Stochastic dynamics of particles trapped in turbulent flows

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The long-time dynamics of large particles trapped in two nonhomogeneous turbulent shear flows is studied experimentally. Both flows present a common feature, a shear region that separates two colliding circulations, but with different spatial symmetries and temporal behaviors. Because large particles are less and less sensitive to flow fluctuations as their size increases, we observe the emergence of a slow dynamics corresponding to back-and-forth motions between two attractors, and a super-slow regime synchronized with flow reversals when they exist. Such dynamics is substantially reproduced by a one-dimensional stochastic model of an overdamped particle trapped in a two-well potential, forced by a colored noise. An extended model is also proposed that reproduces observed dynamics and trapping without potential barrier: the key ingredient is the ratio between the time scales of the noise correlation and the particle dynamics. A total agreement with experiments requires the introduction of spatially nonhomogeneous fluctuations and a suited confinement strength.

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I. INTRODUCTION

Trapping, defined as the process where an entity remains locked in a given region of a dynamical space, is very common in physics, chemistry, and biology [1,2]. This problem is usually described as an activated process, where a particle trapped in a potential can cross a barrier under the action of random fluctuations. The case of white noise fluctuations has been largely studied, yielding a large set of tools that allows the analysis of these problems (e.g., Fokker-Planck equations). However, many questions stay open concerning the influence of a colored noise, which we would like to address in this article using an experimental approach. Turbulent flows laden with particles give the opportunity to study a trapping problem with correlated fluctuations. Indeed, most real turbulent flows have a mean structure, with shear layers separating different circulations in which light inertial particles can be trapped for long times [3–5]. A similar situation arises for large neutrally buoyant particles (namely, particles with diameter typically of the order of the integral scale of the flow), which were, for instance, shown to be preferentially found in two attractors corresponding to low pressure and low fluctuation regions in von Kármán flows [6]. This trapping phenomenon can be related to the lesser response of such large particles to the fluctuations of the flow, an effect which reduces the escape probability of the particle from these attracting regions. Strong and rare fluctuation events can nevertheless trigger the transition between trapping regions. Under the combined action of trapping and turbulent fluctuations, such particles are expected to exhibit a complex dynamics with sudden intermittent transitions between attractors, suggesting possible analogies with multistable stochastic systems.

We report experimental measurements of the dynamics of large particles tracked for very long times in two shear flows (counter-rotating von Kármán flows), and we show how this dynamics is affected by the different symmetries of the large scale circulations. In all situations we find the particle position is a strongly fluctuating quantity with a spectrum presenting a plateau at very low frequencies and a power law of exponent close to −4 at high frequency, reminiscent of the $f^{-2}$ Lagrangian velocity spectrum at inertial time scales, as reported for tracer particles [7,8]. When trapping is present, we observe the emergence of a bistable dynamics characterized by a new power law of exponent −1.7 at intermediate frequency, corresponding to back-and-forth motions between the attractors. All statistical quantities are strongly influenced by the symmetries of the large scale flow and present a signature of its temporal dynamics. Most results are recovered when drawing an analogy with the 1D dynamics of an overdamped particle trapped in a two-well potential and subjected to an exponentially correlated noise. An enhanced description of the experimental data is obtained using a different approach. An improved model without potential barrier is introduced, where the particle evolves in a large region, confined by lateral potential walls, where the trapping close to these walls comes from the effect of the correlated noise together with the spatial nonhomogeneity of the fluctuations. This model can reproduce the observed dynamics and the trapping, but a total agreement with experiments needs a suited confinement strength.

II. EXPERIMENTAL OBSERVATIONS

We investigate the long-time dynamics of large particles in two water-filled von Kármán flows using two distinct setups in Pamplona and Lyon detailed in [9,10], hereafter called C-vK (cylindrical-von Kármán) and S-vK (square-von Kármán), respectively. As shown in Fig. 1, both systems share common features: two coaxial propellers counter-rotating at the same frequency $f_{\text{prop}}$ are placed in a closed cavity, producing nonhomogeneous and nonisotropic turbulent flows. Such configurations produce average flows composed of two toroidal cells, each driven by one of the propellers, with a strong shear layer in between. The two setups have disk...
radii $R_{\text{prop}}^C = 8.75$ cm and $R_{\text{prop}}^S = 9.5$ cm for the C-vK and S-vK, respectively, similar distances between the disks $H^C = 2R_{\text{prop}}^C = 20$ cm ($H^S = 2R_{\text{prop}}^S = 19$ cm), and similar aspect ratios. The main difference concerns the symmetries of the cavity: the Lyon experiment uses impellers with straight blades and has a square cross section so that the mean flow of the S-vK is the most probable flow, with a shear layer in the midplane ($z = 0$) of the apparatus. On the other hand, the Pamplona experiment uses curved blades pushing the fluid with the convex side, and has a circular cross section so that the shear layer of the C-vK is always found to be displaced to one side of the apparatus. This displacement leads to an asymmetric flow with respect to the midplane, one of the cells being bigger than the other. In addition, the shear layer can spontaneously jump to the other side of the apparatus, leading to the opposite state. These reversals occur almost instantaneously while the duration of each state (hereafter referred to as $C^+$ and $C^-$, when the shear layer $z$ position is positive and negative, respectively) lasts for long times [9], the Eulerian velocity time spectra presenting a $f^{-2}$ regime at extremely low frequencies [11]. For the rotating frequencies considered in the experimental runs ($f_{\text{prop}} \in [1, 4]$ Hz), both configurations produce fully turbulent flows with similarly high Reynolds numbers $Re = 2\pi R_{\text{prop}}^2 f_{\text{prop}}/\nu = O(10^5)$.

In the first set of experiments, we track polyamide spheres with density $1.14$ kg m$^{-3}$ and diameters [6, 10, 18, 24] mm in the whole flow volume of the S-vK using the 3D particle tracking velocimetry setup described in [10]. In the second set of experiments, almost neutrally buoyant water-filled celluloid caps particles, with diameters [10, 20, 30, 40] mm, are tracked in the entire flow of the C-vK using only one camera. Because the camera is located at a distance much larger than the dimensions of the vessel, this configuration gives the 2D position $(y, z)$ with only a weak bias.Datasets are obtained with a moderate sampling frequency (45 Hz for S-vK, 15 Hz for C-vK) so that the fastest scales of particle motions are not resolved. This allows for tracking particles during very long times, of the order of thousands integral time scale $T = 1/f_{\text{prop}}$, hence giving access to the particles long-time dynamics.

Figure 2 shows time recordings of the axial position $z(t)$. In the symmetric (S-vK) configuration, particle dynamics exhibit back-and-forth motions between two regions of equally high probability situated on the sides of the vessel. This sampling behavior, which increases with the particle diameter $D$ as already observed in [6], is well captured by the position probability density function (PDF), being almost flat for particles smaller than 10 mm while presenting two preferential regions near the disks (lumps) and a hollow region in the center for larger particles. The particles are also trapped in the asymmetric (C-vK) configuration, but with a more intermittent dynamics. On short times, the particle is most likely found on one side of the vessel (here corresponding to negative values), and is only allowed to visit the other side during very short excursions. This behavior, observed here because the shear layer was displaced toward positive values of $z$ ($C^+$ state of the flow) while this signal was taken, is confirmed when labeling the long-time signal according to the position of the shear layer. Indeed, by looking at simultaneous recordings of

![FIG. 1. Sketches of the von Kármán setups and mean flows. Top: S-vK (square-von Kármán) configuration. Bottom: C-vK (cylindrical-von Kármán) configuration.](image)

![FIG. 2. Time series of the axial position of a particle on short time (first column) and long time (second column) with the probability density functions (third column). The first and second lines stand for 6 and 18 mm particles freely advected in the S-vK configuration with a rotating frequency $f_{\text{prop}} = 3$ Hz, while the last line is a 30 mm particle moving in the C-vK with $f_{\text{prop}} = 3.16$ Hz. For the C-vK, the signal has been labeled according to the position of the shear layer corresponding to $C^+$-vK (black) and $C^-$-vK (gray) states. The PDF are conditioned on the two states $C^{\pm}$-vK.](image)
particle position and flow velocity measured by laser Doppler velocimetry, we observed the reversals in the particle position are synchronized with the reversals of the large scale flow, the particle being trapped in the largest cell [12]. In this asymmetric configuration, particle position PDFs conditioned on the two mirror states $C^\pm$ are then asymmetric as a consequence of the global asymmetry of the large scale flow, and exchange in the symmetry $z \rightarrow -z$. For both C-vK and S-vK configurations, we can determine the time a particle is trapped in one side of the apparatus before it escapes to the other side, called escape time and denoted $\Delta t$ here. For the C-vK configuration, it is necessary to take into account the position of the shear layer to dissociate an escape from, and toward, the most probable region. Whatever the setups and configurations, we always find that the escape times follow decaying exponential distributions: $PDF(\Delta t) \sim 1/T_0 e^{-\Delta t/T_0}$, with $T_0 = \langle \Delta t \rangle$. This kind of PDF distributions for escape times, corresponding to independent random jumps, is often seen in fluctuation-driven bistable systems [1,13–15].

In order to better characterize what range of time scales in the particle dynamics is affected by the heterogeneous sampling, we compute the axial position power spectra of the time series displayed in Fig. 2, and present the results in Fig. 3. For the S-vK configuration, all spectra are monotonically decreasing and present a plateau in the very low frequency range. Such behavior corresponds to a total decorrelation of the axial position whose variance remains finite, which is expected for particles transported in a bounded domain. Concerning the 6 mm particle, one observes a slow transition toward a power law of exponent close to (but steeper than) $-4$ in the high frequency range $f/f_{prop} \gg 1$, as would be observed for tracers in similar flows [7,8]. For the very large particles considered here, which start to be trapped in low pressure, low fluctuation regions when their diameter exceeds $D \simeq 10$ mm [6], the influence of nonhomogeneous sampling manifests itself in the intermediate frequency range $f/f_{prop} \in [0.1,1]$ as a new power law of exponent $\alpha \simeq -1.7$ corresponding to the long-time oscillations observed in Fig. 2. A similar power law is observed in the C-vK for all the large particles considered here, but with a plateau whose height decreases at increasing particle diameter, indicating the position variance decreases within one (C$^+$ or C$^-$) state. The main difference with the S-vK configuration is the appearance of a super-slow regime for the largest particles, for which the position of the most probable region synchronizes with the flow reversals [12].

All these observations are robust when varying the Reynolds number by changing the frequency of the propellers. As demonstrated in Fig. 4, which displays results obtained in the case of the smallest (6 mm) particles advected in the S-vK setup, the normalized frequency spectra $f_{prop}PSD(z)$ reduce to a single curve when plotted as a function of reduced frequency $f/f_{prop}$. Note that this figure presents a combination of spectra for three curves, three corresponding to very long runs with a sampling frequency 45 Hz while the three others correspond to very short runs with a sampling frequency 45 Hz while the three others correspond to very short and well resolved trajectories recorded at 3000 Hz. Such collapse of the spectra from very low up to very high frequencies was observed to hold for any particle size in the range $D \in [6–24]$ mm. It is valid providing the turbulence is fully developed and the particle diameters are of the order of the flow integral scale.

### III. STOCHASTIC MODELS

For both setups the dynamics in the $z$ direction is determined by the trapping of the spheres around two very well defined $z$ positions, close to the propellers. We propose to describe this phenomenon as an overdamped particle moving in a potential defined inside the experimental cell, and driven by random fluctuations:

$$\frac{dz}{dt} = -\frac{dV}{dz} + \nu(z,t),$$

where $V$ is a (dimensionless) potential accounting for confinement and eventually trapping, and $\nu$ is the Lagrangian fluctuating velocity the particle would have in an unbounded domain. Because turbulence intensity varies in space, we write it as $\nu(z,t) = B_0 s(z) \eta(t)$, where $B_0$ is the fluctuation intensity, $s(z)$ a spatial profile, and $\eta(t)$ a random variable. Very small scales of turbulence are not expected to drive long-time dynamics; we thus only retain inertial range fluctuations which are modeled as an Ornstein-Uhlenbeck process with...
correlation time $\tau_p$ \cite{7,16–18}.

$$\frac{d\eta}{dt} = -\frac{1}{\tau_p} \eta + \sqrt{\frac{2\eta^2}{\tau_p}} \xi(t),$$

where $\eta_0 = 1$, and $\xi(t)$ is a Gaussian noise satisfying $\langle \xi(t)\xi(t') \rangle = \delta(t-t')$. Particles may avoid the central region of the flow because of the mean flow topology, or because turbulence is stronger in this region. To account for these two possibilities, we used two different models.

A. Double-well model

In the first model, the double-well model, the fluctuations are homogeneous [$s(z) = 1$], and the potential presents two wells with lateral walls of constant stiffness:

$$V(z) = \delta \left(\frac{z^4}{4} - \frac{z^2}{2}\right) - \lambda z, \quad |z| < 1, \quad (3)$$

$$V(z) = 4 \left(\frac{z^4}{4} - \frac{z^2}{2}\right) - \lambda z, \quad |z| \geq 1. \quad (4)$$

The shape of the potential is then set by the couple of parameters $(\delta, \lambda)$, which control the height of the barrier between the wells and the asymmetry observed in each state C$^\pm$ of the C-vK configuration. This kind of stochastic model is known to reproduce the behavior of bistable systems such as magnetic field reversals \cite{13,15} or turbulent flow reversals \cite{9,14}. In this model, the correlation time and amplitude of fluctuations are chosen so that $\sqrt{B_0 \tau_p}$ equals a significant fraction of the box size to prevent turbulent diffusion when $(\delta, \lambda) = (0,0)$. Figures 5(a) and 5(b) present the position spectra and PDF obtained for three cases of the double-well model with the choice $\tau_p = 1$ and $B_0 = 1$: confinement only (thick solid line, $\delta = \lambda = 0$), symmetric double-well potential (thin solid line, $\delta = 2$, $\lambda = 0$; dashed line, $\delta = 4$, $\lambda = 0$), and asymmetric double-well potential (open circles, $\delta = 2$, $\lambda = 0.35$). Without any barrier, the sampling is almost homogeneous with increased probability on the sides, as already observed for the 6 mm particles. This is due to the finite correlation time $\tau_p$, and leads to a spectrum with a low-frequency plateau and a power law of exponent $-4$ in the high frequency range, resembling the dynamics of the smallest particles in the S-vK. When adding a barrier, we observe a strong preferential sampling with two trapping regions around $z = \pm 1$, leading to a power law of exponent $-2$ for intermediate frequencies, similar to the dynamics of large particles in the S-vK. A change of the height of the barrier $\delta$ modifies the depth of the central valley of the PDF distribution from one to two orders of magnitude compared to the maxima, as well as the extent of the $-2$ slope in the intermediate frequency region. However, a preferential trapping stronger than the one found in the experiments seems to be necessary to recover this slope on a comparable frequency range.

Adding an asymmetry to reproduce the C$^-$ state, we obtain a PDF and spectrum similar to those of C-vK, with decreased height of the plateau at increasing asymmetry as observed in the experiment when $D$ increases. This indicates that if increasing particle size corresponds to an increase of the barrier height in the symmetric configuration, it corresponds to an increased asymmetry when the mean flow is asymmetric. For all sets of parameters, we observed exponential distributions of escape times, corresponding to independent random jumps with transition times much shorter than residence time. This scale separation between escape and transition times is much less evident in the experiment, and can be one of the reasons why this model cannot capture the whole range of experimental dynamical features. This double well model relies on the activation of the particle. When activated, the particle transits rapidly from one potential well to the other. A model relying on a different approach could reproduce the position spectra exponent $-1.7$ and yields an even better agreement with the trapping dynamics.

B. Nonhomogeneous model

With this idea in mind, we replaced the double-well potential with a wide and flat potential that accounts only for the confinement between the propellers. Providing the potential is not quadratic, trapping is obtained by adjusting the ratio between the time scales for the particle dynamics $\tau_p/T$, where $T$ is defined with the deterministic equation $\dot{z} = -dV/dz$ and a typical length scale $\sqrt{\langle z^2 \rangle}$, and $\tau_p$ is the correlation time of the fluctuations \cite{19}. When these times are similar there is no trapping, but when the fluctuations correlation time is large, it induces the trapping as a mixed effect of a noise driven force that pushes the particle toward one of the propellers on larger time scale compared to the time scales of the particle dynamics. Other features that appear in the experiments are also included, as the nonhomogeneity of turbulence intensity or the stiffness of the lateral potential walls. Although these parameters allow a fine tuning of the final results, they are not of crucial importance to induce the
trapping. We would like to highlight that this model induces the trapping even without energy barriers.

For this nonhomogeneous model, the confinement potential is

$$V(z) = z^n/n - \lambda z,$$

(5)

where $n \geq 4$ is an even integer and $\lambda$ the asymmetry parameter (see Ref. [19]). Because fluctuations are stronger close to the plane $z = 0$ in the experiments, we set $s(z) = \exp(-z^2/2 \sigma^2)$, where $\sigma$ is the typical scale of turbulence nonhomogeneity (equal to a fraction of the system size in the experiment). For the results presented here, we set $B_0 = 10$, $\sigma = 1$, and $n = 8$, but the precise values of the first two parameters were found to have a weak impact on the results. The only remaining parameters to be varied are then the asymmetry parameter $\lambda$ and the particles velocity correlation time $\tau_p$, a quantity which increases with the particle diameter because large particles are only sensitive to eddies larger than their own size [20–22]. We would like to stress here that no potential barrier at $z = 0$ is imposed in this second approach, nevertheless the system is able to reproduce trapping close to the propellers when increasing the particles correlation time $\tau_p$ as demonstrated in Figs. 5(c) and 5(d). A particle with a small correlation time ($\tau_p = 1, \lambda = 0$) has a dynamics similar to that observed for small particles in the S-vK, while a larger particle with a larger correlation time ($\tau_p = 10, \lambda = 0$) has a bistable dynamics with a position power spectrum presenting again three regimes, but with an exponent $\beta \sim -1.7$ at intermediate frequencies, closer to the experimental result. Concerning the influence of an asymmetry, the nonhomogeneous model with $\tau_p = 10, \lambda = 5$ gives similar results as those obtained with the double-well model: the height of the plateau at low frequency decreases, corresponding to a reduced rms value for the particle position. However, we observed that the nonhomogeneous model yields different exponents in the range $[-2.2, -1.5]$ when varying the stiffness of the lateral walls, a consequence of the nonlinearity of the restoring force. We may then deduce that the precise value of the exponent in the experimental results has (at least partially) its origin in the confinement strength in the flow combined with the nonhomogeneity of the turbulence intensity.

**IV. CONCLUSION**

We have studied the dynamics of large particles in two turbulent flows presenting a large scale structure with recirculating regions. Because large particles are less sensitive to flow fluctuations as their diameter increases, they tend to be trapped in attractors close to the disks corresponding to low pressure, low fluctuation regions of the flow, and exhibit a complex bistable dynamics under the combined action of the mean flow topology and nonhomogeneous turbulence. This dynamics is very sensitive to any eventual asymmetry of the mean flow structure, and presents the main features of a stochastic bistable system. In order to study the influence of the different mechanisms at play, we described the dynamics using two different models. We first considered a classical double-well model consisting of an over damped particle moving in a two-well potential under the action of fluctuations with exponential correlation. This model reproduces most of the experimental results when varying the height of the barrier. It also demonstrates the influence of the noise correlation, at the origin of an increase of the position PDF close to the disks even for the smallest particles. However, the model only predicts position spectra with a power law of exponent $-2$ at intermediate frequency corresponding to sharp uncorrelated reversals of particle position.

Using a second model based on the different time scales between the particle dynamics and the noise correlation we can reproduce the trapping without any potential barrier that separates two spatial regions. While it was found that the ratio between the time scales of the noise and of the particle dynamics is the most important parameter for the trapping, we observed the back-and-forth dynamics is influenced by nonhomogeneities and the confinement strength. Indeed, the value of the slope of the position power spectra in the intermediate frequency regime is shown to be finely tuned by both parameters. Finally, we note that most real turbulent flows present a mean structure with recirculating regions and nonhomogeneous fluctuation fields where inertial particles, such as bubbles, may be trapped for long times [4,5]. We expect that these particles also present a complex long-time dynamics corresponding to jumps between attractors. Using an approach similar to the one presented in this article, it would be possible to derive a model describing their dynamics, whose key characteristics are the trapping potential and the temporal and spatial distributions of the driving noise.

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[19] Using a quadratic potential (case $n = 2$) would lead to a two-dimensional Ornstein-Uhlenbeck process for the variables $(z, \eta)$ [2]. In such a case the joint probability $P(z, \eta, t)$ converges toward a Gaussian stationary solution $P_s(z, \eta) \propto \exp(-az^2 + b\eta - c\eta^2)$ whatever the correlation time $\tau_p$ if $B(z)$ is constant, or if the nonhomogeneity is too weak as compared to the confinement. We therefore only consider potentials with exponents $n \geq 4$ leading to nonlinear Langevin equations. For such nonlinear equations, increasing the correlation time $\tau_p$ leads to bimodal position PDFs.