  $\Delta_{\tau} x$ .

For tracer particles in isotropic turbulence, Taylor (1922) showed that

$$\sigma^{2}(\Delta_{\tau}x) \sim \begin{cases} \sigma^{2}(u_{l})\tau^{2} & \text{for } \tau \ll T_{L,u_{l}} \text{ (ballistic),} \\ 2\sigma^{2}(u_{l})T_{L,u_{l}}\tau & \text{for } \tau \gg T_{L,u_{l}} \text{ (diffusive),} \end{cases}$$
(1.2)

where  $T_{L,u_l} \equiv \int_0^\infty R_{u_l u_l}(\tau) \, d\tau$  is the fluid Lagrangian integral time scale,  $R_{u_l u_l}(\tau) \equiv \langle u_l(t_0) \, u_l(t_0 + \tau) \rangle / \sigma(u_l)^2$  is the fluid velocity autocorrelation function, and  $u_l$  is the liquid velocity vector with Cartesian components  $u_l, v_l, w_l$ . We use the subscript l for the liquid velocity, while the subscript b is used for the bubble velocity, such that the bubble velocity vector is  $u_b$  with Cartesian components  $u_b, v_b, w_b$ , and the bubble Lagrangian integral time scale is  $T_{L,u_b}$ .

In contrast to the case of small particles (Brandt & Coletti 2022), studies on the turbulent dispersion of finite-sized bubbles are scarce. The numerical study of finite-size bubble dispersion for dense swarms is challenging, not only because such bubbles require interface-resolved direct numerical simulations (Innocenti *et al.* 2021), but also because rising bubble dispersion requires long simulation times and large domains. Experiments on the dispersion of millimetre size bubbles are also rare, with Mathai *et al.* (2018) being the only published study on this, to the best of the authors' knowledge. They studied the dispersion of 1.8 mm air bubbles in nearly homogeneous isotropic turbulence (HIT).

The gas void fraction is very low in their cases ( $\alpha \approx 0.05$  %), so there are negligible bubble–bubble interactions and negligible bubble-induced turbulence (BIT) (Alméras *et al.* 2017; Risso 2018; Liao & Ma 2022; Ma *et al.* 2022). Their results revealed that two mechanisms play a crucial role in the bubble dispersion: the bubble wake dynamics and the crossing-trajectory effect. At short times in the 'ballistic regime', large wakeinduced fluctuations in the bubble velocities cause their MSD to grow much faster than that for tracer particles. At longer times, the MSD approaches the diffusive regime that also occurs for tracer particles. However, because the bubbles can drift through turbulent eddies due to the buoyancy force that they experience ('crossing-trajectory effect'), the diffusion coefficient is smaller for the bubbles than the tracers. The time at which the MSD transitions from ballistic to diffusive growth is much sooner for the bubbles than the tracers, and they showed that for the bubbles, the transition time is related to the intrinsic frequency of vortex shedding from the rising bubble.

While Mathai *et al.* (2018) studied the dispersion of small air bubbles with low gas void fraction where the bubbles are relatively isolated, the present study aims to explore how the dispersion of a swarm of bubbles differs from that of a single isolated bubble. Moreover, while the turbulence in their flow was generated using an active grid with negligible BIT, we consider a flow in which all of the turbulence is BIT. To achieve this, we consider much larger bubbles with a much higher gas void fraction, leading to strong bubble–bubble interactions and BIT. Such conditions are found both in industrial bubble columns for mixing (Schlüter *et al.* 2021) and in natural bubble plumes (Cardoso & Cartwright 2024).

We seek to answer several specific fundamental questions about the dispersion of bubbles in BIT. How does the dispersion of bubbles rising in swarms differ from that of a single bubble in different directions? How does the dispersion of bubble swarms compare to that of tracer particles? To what extent does the bubble size influence the results? To address these questions, we use experiments to track  $O(10^5)$  deformable bubbles using our recently developed three-dimensional (3-D) Lagrangian bubble tracking (LBT) tool (Hessenkemper *et al.* 2024), which can handle overlapping bubbles (crucial for the higher gas void fraction in this study). We also use the open-source 3-D Lagrangian particle tracking (LPT) code (Tan *et al.* 2020) to characterise the liquid phase for comparison.

### 2. Experimental method

The experiments are conducted in a 120 cm tall octagonal bubble column, optimised for multi-view imaging and 3-D tracking (see figure 1*a*). The column is filled with tap water to height 90 cm. The distance between opposite walls is 11.5 cm, and all measurements are taken at height 50 cm to ensure that the bubbles are rising at their terminal velocity. Air bubbles are injected through needle spargers at the bottom, and two bubble sizes (3.5 mm and 4.4 mm) are considered in the present work by using spargers with different inner diameters. The gas injection rate of all eight spargers is adjusted to produce nearly homogeneous, monodisperse bubbly flows in the column core. For comparison, we also perform single-bubble experiments with the same corresponding bubble size. Only one sparger is operated at a very low flow rate to produce bubbles that are sufficiently separated for them to be considered individual (i.e. they experience negligible flow disturbance due to the other bubbles, and bubble–bubble interactions do not occur). In total, we investigate four different cases, denoted as *Sm*, *La*, *Sm-Sin* and *La-Sin* (see supplementary movies for each individual case). Here, *Sm/La* refer to bubbles

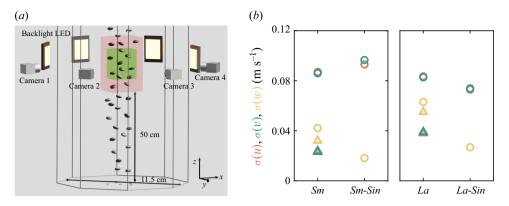


Figure 1. (a) Schematic of the experimental set-up. The red box indicates the bubble tracking measurement section, while the green box is the ROI for 3D-LPT. (Note that in the actual experiment, the number of bubbles in the red box is  $O(10^2)$ ). (b) Plots of standard deviation of the velocity for bubbles (circles) and tracers (triangles), with the three components represented by different colours. Note that the velocity statistics of the liquid are given only for the two swarm cases, *Sm* and *La*.

	α	$d_b$ (mm)	Eo	Ga	$Re_b$	$T_{L,u_l}(s)$	$T_{L,w_l}(s)$	$Re_{\lambda}$	
Sm La	0.52 % 1.20 %	3.5 4.4				0.20 0.11	0.26 0.33	57 91	

Table 1. Selected parameters of the two bubble swarm cases. Here,  $\alpha$  denotes the gas void fraction,  $d_b$  is the bubble diameter,  $Eo \equiv (\rho_l - \rho_g)gd_b^2/\sigma$  is the Eötvös number (where  $\sigma$  is the surface tension),  $Ga \equiv \sqrt{gd_b^3}/\nu$  is the Galileo number, and  $Re_b$  is the bubble Reynolds number based on the bubble-to-fluid relative velocity obtained from the experiment. For the liquid phase,  $T_{L,u_l}$  and  $T_{L,w_l}$  are the horizontal and vertical Lagrangian integral time scales computed from their respective autocorrelation functions, and  $Re_\lambda$  is the Taylor Reynolds number.

with mean equivalent diameters approximately 3.5 mm and 4.4 mm, respectively, which we refer to as the smaller and larger bubbles for brevity. The suffix -Sin indicates the corresponding single-bubble cases. Some key parameters of the two bubble swarm cases are summarised in table 1. The measurement set-up and data acquisition are similar to those in our previous work (Ma *et al.* 2025), so only the key aspects for 3D-LBT and 3D-LPT are presented below. The Taylor Reynolds number  $Re_{\lambda} = \sqrt{15/(v\varepsilon)} u_{rms}^2$  is calculated based on all tracer tracks. Here, the root mean square liquid velocity fluctuation is  $u_{rms} \equiv \sqrt{(1/3)(\sigma^2(u_l) + \sigma^2(v_l) + \sigma^2(w_l))}$ , and the turbulence dissipation rate  $\varepsilon$  is obtained from the compensated structure function (see Ma *et al.* 2025).

Four high-speed cameras arranged in a linear configuration are employed to capture the 3-D dispersion of bubbles and tracers, with the flow being back-illuminated by LEDs for shadowgraph imaging. The region of interest (ROI) for bubble tracking is  $5 \times 5 \times 15$  cm<sup>3</sup>, with recording rate 500 fps. Bubbles are identified and tracked using our in-house 3D-LBT tool (Hessenkemper *et al.* 2024), specifically designed for tracking relatively dense, deformable bubbles that partially overlap with others in the images. For each case, we collect over 2 00 000 bubble tracks and 6 00 000 tracer tracks to ensure statistical convergence. To capture the 3-D flow information, we seed the water with 100 µm polyamide particles as tracers. Since these tracer particles are significantly smaller than bubbles, we perform separate measurements for tracers, with a different ROI  $4.5 \times 4.5 \times 9.0$  cm<sup>3</sup>, at frame rate 2500 fps, ensuring sufficient spatio-temporal resolution for the flow. The tracers are tracked in three dimensions using OpenLPT (Tan *et al.* 2020) – an open-source version of the shake-the-box approach (Schanz, Gesemann & Schröder 2016) that can handle high particle image densities.

Figure 1(*b*) presents all components of the standard deviation of the bubble fluctuating velocities for all four cases, as well as the standard deviation of the liquid velocities for the two swarm cases. Consistent with previous studies (Lu & Tryggvason 2013), the liquid velocity fluctuations in both *Sm* and *La* are anisotropic, with larger fluctuations in the vertical direction (corresponding to the direction of the mean bubble motion). In contrast, the bubble velocity fluctuations in all four cases are larger in the horizontal direction, which we will discuss in detail in § 3.1.

### 3. Results

## 3.1. Dispersion of bubble swarms versus single bubbles

Although the asymptotic results in (1.2) were derived for tracer particles, they are based on the kinematic equation  $\dot{\mathbf{x}}(t) \equiv \mathbf{u}_l(t)$  and make no assumption about the dynamics of the particles or flow. As such, exactly the same predictions apply to the case of bubbles dispersing in turbulence, but with  $\sigma(u_l)$  replaced by  $\sigma(u_b)$ , and  $T_{L,u_l}$  replaced by  $T_{L,u_b}$ .

From the 3-D bubble tracks, we compute the horizontal (figure 2a) and vertical (figure 2b) components of the MSD for the bubbles as a function of time lag  $\tau$  for all four cases. For small  $\tau$ , the MSDs of both bubble swarms (Sm/La) and single bubbles (Sm-Sin/La-Sin) exhibit a  $\tau^2$  growth in both directions, as bubbles essentially follow a ballistic motion. This ballistic motion occurs because for  $\tau$  much smaller than the correlation time scale of the fluctuating bubble velocities, the bubble velocities are constant to leading order in  $\tau$ . For the vertical direction, we find that the MSD for bubble swarms is much larger than that for single bubbles (figure 2b). This difference is due to the BIT experienced by the bubbles dispersing in swarms, and the anisotropy of this BIT. It is known that rising bubble swarms generate larger vertical than horizontal fluctuating velocities in the flow (Riboux, Risso & Legendre 2010), with ratios  $\sigma(w_l)/\sigma(u_l)$  of 1.33 and 1.45 for the Sm and La cases, respectively. Related to this,  $\sigma(w_b)$  is much larger for bubble swarms than singlebubbles due to the BIT, and  $\sigma(w_h)$  is approximately three times greater for the swarm cases than the corresponding single-bubble cases (see figure 1b). Since the vertical MSD is proportional to  $\sigma^2(w_b)$ , this results in an order of magnitude increase in the vertical MSD of bubble swarms compared with single bubbles in the ballistic regime. In contrast, the horizontal component of the MSD does not show such significant differences, since the variations in  $\sigma(u_h)$  (or  $\sigma(v_h)$ ) between the single-bubble and swarm cases are relatively small. This is because the horizontal fluctuations of the bubble velocity are dominated by wake-induced instabilities that are common to both the single-bubble and swarm cases.

As  $\tau$  increases, the MSD gradually deviates from the ballistic behaviour. The most striking behaviour is for the horizontal direction (figure 2*a*); for the two single-bubble cases, the MSD oscillates strongly, while for the swarm cases, although the oscillations in the MSD are present (the linear inset plot shows this more clearly), they are strongly damped. The oscillations in the MSD for the *Sm-Sin* and *La-Sin* cases occurs due to the wake instability that leads to an oscillatory rising path for the bubbles (Cano-Lozano *et al.* 2016; Legendre & Zenit 2025). For the two swarm cases, the MSD oscillations are much weaker because the chaotic effects of BIT and bubble–bubble interactions suppress the systematic oscillatory motion. The oscillations are in fact almost unnoticeable for the

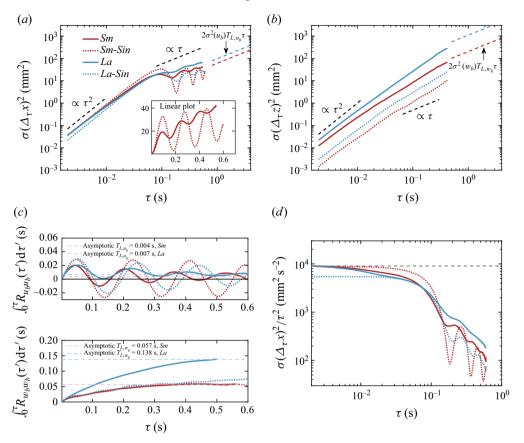


Figure 2. The MSD for single bubbles (dashed lines) and bubble swarms (solid lines) in the (*a*) horizontal and (*b*) vertical directions. Dashed lines indicate asymptotic MSD for long-time diffusive behaviour. (*c*) Integral of Lagrangian autocorrelation function of bubble velocity in the horizontal and vertical components, respectively. Here,  $T_{L,u_b}$  and  $T_{L,w_b}$  are estimated from the asymptotic value of the curve (dashed lines). (*d*) Horizontal MSD compensated by  $\tau^2$  to emphasise the deviation from the ballistic regime with increasing time.

La case, where higher BIT and stronger bubble–bubble interactions further suppress the oscillations compared to the *Sm* case. Interestingly, the damped MSD oscillations share similarities with those observed for active self-propelled particles moving at the air–water interface in a Petri dish (Bourgoin *et al.* 2020). In that case, the oscillatory MSD of a single active particle is damped with increasing particle number due to the particle interactions, paving the way for a diffusive MSD behaviour. Although the origin of the oscillations in the MSD is different for the isolated active particle studied in Bourgoin *et al.* (2020) (where it is caused by reorientation of the particle trajectory upon hitting the dish boundary) and for an isolated bubble in the present study (where it is caused by wake instabilities), the attenuation of the oscillations with increasing particle/bubble number in both situations reflects the randomising effect of the collective motion on the individual particle/bubble motion.

At the largest time for which the MSD is computed  $\tau = \tau_{max}$ , the behaviour does not actually follow a diffusive behaviour  $\propto \tau$ . The data in figure 2(c) indicate that this is because the integral of the bubble velocity autocorrelation over the time span  $[0, \tau]$  does not converge to a constant as  $\tau \rightarrow \tau_{max}$  (although it almost converges for the vertical components). For the swarm cases, the integral oscillates about a mean

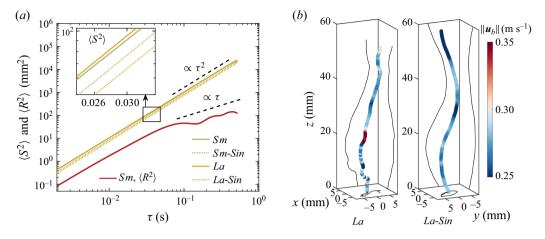


Figure 3. (a) Mean squared path length  $\langle S^2 \rangle$ , together with the total MSD  $\langle R^2 \rangle$  of Sm as comparison. (b) Snapshots of typical bubble trajectories for La and La-Sin, with the same tracking time. The trajectories are coloured by the magnitude of the total velocity  $||\boldsymbol{u}_b||$ .

value with amplitude that decreases with increasing  $\tau$ . We can estimate the integral time scale from the asymptotic value of the curve at large  $\tau$ , and using these we show in figure 2(*a*,*b*) the diffusive behaviour (e.g.  $\sigma^2(\Delta_{\tau}x) = 2\sigma^2(u_b) T_{L,u_b}\tau$ ) that would be expected for time larger than  $\tau_{max}$  for the swarm cases. These indicate that the MSD is in fact approaching the expected diffusive behaviour. For the single-bubble cases, the amplitude of the oscillations of the integrals decreases very slowly with time. Assuming that the integrals would eventually converge, this indicates that extremely large times are required to observe diffusive growth for the single-bubble cases.

We note that the transition away from the ballistic regime occurs earlier for the swarm cases, which can be better seen in the compensated horizontal MSD in figure 2(d). In the swarm cases, bubbles maintain their initial velocity for less time than single bubbles due to the randomising effects of BIT and hydrodynamic interactions with other bubbles in their vicinity.

### 3.2. Path length of bubble swarms versus single bubbles

While the MSD provides a simple metric for understanding the bubble dispersion, further information can be found by studying the path length  $S(\tau)$  of the trajectories (Ouellette, Bodenschatz & Xu 2011), i.e. the total distance travelled by individual bubbles. We can approximately measure the mean-squared path length using

$$\langle S^{2}(\tau) \rangle \approx \left\langle \left[ \sum_{\gamma=1}^{N_{\tau}} \| \boldsymbol{x}(t_{0} + \gamma \ \Delta t) - \boldsymbol{x}(t_{0} + [\gamma - 1] \ \Delta t) \| \right]^{2} \right\rangle,$$
(3.1)

where  $N_{\tau} \equiv 1 + (\tau - t_0)/\Delta t \in \mathbb{Z}^+$ , and  $\Delta t = 0.002$  s is used based on our imaging rate for tracking bubbles. For a representative case *Sm*, we plot  $\langle S^2 \rangle$  in figure 3(*a*), alongside the total MSD  $\langle R^2(\tau) \rangle$  based on all three components of x:

$$\langle R^2(\tau) \rangle \equiv \langle ||\Delta_{\tau} \mathbf{x} - \langle \Delta_{\tau} \mathbf{x} \rangle ||^2 \rangle.$$
(3.2)

The other case, *La*, shows similar behaviour so is not shown here. For both single bubbles and bubble swarms,  $\langle S^2 \rangle$  grows as  $\tau^2$  over almost the entire trajectory, differing from  $\langle R^2 \rangle$ , which undergoes a transition towards a diffusive growth at long times.

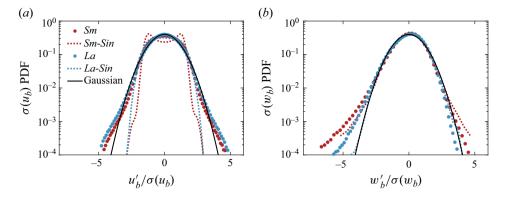


Figure 4. The PDFs of the fluctuating bubble velocities in the (*a*) horizontal and (*b*) vertical directions, normalised by their standard deviations  $\sigma(u_b)$  and  $\sigma(w_b)$ , respectively.

We see a vertical shift between  $\langle S^2 \rangle$  and  $\langle R^2 \rangle$  in the short term due to the subtraction of mean displacement by computing  $\langle R^2 \rangle$  in (3.2). (As an aside, in Ouellette *et al.* (2011),  $\langle S^2 \rangle \approx \langle R^2 \rangle$  for the short-time ballistic regime, since in their flow there is no mean displacement for the tracer particles.) The zoomed-in view of  $\langle S^2 \rangle$  (inset of figure 3a) shows that the path travelled by bubbles rising in swarms is longer than that for the single-bubble cases. This may seem counter-intuitive at first, as it has been found that bubbles rising in turbulence have a reduced rise velocity compared to those in a quiescent liquid (Loisy & Naso 2017; Ruth et al. 2021). The explanation for this is that the path length is determined by  $\langle || \boldsymbol{u}_b || \rangle = \langle \sqrt{u_b^2 + v_b^2 + w_b^2} \rangle$ , and not the rise velocity. Indeed, the exact expression for the path length is  $S(\tau) = \int_0^{\tau} \|\boldsymbol{u}_b(s)\| \, ds$ , and for statistically stationary bubble tracks and large  $\tau$ , we have  $S(\tau) \approx \tau \langle || \boldsymbol{u}_b || \rangle$ . The measured  $\langle || \boldsymbol{u}_b || \rangle$  is 0.315 m s<sup>-1</sup> for *Sm*, 0.286 m s<sup>-1</sup> for *Sm*-Sin, 0.319 m s<sup>-1</sup> for *La*, and 0.269 m s<sup>-1</sup> for *La-Sin*. This corresponds to 10.2 % and 18.7 % increases in path length for Sm and La, respectively, compared to their single-bubble cases. For illustration, we show representative trajectories of La and La-Sin in figure 3(b). Bubbles in swarms have smaller vertical displacements due to decreasing rise velocity, but more twisted trajectories. The figures also indicate that the rising paths of bubbles in swarms still exhibit oscillations, and this is due to the intrinsic wake-driven dynamics dominating the low-frequency behaviour of the bubble motion. However, higher-frequency motion is more erratic and reflects the effect of BIT at small scales in the flow.

# 3.3. Probability density function of fluctuating bubble velocity of bubble swarms versus single bubbles

To fully understand the bubble motion as they disperse, we now turn to consider the probability density functions (PDFs) of the fluctuating bubble velocities,  $u'_b = u_b - \langle u_b \rangle$ , in figure 4. In the horizontal direction, both single bubbles and bubble swarms have symmetric and non-Gaussian PDFs. For the two single-bubble cases, while the PDF of *Sm-Sin* is bi-modal, *La-Sin* is uni-modal with a peak that is wide and flat compared to a Gaussian PDF. These features can also be related to the oscillations in their trajectories, with the stronger oscillations of the MSD for the case *Sm-Sin* (figure 2*a*) being associated with a clear bi-modal velocity PDF. Similar behaviour was also reported by Mathai *et al.* (2015) for finite-sized buoyant particles. For the corresponding swarm cases, the BIT and bubble–bubble interactions introduce additional randomness into the bubble motion,

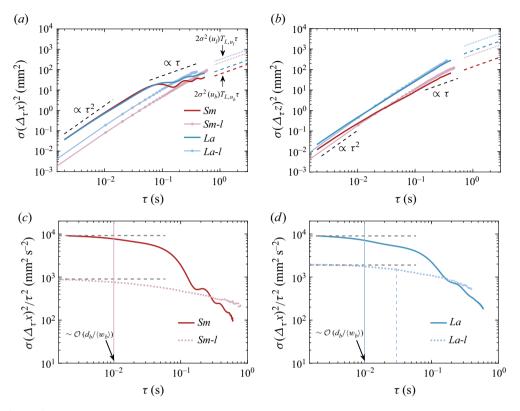


Figure 5. MSD for bubbles and fluid tracers in the (*a*) horizontal and (*b*) vertical directions. Dashed lines indicate the asymptotic dispersion rate for long-time diffusive behaviour. Compensated horizontal MSD for the (*c*) *Sm* and (*d*) *La* cases. The solid vertical lines indicate the onset of transition for bubbles, while the dashed vertical line marks the transition for tracers, defined as the time when the local exponential decay reaches 80 %. For *Sm*, the bubble transition occurs at a similar time, so only one vertical line is shown.

leading to Gaussian-like behaviour in the central region of the PDFs. However, the PDFs have tails that are heavier than in a Gaussian PDF, while those for single bubbles are lighter, indicating intermittency due to the collective motion of the bubbles in swarms. Such intermittent bubble velocities have been observed previously (Ma *et al.* 2023), and may arise when a trailing bubble is caught in the wake of leading bubbles, or be due to intense hydrodynamic interactions between bubbles when they become sufficiently close.

In the vertical direction (figure 4b), the PDFs of Sm and La are negatively skewed, unlike their corresponding single-bubble cases for which the PDFs are approximately symmetric. The negative skewness in the swarm cases is consistent with our previous study (Ma *et al.* 2023) and the observation in Martínez *et al.* (2010). For bubble swarms, Ma *et al.* (2023) argued that the PDF of bubble vertical velocity fluctuations can exhibit skewness of either sign, depending in a complex way on the background turbulence and additional factors, such as the bubble size relative to the turbulence length scales.

### 3.4. Dispersion of bubble swarms versus liquid tracers

We finally turn our attention to the difference in dispersion between bubbles and liquid tracers in the swarm cases, and figure 5(a,b) show their horizontal and vertical MSDs, respectively. At short times, the horizontal dispersion of bubbles is almost an order of magnitude faster than that of tracers, whereas the difference in their MSD in the

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vertical direction is smaller. This can be attributed to the relative difference between the fluctuating bubble velocity and fluctuating liquid velocity, and how this difference varies in the horizontal and vertical directions (see figure 1(*b*) for the *Sm* and *La* cases). More specifically, the horizontal components  $\sigma(u_b)$  and  $\sigma(v_b)$  are significantly larger than the corresponding ones for the liquid,  $\sigma(u_l)$  and  $\sigma(v_l)$ . In contrast, the difference between the vertical components  $\sigma(w_b)$  and  $\sigma(w_l)$  is much smaller, leading to more similar ballistic dispersion between the two phases (figure 5*b*). At longer times, the horizontal MSD of bubbles approaches (but does not actually attain, due to the limited  $\tau_{max}$ , as discussed earlier) a diffusive-like regime  $\propto \tau$ , while the MSD for tracers does not. This is simply due to  $\tau_{max}$  being too small to observe this regime for the tracers. However, the plots show the diffusive prediction for the tracers, and these indicate that the diffusive regime would be reached if  $\tau_{max}$  were several times larger.

With increasing  $\tau$ , the MSD for the tracers gradually exceeds that for the bubbles, in agreement with the results of Mathai et al. (2018) for isolated smaller bubbles in HIT. Mathai et al. (2018) explained this as being due to the crossing-trajectory effect, whereby bubbles can drift through turbulent eddies due to their buoyant rising motion, causing the fluid velocities along their trajectories to decorrelate more rapidly than along tracer trajectories. This mechanism is plausible for their experiments where the bubbles are rising through pre-existing background turbulence and eddies. However, its role in our experiments is less clear, because in ours the bubbles are not rising through pre-existing turbulent eddies, but are in fact generating the eddies themselves as they rise. In our case, what is clear is that the longer correlation time scale for the tracers means that the faster ballistic growth persists for longer for tracers than for bubbles, enabling their dispersion to overtake that of the bubbles. The crossing-trajectory effect may contribute to the reason why the correlation time scale is longer for tracers, but it could also be due to fluctuations associated with the bubble wakes causing the bubble velocities to decorrelate faster than those of tracers, which do not generate fluctuating wakes due to the low Reynolds number of the tracers.

In figure 5(c,d), we plot the compensated horizontal MSD for both phases, and find that for both Sm and La, the time span of the ballistic regime is set by the wake-induced motion at a bubble time scale  $O(d_b/\langle w_b \rangle)$  (Ma et al. 2017, 2020), approximately 0.01 s. However, the time span for the tracers is different for the Sm and La cases. For the La case, the transition away from the ballistic regime occurs considerably later for the tracers than for the bubbles for the La case. This confirms the finding of Mathai et al. (2018)that the transition for bubbles occurs much earlier than for tracer particles due to their oscillatory wake-driven dynamics. By contrast, for the Sm case, the transition for bubbles and tracers occurs at the same time (see figure 5c). The explanation is that for the Sm case, where  $\alpha$  is much smaller, there are relatively few regions in the liquid where turbulence is generated by the bubbles, such that turbulence in the flow is very patchy and intermittent. In this case, the tracer dispersion will be highly dependent upon the bubble parameters. For the La case with higher  $\alpha$  and larger  $d_b$ , the bubble wakes are longer, wider and more numerous. As a result, the wake regions are more space filling and wake-wake interactions are more frequent, leading to a flow that is more homogeneous and well mixed (see Ma et al. (2025)). In this respect, the flow in the La case is more similar to that in Mathai et al. (2018), where there is background turbulence generated by an active grid. This explains the qualitative agreement between the La case and the results of Mathai et al. (2018) regarding the timing of the departure from the ballistic regime for both tracers and bubbles. However, quantitatively, Mathai et al. (2018) observe the bubbles departing from the ballistic regime ten times faster than the tracers, whereas in our case it is three times faster. This difference is due to most of the turbulence in their flow being generated by the active grid, whereas in ours it is purely BIT, which is more dependent on the bubble parameters.

### 4. Conclusions

We used experiments equipped with 3D-LBT and 3D-LPT to explore the Taylor dispersion of bubble swarms rising in initially quiescent water. The bubbles considered are large and relatively dense, and their wakes generate significant turbulence and bubble–bubble interactions – a complementary flow condition to that in the previous work by Mathai *et al.* (2018). To better understand their Taylor dispersion, we compared: (i) bubble swarms with single bubbles; (ii) bubble swarms with fluid tracers.

For (i), we observe that at long times, the horizontal MSD exhibits oscillations for both the bubble swarms and single-bubble cases. These oscillations are due to wake-induced motion of the bubbles and are, however, strongly damped for the swarm cases compared to the single-bubble cases, primarily due to BIT and bubble–bubble interactions. Due to the damping, the swarm cases approach a diffusive regime, while the single-bubble cases do not. The vertical MSD in bubble swarms is significantly larger than that for the single-bubble cases. We also compute the path length of the rising bubbles, and find that it is up to 18.7 % larger in swarms than for single bubbles due to BIT, which contorts the trajectories in the swarms.

For (ii), we find a faster dispersion rate in the ballistic regime for bubble swarms than for tracers due to their larger velocities. At longer times, the dispersion of the bubbles is overtaken by the tracers as the faster ballistic regime persists for longer for the tracers. The time to transition away from the ballistic regime is of the order of bubble time scale for smaller and more dilute swarm cases, while the results for larger bubbles with higher gas void fraction reveal an earlier transition for the bubbles compared to the tracers.

Supplementary movies. Supplementary movies are available at https://doi.org/10.1017/jfm.2025.10316.

**Funding.** We acknowledge financial support from the German Research Foundation (DFG) under grant no. 555712173.

Declaration of interests. The authors report no conflict of interest.

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