The reduction of plankton biomass induced by mesoscale stirring: a modelling study in the Benguela upwelling.

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9 Abstract

Recent studies, both based on remote sensed data and coupled models, showed a 10 reduction of biological productivity due to vigorous horizontal stirring in upwelling areas. 11 In order to better understand this phenomenon, we consider a system of oceanic flow 12 from the Benguela area coupled with a simple biogeochemical model of Nutrient-Phyto-13 Zooplankton (NPZ) type. For the flow three different surface velocity fields are considered: 14 one derived from satellite altimetry data, and the other two from a regional numerical 15 model at two different spatial resolutions. We compute horizontal particle dispersion 16 in terms of Lyapunov Exponents, and analyzed their correlations with phytoplankton 17 concentrations. Our modelling approach confirms that in the south Benguela there is 18 a reduction of biological activity when stirring is increased. Two-dimensional offshore 19 advection and latitudinal difference in Primary Production, also mediated by the flow, 20 seem to be the dominant processes involved. We estimate that mesoscale processes are 21 responsible for 30 to 50% of the offshore fluxes of biological tracers. In the northern area, 22 other factors not taken into account in our simulation are influencing the ecosystem. We 23 suggest explanations for these results in the context of studies performed in other eastern 24 boundary upwelling areas. 25

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26 1. Introduction

Marine ecosystems of the Eastern Boundary Upwelling zones are well known for their major contribution to the world ocean productivity. They are characterized by winddriven upwelling of cold nutrient-rich waters along the coast that supports elevated plankton and pelagic fish production (Mackas et al., 2006). Variability is introduced by strong advection along the shore, physical forcings by local and large scales winds, and high submeso- and meso-scale activities over the continental shelf and beyond, linking the coastal domain with the open ocean.

The Benguela Upwelling System (BUS) is one of the four major Eastern Boundary 34 Upwelling Systems (EBUS) of the world. The coastal area of the Benguela ecosystem 35 extends from southern Angola (around 17°S) along the west coast of Namibia and South 36 Africa $(36^{\circ}S)$. It is surrounded by two boundary currents, the warm Angola Current 37 in the north, and the temperate Agulhas Current in the south. The BUS can itself 38 be subdivided into two subdomains by the powerful Luderitz upwelling cell (Hutchings 39 et al., 2009). Most of the biogeochemical activity occurs within the upwelling front and 40 the coast, although it can be extended further offshore toward the open ocean by the 41 numerous filamental structures developing offshore (Monteiro, 2009). In the BUS, as in the 42 other major upwelling areas, high mesoscale activity due to eddies and filaments impacts 43 strongly marine planktonic ecosystem over the continental shelf and beyond (Brink and 44 Cowles, 1991; Martin, 2003; Sandulescu et al., 2008; Rossi et al., 2009). 45

The purpose of this study is to analyze the impact of horizontal stirring on phytoplankton dynamics in the BUS within an idealized two dimensional modelling framework. Based on satellite data of the ocean surface, Rossi et al. (2008, 2009) recently suggested that mesoscale activity has a negative effect on chlorophyll standing stocks in the four EBUS. This was obtained by correlating remote sensed chlorophyll data with a Lagrangian measurement of lateral stirring in the surface ocean (see Methods section). This result was unexpected since mesoscale physical structures, particularly mesoscale eddies, have

been related to higher planktonic production and stocks in the open ocean (McGillicuddy 53 et al., 2007) as well as off a major EBUS (Correa-Ramirez et al., 2007). A more recent 54 and thorough study performed by Gruber et al. (2011) in the California and the Canary 55 current systems extended the initial results from Rossi et al. (2008, 2009). Based on 56 satellite derived estimates of net Primary Production, of upwelling strength and of Eddy 57 Kinetic Energy (EKE) as a measure the intensity of mesoscale activity, they confirmed 58 the suppressive effect of mesoscale structures on biological production in upwelling areas. 59 Investigating the mechanism behind this observation by means of on 3D eddy-resolving 60 coupled models, Gruber et al. (2011) showed that mesoscale eddies tend to export off-61 shore and downward a certain pool of nutrients not being effectively used by the biology 62 in the coastal areas. This process they called "nutrients leakage" is also having a negative 63 feedback by diminishing the pool of deep nutrients available in the surface waters being 64 re-upwelled continuously. 65

In our work, we focused on the Benguela area, being the most contrasting area of 66 all EBUS in terms of stirring intensity (Rossi et al., 2009). Although the mechanisms 67 studied by Gruber et al. (2011) seem to involve 3D dynamics, the initial observation 68 of this suppressive effect was essentially based on two-dimensional (2D) datasets (Rossi 69 et al., 2008). In this work we use 2D numerical analysis in a semi-realistic framework to 70 better understand the effects of a 2D turbulent flow on biological dynamics, apart from 71 the complex 3D bio-physical processes. The choice of this simple horizontal numerical 72 approach is indeed supported by other theoretical 2D studies that also displayed a neg-73 ative correlation between stirring and biomass (Tél et al., 2005; MacKiver and Neufeld, 74 2009; Neufeld and Hernández-García, 2009). Meanwhile, since biological productivity in 75 upwelling areas rely on the (wind-driven) vertical uplift of nutrients, we introduced in our 76 model a nutrient source term with an intensity and spatial distribution corresponding to 77 the upwelling characteristics. Instead of the commonly used EKE, which is an Eulerian di-78 agnostic tool, we used here a Lagrangian measurement of mesoscale stirring that has been 79

demonstrated as a powerful tool to study patchy chlorophyll distributions influenced by 80 dynamical structures at mesoscale, such as upwelling filaments (Calil and Richards, 2010). 81 The Lagrangian perspective provides a complementary insight to transport phenomena 82 in the ocean with respect to the Eulerian one. In particular, the concept of Lagrangian 83 Coherent Structure may give a global idea of transport in a given area, separating regions 84 with different dynamical behavior, and signaling avenues and barriers to transport, which 85 are of great relevance for the marine biological dynamics. While the Eulerian approach 86 describes the characteristics of the velocity field, the Lagrangian one addresses the effects 87 of this field on transported substances, which is clearly more directly related to the bi-88 ological dynamics. For example the work by Hernández-Carrasco et al. (2012) describes 89 currents in the world ocean having the same level of Eddy Kinetic Energy but having two 90 different stirring characteristics, as quantified by Lagrangian tools. Further discussions 91 comparing Lagrangian and Eulerian diagnostics can be found, for example, in d'Ovidio 92 et al. (2009) and the above cited Hernández-Carrasco et al. (2012). To consider velocity 93 fields with different characteristics and to test the effect of the spatial resolution, different 94 flow fields are used, one derived from satellite and two produced by numerical simulations 95 at two different spatial resolutions. Our modelled chlorophyll-a concentrations are com-96 pared with observed distributions of chlorophyll-a (a metric for phytoplankton) obtained 97 from the SeaWiFS satellite sensor. 98

⁹⁹ This paper is organized as follows. Sec. 2 is a brief description of the different datasets ¹⁰⁰ used in this study. Sec. 3 depicts the methodology, which includes the computation of ¹⁰¹ the finite-size Lyapunov exponents, and the numerical plankton-flow 2D coupled model. ¹⁰² Then, our results are analyzed and discussed in Sec. 4. Finally in Sec. 5, we summed-up ¹⁰³ our main findings.

¹⁰⁴ 2. Satellite and simulated data

We used three different 2D surface velocity fields of the Benguela area. Two are obtained from the numerical model Regional Ocean Model System (ROMS), and the other one from a combined satellite product.

¹⁰⁸ 2.1. Surface velocity fields derived from regional simulations.

ROMS is a free surface, hydrostatic, primitive equation model, and we used here 109 an eddy-resolving climatologically forced run provided by (Gutknecht et al., 2013). At 110 each grid point, linear horizontal resolution is the same in both the longitudinal, ϕ , and 111 latitudinal, θ , directions, which leads to angular resolutions $\Delta \phi = \Delta_0$ and $\Delta \theta = \Delta \phi \cos \theta$. 112 The numerical model was run onto 2 different grids: a coarse one at spatial resolution 113 of $\Delta_0 = 1/4^\circ$, and a finer one at $\Delta_0 = 1/12^\circ$ of spatial resolution. In the following 114 we label the dataset from the coarser resolution run as ROMS1/4, and the finer one as 115 ROMS1/12. For both runs, vertical resolution is variable with 30 layers in total, while 116 only data from the surface upper layer are used in the following. Since the flows are 117 obtained from climatological forcings, they would represent a mean annual cycle of the 118 typical surface currents of the Benguela region. 119

¹²⁰ 2.2. Surface velocity field derived from satellite

A velocity field derived from satellite observations is compared to the simulated fields 121 described previously. It consists of surface currents computed from a combination of 122 wind-driven Ekman currents, at 15 m depth, derived from Quickscat wind estimates, and 123 geostrophic currents calculated using time-variable Sea Surface Heights (SSH) obtained 124 from satellite (Sudre and Morrow, 2008). These SSH were calculated from mapped al-125 timetric sea level anomalies combined with a mean dynamic topography. This velocity 126 field, labeled as *Satellite1/4*, covers a period from June 2002 to June 2005 with a spatial 127 resolution of $\Delta_0 = 1/4^\circ$ in both longitudinal and latitudinal directions. 128

¹²⁹ 2.3. Ocean color as a proxy for phytoplankton biomass

To validate simulated plankton concentrations, we use a three-year-long time series, from January 2002 to January 2005, of ocean color data. Phytoplankton pigment concentration (chlorophyll-a) is obtained from monthly Sea viewing Wide Field-of-view Sensor (SeaWiFS) products, generated by the NASA Goddard Earth Science (GES)/Distributed Active Archive Center (DAAC). Gridded global data were used with a resolution of approximately 9 by 9 km.

¹³⁶ 3. Methodology

137 3.1. Finite-Size Lyapunov Exponents (FSLEs)

FSLEs (Artale et al., 1997; Aurell et al., 1997; Boffetta et al., 2001) provides a measure of dispersion, and thus of stirring and mixing, as a function of the spatial resolution. This Lagrangian tool allows isolating the different regimes corresponding to different length scales of the oceanic flows, as well as identifying Lagrangian Coherent Structures (LCSs) present in the data (Tew Kai et al., 2009). FSLE are computed from τ , the time required for two particles of fluid (one of them placed at **x**) to separate from an initial distance of δ_0 (at time t) to a final distance of δ_f , as

$$\lambda(\mathbf{x}, t, \delta_0, \delta_f) = \frac{1}{\tau} \log \frac{\delta_f}{\delta_0}.$$
 (1)

It is natural to choose the initial points \mathbf{x} on the nodes of a grid with lattice spacing 138 coinciding with the initial separation of fluid particles δ_0 . Then, values of λ are obtained 139 in a grid with lattice separation δ_0 . In most of this work the resolution of the FSLE field, 140 δ_0 , is chosen equal to the resolution of the velocity field, Δ_0 . Other choices of parameter 141 are possible and δ_0 can take any value, even much smaller than the resolution of the 142 velocity field (Hernández-Carrasco et al., 2011). This opens many possibilities that will 143 not be fully explored in this work (see also Fig. 3 and Appendix A.1). Using similar 144 parameters for the FSLEs' computation, We also investigate the response of the coupled 145

¹⁴⁶ biophysical system to variable resolution of the velocity field, (see Hernández-Carrasco
¹⁴⁷ et al. (2011) for further details about the sensitivity and robustness of the FSLEs).

The field of FSLEs thus depends on the choice of two length scales: the initial, δ_0 and 148 the final δ_f separations. As in previous works (d'Ovidio et al., 2004, 2009; Hernández-149 Carrasco et al., 2011) we focus on transport processes at mesoscale, so that δ_f is taken as 150 about 110 km, or 1°, which is the order of the size of mesoscale eddies at mid latitudes. To 151 compute λ we need to know the trajectories of the particles, which gives the Lagrangian 152 character to this quantity. The equations of motion that describe the horizontal evolution 153 of particle trajectories in longitudinal and latitudinal spherical coordinates, $\mathbf{x} = (\phi, \theta)$, 154 are: 155

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

$$\frac{d\theta}{dt} = \frac{v(\phi, \theta, t)}{R}, \qquad (3)$$

where u and v represent the eastwards and northwards components of the surface velocity field, and R is the radius of the Earth (6371 km).

The ridges of the FSLE field can be used to define the Lagrangian Coherent Struc-158 tures (LCSs) (Haller and Yuan, 2000; d'Ovidio et al., 2004, 2009; Tew Kai et al., 2009; 159 Hernández-Carrasco et al., 2011), which are useful to characterize the flow from the La-160 grangian point of view (Joseph and Legras, 2002; Koh and Legras, 2002). Since we are 161 only interested in the ridges of large FSLE values, the ones which significantly affect stir-162 ring, LCSs can be computed by the high values of FSLE which have a line-like shape. We 163 compute FSLEs by integrating backwards-in-time the particle trajectories since attract-164 ing LCSs (and its associated unstable manifolds) have a direct physical interpretation 165 (Joseph and Legras, 2002; d'Ovidio et al., 2004, 2009). Tracers, such as temperature and 166 chlorophyll-a, spread along the attracting LCSs, thus creating their typical filamental 167 structure (Lehan et al., 2007; Calil and Richards, 2010). 168

169 3.2. The Biological model

The plankton model is similar to the one used in previous studies by Oschlies and Garçon (1998, 1999) and Sandulescu et al. (2007, 2008). It describes the interaction of a three-level trophic chain in the mixed layer of the ocean, including phytoplankton P, zoo-plankton Z and dissolved inorganic nutrient N, whose concentrations evolve in time according to the following equations:

$$\frac{dN}{dt} = F_N = \Phi_N - \beta \frac{N}{\kappa_N + N} P + \mu_N \left((1 - \gamma) \frac{\alpha \eta P^2}{\alpha + \eta P^2} Z + \mu_P P + \mu_z Z^2 \right), \tag{4}$$

$$\frac{dP}{dt} = F_P = \beta \frac{N}{\kappa_N + N} P - \frac{\alpha \eta P^2}{\alpha + \eta P^2} Z - \mu_P P, \tag{5}$$

$$\frac{dZ}{dt} = F_Z = \gamma \frac{\alpha \eta P^2}{\alpha + \eta P^2} Z - \mu_Z Z^2,\tag{6}$$

where the dynamics of the nutrients, Eq. (4), is determined by nutrient supply due to the 175 vertical transport Φ_N , its uptake by phytoplankton (2nd term) and its recycling by bacteria 176 from sinking particles (remineralization) $(3^{rd}$ term). Vertical mixing which brings subsur-177 face nutrients into the mixed surface layer of the ocean is parameterized in our coupled 178 model (see below), since the hydrodynamical part considers only horizontal 2D transport. 179 The terms in Eq. (5) represent the phytoplankton growth by consumption of N (i.e. pri-180 mary production $PP = \frac{N}{\kappa_N + N}P$, the grazing by zooplankton $(G_z = \frac{\alpha \eta P^2}{\alpha + nP^2}Z)$, and 181 natural mortality of phytoplankton. The last equation, Eq. (6), represents zooplankton 182 growth by consuming phytoplankton minus zooplankton quadratic mortality. 183

An important term of our model is the parameterization of the vertical transport of nutrients by coastal upwelling. Assuming constant nutrient concentration N_b below the mixed layer, this term can be expressed as:

$$\Phi_N(\mathbf{x},t) = S(\mathbf{x},t)(N_b - N(\mathbf{x},t)),\tag{7}$$

where the function S, which depends on time and space (on the two dimensional location \mathbf{x}), determines the amplitude and the spatial distribution of vertical mixing in the model,

thus specifying the strength of the coastal upwelling. Thus, the function S represents 186 the vertical transport due to coastal upwelling in our 2D model. Upwelling intensity 187 along the coast is characterized by a number of coastal cells of enhanced vertical Ekman 188 driven transport that are associated with similar fluctuations of the alongshore wind 189 (Demarcq et al., 2003; Veitch et al., 2009). Following these results, we defined our function 190 S as being null over the whole domain except in a 0.5° wide coastal strip, varying in 191 intensity depending on the latitude concerned (see Fig. 1). Six separate upwelling cells, 192 peaking at approximately 33°S, 31°S, 27.5°S, 24.5°S, 21.5°S, 17.5°S, can be discerned. 193 They are named Cape Peninsula, Columbine/Namaqua, Luderitz, Walvis Bay, Namibia 194 and Cunene, respectively, Luderitz being the strongest. For the temporal dependence, S195 switches between a summer and a winter parameterization displayed in Fig. 1. 196

¹⁹⁷ When Φ_N is fixed to either its summer or its winter shape described in Fig. 1, the ¹⁹⁸ dynamical system given by Eqs. (4,5,6) evolves towards an equilibrium distribution for ¹⁹⁹ N, P and Z. The transient time to reach equilibrium is typically 60 days with the initial ²⁰⁰ concentrations used (see Sec. 3.3). The parameters are set following a study by Pasquero ²⁰¹ et al. (2004) and are listed in Table 1.

²⁰² 3.3. Coupling hydrodynamical and biological models in Benguela.

We used the velocity fields provided by (Sudre and Morrow, 2008) and (Gutknecht et al., 2013) to do offline coupling with the NPZ model. The evolution of simulated concentrations advected within a flow is determined by the coupling between the hydrodynamical and biological models, as described by an advection-reaction-diffusion system. The complete model is given by the following system of partial differential equations:

$$\frac{\partial N}{\partial t} + \mathbf{v} \cdot \nabla N = F_N + D \nabla^2 N,\tag{8}$$

$$\frac{\partial P}{\partial t} + \mathbf{v} \cdot \nabla P = F_P + D\nabla^2 P,\tag{9}$$

$$\frac{\partial Z}{\partial t} + \mathbf{v} \cdot \nabla Z = F_Z + D \nabla^2 Z. \tag{10}$$

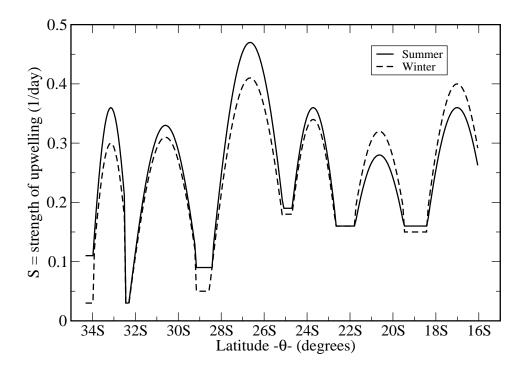


Figure 1: Shape and values of the strength (S) of the upwelling cells used in the simulations for winter and summer seasons (following Veitch et al. (2009)).

The biological model is the one described previously by the functions F_N , F_P and F_Z . Horizontal advection is the 2D velocity field \mathbf{v} , which is obtained from satellite data or from the ROMS model. We add also an eddy diffusion term, via the ∇^2 operator, acting on N, P, and Z to incorporate the unresolved small-scales which are not explicitly taken into account by the velocity fields used.

The eddy diffusion coefficient, D, is given by Okubo's formula (Okubo, 1971), D(l) =214 2.055 * 10⁻⁴ $l^{1.15}$, where l is the value of the resolution, in meters, corresponding to the 215 angular resolution $l = \Delta_0$. The formula gives the values $D=26.73 \ m^2/s$ for Satellite1/4 216 and ROMS1/4, and $D=7.4 \ m^2/s$ for ROMS1/12.

Parameter	Symbol	Value
Phytoplankton growth rate	eta	0.66 day^{-1}
Prey capture rate	η	$1.0 \text{ (mmol N m}^{-3})^{-2} \text{ day}^{-1}$
Assimilation efficiency of Zooplankton	γ	0.75
Maximum grazing rate	a	2.0 day^{-1}
Half-saturation constant for N uptake	k_N	$0.5 \text{ mmol N m}^{-3}$
Inefficiency of remineralization	μ_N	0.2
Specific mortality rate	μ_P	$0.03 \ day^{-1}$
(Quadratic) mortality	μ_Z	$0.2 \ (\text{mmol N m}^{-3})^{-1} \ \text{day}^{-1}$
Nutrient concentration bellow mixed layer	N_b	$8.0 \text{ mmol N m}^{-3}$

Table 1: List of parameters used in the biological model.

The coupled system Eqs. (8), (9) and (10) is solved numerically by the semi-Lagrangian 217 algorithm described in Sandulescu et al. (2007), combining Eulerian and Lagrangian 218 schemes. The initial concentrations of the tracers were taken from Koné et al. (2005) 219 and they are $N_0 = 1 \ mmol Nm^{-3}$, $P_0 = 0.1 \ mmol Nm^{-3}$, and $Z_0 = 0.06 \ mmol Nm^{-3}$. 220 The inflow conditions at the boundaries are specified in the following way: at the eastern 221 corner, and at the western and southern edges of the computational domain fluid parcels 222 enter with very low concentrations $(N_L = 0.01N_0 \ mmol Nm^{-3}, P_L = 0.01P_0 \ mmol Nm^{-3},$ 223 and $Z_L = 0.01 Z_0 \ mmol Nm^{-3}$). Across the northern boundary, fluid parcels enter 224 with higher concentrations $(N_H = 5 \ mmol Nm^{-3}, P_H = 0.1 \ mmol Nm^{-3}, and Z_H =$ 225 $0.06 \ mmol Nm^{-3}$). Nitrate concentrations are derived from CARS climatology (Condie 226 and Dunn, 2006), while P and Z concentrations are taken from Koné et al. (2005). The 227 integration time step is dt = 6 hours. 228

To convert the modeled P values, originally in $mmolN.m^{-3}$, into $mg m^{-3}$ of chlorophyll, we used a standard ratio of Chloro/Nitrogen = 1.59 as prescribed by Hurtt and Armstrong (1996) and Doney (1996). In the following we refer to as "simulated chlorophyll" for the concentrations derived from the simulated phytoplankton P, after applying
the conversion ratio (see above); and we use "observed chlorophyll" for the chlorophyll-a
measured by SeaWIFS.

235 4. Results and discussion

236 4.1. Validation of our simple 2D idealized setting using satellite data

237 4.1.1. Horizontal stirring

We compute the FSLE with an initial separation of particles equal to the spatial 238 resolution of each velocity field ($\delta_0 = 1/4^\circ$ for *Satellite1/4* and *ROMS1/4*, and $\delta_0 = 1/12^\circ$ 239 for ROMS1/12), an a final distance of $\delta_f = 1^\circ$ to focus on transport processes by mesoscale 240 structures at mid latitudes. The areas of more intense horizontal stirring due to mesoscale 241 activity can be identified by large values of temporal averages of backward FSLEs (see 242 Figure 2). While there are visible differences between the results from the different velocity 243 fields, especially in the small-scale patterns, the spatial pattern are quantitatively well 244 reproduced. For instance, spatial correlation coefficient R^2 between FSLEs map from 245 Satellite 1/4 and from ROMS1/4 is 0.81. Correlation coefficients between Satellite 1/4246 and ROMS1/12 on one hand, and between ROMS1/4 and ROMS1/12 on the other 247 hand, are lower (0.61 and 0.77 respectively) since the FSLE were computed on a different 248 resolution. More details on the effect on the grid resolution when computing FSLEs can 249 be found in Hernández-Carrasco et al. (2011). For all datasets, high stirring values are 250 observed in the southern region, while the northern area displays significantly lower values, 251 in line with Rossi et al. (2009). Note that the separation is well marked for Satellite 1/4252 where high and low values of FSLE occur below and above a line at 27° approximately. 253 In the case of ROMS flow fields, the stirring activity is more homogeneously distributed, 254 although the north-south gradient is still present. We associate this latitudinal gradient 255 with the injection of energetic Agulhas rings, the intense jet/bathymetry interactions 256 and with other source of flow instabilities in the southern Benguela. Following Gruber 257

et al. (2011) we compute the EKE, another proxy of the intensity of mesoscale activity. 258 There are regions with distinct dynamical characteristics as the southern subsystem is 259 characterized by larger EKE values than the northern area, in good agreement with the 260 analysis arising from FSLEs (Fig. 2). Spatial correlations (not shown) indicate that EKE 261 and FSLE patterns are well correlated using a non-linear fitting (power law). For instance, 262 EKE and FSLE computed on the velocity field from Satellite1/4 exhibit a R^2 of 0.86 for 263 the non-linear fitting: $FSLE = 0.009 \cdot EKE^{0.49}$. This is in agreement with the initial 264 results from Waugh et al. (2006); Waugh and Abraham (2008), for a related dispersion 265 measurement, and confirmed for the Benguela region by the thorough investigations of 266 EKE/FSLE relationship by Hernández-Carrasco et al. (2012). 267

To analyze the variability of horizontal mixing with latitude, we compute longitudinal 268 averages of the plots in Fig. 2 for two different coastally-oriented strips extended: a) from 269 the coast to 3° offshore, and b) from 3° to 6° offshore (see Fig. 3). It allows analyzing 270 separately subareas characterized by distinct bio-physical characteristics (see also Rossi 271 et al. (2009)), the coastal upwelling (3° strip) with high plankton biomasses and moderated 272 mesoscale activity, and the open ocean (from 3° to 6° offshore) with moderated plankton 273 biomasses and high mesocale activity. It is clear that horizontal stirring decreases with 274 decreasing latitude. In Fig. 3 (a) we see that, for Satellite1/4, the values of FSLEs 275 decay from 0.18 $days^{-1}$ in the southern to 0.03 $days^{-1}$ in the northern area, with similar 276 significant decays for ROMS1/4 and ROMS1/12. Specifically the North-South difference 277 for Satellite1/4, ROMS1/4 and ROMS1/12 are of the order of $0.15 \ days^{-1}$, $0.15 \ days^{-1}$ 278 and $0.08 \ days^{-1}$, respectively, confirming a lower latitudinal gradient for the case of 279 ROMS1/12. 280

Note that there are differences in the stirring values (FSLEs) depending on the type of data, their resolution, the averaging strip, and the grid size of FSLE computation. In general, considering velocities with the same resolution, the lower values correspond to *Satellite1/4* as compared to ROMS1/4. On average, values of stirring from ROMS1/4

are larger than those from ROMS1/12, whereas we would expect the opposite considering 285 the higher resolution of the latter simulation favoring small scales processes. However, 286 this comparison is hampered by the fact that spatial means of FSLE values are reduced 287 when computing them on grids of higher resolution, because the largest values become 288 increasingly concentrated in thinner lines, a consequence of their multifractal character 289 (Hernández-Carrasco et al., 2011). Indeed, one can not compare consistently two FSLEs 290 field computed on a different resolution, whatever the intrinsic resolution of the velocity 291 field is. The FSLEs computed on a $1/4^{\circ}$ grid (black and red lines on Fig. 3) cannot 292 be directly compared to FSLE fields computed on a $1/12^{\circ}$ grid (green line Fig. 3) (see 293 Hernández-Carrasco et al. (2011)). Note however that when FSLEs are computed using 294 the ROMS1/12 and ROMS1/4 flows but on the same FSLE grid with a fixed resolution 295 of $1/12^{\circ}$, one finds smaller values of FSLEs for the coarser velocity field (ROMS1/4) (see 296 green and blue lines in Fig. 3). The effect of reducing the velocity spatial resolution on 297 the FSLE calculations is considered more systematically in Appendix A.1. FSLE values 298 obtained from the same FSLE-grid increase as the resolution of the velocity-grid becomes 299 finer (Fig. A.12) A general observation consistent between all datasets is that horizontal 300 mixing is slightly less intense and more variable in the region of coastal upwelling (from 301 the coast to 3° offshore) than within the transitional area with the open ocean (3-6° 302 offshore). Note also that a low-stirring region is observed within the 3° width coastal 303 strip from 28° to 30°S on all calculations. These observations confirm that the ROMS 304 model is representing well the latitudinal variability of the stirring as measured from FSLE 305 based on satellite data. These preliminary results indicate that Lyapunov exponents and 306 methods could be used as a diagnostic to validate the representation of mesoscale activity 307 in eddy-resolving oceanic models, as suggested recently by Titaud et al. (2011). Overall, 308 the variability of stirring activity in the Benguela derived from the simulated flow fields 309 is in good agreement with the satellite observations. 310

311 4.1.2. Simulated phytoplankton concentrations

Evolution of N, P and Z over space and time is obtained by integrating the systems 312 described by Eqs. (8), (9) and (10). The biological model is coupled to the velocity field 313 after the spin-up time needed to reach stability (60 days). Analysing the temporal average 314 of simulated chlorophyll (Fig. 4), we found that coastal regions with high P extend 315 approximately, depending on latitude, between half a degree and two degrees offshore. 316 It is comparable with the pattern obtained from the satellite-derived chlorophyll data 317 (Fig.4 d)). The spatial correlation between averaged simulated and satellite chlorophyll 318 is as follows: $R^2 = 0.85$ for Satellite1/4 versus SeaWIFS; $R^2 = 0.89$ for ROMS1/4 versus 319 SeaWIFS and $R^2 = 0.85$ for ROMS1/12 versus SeaWIFS. Despite the very simple setting 320 of our model, including the parameterization of the coastal upwelling, the distribution of 321 phytoplankton biomass is relatively well simulated in the Benguela area. Note however 322 that our simulated chlorophyll values are about $\simeq 3-4$ times lower than satellite data. 323 Many biological and physical factors not taken into account in this simple setting could 324 be invoked to explain this offset. Another possible explanation is the low reliability of 325 ocean color data in the optically complex coastal waters (Mélin et al., 2007). 326

We now examine the latitudinal distribution of P comparing the outputs of the numer-327 ical simulations versus the satellite chlorophyll-a over different coastally oriented strips 328 (Fig.5). Simulated P concentrations are higher in the northern than in the southern area 329 of Benguela, in good agreement with the chlorophyll-a data derived from satellite. A 330 common feature is the minimum located just below the Luderitz upwelling cell $(28^{\circ}S)$, 331 which may be related to the presence of a physical boundary, already studied and named 332 the LUCORC barrier by Shannon et al. (2006) and Lett et al. (2007). The decrease of P 333 concentration is clearly visible in the open ocean region of the Satellite1/4 case (Fig. 5) 334 b)). Correlations of zonal averages between simulated and satellite chlorophyll-a are poor 335 when considering the whole area (R^2 ranging from 0.1 to 0.5). However, when considering 336 each subsystem (northern and southern) independently, high correlation coefficients are 337

found for the south Benguela (R^2 around 0.75), but not for the north. This indicates that our simple modelling approach is able to simulate the spatial patterns of chlorophyll in the south Benguela, but not properly in the northern part. In the north, other factors not considered here (such as the 3D flow, the varying shelf width, the external inputs of nutrients, realistic non-climatologic forcings, complex biogeochemical processes, etc...) seem to play an important role in determining the surface chlorophyll-a observed from space.

345 4.2. Relationship between phytoplankton and horizontal stirring.

In Fig. 6 we show six selected snapshots of chlorophyll concentrations every 8 days 346 during a 32 days period for ROMS1/12. Since both ROMS simulations were climato-347 logically forced runs, the dates do not correspond to a specific year. The most relevant 348 feature is the larger value of concentrations near the coast due to the injection of nu-349 trients. Obviously the spatial distribution of P is strongly influenced by the submeso-350 and meso-scale structures such as filaments and eddies, especially in the southern sub-351 system. Differences are however observed between the three data sets. In particular, it 352 seems that for Satellite1/4 and ROMS1/12 the concentrations extend further offshore 353 than for ROMS1/4 (not shown). In Appendix A.1 we provide additional analysis of 354 the effect of the velocity spatial resolution on phytoplankton evolution. We found that 355 velocity data with different resolution produces similar phytoplankton patterns but larger 356 absolute values of concentrations as the spatial resolution of the velocity field is refined 357 (see Mahadevan and Archer (2000); Levy et al. (2001)), supporting the need to compare 358 different spatial resolutions. 359

Several studies (Lehan et al., 2007; d'Ovidio et al., 2009; Calil and Richards, 2010) have shown that transport of chlorophyll distributions in the marine surface is linked to the motion of local maxima or ridges of the FSLEs. This is also observed in our numerical setting when superimposing contours of high values of FSLE (locating the LCSs) on top of phytoplankton concentrations for ROMS1/12 (see Fig. 6). In some regions P concentrations are constrained and stirred by lines of FSLE. For instance, the elliptic eddy-like structure at 13 °E, 32 °S is characterized by high phytoplankton concentrations at its edge, but relatively low in its core. This reflects the fact that tracers, even active such as chlorophyll, still disperse along the LCSs.

From Fig. 5 it is clear that phytoplankton biomass has a general tendency to decrease 369 with latitude, an opposite tendency to the one exhibited by stirring (as inferred from 370 the FSLEs and EKE distributions in Figs. 2 and 3) for the three data sets. Moreover, 371 note that the minimum of phytoplankton located just below the LUCORC barrier at 372 28°S (Fig. 5) coincides with a local maximum of stirring that might be responsible for 373 this barrier (Fig. 3 a). Spatial mean and latitudinal variations of FSLE and chlorophyll-374 a analyzed together suggest an inverse relationship between those two variables. The 375 2D vigorous stirring in the south and its associated offshore export seem sufficient to 376 simulate reasonably well the latitudinal patterns of P. The numerous eddies released 377 from the Agulhas system and generally travelling north-westward, associated with the 378 elevated mesoscale activity in the south Benguela, might inhibit the development of P379 and export unused nutrients toward the open ocean. Although Gruber et al. (2011) 380 invoked the offshore subduction of unused nutrients (3D effect), our results suggest that 381 2D offshore advection and intense horizontal mixing could by themselves affect negatively 382 the phytoplankton growth in the southern Benguela. 383

To study quantatively the negative effect of horizontal stirring on phytoplankton con-384 centration, we examine the correlation between the spatial averages – over each subregion 385 (North and South) and the whole area of study – of every weekly map of FSLE and 386 the spatial average of the corresponding weekly map of simulated P, considering each 387 of the three velocity fields (Fig.7). For all cases, a negative correlation between FSLEs 388 and chlorophyll emerges: the higher the surface stirring/mixing, the lower the biomass 389 concentration. The correlation coefficient taking into account the whole area is quite high 390 for all the plots, $R^2=0.77$ for Satellite1/4, 0.70 for ROMS1/4 and 0.84 for ROMS1/12, 391

and the slopes (blue lines in Fig.7 have the following values: -1.8 for Satellite 1/4, -0.8 for 392 ROMS1/4 and -2.3 for ROMS1/12. The strongest negative correlation is found for the 393 setting with ROMS1/12. Note that, similarly to the results of Rossi et al. (2008, 2009) 394 and Gruber et al. (2011), the negative slope is larger but less robust when considering the 395 whole area rather than within every subregion. Moreover, if we average over the coastal 396 strip (from coast to 3° offshore) and only in the south region (Fig.7 d),e),f)) we find high 397 values of the correlation coefficient for the Satellite1/4, and ROMS1/12 cases. The sup-398 pressive effect of stirring might be dominant only when stirring is intense, as in the south 390 Benguela. Gruber et al. (2011) stated that the reduction of biomass due to eddies may 400 extend beyond the regions of the most intense mesoscale activity, including the offshore 401 areas that we do not simulate in this work. 402

In the following we analyse the bio-physical mechanisms behind this negative relation-ship.

4.3. What causes the variable biological responses within regions of distinct dynamical 406 properties?

In the following, our analysis is focused on the setting using *ROMS1/12* as the previous results revealed that the negative correlation is more robust. Similar results and conclusions can be obtained from the simulations using the two other velocity fields (not shown), attesting of the reliability of our approach (see correlation coefficients and slopes in Fig. 7).

To understand why simulated chlorophyll-a concentrations differs in both subsystems, as is the case in satellite observations, we compute annual budgets of N, P, Z and biological rates (Primary Production PP, Grazing and Remineralization) in the case of the biological module alone (Table 2) and when coupled with a realistic flow (Table 3). Considering the biological module alone, we found that PP in the north subsystem is slightly higher than in the southern one (4%, see also Table 2), essentially due to the differential nutrient inputs Φ_N . However, when considering the full coupled system (hydrodynamic and biology), the

⁴¹⁹ latitudinal difference in PP increases significantly (32%, see also Table 3). This latitudinal ⁴²⁰ difference is in agreement with the patterns of PP derived from remote-sensed data by ⁴²¹ Carr (2002). These results indicate that the flow is the main responsible of the difference ⁴²² in PP. Additional computations (see Appendix A.2) also confirm the minor effect of the ⁴²³ biological module (Φ_N), as compared with the flow, on the observed latitudinal differences ⁴²⁴ in PP.

Annual budgets only biological system				
	South	North	North-South difference (%)	
Nutrients $(mmolNm^{-3})$	821	1305	37	
Phytoplankton $(mmolNm^{-3})$	57.0	57.7	1	
Zooplankton $(mmolNm^{-3})$	113	115	2	
Primary Production $(mmolNm^{-3}yr^{-1})$	35	36	4	
Grazing $(mmolNm^{-3}yr^{-1})$	33	35	4	
$\Phi_N \ (mmolNm^{-3}yr^{-1})$	28	29	3	
Remineralization $(mmolNm^{-3}yr^{-1})$	7.0	7.4	4	

Table 2: Budgets of N,P,Z and biological rates (Primary Production, Grazing, Φ_N , and remineralization) for the biological model.

Gruber et al. (2011)) suggested that the offshore advection of plankton biomass enhanced by mesoscale structures might be responsible for the suppressive effect of stirring in upwelling areas. To test this mechanism, we next analyze the net horizontal transport of biological tracers by the flow. In particular, we have computed the zonal, JC_{ϕ} , and meridional, JC_{θ} , advective fluxes of N, P, Z (the diffusive fluxes being much smaller):

$$JC_{\phi}(\mathbf{x},t) = u(\mathbf{x},t)C(\mathbf{x},t), \qquad (11)$$

$$JC_{\theta}(\mathbf{x},t) = v(\mathbf{x},t)C(\mathbf{x},t), \qquad (12)$$

Annual budgets hydrodynamics-biology coupled system				
	South	North	North-South difference (%)	
Nutrients $(mmolNm^{-3})$	849	1937	56	
Phytoplankton $(mmolNm^{-3})$	147	198	26	
Zooplankton $(mmolNm^{-3})$	231	347	33	
Primary Production $(mmolNm^{-3}yr^{-1})$	63	98	32	
Grazing $(mmolNm^{-3}yr^{-1})$	56	87	35	
$\Phi_N \ (mmolNm^{-3}yr^{-1})$	81	91	10	
Remineralization $(mmolNm^{-3}yr^{-1})$	11	18	4	

Table 3: Budgets of N,P,Z and biological rates (Primary Production, Grazing, Φ_N , and remineralization) for the bio-flow coupled model.

where u and v are the zonal and meridional components of the velocity field respectively, 430 and with C we denote the N, P and Z concentrations, all of them given at a specific point 431 in the 2D-space and time (\mathbf{x}, t). JC is the flux of the concentration, C, i.e., JN_{ϕ} is the 432 zonal flux of nutrients (eastward positive), JP_{θ} is the meridional flux (northward positive) 433 of phytoplankton, and so on. Annual averages of daily fluxes were computed, and then a 434 zonal average as a function of the latitude was calculated for the different coastal bands 435 considered all along this paper. Fig. 8 shows these calculations for the velocity field from 436 ROMS1/12, while similar results were found for the other data sets (not shown). Similar 437 behavior is observed for the fluxes of N, P and Z: zonal fluxes are almost always negative, 438 so that westward transport dominates, and meridional fluxes are predominantly positive 439 so that they are directed to the north. Comparing North and South in the 3° coastal 440 band, it is observed that at high latitudes the zonal flux has larger negative values than 441 at low latitudes, and the meridional flux presents larger positive values at higher latitudes. 442 In other words, the northwestward transport of biological material is more intense in the 443 southern than in the northern regions, suggesting a higher 'flushing rate'. It also suggests 444

that unused nutrients from the southern Benguela might be advected toward the northern
areas, possibly promoting even further the local ecosystem.

To estimate the transport of recently upwelled nutrients by LCSs and other mesoscale 447 structures, apart from the mean flow, we compute the zonal and meridional fluxes of 448 biological tracers using the smoothed ROMS1/12 velocity field at the spatial resolution 449 equivalent to $1/2^{\circ}$ (see Appendix A.1 for more details). The results, plotted in Fig. 8 450 (red lines), show that in general the fluxes are less intense in the coarser than in the 451 finer velocity, indicating that there is a contribution to net transport due to the submeso-452 and meso-scale activity. To estimate the quantitative contribution of mesoscale processes, 453 we compute the difference of the fluxes of the different biological tracers C = N, P, Z, 454 Q_{JC} , in the coarser velocity field with respect to the original velocity field. The values of 455 Q_{JC} range from 30 to 50%, indicating that the contribution of the mesocale to the net 456 transport of the biological concentrations is important. Moreover, the values of Q_{JC} are 457 larger in the south than in the north confirming that the mesoscale-induced transport is 458 more intense in the south. 459

Lachkar and Gruber (2011) showed that mesoscale processes reduce the efficiency of 460 nutrients utilization by phytoplankton due to their influence on residence times. The 461 longer residence times (i.e. the less mesoscale activity) seem to favor the accumulation 462 of biomass. To test this effect in our simulations, we compute the residence times (RT), 463 defined as the time interval that a particle remains in the coastal trip of 5° wide. The 464 spatial distribution (not shown) of the annual average of RT indicates that the longest RT 465 are found in the north region. In fact, zonal analysis reveals that RT has a tendency to 466 increase as the latitude decreases, with a mean value in the North equals to 249 days, and 467 146 days in the South. This suggests that regions with weak fluxes are associated with 468 long residence times and high growth rate of phytoplankton. On the other hand, high 469 mesoscale activity is favoring the northwestward advection which decreases the residence 470 times, associated to lower growth rate of plankton. 471

This effect and the role of horizontal advection is confirmed by performing numerical 472 simulations where no biological dynamics is considered. This amounts to solving Eq. 473 (4) with P = Z = 0 considering solely lateral transport, so that N is a passive scalar 474 with sources. In Fig. 9 we see the results (for the ROMS1/12 case, similar for the 475 other datasets). There is a very small tracer concentration in the southern domain, and 476 the differences north-south are more pronounced than the case including the plankton 477 dynamics (see Fig. 5). This supports further the fact that the main actor on the spatial 478 distribution of biomasses is the horizontal transport. 470

480 5. Conclusions

We have studied the biological dynamics in the Benguela area by considering a simple 481 biological NPZ model coupled with different velocity fields (satellite and model). Al-482 though in a simple framework, a reduction of phytoplankton concentrations in the coastal 483 upwelling for increasing mesoscale activity has been successfully simulated. Horizontal 484 stirring was estimated by computing the FSLEs and was correlated negatively with chloro-485 phyll stocks. Similar correlations are found, though not presented in this manuscript, for 486 the primary production. Some recent observational and modelling studies proposed the 487 "nutrient leakage" as a mechanism to explain this negative correlation. Here we argue 488 that Lagrangian Coherent Structures, mainly mesoscale eddies and filaments, transport a 489 significant fraction (30-50%) of the recently upwelled nutrients nearshore toward the open 490 ocean before being efficiently used by the pelagic food web. The fluxes of nutrients and 491 organic matter, due to the mean flow and its mesoscale structures, reflect that transport 492 is predominantly westward and northward. Biomass is transported towards open ocean 493 or to the northern area. In addition to the direct effect of transport, primary production 494 is also negatively affected by high levels of turbulence, especially in the south Benguela. 495 Although some studies dealt with 3D effects, we have shown that 2D advection processes 496 seems to play an important role in this suppressive effect. Our analysis suggests that the 497

⁴⁹⁸ inhibiting effect of the mesoscale activity on the plankton occurs when the stirring reaches ⁴⁹⁹ high levels, as in the south Benguela. However, this effect is not dominant under certain ⁵⁰⁰ levels of turbulence. It might indicate that planktonic ecosystems in oceanic regions with ⁵⁰¹ vigorous mesoscale dynamics can be, as a first approximation, easily modeled just by ⁵⁰² including a realistic flow field. The small residence times of waters in the productive area ⁵⁰³ will smooth out all the other neglected biological factors in interaction.

Our findings confirm the unexpected role that mesoscale activity has on biogeochemical dynamics in the productive coastal upwelling. Strong vertical velocities are known to be associated with these physical structures and they might have another direct effect by transporting downward rich nutrient waters below the euphotic zone. Further studies are needed such as 3D realistic modelling that take into account the strong vertical dynamics in upwelling regions to test the complete mechanisms involved.

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517 Appendix A. Sensitivity analysis

A number of numerical experiments were done to investigate the sensitivity of the coupled bio-physical model with respect to different variables.

Appendix A.1. Sensitivity with respect to different spatial resolution of the velocity field In this experiment we used a velocity field from ROMS1/12 smoothed out towards a resolution $1/4^{\circ}$, and to be compared with ROMS1/4 and ROMS1/12 at their original ⁵²³ spatial resolution. We coarse-grained the velocity field with a convolution kernel weighted ⁵²⁴ with a local normalization factor, and keeping the original resolution for the data so that ⁵²⁵ land points are equally well described as in the original data. The coarsening kernel with ⁵²⁶ scale factor s, k_s , is defined as:

$$k_s(x,y) = e^{-\frac{(x^2+y^2)}{2s^2}}.$$
(A.1)

To avoid spurious energy dump at land points we have introduced a local normalization weight given by the convolution: $k_s(x, y) * M(x, y)$, where M(x, y) is the sea mask. For points far from the land the weight is just the normalization of k_s , and for points surrounded by land the weight takes the contribution from sea points only. Thus v_s , the velocity field coarsened by a scale factor s, is obtained from the original velocity field vas:

$$v_s = \frac{k_s * v}{k_s * M}.\tag{A.2}$$

In Fig. A.10 we compare two ROMS1/12 smoothed velocity fields at scales s=3 and 533 s=6 (with an equivalent spatial resolution $1/4^{\circ}$ and $1/2^{\circ}$, respectively) with the original 534 velocity field from ROMS1/12. It is clear that the circulation pattern is smoothed as 535 s is increased. The FSLE computations using these smoothed velocity fields are shown 536 in Fig A.11. When the spatial resolution is reduced to $1/4^{\circ}$ the FSLEs and small-scale 537 contributions decrease, but the main global features remain, as indicated in the study 538 by Hernández-Carrasco et al. (2011). Further coarsening to $1/2^{\circ}$ smoothes most of the 539 structures except the most intense ones. 540

The latitudinal variations of the zonal averages performed on the time averages of the FSLE maps plotted in Fig. A.11 are compared in Fig.A.12. The mean FSLEs values strongly diminish when the velocity resolution is sufficiently smoothed out. This is due to the progressive elimination of mesoscale structures that are the main contributors to stirring processes. Also the latitudinal variability of stirring diminishes for the very smoothed velocity field (blue line in Fig. A.12). Thus, latitudinal differences of stirring
in the Benguela system are likely to be related to mesoscale structures (eddies, filaments,
fronts, etc.) contained in the velocity fields.

⁵⁴⁹ We have also computed the phytoplankton using these smoothed velocity fields. Some ⁵⁵⁰ instantaneous spatial distributions can be seen in Fig A.13. The filaments of phytoplank-⁵⁵¹ ton disappear in the very smoothed velocity field $(1/2^{\circ})$. The spatial distribution of ⁵⁵² the annual average of phytoplankton concentrations for the different velocity field shows, ⁵⁵³ however, quite similar patterns (not shown).

In the time series of N, P and Z budgets for the coarser velocities one observes the same behavior as for the original velocity field (not shown).

Appendix A.2. Sensitivity with respect to different parameterization of the coastal up welling of nutrients.

In section 3.2 we mimicked coastal upwelling of nutrient via a source term in the 558 nutrients equation which is determined by the function S, and was considered spatiotem-559 porally variable. Here we explore the plankton dynamics using spatially and temporally 560 homogeneous upwelling along the coast. S is fixed to an average value $S = 0.1 \ day^{-1}$ 561 along the coast at any time. In Fig. A.14 we show the annual average of P for the 562 ROMS1/12 (top panel), and the comparisons with the inhomogeneous case for the zonal 563 mean (bottom panel). Therefore, this test suggests that the way we simulate vertical 564 mixing along the coast has not a large effect on the 2D biological dynamics, which will 565 be mainly determined by the interplay with horizontal advection. 566

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- ⁶⁹⁵ surface ocean: A case of study of the Tasman sea. J. Phys. Oceanogr. 36, 526–542.

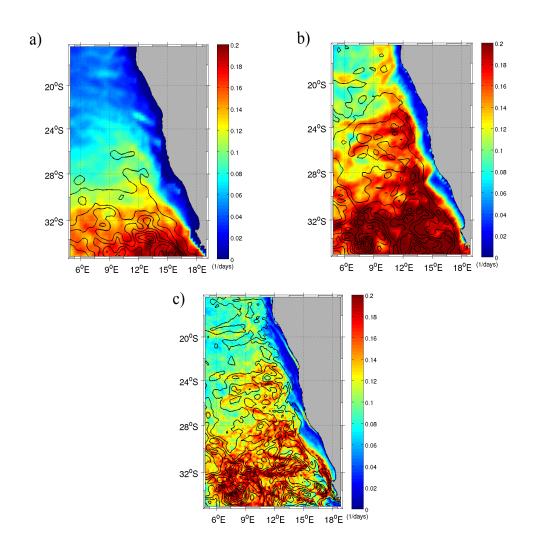


Figure 2: Spatial distribution of time average of weekly FSLE maps in the Benguela region. a) Three years average using data set *Satellite1/4*; b) one year average using ROMS1/4; c) one year average using ROMS1/12. The units of the colorbar are 1/days. The black lines are contours of annual EKE. The separation between contour levels is $100cm^2/s^2$.

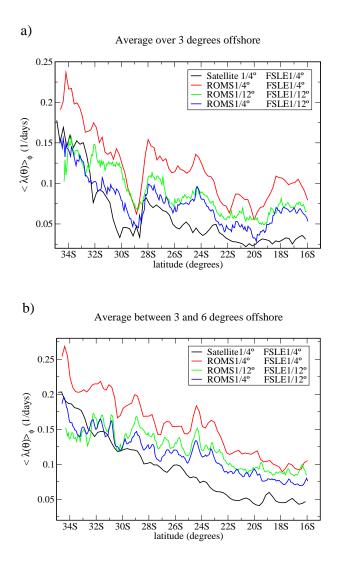


Figure 3: Zonal average on coastal bands of the FSLE time averages from Fig. 2 as a function of latitude. a) from the coast to 3 degrees offshore; b) between 3 and 6 degrees offshore.

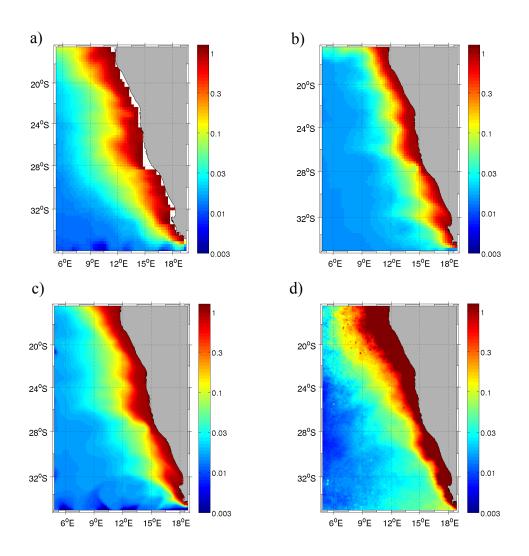


Figure 4: Spatial distribution of: a) Three years average of simulated chlorophyll using *Satellite1/4*, b) One year average of simulated chlorophyll using ROMS1/4, c) Same than b) but using ROMS1/12, d) Three years average of observed chlorophyll derived from monthly SeaWIFS data. The units of the colorbar are mg/m^3 . Logarithmic scale is used to improve the visualization of gradients in nearshore area.

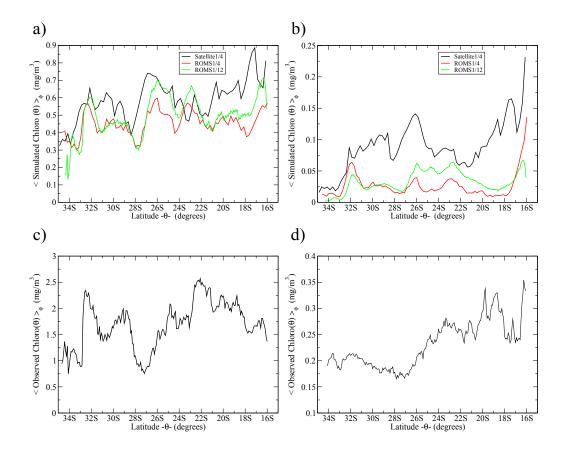


Figure 5: Zonal mean of simulated chlorophyll on a coastally oriented strip from the coast to 3 degrees (a) and from 3 degrees to 6 degrees offshore (b), plotted as a function of latitude. Zonal average of observed chlorophyll (SeaWIFS) over a coastal band from the coast to 3 degrees (c) and from 3 degrees to 6 degrees offshore (d).

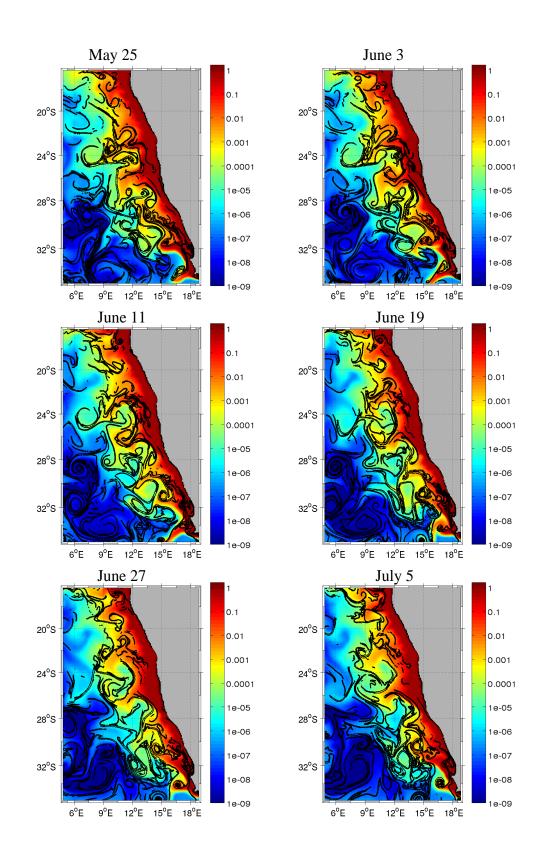


Figure 6: Snapshots every 8 days of large (top 30%) values of FSLE superimposed on simulated chlorophyll concentrations calculated from ROMS1/12 in mg/m^3 . Logarithmic scale for chlorophyll concentrations is used to improve the visualization of the structures

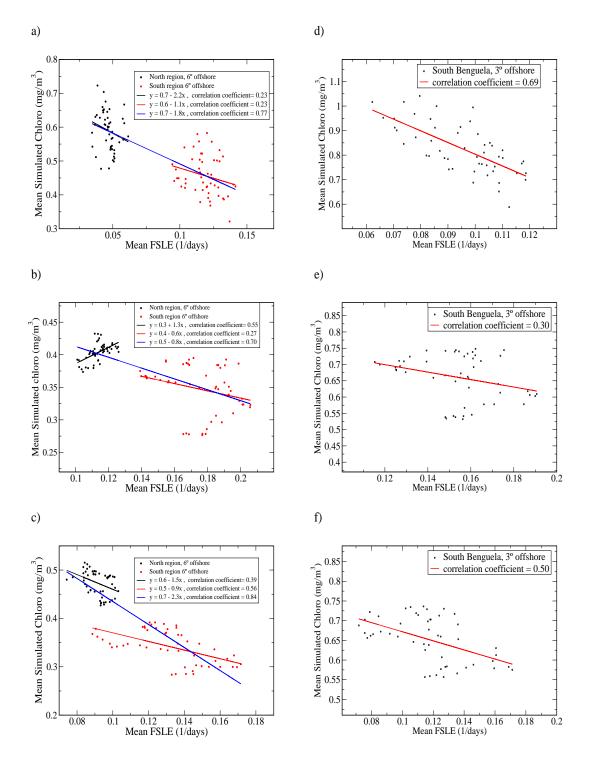


Figure 7: Weekly values of spatial averages of simulated chlorophyll versus weekly values of spatial averages of FSLE, where the average are over the whole area (6 ° from the coast) and in North and South subareas of Benguela. a) *Satellite1/4*, b) *ROMS1/4* and c) *ROMS1/12*. Right column plots the average over 3° offshore in the south region: d) *Satellite1/4*, e) *ROMS1/4* and f) *ROMS1/12*

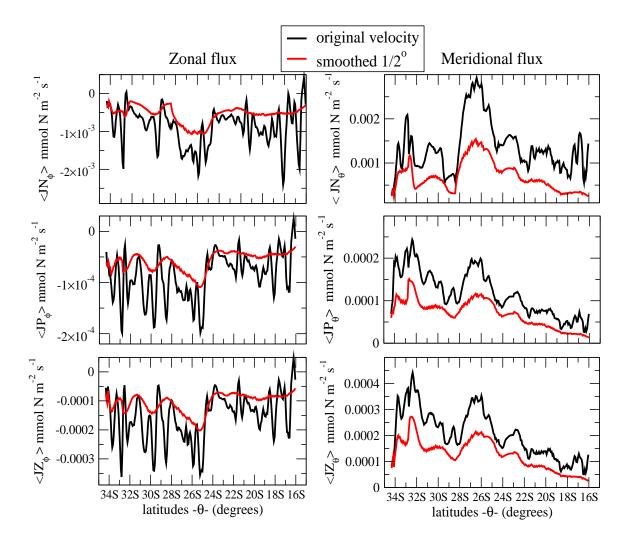


Figure 8: Zonal mean of zonal and meridional fluxes of N, P, Z concentrations for the ROMS1/12 case, averaged from the coast to 3° offshore.

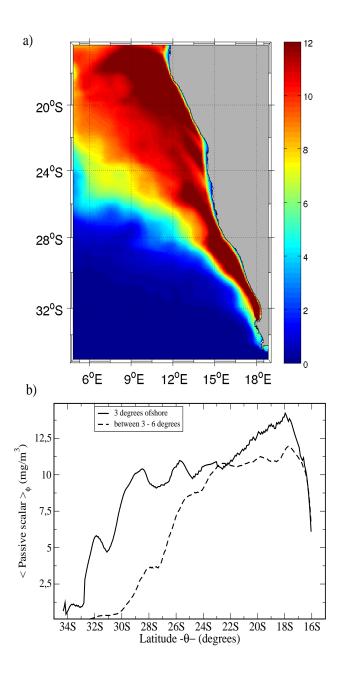


Figure 9: a) Spatial distribution of time average of the passive scalar concentration (see details at the end of subsection 4.3). b) Comparison of latitudinal profile of time averages of the passive scalar, as a function of latitude, for zonal average over different coastal bands.

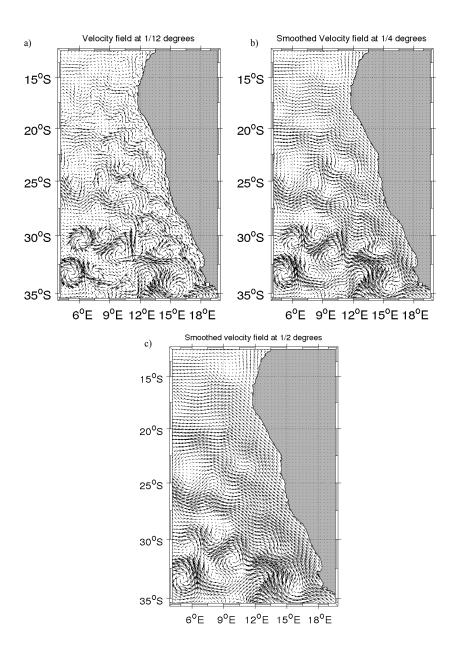


Figure A.10: Vectors of a velocity field from ROMS1/12: a) at original resolution. b) smoothed by a scale factor of s=3, obtaining and equivalent spatial resolution of $1/4^{\circ}$, c) smoothed by a scale factor of s=6, obtaining and equivalent spatial resolution of $1/2^{\circ}$. The snapshots correspond to day 437 of the simulation.

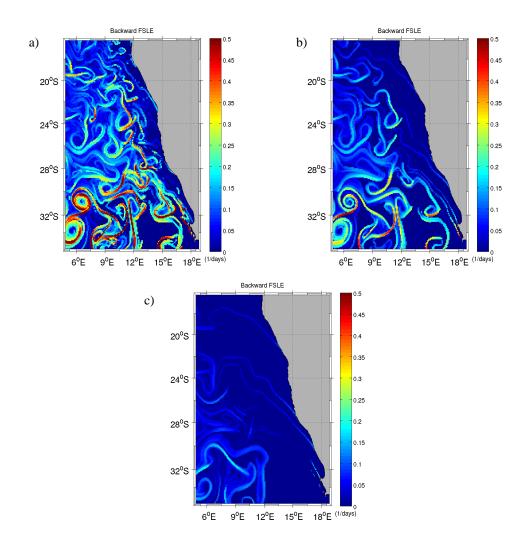
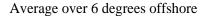


Figure A.11: Snapshots of spatial distributions of FSLEs backward 437 days in time starting from day 437 of ROMS1/12 at the same FSLE grid resolution of $1/12^{\circ}$, and using the velocity fields at different resolutions: a) at original resolution $1/12^{\circ}$. b) smoothed velocity field at equivalent $1/4^{\circ}$ and c) smoothed velocity field at equivalent $1/4^{\circ}$ and c) smoothed velocity field at equivalent $1/2^{\circ}$.



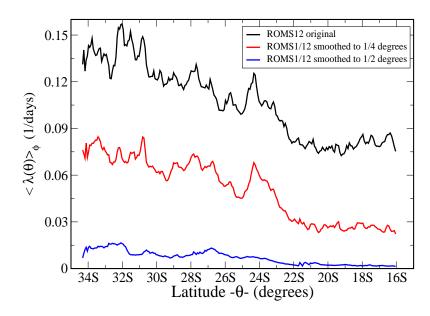


Figure A.12: Latitudinal profile of the zonal mean values of annual averaged backward FSLEs (51 snapshots weekly separated) at the same FSLE grid resolution of $1/12^{\circ}$, and using different smoothed velocity fields.

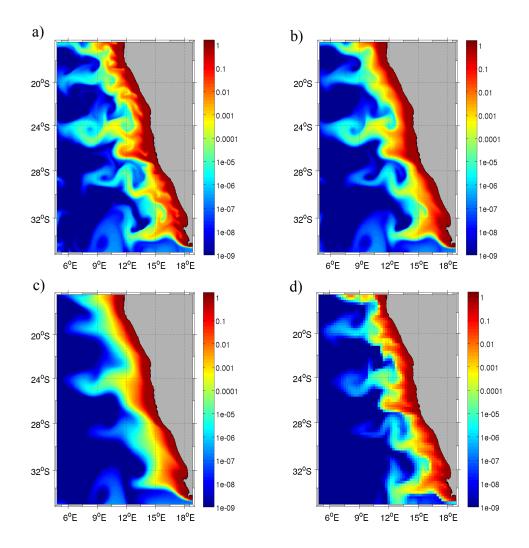


Figure A.13: Snapshots of simulated chlorophyll field using different velocity fields: a) ROMS1/12 at original resolution $1/12^{\circ}$, b) smoothed ROMS1/12 velocity field at equivalent $1/4^{\circ}$, c) smoothed ROMS1/12 velocity field at equivalent $1/2^{\circ}$, and d) ROMS1/4 at original resolution $1/4^{\circ}$. The units of the colorbar are mg/m^3 .

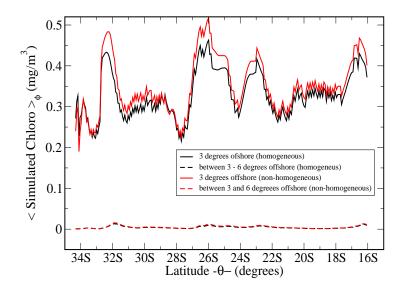


Figure A.14: Comparison between zonal average on different coastal bands of annual time average of simulated chlorophyll, using homogeneous upwelling and the non-homogeneous upwelling cells described in Fig. 1.