A Dynamical Systems Approach to the Surface Search of Debris Associated with the Disappearance of Flight MH370

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Abstract. The disappearance of Malaysia Airlines flight MH370 on the morning of the 8th of March 2014 is one of the great mysteries of our time. Perhaps the most relevant aspect of this mystery is that not a single piece of debris from the aircraft was found during the intensive surface search carried out for roughly two months following the crash. Difficulties in the search efforts, due to the uncertainty in the plane's final impact point and the time that had passed since the accident, bring the question on how the debris scattered in an always moving ocean, for which there are multiple datasets that do not uniquely determine its state. Our approach to this problem is based on the use of Lagrangian Descriptors (LD), a novel mathematical tool coming from dynamical systems theory that identifies dynamic barriers and coherent structures governing transport. By combining publicly available information supplied by different ocean data sources with these mathematical techniques, we are able to assess the spatio-temporal state of the ocean in the priority search area at the time of impact and the following weeks. Using this information we propose a revised search strategy by showing why one might not have expected to find debris in some large search areas targeted by the Australian Maritime Safety Authority (AMSA), and determining regions where one might have expected impact debris to be located and that were not subjected to any exploration.

1 Introduction

The fate of Malaysia Airlines flight MH370 has been a mystery since its disappearance on the morning of the 8th of March 2014. An analysis of radar data, aircraft performance calculations and satellite communication (SATCOM) system signaling messages placed the aircraft over an arc, the 7th arc, in the southern part of the Indian Ocean ATSB (2014a),

where the aircraft's fuel was, presumably, exhausted. Refinements to the analysis of both the flight and satellite data have been continuous since the loss of MH370 and have resulted in the definition of several potential impact regions along the 7th arc, driving the search efforts to consider different search areas.

The events determining the plane's fate after the crash were undoubtedly affected by the manner in which the impact occurred, since this should have determined the nature of the breakup of the plane into pieces of debris. A study by Chen *et al.* (2015) has explored how different impact angles would have affected the breakup and also conjectured plane impact conditions for which no debris would have been produced. However, the finding of a right wing flaperon from the plane on a beach of Réunion Island in the Indian Ocean, 16 months after the disappearance, has ruled out this possibility (http://edition.cnn.com/2015/09/03/europe/mh370-investigation/index.html). On the other hand, search services always considered that, after the plane disappeared, floating debris should have been produced, and began one of the most challenging searches in aviation history. During roughly two months after the disappearance, a surface search was conducted. It was not until October 2014 that the much more demanding underwater search phase started.

It is hard to know what should be the properties of the debris produced after the impact, and some aspects in this respect are discussed by Chen *et al.* (2015). Large heavy pieces of the plane would have sank immediately, but small floating pieces are also expected. For instance, fuselage pieces similar to those recovered from the Air France Flight 447 flight, (see http://www.aviationlawmonitor.com/tags/air-france-flight-447/) which consisted of thin, flat, half-submerged structures, or personal flotation devices, which potentially would have been driven mainly by ocean currents. The presence of this kind of debris is consistent with the plan and actions taken by the search services and is confirmed by the discovery of a wing piece on the beach of Réunion Island.

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Under these assumptions it is then clear the importance of understanding the nature of the ocean currents in the impact area (Saab, 2014) at the time of disappearance and thereafter, and to then determine how they contributed to debris dispersion. We will assume that it is reasonable to relate the evolution of the described potential debris with that of surface drifters, such as those distributed by the Global Drifters Program (GDP), and for this reason, in order to support our study, we will benchmark our conclusions with these drifters tracks. It is important to remark that drifters are the only floating objects in the area, at the time of the impact, for which we have full knowledge of their time evolution. No comparison is possible with the real debris.

Differences between the forecasted velocity fields are a handicap for the analysis of particle dispersion, and therefore having a good representation of the ocean circulation patterns becomes crucial for dispersion studies (Mendoza *et al.*, 2014; Griffa *et al.*, 2013; Haza *et al.*, 2007). Mainly two type of data sources for oceanic currents are available in oceanic contexts. One is obtained in almost real time after post-processing satellite altimetry, such as AVISO products, which provide mainly geostrophic currents. Similar products integrating surface winds and/or Ekman dynamics are, for instance, OSCAR and SCUD.

Alternatively, surface ocean currents can be provided by physics-based computational models which are solved on high-resolution meshes. These provide ocean circulation currents in space and time on the whole oceanic basin under study and, in order to be representative of the ocean state, they usually assimilate AVISO data and drifters and incorporate other important dynamics and measurements. Examples of these models are the Hybrid Coordinate Ocean Model (HYCOM), or the Operational Mercator global Ocean analysis and forecast system (provided by EU Copernicus). Typically these products provide high resolution space-time data sets but only in areas of interest to the countries funding the consortia providing simulations. In this study the focus is in the middle of the Indian Ocean, where only low resolution data is available for the considered models.

This study is focused in the analysis of AVISO and HYCOM data predictions for the region and period of interest. Our analysis utilizes fundamental ideas coming from dynamical systems theory applied to Lagrangian transport, which provide sharper insights than the simple drifter tracking supplied by tools such as GNOME or SCUD. The approach taken by the rescue services as described in ATSB (2014a) seems to be closer to a simple drifter tracking approach, and no information is provided on the type of velocity fields used.

Dynamical systems theory contributes to this problem by realizing Poincaré's idea of seeking geometrical structures in the phase portrait (for this problem, the ocean surface) that can be used to organize schematically regions corresponding to qualitatively different types of trajectories. These geometrical objects, the stable and unstable manifolds of hyperbolic trajectories, also called Lagrangian structures, are expected

to be robust with respect to slight perturbations of the velocity field. The main contribution from this perspective is the consideration that the analysis of individual trajectories may be misleading, and that the right approach to take is to observe the consistency of individual trajectories with the dynamical barriers highlighted by the Lagrangian skeleton of the velocity field.

Finding these structures in the context of geophysical flows is a dynamical systems challenge, as these velocity fields are time dependent and only known on a finite time dataset. Their study requires the use of modern techniques in nonlinear dynamical systems theory that achieve a phase portrait representation for systems with these characteristics. In this context many tools have been successful to this end and have provided interesting insights into oceanic problems. For instance, manifolds have been approximated by computing ridges of fields, such as finite size Lyapunov exponents (FSLE) (Aurell *et al.*, 1997) succesfully applied into oceanic contexts (d'Ovidio *et al.*, 2004; Tew Kai *et al.*, 2009) and finite time Lyapunov exponents (FTLE) (Nese, 1989; Shadden *et al.*, 2005, 2009). Another perspective within the geometrical approach different from Lyapunov exponents is that provided by distinguished hyperbolic trajectories (DHT), a generalization of the concept of fixed point for dynamical systems with a general time dependence (Ide *et al.*, 2002; Ju *et al.*, 2003; Madrid and Mancho, 2009), and their stable and unstable manifolds (Mancho *et al.*, 2006c; Mendoza and Mancho, 2012). In this approach stable and unstable manifolds are directly computed as material surfaces (Mancho *et al.*, 2003, 2004). This method has also provided valuable insight into oceanic problems (Mancho *et al.*, 2006b; Mendoza *et al.*, 2010). Other approaches in this field have been the geodesic theory of Lagragian Coherent Structures (LCS) (Haller and Beron-Vera, 2012), the variational theory of LCS (Farazmand and Haller, 2012), the trajectory complexity measures (Rypina *et al.*, 2011), mesohyperbolicity measures and ergodic partitions (Mezic and Wiggins, 1999; Mezic *et al.*, 2010) and transfer operator methods (Froyland and Padberg-Gehle., 2014; Froyland *et al.*, 2012).

A recent tool that reveals phase space structures of general time dependent dynamical systems is the so-called function M, also referred to as Lagrangian Descriptors (see for instance Mendoza and Mancho (2010, 2012); Mancho *et al.* (2013)), for which several advantages have been discussed in Mancho *et al.* (2013); Rempel *et al.* (2013); de la Cámara *et al.* (2012, 2013) versus other classical approaches (Shadden *et al.*, 2005; Mezic and Wiggins, 1999). We illustrate the power of this proposed methodology jointly with techniques based on contour advection (Dritschel, 1989; Mancho *et al.*, 2003) to reach conclusions regarding the fate of the plane debris in the weeks after the accident.

In this paper we analyze the transport processes arising from AVISO and HYCOM velocity fields. In order to assess the performance (quality) of the ocean state data for the time period and region under consideration we compute for each

dataset the Lagrangian geometrical skeleton by means of the function M, which is then benchmarked with surface GDP drifter tracks. We find that drifters remarkably follow the Lagrangian skeleton provided by AVISO data. HYCOM data presents high-frequency motions, but still our Lagrangian techniques highlight mesoscale structures analogous to those found in AVISO. By combining contour advection of the presumed impact areas and the geometrical skeleton of the underlying flow we note the presence of ocean mesoscale structures, which could have acted as barriers for the debris. Additionally it is observed that the impact area evolves in such a way that it fills quiet ocean regions, suggesting that they are a very likely destination for the debris. Interestingly, our Lagrangian analysis reaches conclusions that could have guided the search tasks: it highlights regions disregarded by the search efforts, where debris could have been found, and points out that debris could scarcely have visited certain regions subjected to intense search.

The structure of this article is as follows. Section 2 describes the data used in this study. Section 3 describes and discusses the approach to the debris dispersion. Section 4 provides the results and the discussion. Finally, Section 5 provides the Conclusions.

2 Data

The surface velocity fields used for this work have been obtained from satellite altimetry produced by Ssalto/Duacs and distributed by AVISO, with support from CNES, and are downloadable from http://www.aviso.oceanobs.com/duacs/. In particular we have considered the product UPD, which is reconstructed from four satellites. The data are given on a spatial grid of 1080×915 points (longitude/latitude). The latitude ranges from 82^oS to 81.9746^oN using a Mercator projection, and the longitude ranges from 0° to 359.667^o using a uniform grid. The spatial precision is thus $1/3°$ at the Equator and is provided with daily frequency. AVISO data essentially reproduces geostrophic currents. A priori, the convenience of using this type data for our study is supported by work discussed in Olascoaga *et al.* (2013); Mendoza *et al.* (2014), and eventually is confirmed by the results reported in the discussion section.

A second source used for the velocity fields is the Hybrid Coordinate Ocean Model (HYCOM) Bleck (2002); Chassignet *et al.* (2007), which provides velocity fields throughout the entire ocean depth. This model assimilates satellite sea-surface height and temperature data by means of the Navy Coupled Ocean Data Assimilation (NCODA) system and it is forced by surface winds and air-sea fluxes. These factors introduce a high-frequency variability on HYCOM data, producing velocity fields that, at least in the very upper layers, are far from geostrophy. In the next section we will discuss issues of finite resolution and wind effects in relation to the debris dispersion problem. In particular,

we have considered the HYCOM GLBa0.08 dataset (experiments expt_91.0 and expt_91.1), which can be downloaded from http://hycom.org/dataserver/glb-analysis/. These experiments use 32 layers along the vertical coordinate and are carried out over a global Mercator curvilinear grid for the ocean, where latitude ranges from $78°$S to $47°$N and the equatorial resolution is $1/12°$, resulting in a grid point spacing of approximately 7 km on average. Regions north of $47°$N are represented with a bipolar patch. The data is provided daily.

In the calculations performed we attempt to filter the high-frequency variability by using the HYCOM data layer at 50 meter depth. A similar depth choice for this model is used, for instance, in (Sulman *et al.*, 2013) or for CUPOM (Colorado University Princeton Ocean Model) in (Branicki and Kirwan Jr., 2010). In the latter work the authors show how the resulting Lagrangian structure is close to 2-D surfaces that extend nearly vertically into the water column. The full 3D Lagrangian structures can be obtained by a vertical extension of the evolving stable and unstable manifolds calculated in the 2D plane, but this is valid only throughout a layer whose thickness depends on the ratio of the characteristic velocity within the 2D slice to the characteristic vertical shear of the horizontal velocities (Branicki *et al.*, 2011; Branicki and Kirwan Jr., 2010). We confirm that this is the case in our study.

Finally, in order to benchmark the Lagrangian structures calculated for the velocity field datasets described above, surface drifter tracks are obtained from data distributed by the Global Drifters Program (GDP), from the National Oceanic and Atmospheric Administration (NOAA) and Atlantic Oceanographic and Meteorological Laboratory (AOML). These tracks can be downloaded from http://www.aoml.noaa.gov/phod/dac/index.php. Each drifter has an identification number with five digits, which allows for the identification of different drifters. The sampling of the drifter position is once every 6 hours. GDP drifters are designed to avoid direct wind forcing and to represent motions under currents at a nominal depth of 15m (Grodsky *et al.*, 2011). This supports the comparison of their motion with AVISO and with HYCOM data in a layer below the surface as the one chosen.

3 Modelling debris dispersion

The debris produced after a plane accident is due to the breakup of the plane and it depends on how it enters the water. Large heavy and unbroken pieces of fuselage would sink rapidly, however there exist reports of plane accidents (Chen *et al.*, 2015) which produced debris spread over a wide area, with light pieces that might have floated for a long time. The finding of a right wing flaperon from the plane on a beach of Réunion Island the 29th July 2015 confirms this point.
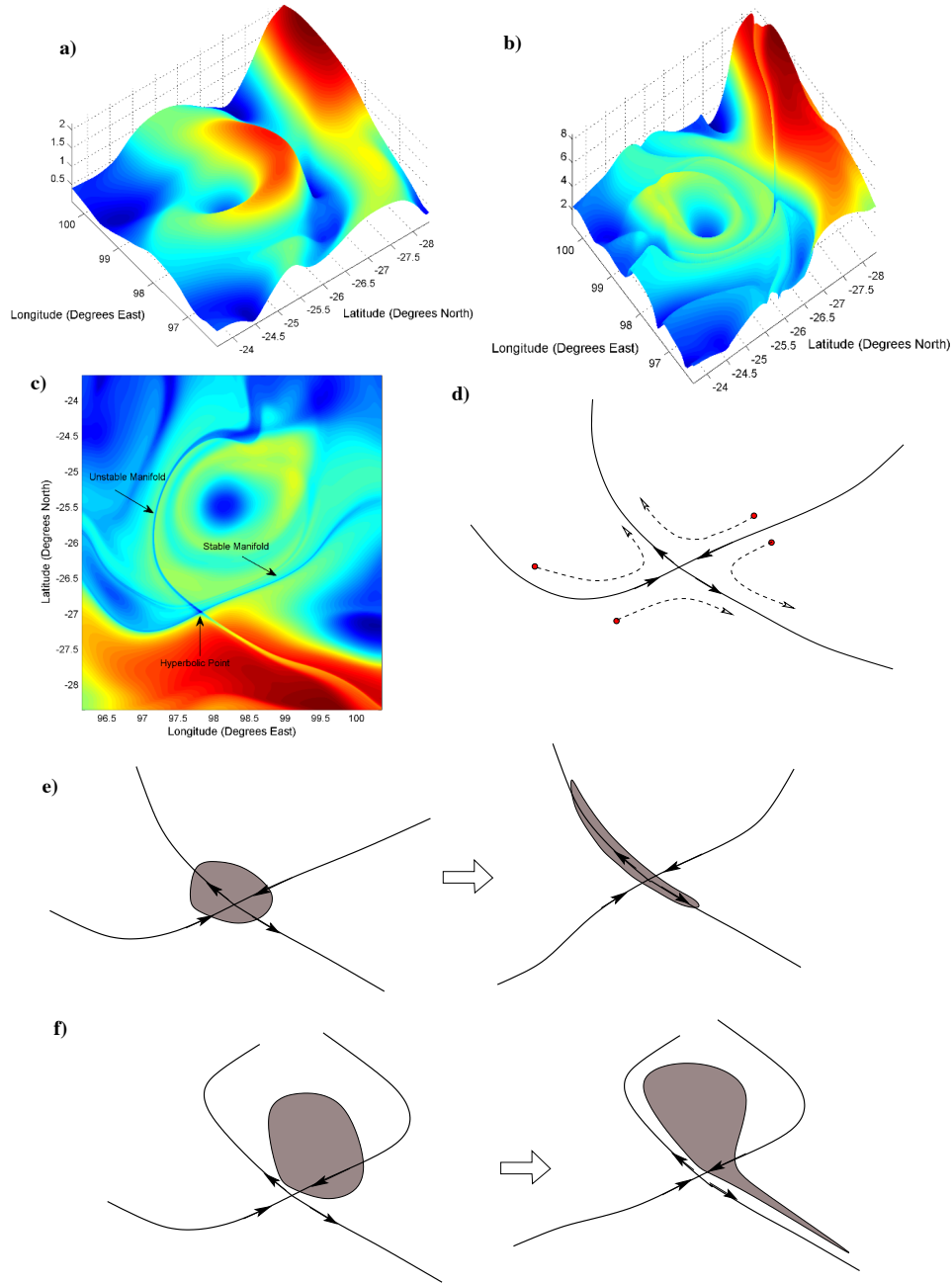
Fig. 1. Evaluation of the M function for AVISO data in the southern Indian Ocean on the 8th of March 2014. (a) $\tau = 5$ days; (b) $\tau = 20$ days; (c) a countour plot of (b) highlighting the position of visible invariant manifolds and a hyperbolic point; (d) a schematic representation of the manifolds of (c) showing the particle evolution in the neighborhood; (e) tracer blob evolution in a neighborhood of the crossing of the stable and unstable manifolds; f) tracer blob evolution in a neighborhood of a hyperbolic point and a elliptic (eddy-like) region.
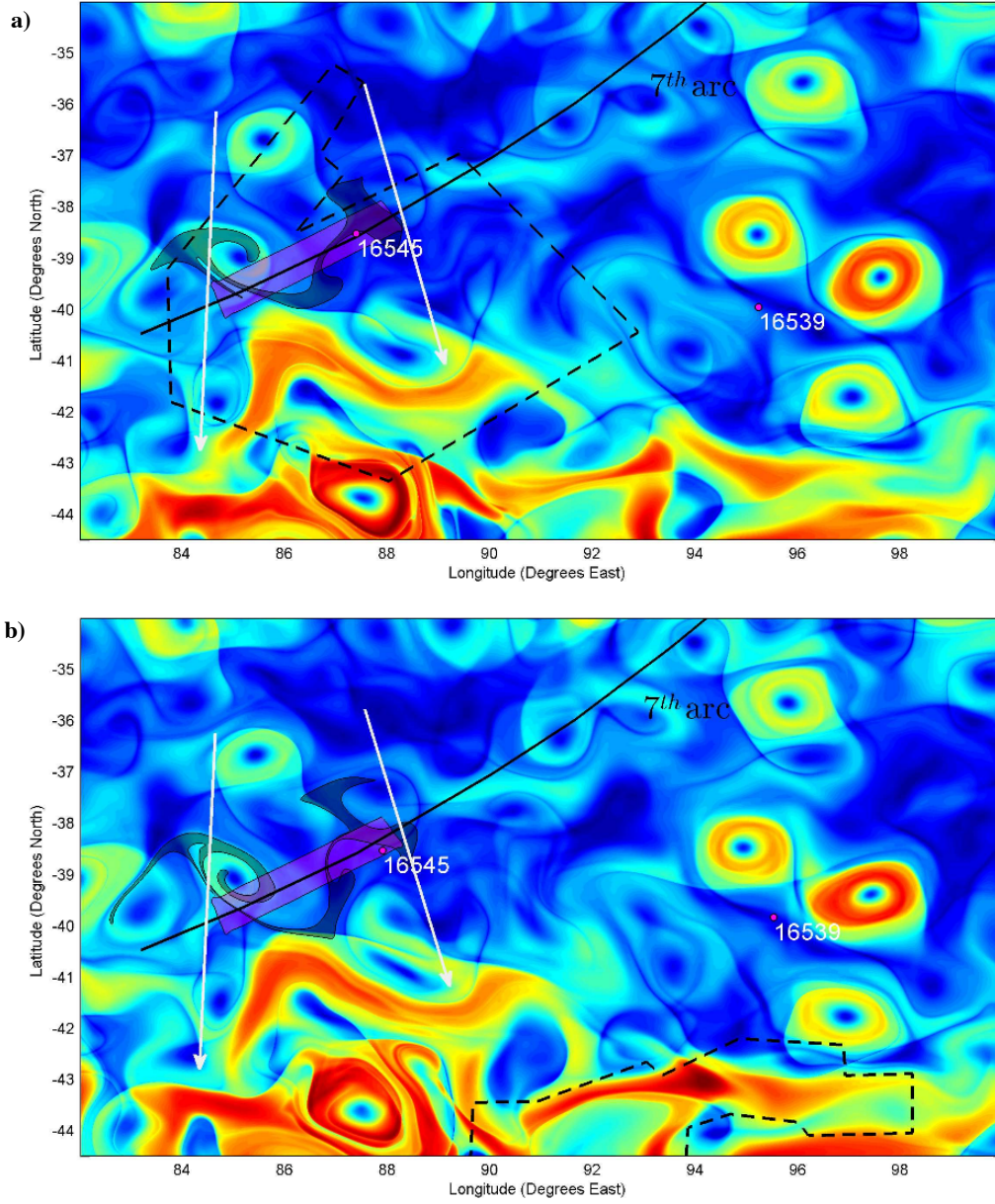
Fig. 2. A summary of the debris search for the Malaysian MH370 plane in the southern Indian Ocean. In the background the M function, evaluated on AVISO data for $\tau = 20$ days, highlights mesoscale structures and invariant manifolds. Overlapped are the drifters in the area (magenta dots), the expected flight paths (white arrows), the likely impact area (pink) and its contour evolution (gray). Dashed lines outline the search areas for the respective dates (a) 19th of March 2014; (b) 27th of March 2014.
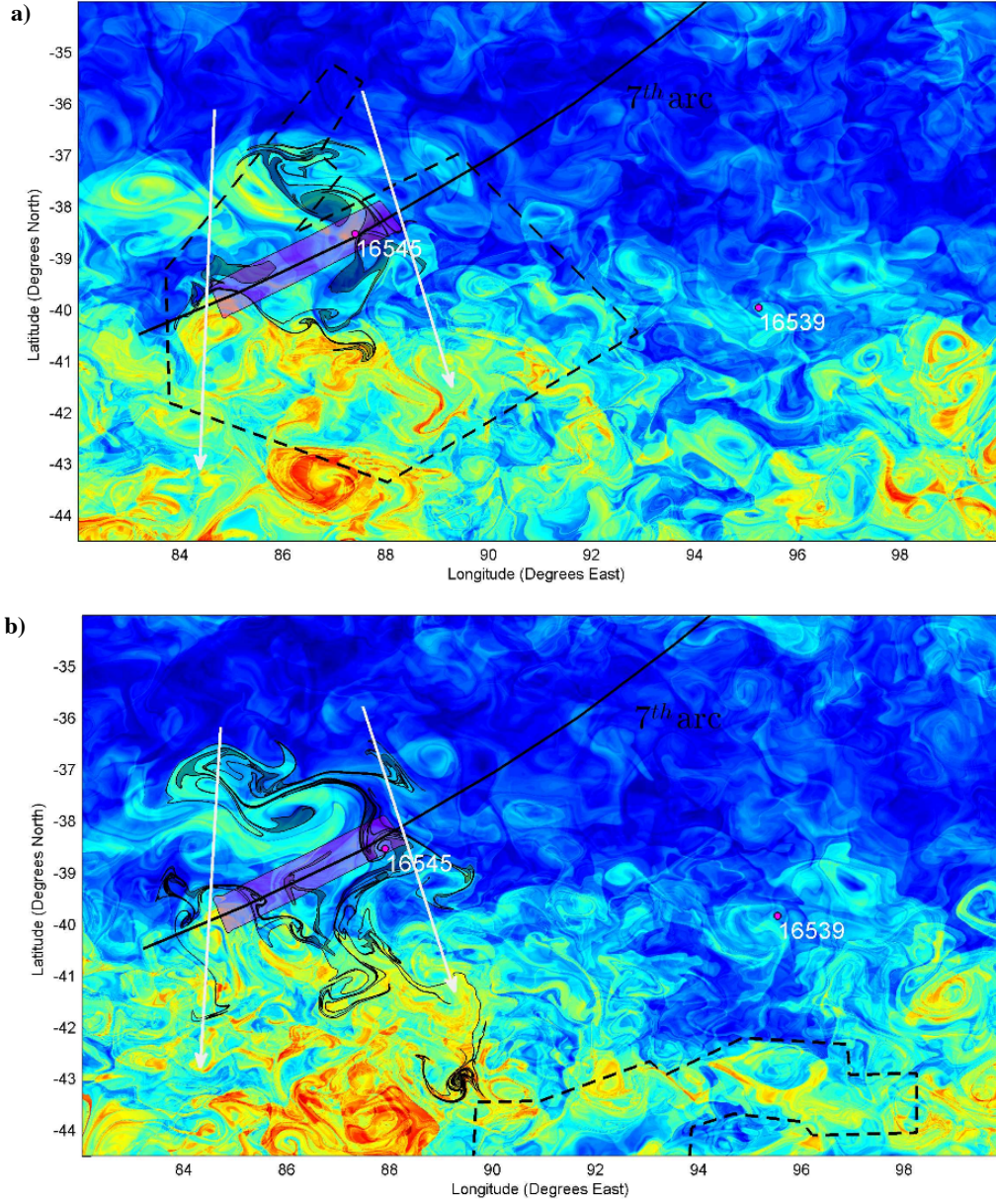
Fig. 3. A summary of the debris search for the Malaysian MH370 plane in the southern Indian Ocean. In the background the M function, evaluated on HYCOM data for $\tau = 15$ days at 50m depth, highlights mesoscale structures and invariant manifolds. Overlapped are the drifters in the area (magenta dots), the expected flight paths (white arrows), the likely impact area (pink) and its contour evolution (gray). Dashed lines outline the search areas for the respective dates (a) 19th of March 2014; (b) 27th of March 2014.

This article is focused on discussing the search strategy, from the dynamical systems point of view, of floating debris that does not surpass the waterline and is not subjected to wind sailing effects. This debris would have been mainly driven by ocean currents, similarly to GDP drifters, i. e. we will assume a similarity between this debris and drifter motion. In our approach we disregard the direct action of the wind. However, HYCOM data incorporates this effect on the ocean surface, and thus our study does not neglect this effect completely.

It is clear that wind action is not negligible when considering the leeway of different kinds of objects. Works devoted to exploring this contribution are for instance Breivik and Allen (2008); Breivik *et al.* (2011). As remarked there, wind action is strongly dependent on the shape and size of the object and on how it surpasses the waterline. Thus, an accurate study requires previous knowledge of the objects themselves, which is not known in this case (except for the flaperon). In this respect, our study addresses the scattering of flat and thin objects below the waterline which could have only been driven by ocean currents.

A perspective similar to the one in this article has been taken by Kuznetsov *et al.* (2002) who have examined the role played by Lagrangian structures obtained in the Gulf of Mexico. In particular, they have analyzed data from the Colorado University Princeton Ocean Model and have compared the geometry of the dynamics with simultaneous trajectories of drifters measured in an independent way. Indirectly, the agreement between the drifter evolution and the Lagrangian patterns of purely advected particles has served as a confirmation of the model quality. Also, Beron-Vera *et al.* (2010) compares the quality of two different altimetry AVISO products based on the agreement between a drifter trajectory and the Lagrangian skeleton supplied by the FTLE.

Recent studies (Tallapragada and Ross, 2008; Beron-Vera *et al.*, 2015) have considered deviations in the evolution of drifters from that of purely advected particles by taking into account inertial effects produced by the buoyancy of the object and their finite size. Their approach considers the Maxey-Riley equation (Maxey and Riley, 1983) which holds for small rigid spheres. Similarly to wind effects, inertial effects depend on the shape of the debris objects, which we do not know in this case, except for the flaperon piece. Although beyond the scope of this work, a thorough study of inertial effects for the flaperon would be of much interest, as it would help to track back, with a larger degree of accuracy, a possible impact point. The lack of knowledge on the distribution of shapes, densities and sizes of the floating debris, requires too many assumptions which would prevent a reliable conclusion on the inertial effects. We thus simplify our approach to that of purely advected particles. In the end, the agreement found between the GDP drifters tracks and the mesoscale features that our tools highlight supports this decision. In this way we consider the motion of the airplane debris as that of purely advected particles. Such particles

follow trajectories $\boldsymbol{x}(t)$ in the ocean that evolve according to the dynamical system:

$$\frac{d\boldsymbol{x}}{dt} = \boldsymbol{v}(\boldsymbol{x}(t),t) \tag{1}$$

where $\boldsymbol{v}(\boldsymbol{x}(t),t)$ is the velocity field of the ocean region of interest. In our analysis, as previously explained, we will assume that the motion of particles is mainly horizontal. The equations of motion that describe the horizontal evolution of particle trajectories on a sphere of radius R are:

$$\frac{d\lambda}{dt} = \frac{u(\lambda, \phi, t)}{R \cos \phi}, \tag{2}$$

$$\frac{d\phi}{dt} = \frac{v(\lambda, \phi, t)}{R}. \tag{3}$$

Here the variables (λ, ϕ) are longitude and latitude, u and v respectively represent the eastward and northward components of the velocity field provided by the dataset.

For our Lagrangian analysis, which is based on Lagrangian Descriptors (function M) and also on contour evolution, it is necessary to integrate Eqs. (2)-(3) in order to compute particle trajectories. As the velocity field for the system (2)-(3) is provided solely on a discrete space-time grid, the first issue to deal with is that of interpolation. We have used bicubic interpolation in space and third order Lagrange polynomials in time according to the details given in Mancho *et al.* (2006a); Mendoza *et al.* (2014). This assumes smoothness of the velocity field below the resolution which, on the other hand, is rather low.

An open question here is how robust are Lagrangian techniques when dealing with ocean motions that do not vary smoothly at small scales, as those having an inherent turbulent nature. Recent work by Hernández-Carrasco *et al.* (2011) analyze this question by looking at the impact on FTLE of the two major effects when dealing with real data, namely, noise and dynamics of unresolved scales. Their work concludes that, although some features are lost, this tool still gives an accurate picture of the oceanic transport properties. We take these conclusions as supportive of our assumptions in the interpolation scheme that we use. On the other hand, effects of high frequency variations on the velocity field are also included in the HYCOM data. In the last section we will highlight common features between this and the more smooth AVISO data, which will support also the conclusions in Hernández-Carrasco *et al.* (2011).

4   Results and discussion

4.1   The Lagrangian Skeleton

The global nature of particle trajectories generated by Eq. (1) can be understood through the spatio-temporal template formed by geometrical structures of the flow that organize trajectories into distinct ocean regions, corresponding to

qualitatively different types of trajectories. The boundaries or barriers between these regions are time dependent material surfaces (which, mathematically, are invariant manifolds). Such a spatio-temporal template can be constructed with the technique that is referred to as Lagrangian Descriptors (LDs), based on a function, function M (see Madrid and Mancho (2009); Mendoza and Mancho (2010); Mancho *et al.* (2013)), defined as follows:

$$ M(\boldsymbol{x}_0, t_0, \tau) = \int_{t_0-\tau}^{t_0+\tau} ||\boldsymbol{v}(\boldsymbol{x}(t; \boldsymbol{x}_0), t)|| \, dt \qquad (4) $$

here $|| \, ||$ stands for the modulus of the velocity vector. At a given time t_0, function $M(\boldsymbol{x}_0, t_0)$ measures the arclength traced by the trajetory starting at $\boldsymbol{x}_0 = \boldsymbol{x}(t_0)$ as it evolves forwards and backwards in time for a time period τ. The structure of the function M shows, at low τ values, a smooth pattern such as that visible in Fig. 1a). There, M has been evaluated for AVISO data, on the date of the plane crash and near one of the search areas, using an integration period of $\tau = 5$ days. On the other hand, Fig. 1b) (computed for $\tau = 20$ days) illustrates how the structure of M evolves for large τ towards less regular structures. By this we mean that sharp changes of M values occur in narrow gaps, forming filaments that highlight stable and unstable manifolds. A thorough explanation of this effect is discussed in (Mendoza and Mancho, 2010, 2012; Mancho *et al.*, 2013; Lopesino *et al.*, 2015). Figure 1c) shows a different projection for the latter case, which highlights the singular features of M aligned with stable and unstable invariant manifolds, and their crossing in a hyperbolic point. We remark that the information contained in these figures is obtained by means of integration of particle trajectories. In fact some of the figures reported in this article use tens of thousands of them. The difference in this analysis with respect to that performed by the drifter tracking approach taken by ATSB (2014b), or other tools such as GNOME or SCUD, is the way in which this information is displayed. The latter tend to represent this output as spaghetti diagrams, while our Lagrangian perspective finds geometrical structures on the ocean surface, that are used to distinguish regions corresponding to qualitatively different types of trajectories.

Large M values, represented in reddish colors, are related to regions of high speed fluid (such as jets), while bluish colors denote calm regions. Figure 1d) schematically shows the manifold skeleton and how particles, such as drifters or plane debris would evolve in the neighbourhood of this structure. Invariant manifolds are dynamic barriers that cannot be crossed by purely advected particles and control transport in the region. The cross point of the stable and unstable manifolds, the hyperbolic point, drastically bends the trajectories. Tracer blobs evolve constrained by the manifold structure. Figure 1e) illustrates this point by showing elongation of blob contours along the unstable manifold of a hyperbolic trajectory and stretching along its stable manifold. It is im-

portant to remark here that, from the dynamical system perspective, the main distortion agents for the contours are those causing their filamentous shape and, as explained here, these agents are the hyperbolic trajectories and their stable and unstable manifolds. Additionally, in the flow there exists regions dominated by trajectories with elliptic type stability, in which, contrary to what happens near hyperbolic trajectories, blobs remain coherent instead of forming filaments. This is illustrated in Figure 1f). Oceanic eddies are an example of regions displaying such a behaviour (see, e.g., Chelton *et al.* (2011)) and this is also the case for oceanic jets, in which blobs are transported at a high speed but not distorted into filaments (see e.g., Wiggins and Mancho (2014)). Therefore, the interplay between stretching and confinement is an essential ingredient of fluid transport processes.

In this work, the importance of how water masses evolve is clear because of the uncertainty in the plane's impact point, and thus, in order to reach conclusions on the fate of the plane debris, it is important to track the time evolution of areas in which the plane potentially could have crashed, and recognize the constraints on these regions found in the ocean during the period after the accident. The evolution of these areas is tracked with the contour advection algorithm developed by Dritschel (1989), but including some modifications explained in (Mancho *et al.*, 2003, 2004, 2006c)

4.2 Analysis of the MH370 plane debris dispersion

The goal of this section is to analyze the search strategy followed by the Australian Maritime Safety Authority (AMSA) in the months just after the crash, in order to see if, in the light of the tools and data described in the previous sections, alternative search strategies could have been suggested.

One of the major challenges in the first stages of the search was to know how debris had scattered in an always moving ocean. On Tuesday 18th of March and on Wednesday 19th of March search areas were defined by AMSA according to possible flight paths deduced from satellite and aircraft performance data which assumed impact points along the 7th arc. The charts released by AMSA for the different surface search areas are available at http://www.amsa.gov.au/media/incidents/mh370-search.asp. Figure 2a) shows the potential flight paths in white, and the 7th arc in black. The presumable impact area along the 7th arc is depicted in pink. Its width, which is at around 93 km, expresses uncertainties in the impact point. Our discussion is based on this uncertainty band, which was considered as the maximum priority in the reports by ATSB (2014a,b). However, we note that the satellite analysis also has highlighted a wider search band around this narrower strip.

The search area released by AMSA during these days appears in the figure surrounded by a dashed line. Moreover, the gray shaded contour shown in this figure represents the advection of the presumed initial impact area until the 19th
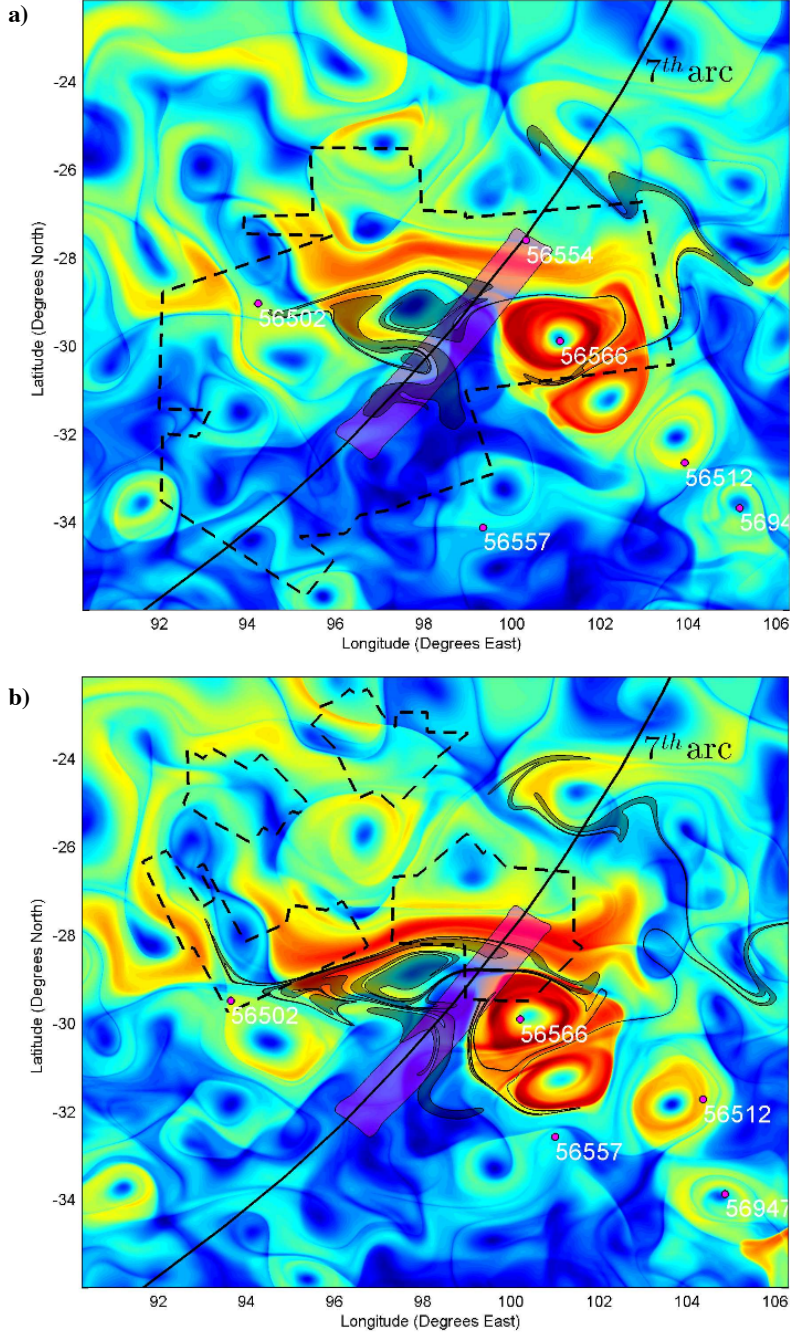
Fig. 4. A summary of the debris search for the Malaysian MH370 plane at the north of the Broken Ridge in the Indian Ocean. In the background the M function, evaluated on AVISO data for $\tau = 20$ days, highlights mesoscale structures and invariant manifolds. Overlapped are the drifters in the area (magenta dots), the likely impact area (pink) and its contour evolution (gray). Dashed lines surround the search areas for the respective dates (a) 3rd of April 2014; (b) 15th of April 2014.
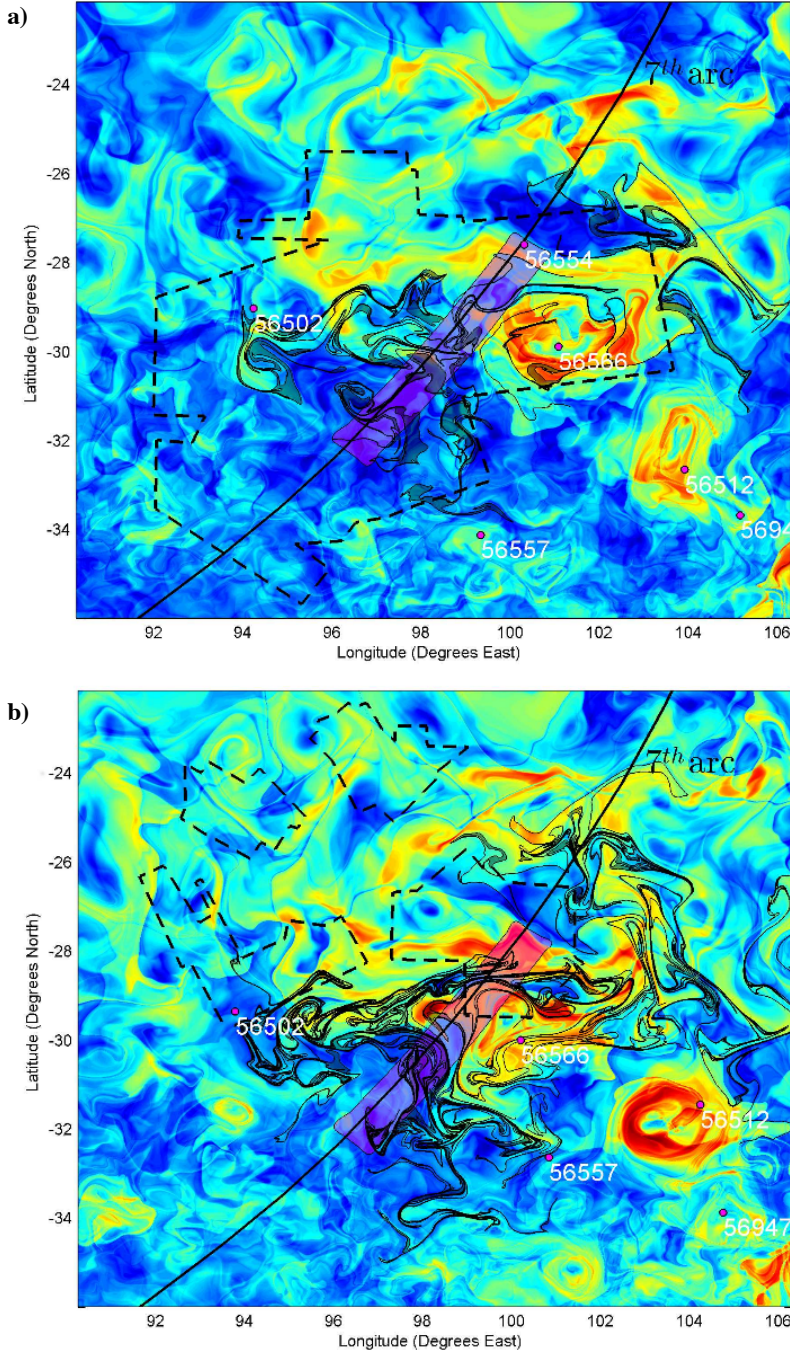
Fig. 5. A summary of the debris search for the Malaysian MH370 plane at the north of the Broken Ridge in the Indian Ocean. In the background the M function, evaluated on HYCOM data for $\tau = 15$ days at 50m depth, highlights mesoscale structures and invariant manifolds. Overlapped are the drifters in the area (magenta dots), the likely impact area (pink) and its contour evolution (gray). Dashed lines surround the search areas for the respective dates (a) 3rd of April 2014; (b) 15th of April 2014.

of March, according to ocean velocity data distributed by AVISO. This analysis thus suggests a smaller search area than the one determined by AMSA for the search operations that took place during the 18th and 19th of March. However, one remaining question that needs to be addressed in order to support this conclusion is, how accurate are AVISO data when representing the true ocean state? We provide some discussion of this point in terms of the tools described in the previous subsection. We observe that the advected contour stretches along unstable manifolds, which act as the main deforming agents for this blob. Stable and unstable manifolds and eddies are recognized in the background of Fig. 2a) by means of the function M. The dark blue regions represent calm ocean regions and their presence is consistent with drifters motions. For instance, drifter 16545, represented by a magenta dot on the 19th of March, appears to be in one of these calm regions, and consistently it barely moves. Video S1 confirms that this is the case from the 8th to the 20th of March. Similarly, the movie confirms that the drifter 16539 placed in a zone further east, during the period running from the 20th of March to the 27th of March remains in a blue calm region, scarcely moving, consistent with AVISO data. The agreement between AVISO data and drifter motions supports the adequacy of AVISO to accurately describe the ocean motion.

Satellite imagery provided to AMSA on the 20th of March revealed objects that could have been possible debris of the missing Malaysia Airlines flight MH370. Subsequently, the search area was shifted 185 km to the south east of the original search area and the search efforts were focussed in this area from the 20th to the 27th of March. This new search area is shown in Fig. 2b) limited by a dashed line. The drifter 16539 is now the closest to the new search area. The gray shaded contour represents the advection of the presumed initial impact area along the 7th arc until the 27th of March 2014, and the coloring at the background highlights for this day, by means of the M function, the Lagrangian skeleton. The figure suggests that according to AVISO the debris of a plane that crashed along the 7th arc could not have flowed to this region in this period of time, and thus the objects detected in this area should have had a different origin.

Figures 3a) and b) proceed with a similar analysis to that of Figs. 2a) and b), but using HYCOM data instead. In the HYCOM simulations, layers near the surface are strongly dominated by wind forcing and, as a result, the velocity fields are subjected to high frequency variations. As explained in Sections 1 and 2, our study assumes a similarity between debris motion and that of drifters. Mancho *et al.* (2006b); Branicki and Kirwan Jr. (2010); Sulman *et al.* (2013) justify the study of Lagrangian structures from velocity fields produced by models by considering layers just below the very upper layers which are slightly wind filtered. In Figs. 3a) and b) the background coloring shows 2D Lagrangian structures obtained at 50 meters depth. The Lagrangian structures now are much more blurred than those obtained from AVISO,

but still a comparison is feasible in terms of the mesoscale structures highlighted by the M function. HYCOM shows mesoscale features linked to the circumpolar current further spread into the north, and the calm region close to drifter 16545 still seems to be present, but rather diffuse and displaced south of the drifter. Figure 3 a) illustrates that the spreading of the presumed impact area is broader than that computed from AVISO data, but still smaller than the AMSA search area. Further details are found in movie S2. The calm area in which drifter 16539 seemed to be anchored, according to Fig. 3 b), now appears as a more active region with diffuse structures. However the HYCOM analysis likewise confirms that the debris of a plane crashing along the 7th arc could have barely reached this region in this period of time.

On the 28th of March further refinements of the flight path shifted the search area up to the north, and the newly determined most likely impact area was then the one depicted in Fig. 4a) ATSB (2014a) in the northeast direction above the Broken Ridge along the 7th arc. From the 28th of March until the 3rd of April the search services were focused on the area surrounded by the dashed line in Fig. 4a). The background coloring of this figure shows the Lagrangian structures obtained from the M function evaluated from AVISO data on the 3rd of April 2014. The presumed initial impact area is advected until this day and represented in the gray shaded region. Its filamented structures clearly tend to be aligned along the unstable manifolds visible in the singular features of M. Numerous drifters are represented with magenta dots and they move consistently with the highlighted Lagrangian skeleton. This is further confirmed in the video S3. For instance drifter 56566, which, on the day of the accident, is within a strong mesoscale structure, an oceanic eddy placed at the east of the presumed impact area, remains within the eddy during several months, being transported with it towards the west. Similarly, drifters 56947 and 56512 are trapped at some point in weaker eddies. Drifters 56557 and 56502, navigate along stable or unstable manifolds during noticeable periods. The latter drifter, which was placed very close to the presumed search area on the impact day, remains close to the contour after this time interval.

The strong eddy containing the drifter 56566, behaves like a capsule where surrounding waters cannot penetrate. The advected gray shaded region deforms around it, showing it is a forbidden region for the debris. On the 3rd of April, this large vortex invaded the search area, and thus our analysis suggests that the region occupied by this moving coherent structure could have been removed from the region where the search efforts were focused.

Another interesting mesoscale element in this area is the strong jet which crosses the presumed impact area at the north end. The feature is visible in orange-reddish colors and its presence is confirmed by the motion of drifter 56554 which navigates towards the east between the 27th of March until the 11th of April. The jet persists since the impact day (the 8th of March) until at least the end of May and as we

will discuss below is a dynamic barrier. It separates the blob located in the impact area into two pieces which remain unmixed for the whole period of study, a small one at its north side and the larger one at south side.

Between the 3rd and the 11th of April the search area was moved up to the north, to regions rather diverted from the probable impact area displayed in Fig. 4a). We ignore this part and we pursue our discussion with the search targets held from the 12th to the 28th of April, which are consistent with the impact area under consideration. The search areas after the 12th of April are reported by the Australian Government (see at http://www.jacc.gov.au/media/releases/2014/april/index.aspx), and correspond to the regions surrounded by dashed lines in Fig. 4b). There, it is shown again the presumed impact area along the 7th arc, and the advection of this contour by the 15th of April. From the background coloring of the M function, we conclude that as time evolves the contour tends to form filaments aligned with the unstable manifolds and accumulates into calm regions which gather most of the material (see also the video S3). From the figure it is clear that most of the impact area has scattered into the calm region below the strong jet described in the previous paragraph. Interestingly, this region was left out of the search area for this period, and reversely the search area barely contains material coming from the impact area. As time evolves the gray shaded contour evolves and penetrates more and more into the search panel at the right, but just at the south of the strong jet. We see that the jet acts as a barrier which prevents most of the material of the likely impact area from being transported towards the north, this had the effect of paradoxically concentrating the main search in an area where, according to our analysis, there was likely no debris.

Figures 5a) and b) show a similar analysis to that of Figs. 4a) and b) using HYCOM data at 50m depth. Mesoscale structures in this data are consistent with those of AVISO. For instance, the large eddy which isolates drifter 56566 is present in a similar position, invading the search area from the 28th of March to the 3rd of April, confirming again that this part could have been excluded from the search. The jet structure splitting the impact region in two is also present at the same position, although somewhat perturbed by wind effects. Similarly to AVISO, much of the material contained in the impact area would evolve filling calm regions which, roughly speaking, are positioned the same. The analysis of Fig. 5 b) is similar to that of 4b), and it says that, according to our diagnosis, on the 15th of April most of the material in the impact area is outside the search area. Video S4 completes these conclusions.

5　Conclusions

This work addresses, from the dynamical systems perspective, the fate of the MH370 plane debris after its presumed crash on the morning of the 8th of March 2014. This point of view provides a powerful tool for dealing with the difficulty arising from the uncertainty of predictions, which comes from the fact that there are several datasets that define multiple ocean states. Additional uncertainties coming from wind and inertial effects have not been taken into account, as too many assumptions on the shape, size and densities of the debris objects would have been required, preventing a reliable conclusion in this regard. Drifters are the only floating objects at the time of the impact for which we have full knowledge of their position and progress, and they evolve mainly transported by the ocean currents. Our conclusions are backed by comparisons with their evolution.

The findings described in this paper highlight several facts that could have been relevant to the search for debris associated with MH370, subject to the restrictions just mentioned. First, we have shown that, according to several available data sources, impact debris from the MH370 plane would have been mainly scattered into calm ocean regions since the material from the likely impact areas tends to fill these areas. Second, mesoscale structures such as ocean eddies and jets may have played a key role in determining forbidden regions and barriers for debris. The consistency found between data obtained from different and independent sources (AVISO, HYCOM, drifters) back the evidence that the mesoscale structures we have described were present in the Indian Ocean during the accident time frame, and that considering these structures could have guided an efficient search procedure. These facts also back the reliability of our dispersion analysis, which would have suggested channeling efforts to regions disregarded from scheduled search areas and bypassing certain regions that were subjected to intense search.

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