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## Pair Dispersion in Turbulence: The Subdominant Role of Scaling

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# Pair dispersion in turbulence: the subdominant role of scaling

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The mixing properties of turbulent flows are, at first order, related to the dynamics of separation of particle pairs. Scaling laws for the evolution in time of the mean distance between particle pairs  $\langle r^2 \rangle(t)$  have been proposed since the pioneering work of Richardson. [We analyze a model which shares some features with 3D experimental and numerical turbulence, and suggest that pure scaling laws are only subdominant.](#) The dynamics is dominated by a very wide distribution of “delay times”  $t_d$ , the duration for which particle pairs remain together before their separation increases significantly. The delay time distribution is exponential for small separations and evolves towards a flat distribution at large separations. The observed  $\langle r^2 \rangle(t)$  behavior is best understood as an average over separations that individually follow the Richardson-Obukhov scaling,  $r^2 \propto t^3$ , but each only after a fluctuating time delay  $t_d$ , where  $t_d$  is distributed uniformly.

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Scalar transport by turbulent flows is naturally described in terms of Lagrangian particle dispersion. This most generally requires knowledge of the statistics of  $n$ -particle dynamics  $\{\mathbf{r}_1(t), \mathbf{r}_2(t), \dots, \mathbf{r}_n(t)\}$  which in turn hinges on a closure scheme [1]. Recent theoretical and phenomenological efforts have focused on the dynamics of tetrads [2, 3] as tracers of nonlinear (triadic) interactions. A simpler first step is the pair dispersion problem, acquiring an understanding of the evolution in time of the distance between two Lagrangian fluid particles  $\langle r^2(t) \rangle_{\text{pairs}}$ . Recent reviews [4, 5] have concluded that for such 2-point statistics the predictions of the celebrated Kolmogorov 1941 theory are not as readily observed as for 1-point statistics. We examine the issue here using a stochastically driven point vortex model [6]. The model creates a 2D flow via the interaction of randomly generated vortices of random amplitude. Generation followed by merger of vortices mimics some ingredients of three dimensional vortex stretching and dissipation.

Let us first recall some fundamental features of the 2-point dispersion problem and associated scaling hypotheses in the context of the Kolmogorov phenomenology of turbulence. In the limit of very short times, comparable to the dissipative time scale  $\tau_\eta$ , neighboring fluid particles are expected to separate exponentially following the largest Lyapunov exponent of the local (smooth) flow. On the other hand, for very long times, comparable to the flow integral correlation time  $T_L$ , turbulence is expected to be diffusive and so one expects  $\langle r^2 \rangle_{\text{pairs}} \propto t$ . Modeling efforts have thus concentrated on the intermediate range of time scales,  $\tau_\eta \ll t \ll T_L$  (the “inertial” subrange). In this range, there is no characteristic time or length scale and the constraint of a fixed mean energy transfer rate  $\langle \epsilon \rangle$  suggests the relationship known as the

Richardson-Obukhov law [7, 8],  $\langle r^2 \rangle = g \langle \epsilon \rangle t^3$ , where  $g$  is a dimensionless constant. (Note: this scaling also results if the particles execute a random walk in velocity space, *i.e.* if one assumes a diffusive behavior for the velocity difference between two points,  $(\delta u(t))^2 \propto t$ , then  $r(t) = \int \delta u(t') dt' \sim t^{3/2}$ . There is some suggestion that single point Lagrangian trajectories effectively sample velocity space in this way – Eqn. 18 in [6].)

However, the inertial range is limited in its extent,  $T_L/\tau_\eta \sim Re^{1/2}$  with  $Re$  the flow Reynolds number, and it has been argued that one should include the initial separation  $r_0$  in the above dimensional argument since the relative dynamics of a particle pair introduces an origin of time, that at which their locations coincide. Taking  $t_0$  as the time over which the initial separation is important, one looks for a scaling solution  $\langle r^2 \rangle_{\text{pairs}} = r_0^2 f(t/t_0)$ . Batchelor [9] suggested that the characteristic time  $t_0$  for the initial entrainment of the particle pair by an eddy of size  $r_0$  follows the Richardson-Obukhov law,  $t_0 \sim \langle \epsilon \rangle^{-1/3} r_0^{2/3}$ , and thus for times less than  $t_0$  pair separation evolves as  $\langle r^2 \rangle = g' (\langle \epsilon \rangle r_0)^{2/3} t^2$ , with  $g'$  another dimensionless constant related to the Kolmogorov constant for the longitudinal second-order velocity structure function,  $g' = (11/3)C_2$ . For  $t_0 \ll t \ll T_L$ , the Richardson-Obukhov law still holds.

Such scaling behaviors have been difficult to identify in experiments, observations, or direct numerical simulations. It has been suggested that it is because of the limited inertial range accessible to numerical studies that they only hint at possible asymptotic Richardson-Obukhov behavior [10], though exit time statistics seem to provide clearer evidence [11, 12]. On the other hand, experimental studies point to Batchelor scaling when

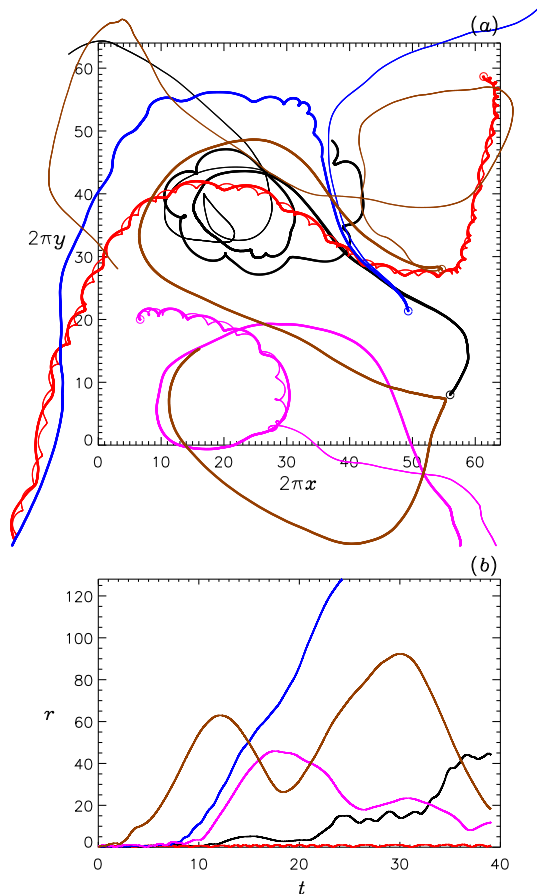


FIG. 1: (a) Example trajectories of particle pair members. Trajectories of individual members of each pair are shown with thin and bold lines. (b) Corresponding (by color) time traces of their separation  $r(t)$ . All pairs were initiated, at sites indicated by open circles, with initial separation  $r_0 = 0.2$ .

the behavior of  $\langle r^2(t) \rangle$  is directly investigated [13, 14] or to a Richardson-Obukhov regime if time and space are suitably rescaled to account for the initial phase  $(r_0, t_0)$  [15]. Here we suggest an alternative, that while the Richardson-Obukhov scaling may underly the dynamical behavior of individual particle pairs it does so only intermittently, interrupted by “trapping delays” with a broad distribution of durations, and it is the averaging over these delays which dominates the observed  $\langle r^2 \rangle$  behavior [16].

We employ a simplified point-vortex flow model, the main characteristics of which [6] are only briefly recalled here. Point vortices are randomly generated at a constant average rate with Gaussianly distributed intensity in a two-dimensional periodic domain of dimension  $x_{\max}^2$ . The velocity field is built from the contributions of each individual vortex as

$$\mathbf{u}(\mathbf{x}) = \sum_{k=1}^N \frac{\Gamma_k}{2\pi|\mathbf{x} - \mathbf{x}_k|} (\hat{\mathbf{z}} \times (\widehat{\mathbf{x} - \mathbf{x}_k})), \quad (1)$$

where  $\Gamma_k$  are the circulations, and the range of contribution is truncated at the distance  $x_{\max}$ . Vortex merger is imposed when vortices are closer than a fixed critical separation, unit one distance. (We note, that for simplicity of notation (as compared to [6]) we scale the distance between Lagrangian particles here so that  $r = 2\pi\sqrt{x^2 + y^2}$ .) The system would ultimately decay due to the merger of oppositely signed vortices except for the continuous stirring by the aforementioned generation of new point vortices at random locations in the domain. Effective stretching occurs when such vortices are generated within the merging distance of an existing like-sign vortex. The velocity field created in this way shows surprisingly strong similarities to 3D turbulence. For example, the agreement between the Lagrangian intermittency (1-point statistics) in the model and that found experimentally is quite remarkable [6]. We will show here (Figure 2) that this is true for pair dispersion (2-point statistics) as well.

The point-vortex model solutions discussed in this paper each continue, with the same parameter values, from the endpoint of the simulation presented in [6]. They were seeded with a grid of  $N \in [2304, 2304, 2304, 1024]$  Lagrangian particle pairs, randomly oriented and with initial separations between pair members of  $r_0 \in [0.05, 0.2, 0.5, 1.0]$  respectively. The positions and velocities of each particle were tracked as the flow evolved. Examples of particle trajectories and corresponding pair separations  $r(t)$  are shown in Figure 1, with thin and bold lines marking individual pair member paths and an open circle marking their initial positions. It is clear even from this limited sample of trajectories that individual pairs show distinctive behaviors. Pair separation initiates after differing initial delays and can be intermittent even at late times, stalling due to trapping events. These differences occur even when the pairs share the same initial separation, as they do in Figure 1.

The solid curves in Figure 2 show the time evolution of the mean squared-separation of the particle pairs, and are qualitatively similar to those of dispersion in both laboratory [e.g. 13, 15] and three-dimensional numerical experiments [e.g. 12, 17]: 1) the pair separation grows steeply after an initial phase during which the particles remain in close proximity (though this phase is exaggerated by the logarithmic scale) and 2) no clear scaling behavior emerges. The slopes of the curves observed in previous studies differ, ranging from values of 2 in [13] to 3 in [12, 15], and 4.5 (possibly 4) in [17]. In our work, the curves collapse when time is shifted so that the origins of time in the  $r_0 > 0.05$  cases align with the times required to reach  $\langle r^2 \rangle = r_0^2$  in the  $r_0 = 0.05$  case (black, blue, and red dashed curves in Figure 2) and show a slope of about 4 over a limited range.

The scaling discrepancies seen in previous studies have usually been taken to reflect the initial conditions of the pair measurements, and several approaches have been

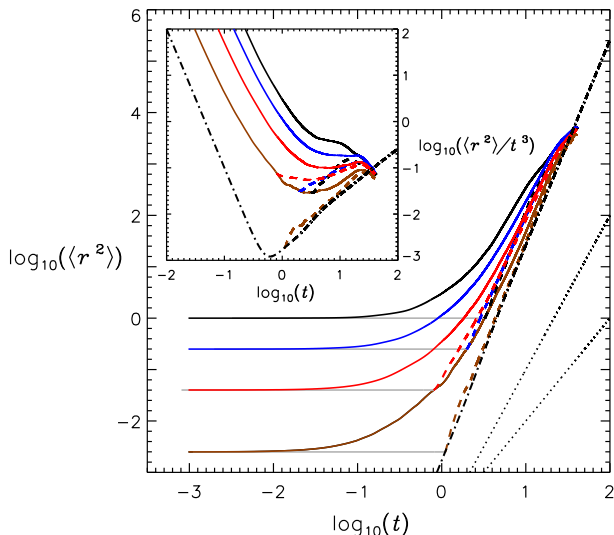


FIG. 2: Pair dispersion  $\langle r^2(t) \rangle$  for initial separations  $r_0 = 1.0, 0.5, 0.2$ , and  $0.05$  shown with black, blue, red, and brown curves respectively. Inset shows  $t^3$  compensated curves. Dashed black, blue, and red plot dispersion with shift in time based on time to reach  $\langle r \rangle = r_0 = 1.0, 0.5$ , and  $0.2$  in  $r_0 = 0.05$  solution. Dash-dotted curves show results of uniform waiting time distribution model (see text), and brown dashed curve the  $r_0 = 0.05$  solution with time shifted to account for time to reach  $\langle r \rangle = 0.5$  in that. Fiducial  $\langle r^2(t) \rangle \propto t^2$  and  $\langle r^2(t) \rangle \propto t^3$  dotted lines are shown for reference.

proposed to account for them. Perhaps the most convincing evidence for scaling comes from the exit-time analysis proposed in [11, 12], but even in that analysis the scaling range is quite limited. Critically, such exit-time analysis relies on the assumption that the time  $t_0$  required to reach a separation significantly larger than the initial  $r_0$  has a distribution peaked around the dimensional value  $(r_0^2/\langle \epsilon \rangle)^{1/3}$ . We show here that it is not the case – at least not in this simplified model of a turbulent flow. As seen in Figure 3, the distribution of such times is very broad. It is exponential with a time scale of order the flow integral time for small initial separations but rapidly evolves towards a flat distribution as  $r_0$  grows into the inertial range. We will return in detail to these properties, which are the main findings of our study, but we first demonstrate that such a broad distribution of delay times has an order-one effect on the dynamics of separation.

A crude model of the dynamics underlying each individual pair separation can be constructed as a combination successive delays and separations, as in [16]. Here we consider only two such steps: in the first, the particles remain at their original separation distance  $r_0$  for a time  $t_d$ , a time chosen from a uniform distribution, as suggested by the data. In the second, they separate according to an algebraic law,  $r^2 = r_0^2 + (t - t_d)^\alpha$ , where  $\alpha$  is a constant which may be set to 3 for an expected Richardson scaling or 2 for Batchelor-like behavior. The result of averaging over this simplified dynamics is shown

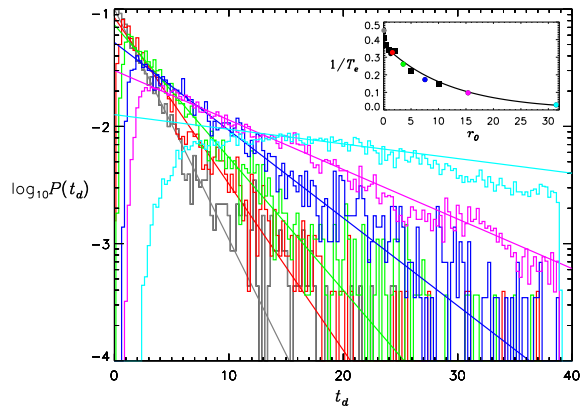


FIG. 3: Probability density of delay times, time to double the initial separation, for narrow ranges of  $r_0$  (one unit wide) characterized by mean  $r_0 = 0.05, 1.29, 3.57, 7.53, 15.4$ , and  $31.4$  (gray, red, green, blue, fuchsia, and cyan respectively). Solid lines plot exponential fits to distribution tails. Values of these are plotted in the inset as function of  $r_0$ , along with the same measure from a range of simulations (black symbols).

in Figure 2 as the black dash-dotted curve. Two features are readily apparent: (i) the model behavior is in very good agreement with the numerical data of the simulation, (ii) a scaling plateau  $\langle r^2 \rangle / t^3 \sim C$  is not observed, even when a perfect Richardson scaling is imposed in the model – in fact an underlying Batchelor scaling (i.e;  $t^2$ ) in the separation phase actually yields a better Richardson  $\langle r^2 \rangle / t^3$  plateau. This is because a random sequence of algebraic separations with uniformly distributed delays would actually lead to the average pair separation growing as  $\int (t - t_d)^\alpha dt \propto t^{\alpha+1}$  [18]. For instance a Richardson  $t^3$  scaling actually leads to the observed  $t^4$  behavior observed in Figure 2. Other broad delay time distributions, nonuniform, produce somewhat different slopes, all between 3 and 4. We conclude that similarly the actual dynamics of separation is dominated by the wide distribution of delay times. Additional evidence for this is found in the observed behavior of the  $r_0 = 0.05$  solution. When time in that solution is shifted to account for the time needed to reach the  $r_0 = 0.05$  initial condition, and when that temporal offset is based on the uniform waiting time distribution model, it follows the black dash-dotted curve of the model very closely (as shown by the dashed brown curve in Figure 2). In other words, pair dispersion in the point vortex model behaves as the superposition of Richardson-Obukov trajectories with onset times sampling a uniform distribution of delays.

We thus now aim to quantify the delay times  $t_d$  observed in the point vortex simulations. We define the delay time as the time needed for the distance between a particle pair to grow by a factor of two, and note that the change in terminology from exit time, used by previous authors, to delay time here is non-trivial. We imagine the delay time to occur not strictly at the beginning

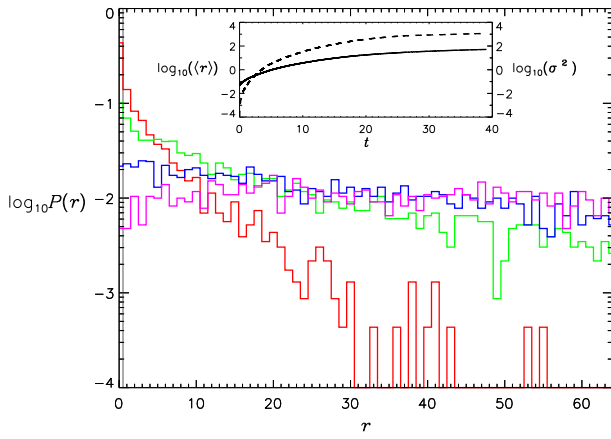


FIG. 4: Probability density of pair separations  $r$  in  $r_0 = 0.05$  solution at a function at  $t = 0, 10, 20, 30$ , and  $40$  (gray, red, green, blue, and fuchsia respectively). Inset plots logarithm of the mean (solid) and variance (dashed) of distribution as function of time. Note that the variance rapidly exceeds the mean by an order of magnitude.

of the measurement, to account for effects of the initial condition, but continuously throughout the time series as subsequent trapping events at large scales occur with finite probability.

To illustrate the delay time probability distribution we analyze the evolution of pairs with narrowly specified values of initial separation  $r_0$ , while understanding that at any time  $t$  a range of effective “initial” separations is sampled by the solution involving many pairs (Figure 4). The delay time distributions as a function of  $r_0$  are shown in Figure 3. Very wide distributions occur for all values of  $r_0$ , with the distribution widening with increased  $r_0$ . That is, even if many pairs separate right away, a significant fraction can remain bound for times comparable to the large scale eddy turnover time. The distribution  $P(t_d)$  has a marked peak only for quite small  $r_0$  values and becomes flat as  $r_0$  grows into the inertial range. From the exponential behavior of the distribution, one may extract a characteristic time  $T_e$  of the “bound phase” of the pair dynamics. It grows with the initial separation  $r_0$  as shown in the inset of Figure 3; the functional form of this growth is also exponential with a characteristic scale of about 1/5th of the flow domain.

In Figure 4 we turn to the evolution of the distribution of pair separations with time in the point vortex flow (starting from the smallest initial separation  $r_0 = 0.05$  studied). The distribution quickly broads, possibly to a stretched exponential at early times, as previously reported in 2D [19] and 3D [15] experiments, numerical studies [10, 16], and some statistical models [20, 21]. At later times,  $P(r)$  flattens. The inset of Figure 4 displays the evolution of the variance of  $P(r)$  compared to its mean, and shows that the variance in pair spacing exceeds the mean value after very short times. The system

rapidly evolves to a state in which the mean is a poor representation of the pair separation statistics. Moreover, the wide distribution of pair separations observed is associated with a wide distribution of delay times (Figure 3), and these dominate further evolution of  $\langle r^2 \rangle$  as we have illustrated by the highly simplified uniform delay time distribution model. While careful data analysis may extract behavior tangent to scaling regimes [12, 15], fixed time  $\langle r^2 \rangle(t)$  or fixed scale  $\langle t \rangle(r^2)$  statistics are fundamentally subdominant. This finding explains the elusive evidence for scaling in previous work: successive trapping by coherent structures generate a very wide distribution of delay times which actually dominate the functional form of the average separation rate. Scaling is not prevented by a lack of inertial range dynamics, but is instead blurred by intermittent dynamics which generate the wide distribution of delay times.

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