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## Evaluating where and why drifters die

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#### ABSTRACT

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NOAA's Global Drifter Program (GDP) manages a global array of ~1250 active satellite-6 tracked surface drifting buoys ("drifters") in collaboration with numerous national and in-7 ternational partners. In order to better manage the drifter array and to assess the perfor-8 mance of various drifter manufacturers, it is important to discriminate between drifters that 9 cease transmitting due to internal failure and those that cease due to external factors such as 10 running aground or being picked up. An accurate assessment of where drifters run aground 11 would also allow the observations to be used to more accurately simulate the evolution of 12 floating marine debris, and quantify globally which shores are most prone to the deposit 13 of marine debris. While the drifter Data Assembly Center of the GDP provides a meta-14 data file which includes cause of death, the cause for most drifters is "quit transmitting." 15 In this study it is shown that a significant fraction of these drifters likely ran aground or 16 were picked up, and a statistical estimate that each drifter ran aground or was picked up is 17 derived. 18

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## **19 1.** Introduction

NOAA's Global Drifter Program (GDP)<sup>1</sup> manages a global array of  $\sim 1250$  active satellite-20 tracked surface drifting buoys (hereafter "drifters") in collaboration with numerous national 21 and international partners. The drifters have a mean lifetime of  $\sim 450$  days, requiring the 22 acquisition and deployment of  $\sim 1000$  drifters per year to maintain the active array. Drifters 23 die (i.e., cease providing oceanic data) for reasons which can be broadly categorized as 24 internal – for example the drifter quits transmitting due to hull leakage or drained batteries 25 - or external reasons such as running aground or being picked up by a boater. As the 26 GDP and its partners plan deployments, it is important to consider as accurately as possible 27 where these external causes of death are likely to occur. It is also important to consider the 28 causes of death when assessing the performance of drifters from various manufacturers. 29 For example, the GDP calculates the median lifetime of all drifters for each manufacturer 30 deployed in a given year. In principle this should be done only for drifters which died 31 from internal reasons, as drifters which happened to run aground or be picked up soon after 32 deployment should not negatively impact the assessment of the associated manufacturer's 33 drifters. These logistical factors dictate that a careful assessment be made of why and where 34 drifters die. 35

<sup>36</sup> An accurate assessment of where and why drifters die can also improve scientific appli-<sup>1</sup>http://www.aoml.noaa.gov/phod/dac

cations of the data. Because the drifters are pseudo-Lagrangian tracers of the ocean surface, 37 their trajectories can be used to estimate the advection and dispersion of oil, plankton and 38 other passive particles. In the simplest such use of these data, all trajectories leaving from 39 an area can be plotted to visualize the downstream fate of particles released in an area. 40 Alternatively, source regions can be visualized by plotting the prior trajectories of drifters 41 that enter a particular area. Such approaches are typically very limited; for example, few 42 drifters may have entered a small region, thus limiting the statistical robustness that can 43 be inferred from their downstream fate. However, if those few trajectories subsequently 44 crossed other trajectories, the number of representative trajectories can be increased by 45 including those trajectories. Because each of those will in turn intersect many more trajec-46 tories, an extremely large number of possible trajectories can be derived. Such an approach 47 has been exploited by Brambilla and Talley (2006) and van Sebille et al. (2011), who con-48 structed "composite trajectories" using crossing points and additional criteria intended to 49 follow a particular water mass. Given a model for source regions of marine debris, this type 50 of analysis could be extended to simulate floating plastic, which accumulates in the centers 51 of the major ocean gyres (IPRC, 2008; Law et al., 2010; Maximenko et al., 2011). One 52 of the ways debris is removed from the ocean is by washing ashore, and in principle the 53 model could include this by noting which drifter trajectories ran aground. When a compos-54 ite trajectory includes one of these "ran aground" trajectories, the simulated debris would 55

<sup>56</sup> be removed from the system. In addition, the location where drifters routinely run aground
 <sup>57</sup> could be used to identify shores which are particularly exposed to marine debris.

The goal of this paper is to examine where surface drifters run aground, and more gener-58 ally evaluating why drifters die. We limit our study to the Surface Velocity Program (SVP) 59 type drifter of the GDP (Niiler, 2001; Lumpkin and Pazos, 2007). The drifter Data Assem-60 bly Center (DAC) of the GDP records the cause of drifter death in a "directory file" offered 61 at http://www.aoml.noaa.gov/phod/dac/dirall.html. This file is updated approximately ev-62 ery three months. As of June 30, 2010, this file covered 14,554 unique drifters including 63 1427 that were still alive as of that date. For the remaining 13,127 drifters that had died, 64 the causes of death were: 65

Ran aground:	3049 (23.2%)
Picked up:	888 (6.8%)
Quit transmitting:	8972 (68.3%)
Unreliable transmissions at end of trajectory:	86 (0.7%)
Bad battery voltage:	37 (0.3%)
Placed in inactive status while still transmitting:	95 (0.7%)

66

The DAC determines that a drifter is dead after no transmissions have been received for 30 days, after the drifter stops moving, or after its behavior indicates it has been picked up. Every Monday, the DAC updates the status of the drifter array; the software used for this

also automatically flags drifters which have moved less than 1 km over the previous seven 70 days or moved at a sustained speed greater than 2 m/s. All drifters which have died in the 71 preceding week are then manually examined for the cause of death. The DAC declares that 72 a drifter has "run aground" when its position data indicates that it has stopped moving, apart 73 from the random jitter introduced by position fix errors (Fig.1c,d), without any evidence 74 that it was picked up first. The DAC determines that a drifter was "picked up" when its 75 trajectory abruptly moves in an artificial manner (such as in straight legs from one point to 76 another), usually accompanied by a large increase in diurnal temperature variations and an 77 abrupt drop in the submergence or tether strain sensors used for drogue detection. A drifter 78 is also declared to have been picked up when its position rapidly moves onto land without 79 intervening location fixes (Fig.1a,b). In many cases, "picked up" drifters are first identified 80 by their non-moving transmissions from their final resting place in a marina or boater's 81 yard, and the previous behavior is used to manually assess when and where the drifter was 82 picked up. "Unreliable transmissions" may be associated with antennae failures, and are 83 often preceded by poor quality and sporadic location fixes. "Bad battery voltage" was a 84 designation used briefly by the DAC to flag drifters which quit with voltage less than 9V, 85 but is no longer implemented when assessing drifter death. "Placed in inactive status while 86 still transmitting" is done at the request of a few principal investigators to save transmission 87 fees after drifters leave an area of interest or when the drifter is no longer transmitting good 88

sensor data and/or has lost its drogue. Most drifters die due to "quit transmitting", i.e., the
transmissions simply terminate without any change in location indicating why.

91

#### [Figure 1 about here.]

The DAC determines when a drogue is lost using submergence or tether strain time se-92 ries (Lumpkin and Pazos, 2007). Of the 13,127 drifters considered here, 5354 died with the 93 drogue still attached and 7773 died after losing their drogue. The locations of drogue loss 94 (Fig. 2a) include many clustered against windward coastlines such as Brazil and the eastern 95 African coast, suggesting damage during or shortly before running aground. It is plausible 96 that drogue presence could have affected the distribution of deaths by running aground, 97 and merits consideration before collectively treating drogued and undrogued drifter deaths. 98 Fig. 2b,c shows the location of the 1672 drifters that ran aground with drogue attached 99 and of the 1376 drifters that ran aground after losing their drogues. These distributions are 100 not significantly different. Note that this does *not* suggest that an individual drifter with a 101 drogue attached is as likely to run aground as a drifter without one, but only that the dis-102 tribution of where drifters run aground does not depend significantly upon whether those 103 drifters had drogues attached at the time. 104

105

[Figure 2 about here.]

## **2.** Reevaluating the "ran aground" drifters

Fig. 3 shows the locations of all (drogued and undrogued) deaths due to "ran aground". Most of these deaths are located on or near coastlines. However, there are a few locations visible in Fig. 3 that are not near any land.

110

#### [Figure 3 about here.]

Fig. 4a,b shows the histogram of the "ran aground" locations as a function of distance 111 from the nearest coastline, determined from the NOAA Global Self-consistent, Hierar-112 chical, High-resolution Shoreline Database (GSHHS version 2.1), and as a function of 113 depth from the ETOPO1 Global Relief Model. While it is plausible that drifters can "run 114 aground" far from shore if the water is shallower than the bottom of the drogue depth 115  $(\sim 20 \text{m})$ , it is unlikely that drifters in an ETOPO1 grid averaging > 100m depth and more 116 than 100km from any shoreline actually ran aground. A total of 222 "ran aground" drifters 117 meet both these criteria (circles in Fig. 3). 118

119

#### [Figure 4 about here.]

These 222 "ran aground" drifters were treated as "quit transmitting" for the remainder of this study, and individually reevaluated for an update of the directory file. In a few cases, the drifters appeared to cease moving due to entering an extremely quiescent location in the

ocean, or due to being trapped in a small, non-propagating vortex. These drifters continued 123 motion after having been declared "ran aground". The subsequent trajectories have now 124 been included in the GDP data base and the cause of death reevaluated. In some high-125 latitude cases, the drifter may have become frozen in ice. Finally, in a number of cases, the 126 "ran aground" declaration appears to be human error as the trajectory simply terminated 127 without evidence of running aground (i.e., the drifter died by "quit transmitting"). These 128 deaths have been changed to "quit transmitting" in the updated version of the directory file 129 now available on the GDP web page. In this update, 160 (72%) of the 222 were changed to 130 "quit transmitting," 57 (26%) were changed to "picked up," often with additional data after 131 the original "quit" location, and two were deemed to have "ran aground" at some point 132 after the original "ran aground" death date. 133

### **3.** Examining why drifters quit

Fig. 5 shows the spatial distribution of the various death types in deaths per square degree, counted in  $2^{\circ} \times 2^{\circ}$  bins. While the revised "ran aground" are concentrated along the coastlines, the distribution of "picked up" also reflects near-shore fishing activities, particularly concentrated off the coast of Brazil, in the northern Gulf of Guinea, and in the northeastern Indian and western and eastern tropical Pacific basins. [Figure 5 about here.]

The distribution of "quit transmitting" death locations (Fig. 5) includes a large number 141 concentrated along coastlines (also see Fig. 4c,d). On close inspection, it is clear that a 142 number of these deaths are due to the drifter running aground and immediately ceasing 143 transmission. Because the drifters do not subsequently transmit from a fixed location, they 144 are not flagged as "ran aground" by the DAC; instead, because transmissions cease to be 145 received, they are flagged as "quit transmitting." For example, many trajectories terminate 146 at the southwestern tip of South America (Fig. 6) where the drifters are presumably running 147 aground (few drifters are picked up in this region). 148

#### [Figure 6 about here.]

Because most of the drifter deaths in the directory file are attributed to "quit transmitting," and some fraction of these represent drifters that actually ran aground and immediately stopped transmitting, it is important to reassess the "quits" to determine which of these actually ran aground or were picked up.

If the death types provided by the DAC are counted in  $2^{\circ} \times 2^{\circ}$  bins (as shown in Fig. 5), then the total number of deaths per square degree D in any given bin can be written as

$$D = D_g + D_{pu} + D_q,\tag{1}$$

140

149

where  $D_g$  are deaths attributed to "ran aground",  $D_{pu}$  are deaths attributed to "picked up",  $D_q$  are deaths attributed to "quit transmitting," and we shall ignore the negligible number of deaths due to causes besides these three categories.

Fig. 7 compares the distribution of  $D_q$  to the background density of drifter observations 157 N and the mean age of drifters at death. N was calculated by counting in each bin the num-158 ber of six-hourly drifter observations in the kriged, quality-controlled data set offered by 159 the DAC. The distribution of mean age highlights convergent regions where older drifters 160 tend to accumulate. It is correlated with N because of the increased number of observa-161 tions collected by these drifters, but the two distributions differ because of the effect of 162 spatially inhomogeneous deployments on N. Away from coastlines, the distribution of  $D_q$ 163 resembles that of N more so than mean age at death, suggesting that a large fraction of 164  $D_q$  is caused by internal failures such as hull leakage, battery failure, etc. which are not 165 location-dependent or age-dependent to lowest order. 166

Anomalously high values of  $D_q$  near coastlines are due to drifters that have run aground or were picked up, but have been flagged as "quit transmitting" by the DAC. If  $D_q^*$  is the background rate of quit drifters in the absence of any drifters running aground or being picked up, we can write this as  $D_q^* = N/r$ . The constant r can be estimated by averaging  $N/D_q$  in bins with zero grounded or picked up drifters. If the ratio r is plotted as a function of distance from coast for all bins that also satisfy  $D_g = D_{pu} = 0$  and N > 100 drifter days

per square degree (not shown), it is basically constant, with a mean value of  $650\pm7$  days 173 (standard error from the standard deviation and number of bins, each assumed to provide an 174 independent estimate). For the subset of these bins that are  $\geq 100$  km from the nearest coast, 175 the mean value is not significantly different (654 $\pm$ 7 days). Because N has units of drifter 176 days per square degree and  $D_q^*$  is the background number of deaths from quitting per 177 square degree, r is a measure of drifter lifetime in the absence of external causes of death. 178 For comparison, the mean lifetime of all drifters is 384 days, the mean lifetime of drifters 179 identified as "quit transmitting" is 417 days, and the design half-life of a drifter is 450 days. 180 Fig. 7d shows the difference  $D_q - N/r$ , indicating the deviation "quit transmitting" deaths 181  $D_q$  from the background rate  $D_q^*$ . 182

183

[Figure 7 about here.]

## <sup>184</sup> 4. A statistical model for the "quit transmitting" drifters

In the absence of (unavailable) further data on the hundreds of "quit transmitting" drifters creating enhanced values of  $D_q - N/r$  (Fig. 7d), we can only make statistical statements about the likelihood that a particular drifter quit due to the background rate or because it actually ran aground or was picked up.

Because we assume that some fraction of the "quit transmitting" drifters actually ran

aground or were picked up, an improved estimate of the number of drifters which ran aground,  $D_g^*$ , will be greater than or equal to the number  $D_g$  identified by the DAC. Similarly,  $D_{pu}^* \ge D_{pu}$ . This can be expressed as

$$D_g^* = (1+x_1) D_g, \quad D_{pu}^* = (1+x_2) D_{pu},$$
 (2)

where constants  $x_1$  and  $x_2$  are both  $\ge 0$  and superscript \* indicates improved estimates of these terms. The background rate of "quit transmitting" drifters, as defined in the previous section, can then be estimated as

$$D_{q}^{*} = N/r \sim D_{q} - x_{1}D_{g} - x_{2}D_{pu}, \qquad (3)$$

where r=(650±7) days. We solve for the value of the unknown coefficients  $x_1$ ,  $x_2$  to minimize  $(D_q - x_1D_g - x_2D_{pu} - N/r)^2$  in all 5109 bins with N > 100 observations per square degree. The resulting least squares best fit values are

$$x_1 = 0.240 \pm 0.001, \quad x_2 = 0.430 \pm 0.005.$$
 (4)

If the background lifetime r is treated as an unknown and determined simultaneously with  $x_1$  and  $x_2$ , the results are

$$r = 699 \pm 58 \text{ days}, \quad x_1 = 0.251 \pm 0.042, \quad x_2 = 0.48 \pm 0.13,$$
 (5)

i.e., not significantly different from the values obtained by first separately solving for r. Our results are not very sensitive to the drogue status of the drifters; if the calculation is repeated for the subset of drifters that were drogued upon dying, the results are:

$$r = 738 \pm 132 \text{ days}, \quad x_1 = 0.237 \pm 0.082, \quad x_2 = 0.31 \pm 0.29,$$
 (6)

<sup>204</sup> and if calculated only for drifters that were undrogued,

$$r = 733 \pm 100 \text{ days}, \quad x_1 = 0.255 \pm 0.068, \quad x_2 = 0.45 \pm 0.16, \quad (7)$$

not significantly different from the overall results but with larger error bars due to the
 smaller sample sizes.

Fig. 8 shows  $D_q$  for drogued+undrogued drifters (repeated from Fig. 5c), the distribution described by the best-fit model  $D_q^*$ , the difference between these two, and the deaths in  $D_q^*$  which are attributed to running aground or being picked up. The residual  $D_q - D_q^*$ is an unstructured field of noise except for excessively large values against the Antarctic Peninsula and in the East China Sea. Excessive "quit transmitting" against the Antarctic Peninsula is likely due to interaction with ice away from the coastlines (not captured by the term  $x_1D_g$ ) destroying the drifters, while the elevated number of "quits" in the East China Sea (elevated above the level expected from those seen as "picked up") may be caused by an elevated number of vessels accidentally striking the drifters, or by boaters more likely there than elsewhere to destroy a drifter rather than recover it (thus violating the assumption of a global constant value for  $x_2$ ).

#### [Figure 8 about here.]

With these results, we may reassess how many drifters ran aground, how many were picked up, and how many quit transmitting due to internal reasons. Compared to the original numbers given earlier in this paper (original values in parentheses), the reassessed numbers are:

	Ran aground:	3520 (3049)
223	Picked up:	1260 (888)
	Quit transmitting at background rate:	8129 (8972)

From our best-fit model for the distribution of "quit transmitting" drifters, we can assess the statistical odds that a particular drifter which "quit transmitting" actually ran aground or was picked up. In each bin, the total number of "quit transmitting" drifters is  $D_q =$  $N/r + x_1D_g + x_2D_{pu}$ , of which  $x_1D_g$  actually ran aground and  $x_2D_{pu}$  were picked up. Then the spatially-varying field

$$\frac{x_1 D_g}{N/r + x_1 D_g + x_2 D_{pu}},\tag{8}$$

interpolated to the location of a "quit" drifter, gives the odds that it actually ran aground,while the field

$$\frac{x_2 D_{pu}}{N/r + x_1 D_g + x_2 D_{pu}},$$
(9)

gives the odds that it actually was picked up. We have applied this to all drifters in the directory file, generating a new metadata file which gives the odds that each drifter ran aground or was picked up. This file is available at:

#### 234 http://www.aoml.noaa.gov/phod/dac/drifter\_deaths.html

In this file, the chance  $p_g$  that a drifter ran aground will be 0 for drifters which were identified as "picked up", 1 for drifters identified as "ran aground", and will be in the range  $0 \le p_g < 1$  for drifters identified as "quit transmitting." Similarly, the chance  $p_{pu}$  that a drifter was picked up will be 0 for drifters which were identified as "ran aground", 1 for drifters identified as "picked up", and will be in the range  $0 \le p_{pu} < 1$  for drifters identified as "quit transmitting."

## **5.** Application to Marine Floating Debris

Improved information on where drifters run aground can be used to estimate where floating 242 marine debris is likely to be deposited by ocean currents, under the assumption that the 243 debris follows the water like a drifter (i.e., that shear in the upper 15 m is negligible). 244 One way of formulating this problem is documented in Maximenko et al. (2011). In this 245 approach, the advective and turbulent processes that govern particle spreading are assumed 246 to be stationary. In this case, the probability distribution function P that describes how all 247 drifters within a bin will subsequently enter neighboring bins a fixed time T later can be 248 applied at any time to a simulated particle in that bin. Maximenko et al. (2011) calculated 249 this for  $1/2^{\circ}$  bins with a time step of five days and calculated the spatial distribution of P 250 (see their Fig. 3 for examples of P at various locations in the Pacific Ocean). Starting in 251 May 2005, the same methodology, with five degree bins and a time step of 90d, has been 252 used by R. Lumpkin to make 90-day forecasts of the global drifter array.<sup>2</sup> 253

As shown by Maximenko et al. (2011), the concentration of a tracer C can be projected forward in time by iteratively solving

$$C(\boldsymbol{x}, t+T) = \int C(\boldsymbol{x}, t) P(\boldsymbol{x}, T) d\boldsymbol{x} + S(\boldsymbol{x}), \qquad (10)$$

<sup>&</sup>lt;sup>2</sup>See http://www.aoml.noaa.gov/phod/graphics/dacdata/forecast90d.gif

where S represents sources or sinks of C. Maximenko et al. (2011) used this to simulate the evolution of marine debris from an initially homogeneous distribution, with all drifter death locations used as sinks for the tracer. However, these deaths include many drifters which were picked up or quit transmitting from internal causes which ideally should not be included in a simulation of marine debris.

With the results of this study, we can repeat the calculation of Maximenko et al. (2011) 261 but include as sinks only those drifters which ran aground. Drifters which "quit transmit-262 ting" with a chance of running aground between 0 and 1 contribute to this chance in the 263 bins where they quit. Fig. 9 shows the resulting concentration of floating marine debris af-264 ter 10 years of integration, starting from a uniform distribution at a concentration of unity. 265 The vertical bars indicate the grounded concentration on land, with relative heights indi-266 cating how much debris has run aground in that bin and colors corresponding to  $10 \times$  the 267 value in the color scale for floating debris. These results indicate remarkably larger ma-268 rine debris impact on the coastlines of Alaska and Washington compared to California and 269 most of Oregon, southern Chile compared to Argentina, Brazil compared to northern Chile, 270 and eastern South Africa compared to western South Africa. In addition, they suggest that 271 many mid-latitude islands are particularly threatened locations for deposit of floating ma-272 rine debris. Note that, while the locations of the bars are supported by real drifters that ran 273 aground, the heights of the bars will likely change in more realistic model runs with the 274

<sup>275</sup> debris sources distributed inhomogeneously along the coastlines.

276

[Figure 9 about here.]

## 277 6. Conclusions

By better understanding why and where drifters die, management of the global array can be improved: deployment locations can be chosen that optimize drifter lifetime, regions where large numbers of drifters are picked up can be targeted for educational outreach efforts, and simulations of the array's evolution can more accurately represent the places that drifters are likely to run aground or be picked up. This information can also be used in a statistical model in which individual trajectories can be processed in a probabilistic way to simulate ocean advection of a particle floating at the ocean surface.

In order to improve our understanding of drifter death causes, we have examined the relevant metadata file, known as the directory file, maintained by the Global Drifter Program's Data Assembly Center (DAC). We identified 222 deaths flagged as "ran aground" which were far from any land or shallow water. The DAC has reassessed the cause of death for these drifters and concluded that 26% of the 222 have been switched to "picked up" and 72% have been switched to "quit". These revised death causes now appear in the updated directory file publicly available at the DAC web page.

In the directory file, the vast majority of drifters die due to "quit transmitting." The 292 distribution of these deaths (Fig. 7a) reflects the background density of the data (Fig. 7b), 293 but is enhanced in coastal and shallow regions where drifters are frequently picked up or run 294 aground. This indicates that a significant fraction of the drifters that "quit transmitting" did 295 so due to interaction with land or boaters. The fraction of "quit" drifters that ran aground 296 or were picked up can be estimated with a statistical best-fit model (equation 3) based on 297 the distributions of the various causes of drifter death. We conclude that the total number 298 of drifters that ran aground is 24% greater than indicted in the DAC metadata, while the 299 number that were picked up is greater by 43%. Using this best-fit model, we can assess the 300 statistical odds that each individual drifter which "quit transmitting" actually ran aground 301 or was picked up. We have applied this to all drifters in the DAC metadata, generating a 302 new metadata file available at: 303

304 http://www.aoml.noaa.gov/phod/dac/drifter\_deaths.html

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was obtained from http://www.ngdc.noaa.gov/mgg/global/global.html.

## **References**

Brambilla, E. and L. Talley: 2006, Surface drifter exchange beween the North Atlantic subtropical and subpolar gyres. *J. Geophys. Res. Oceans*, **111**, C07026, doi:10.1029/2005JC003146.

- <sup>319</sup> IPRC: 2008, Marine Debris. Technical Report 2, International Pacific Research Council
  <sup>320</sup> (IPRC) Climate, Univ. Hawaii at Manoa, Honolulu, HI 96822.
- Law, K. L., S. Morét-Ferguson, N. A. Maximenko, G. Proskurowksi, E. E. Peacock,
   J. Hafner, and C. M. Reddy: 2010, Plastic accumulation in the North Atlantic subtropical
   gyre. *Science*, **329**, 1185–1188.
- Lumpkin, R. and M. Pazos: 2007, Measuring surface currents with Surface Velocity Program drifters: the instrument, its data and some recent results. *Lagrangian Analysis*

- and Prediction of Coastal and Ocean Dynamics, A. Griffa, A. D. Kirwan, A. Mariano, 326
- T. Özgökmen, and T. Rossby, eds., Cambridge University Press, chapter 2, 39–67. 327
- Maximenko, N., J. Hafner, and P. Niiler: 2011, Pathways of marine de-328 bris derived from trajectories of Lagrangian drifters. Marine Pollut. Bull., 329 doi:10.1016/j.marpolbul.2011.04.016, in press. 330
- Niiler, P. P.: 2001, The world ocean surface circulation. Ocean Circulation and Climate, 331 G. Siedler, J. Church, and J. Gould, eds., Academic Press, volume 77 of International 332 Geophysics Series, 193–204. 333
- van Sebille, E., L. Beal, and W. E. Johns: 2011, Advective time scales of Agulhas leak-334 age to the North Atlanticin surface drifter observations and the 3d OFES model. J. 335 Phys. Oceanogr., 41, 1026–1034.

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Figure 1: Examples of drifters that were picked up or ran aground. (a) Drifter 78863 was picked up by a vessel and carried southeast at >2 m/s, then west to the Brazilian coast at >3 m/s. (b) Drifter 42576 made an abrupt jump from the ocean to the land at a speed which must have exceeded 5.5 m/s, and remained on the land thereafter. (c) Drifter 78778 ran aground on the Falkland Islands, as also seen in its time series of latitude vs. days in 2010 (d).



Figure 2: a) Locations of drogue loss for 5354 drifters. b) Locations of 1672 "ran aground" death locations for drifters with drogues on. c) Locations of 1376 "ran aground" death locations for drifters with drogues off.



Figure 3: Locations of 3049 "ran aground" death locations. Circles indicate the 222 locations in water >100 m deep and >100 km from the nearest coast.



Figure 4: Left: histograms of "ran aground" death locations as a function of distance from coast (a) and depth (b) (depths >100m not shown). Right: histograms of "quit transmitting" death locations as a function of distance from coast (a) and depth (b) (depths >100m not shown).



Figure 5: Spatial distribution of deaths from various causes, in deaths per square degree, counted in  $2^{\circ} \times 2^{\circ}$  bins.



Figure 6: Final 90 days of trajectories for drifters flagged as "quit transmitting" which terminated against the southwest coast of South America.



Figure 7: a) Spatial distribution of  $D_q$ , deaths per square degree flagged as "quit transmitting". b) N, the number of six-hourly drifter observations per square degree. c) Average age of drifters at death (years). d)  $D_q - N/r$  with r = 650 days.



Figure 8: a)  $D_q$ , the observed distribution of "quit transmitting" deaths (deaths per square degree). b) modeled distribution (see text). c) residual (top left minus top right). d) estimated distribution of "quit transmitting" deaths caused by drifters running aground or being picked up.



Figure 9: Distribution of the concentration of floating marine debris in arbitrary units, after 10 years of integration from an initially homogeneous distribution of concentration unity. Vertical bars indicate the concentration of material that has washed ashore, with color corresponding to  $10 \times$  the value in the color bar.