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## Impact of environmental conditions on fish early-life stages, an Individual-Based Model approach

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#### Abstract

The duration and survival of dispersing fish Early-Life Stages (ELS) are influenced by biotic and abiotic factors. Moreover, current methods for estimating mortality rates based on laboratory experiments or field studies neglect key components, which can be investigated thanks to modeling. To address these gaps, a growth model is coupled with a Lagrangian model to simultaneously account for species-specific physiology, environmental variability and physical transport. Growth was modeled using Dynamic Energy Budget theory, coupled with a particle-tracking model that computes trajectories. Focusing on three species of Mediterranean coastal fishes, we first model their Pelagic Larval Durations (PLD) over realistic ranges of constant temperature and food density. Our modeling framework reproduces well the expected environmentally-driven variation of PLD. Then we estimated mortality as a function of spawning, using varying food density and

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temperature along dispersal trajectories. Mortality was estimated based on three criteria: time to metamorphosis, final position when metamorphosis occurs, and starvation. Variations of temperature and food density across the year induce seasonal variations of both PLDs and mortality rates, with slow growing species exhibiting higher mortality rates than those characterized by faster development. Our results showed that spawning phenology affects seasonal mortality rates, opening new opportunities to explicitly test the "match-mismatch" hypothesis.

*Keywords:* Biophysical modeling, DEB model, Lagrangian particle-tracking model, Early-Life Traits, Larval mortality, Pelagic Larval Duration

#### 1 1. Introduction

The great majority of marine fishes undergo pelagic Early-Life Stages (ELSs, i.e. embryos and larvae), which are numerous (R-strategists) and dis-3 perse largely in the ocean while juvenile and adult phases are more sedentary 4 (Thresher et al., 1989). To better understand and model the eco-evolutionary 5 dynamics of fish populations characterized by biphasic life cycles, stage-6 specific source and sink terms (such as mortality) must be well-known (Mar-7 shall and Morgan, 2011), as it has far-reaching implications for community 8 structure and species resilience to external perturbations (Cowen et al., 2007). 9 Historical efforts have been essentially devoted to estimating natural mortal-10 ity in adults (Maunder et al., 2023) but large uncertainties remain regarding 11 the survival of fish ELS (Houde, 1997; White et al., 2014; Robert et al., 2023). 12 The study of fish ELS mortality is crucial for coastal fishes as it has large im-13 pacts on recruitment and demographic connectivity (Cowen and Sponaugle, 14

<sup>15</sup> 2009), which are fundamental for population dynamics and fisheries man-<sup>16</sup> agement (Hidalgo et al., 2019). Moreover, the *Growth-Survival Paradigm* <sup>17</sup> recently reviewed by Robert et al. (2023) indeed postulates that recruitment <sup>18</sup> depends on growth and mortality during ELSs trajectory from spawning to <sup>19</sup> settlement, as well as the duration of this stage, which are our focus here.

Pelagic ELSs have the potential for large dispersal in the ocean, enduring 20 variable abiotic conditions. Dispersal is defined as the probability of an in-21 dividual being successfully transported (under conditions favoring survival) 22 from the spawning site, where embryos are released, to the settlement site, 23 where post-metamorphosis larvae become juveniles to later recruit and re-24 produce (Cowen et al., 2000; Pineda et al., 2007). As such, a combination of 25 transport-related processes, internal factors and external pressures (such as 26 predation, starvation, and thermal stress) would control the probability of 27 ELS survival, or ELS mortality rate (McGurk, 1986; Peck and Daewel, 2007; 28 Houde, 2008; Peck and Hufnagl, 2012). On one hand, the oceanic transport 20 of ELS is controlled by the location and period of spawning (Macpherson 30 and Raventos, 2006; Di Stefano et al., 2022), by turbulent advection due to 31 multi-scale ocean currents (Legrand et al., 2019), and eventually modulated 32 by the unpredictable swimming capacities of larvae (Cowen and Sponau-33 gle, 2009). On the other hand, the space and time windows exploited by 34 dispersing ELSs dictate the environmental conditions they encounter, hav-35 ing consequences for their development through thermally- or food-regulated 36 growth, as well as for their survival, through lethal temperatures or direct 37 predation (Lett et al., 2010; Dahlke et al., 2020). 38

39

The study of fish ELS has been challenging due to the difficulty associated

with observing them in the field and rearing them in the laboratory. In 40 consequence, coupled biological and physical models offer promising tools 41 to investigate ELS dynamics (Werner et al., 2001; Pethybridge et al., 2013; 42 Falcini et al., 2020; Flores-Valiente et al., 2023). Using Individual Based 43 Models (IBMs), when coupled with biophysical models, allows the estimation 44 of the Pelagic Larval Duration (PLD), defined as the time ELS spend as 45 embryos and larvae in the ocean, which is influenced by unfavorable transport 46 by currents, unsuitable temperatures, and an insufficient quantity of prey 47 (Knights, 2003; Macpherson and Raventos, 2006; Peck and Hufnagl, 2012; 48 Lacroix et al., 2018; Cabral et al., 2021; Rose et al., 2024). By estimating 49 the PLD, we can then study mortality, as organisms spending longer time in 50 the water column are more subject to encounter unfavorable environmental 51 conditions and/or predation pressure (Chambers and Leggett, 1987; Houde, 52 Edward, 1987; Peck and Hufnagl, 2012). 53

Given the importance of spawning periods in determining larval success, 54 this study tested how different spawning behaviors influence larval trajecto-55 ries and mortality rate. Our case study focuses on the Mediterranean sea, 56 where considering the typical seasonality of environmental conditions in tem-57 perate seas, suggests that spawning strategies of Mediterranean fishes play 58 a role in determining larval trajectories, influencing their settlement or mor-59 tality. Additionally, previous studies suggest that the majority of Mediter-60 ranean coastal Teleosts have a 2-4 months spawning period, occurring from 61 the end of spring to early summer (Tsikliras et al., 2010). However, a recent 62 compilation of Mediterranean fishes' spawning behavior has shown that the 63 spawning periods may be misestimated because of a sampling bias towards 64

summer months (Di Stefano et al., 2024). To address this, we simulated ELS 65 trajectories for particles spawned during different spawning periods all year 66 round as species with a short, one peak spawning period concentrate their 67 reproductive effort into a specific window, to ensure that larvae encounter 68 adequate environmental conditions. In contrast, species with extended or 69 multiple spawning periods spread their reproductive effort across a larger 70 window, increasing the probability that at least some of the larvae will find 71 suitable environmental conditions (James et al., 2003; Tsikliras et al., 2010; 72 Peck and Hufnagl, 2012). 73

The objective of this study is to assess the effect of spawning behaviors on 74 the Pelagic Larval Duration and on ELS mortality rate. Our study employs 75 a mechanistic Dynamic Energy Budget (DEB) model to analyze ELS growth 76 and development forced by outputs from a physical/biogeochemical circula-77 tion model, incorporating the spatio-temporal variability of environmental 78 conditions. Our study focuses on three well-known species on the Western 70 Mediterranean Pagellus erythrinus, Diplodus sargus (Sparidae family), and 80 Sciaena umbra (Sciaenidae family). These species were chosen based on 81 the availability of ecological data (ELSs dispersal traits)(Di Stefano et al., 82 2024) and the availability of DEB parameters which suggested contrasting 83 physiologies. Moreover, they are targeted by artisanal and recreational fish-84 ermen. First, we explored the effect of food density and temperature on 85 species' PLDs, using constant conditions. Then, using varying food density 86 and temperature from a Lagrangian model, we estimated PLDs and fish lar-87 val mortality for different spawning months based on three criteria: time to 88 arrive at metamorphosis, final position when metamorphosis occurs and star-89

vation. For practical reasons and due to the lack of data, predation mortality
and the larvae swimming capacities were neglected. Finally, we discussed the
effect of environmental conditions on ELS development and survival.

#### 93 2. Material and methods

#### 94 2.1. Species-specific growth model

Dynamic Energy Budget (DEB) theory describes the assimilation and 95 use of energy for maintenance, growth, maturity and reproduction during 96 an organism's life cycle according to environmental conditions (Kooijman, 97 2009). DEB theory considers three main life stages: embryos, juveniles, 98 and adults. Embryos do not feed nor reproduce; juveniles feed but do not 99 reproduce; adults feed and reproduce. Based on this theory, we simulated 100 growth and development of fish embryos and larvae, which are described by 101 three state variables: the structural volume V, the reserve energy E, and the 102 cumulative energy invested in maturity  $E_H$ . Equations describing the model 103 are presented in Table 1. 104

In this study, we used the extended DEB model to incorporate the larval 105 stage into the standard model as proposed by Lika et al. (2014). Thus the 106 model includes the embryo stage which starts at spawning (including the egg 107 and the yolk-sac larvae) and the larval stage, marked by the start of individual 108 exogenous feeding and ends with metamorphosis, when larvae transform into 109 juveniles (Figure 1). The transition from one stage to another occurs when 110 the energy accumulated in maturity  $(E_H)$  reaches the threshold  $E_H^b$  for birth 111 and  $E_H^j$  for metamorphosis. Considering this, in this study PLD is defined 112 as the time duration between spawning and metamorphosis. 113



Figure 1: Fish life cycles stages according to DEB theory. PLD in this study is represented as the duration between spawning and metamorphosis processes.

Furthermore, the extended DEB model considers that at embryonic stage 114 individuals are isomorphic, meaning that surface area is proportional to the 115 volume to the power 2/3, and that at larval stage they become V1-morphs, 116 meaning that surface area is proportional to the structural volume (Kooi-117 jman, 2009, 2014). To follow this change in shape, the acceleration factor 118  $(s_M)$  must be implemented to adjust the maximum specific assimilation rate 119  $\{\dot{p}_{Am}\}\$  and energy conductance,  $\dot{v}$  based on the stage of development (Lika 120 et al., 2014). 121

Equations describing individual growth and allowing for the estimation of mortality under different environmental conditions depend on two forcing variables: temperature and food density. Temperature T influences all rates

Table 1: Implemented equations of the standard DEB model for an organism. [E] represents reserve density E/V with V the structural volume and E energy in reserve.

Equation	Definition
Physiological rates	
$\dot{p}_A = 0$	Embryos assimilation rate
$\dot{p}_A = c(T)f\{\dot{p}_{Am}\}V^{2/3}$	Larvae assimilation rate
$\dot{p}_C = [E] \frac{[E_G] \dot{v} V^{2/3} + \dot{p}_M}{\kappa [E] + [E_G]}$	Reserve mobilization rate
$\dot{p}_M = [\dot{p}_M]V$	Somatic maintenance rate
$\dot{p}_J = \dot{k}_J E_H$	Maturity maintenance rate
$\dot{p}_G = \kappa \dot{p}_C - \dot{p}_M$	Growth rate
$\dot{p}_R = (1 - \kappa)\dot{p}_C - \dot{p}_J$	Energy flux to maturation
State variables	
$\frac{dE}{dt} = \dot{p}_A - \dot{p}_C$	Energy in reserve
$\frac{dV}{dt} = \frac{\dot{p}_G}{[E_G]}$	Structural body volume
$\frac{dE_H}{dt} = \dot{p}_R(E_H < E_H^p)$	Energy investment to maturation
$\frac{dE_R}{dt} = 0$	Energy investment to reproduction

<sup>125</sup> through an Arrhenius function, defined as:

$$\dot{k}(T) = \dot{k}_{ref}c(T) \tag{1}$$

where  $\dot{k}_{ref}$  represents each physiological rate at the reference temperature  $T_{ref}$  (273 K). The term c(T) refers to the correction factor of temperature:

$$c(T) = exp[\frac{T_A}{T_{ref}} - \frac{T_A}{T}]$$
(2)

with  $T_A$  the Arrhenius temperature (in Kelvin).

The second forcing variable is the scaled functional response f, which follows a Holling Type II model with 0 being no food and 1 the maximal functional response and is described as follows :

$$f = \frac{X}{K_X + X} \tag{3}$$

with X, food density and,  $K_X$  the species-specific half saturation constant expressing the food density X, which provides half of the maximum uptake rate (Kooijman, 2009).

135

To simulate ELS growth and estimate mortality, we used the DEB param-136 eters, obtained from the AddmyPet database (Table 2; https://www.bio. 137 vu.nl/thb/deb/deblab/add\_my\_pet/). The initial reserve energy  $E_0$  of the 138 fish embryos depends on the mature female's conditions at the time of spawn-139 ing. For each simulation, we considered an egg spawned from a mother with 140 the maximum functional response (f = 1) at a temperature of  $T = 20^{\circ}C$ . 141 The initial structural volume  $V_0$  was estimated using  $V_0 = W_d^0/d_V$ , where 142  $W_d^0$  represents the initial dry weight and  $d_V$  represents the specific density 143 of the structure for dry weight. Lastly, the energy invested in maturity  $E_H^0$ 144 was set to 0. 145

#### <sup>146</sup> 2.2. External forcing along dispersal trajectories

To simulate Mediterranean environmental forcing conditions along ELS's dispersal pathways, a Lagrangian transport model was used (Lett et al., 2008) to obtain space- and time-dependent 3-dimensional trajectories. Then, food density and temperature conditions along each trajectory are extracted from

Parameter	Symbol	Unit	P. erythrinus	D. sargus	S. umbra
Arrhenius temperature	$T_A$	K	8000	8000	8000
Specific assimilation rate	$\{\dot{p}_{Am}\}$	$J/d.cm^2$	26.2038	115	54.2356
Energy conductance	$\dot{v}$	cm/d	0.05087	0.059223	0.075943
Allocation fraction to	$\kappa$	-	0.9659	0.90162	0.92491
soma					
Volume-specific somatic	$[\dot{p}_M]$	$J/d.cm^3$	17.09	21	8.6618
maintenance					
Maturity maintenance	$\dot{k}_J$	1/d	0.002	0.002	0.00050435
rate coefficient					
Specific cost of structure	$[E_G]$	$J/cm^3$	5231	5220.37	5239.49
Maturity at birth	$E_H^b$	J	0.02744	0.128	0.1823
Maturity at metamor-	$E_H^j$	J	24.03	1.491	5.166
phosis					

Table 2: DEB parameters available in AddmyPet for the studied species

the 4-dimensional (longitude, latitude, depth, time) outputs of a biogeochem-151 ical model ECO3M-Med coupled with the circulation model NEMO-Med12 152 (1/12° spatial resolution on a C-Arakawa grid). The NEMO (Nucleus for Eu-153 ropean Modelling Ocean) model computes current velocities, temperature, 154 and salinity fields based on hydrostatic primitive equations. It is coupled 155 offline with ECO-3M-Med which simulates biogeochemical tracers and zoo-156 plankton compartments, obtaining environmental data representative of the 157 Mediterranean pelagic seascape (Guyennon et al., 2015; Pagès et al., 2020). 158 Here, food consists of the biomasses of copepods, ciliates, and nanoflagellates 159  $(molCL^{-1})$ . More concretely, for this study, based on the Ichthyop model, 160 Lagrangian trajectories were simulated using velocity and recording position 161

(latitude, longitude, depth), plus temperature and food density along each 162 particle's trajectory on a daily basis. For this, a set of initial particles (885) 163 was seeded every 10 km along the western Mediterranean coastline (aligned 164 with the 10 m isobath) for the year 2005, with initial releases occurring every 165 15 days (twice a month). Transport was considered passive, as the effects of 166 egg buoyancy and fish larval swimming capacities were not included. This 167 choice was made as knowledge of species-specific active transport behaviors 168 is limited. 169

# 2.2.1. Growth model and mortality estimation under constant environmental conditions

To quantitatively estimate the influences of the environment on PLD and mortality, first simulations were carried out with constant temperature and food conditions within each model run, varying these values across multiple runs. We explored the range of sea water temperatures typical of the western Mediterranean sea (13-28°C; García-Monteiro et al. (2022)) and a functional response between 0 and 1.

Each simulation was run for a maximum duration equivalent to four times 178 the mean PLD  $(PLD_{mean})$  of each species, as derived from a compilation of 179 observed early-life traits (Table 3, Di Stefano et al. (2024)). The time inter-180 val from the start of simulations to birth and metamorphosis was recorded 181 based on the transitions between each development stage, as outlined in 182 the Subsection 2.1. Mortality was estimated using a duration of develop-183 ment  $(PLD_{simu}, duration from spawning to metamorphosis)$  criterion: par-184 ticles that did not reach birth or metamorphosis, as well as larvae for which 185  $PLD_{simu} > PLD_{mean} + 2std$  (standard-deviation), were considered dead. 186

Table 3: PLD and spawning periods from various sources, for the three species.  $PLD_{mean}$  and spawning months from Di Stefano et al. (2024). PLD literature from <sup>1</sup> Micale et al. (2006), <sup>2</sup> Macpherson and Raventos (2006), <sup>3</sup> Di Franco and Guidetti (2011), <sup>4</sup> Ducos et al. (2022), and <sup>5</sup> Millot et al. (2023).

Species	PLD literature (days)	PLD mean (days)	Spawning period
P. erythrinus	$28-30^{1}$	58	June-July
	$43.9^{2}$		
D. sargus	27.6 <sup>2</sup>	21	January-April
	$21.95^{3}$		
S. umbra	$25$ $^4$	36	May-June
	$35\ ^5$		

187 2.2.2. Growth and mortality under varying environment

Model setup. Second simulations were done by integrating the DEB model with temperatures and the functional response associated with the food density estimates obtained from the Lagrangian transport model (Subsection 2.2) in the Mediterranean sea (Figure 2), considering monthly spawning events.

Spawning events were modeled as the fortnightly particle releases on the 193 1st and 15th of the month, with total number of particles for a monthly event 194 being the sum of particles released on these two dates.

Firstly, to begin simulations of ELS trajectories, the half-saturation parameter  $K_X$  is species-specific and depends on local conditions, thus, it has to be fitted using temperature and food. To achieve this, DEB simulations were conducted using a range of  $K_X$  values. Each simulation started at the spawning month with the highest number of observed occurrences (Table 3) for each species in the western Mediterranean (Di Stefano et al., 2024).

For each simulation (*i* initial positions, *j* the different  $K_X$  values), the

resulting  $PLD_{simu;i,j}$  for each simulation was compared to the species-specific  $PLD_{mean}$ . The mean quadratic error, the so-called Standard-Error (SE) of all  $PLD_{simu;i,j}$  was calculated across all simulations for each  $K_X$  value as :

$$SE_{,j} = \frac{1}{N} \sum |PLD_{simu;i,j} - PLD_{mean}|^2 \tag{4}$$

Subsequently, the optimal  $K_X$  value was selected based on the lowest mean quadratic  $(\hat{SE}_j)$ , and it was used for the following simulations. The values are for *P. erythrinus*  $K_X = 4e-07$ , for *D. sargus*  $K_X = 2e-06$ , and for *S. umbra*  $K_X = 2e-06$ .

*PLD and mortality.* From the simulated trajectories, time at birth and at 209 metamorphosis,  $PLD_{simu}$  and the final position at time  $PLD_{simu}$  were recorded. 210 Mortality was estimated based on three criteria (Fig. 2). The first develop-211 ment criterion considers  $PLD_{simu} > PLD_{mean} + 2std$  as a limit for the 212 ELS growth duration. The second *dispersal* criterion takes into account the 213 bathymetry of the particle's final position at time  $PLD_{simu}$ , with lethal set-214 tlement happening offshore the 100 m isobath. Lastly, the third starvation 215 criterion considers the feeding condition of larvae. Organisms that experi-216 enced extended periods without enough food may undergo starvation, which 217 we considered as lethal. In the case of the larval DEB model, this occurs when 218 energy mobilized from reserves is not sufficient to pay for somatic mainte-219 nance costs ( $\kappa p_C < [p_M]V$ ) leading to structure break down, to pay for the 220 remaining costs which leads to larval shrinking (Augustine et al., 2011). 221

Total mortality is estimated as the ratio of final dead particles to the initial number of particles for each month and expressed as a percentage. First, mortality is estimated independently based on the three criteria: *de*- velopment mortality, dispersal mortality and starvation mortality. The total
mortality is then calculated as the intersection of the fulfilled criteria.

Based on the exponential mortality model (Mendiola et al., 2006), daily mortality rates (z, expressed in day<sup>-1</sup>) were estimated for each month of spawning and then the annual daily mortality rate was calculated as the average of the whole period.

$$z = \ln(N_0/N_t)/t \tag{5}$$

with  $N_0$  initial number of particles,  $N_t$  final number of particles and t, number of days for each month.

233

To evaluate the environmental conditions that embryos and larvae experienced, we analyzed the food density and temperatures encountered by each living particle throughout their trajectory from the time of spawning until  $PLD_{simu}$ . Additionally, to better understand the cause of success or failure of recruitment, we compared the  $PLD_{simu}$  between living and dead particles (those who underwent metamorphosis outside of the coastal area), and examined the food and temperatures encountered by dead particles.

#### 241 2.3. Spawning duration

In consideration of the diverse spawning behaviors reported in the literature for Mediterranean fish and the effect this can have in ELS growth and survival (James et al., 2003; Tsikliras et al., 2010; Peck and Hufnagl, 2012), one-peak spawning lasting 2, 4 and 8 consecutive months in 2005 were analyzed. The total initial particles of each spawning duration corresponds to the total number sum of all initial particles for the given months (e.g.



Figure 2: Integration of the physiological growth model (from the DEB theory) with the Lagrangian model, coupled to larval and adult observations (Di Stefano et al., 2024), in order to estimate  $PLD_{simu}$  and fish ELS mortality.

248 885 particles every 15 days, 1770 for each month. Totaling 3540 particles for 249 the 2-month duration configuration). Subsequently, total mortality percent-250 ages were estimated for each duration based on the intersection of the three 251 criteria, along with the associated standard deviation and the average daily 252 mortality rate.

#### 253 3. Results

#### 254 3.1. Simulations with constant environmental conditions

For all three species in constant conditions, simulations showed an in-255 crease of  $PLD_{simu}$  when temperatures or food density decreased, indicating 256 a slower development (Figure 3). Lower temperatures and insufficient food 257 density resulted in larvae not reaching metamorphosis before the prescribed 258 end of the simulation (4 times  $PLD_{mean}$ ). In other words, it leads to infinite 259 PLDs that increase total mortality due to development duration being slower 260 than those allowing ELS survival and subsequent metamorphosis. Further-261 more, estimated  $PLD_{simu}$  under the same temperature and functional re-262 sponse varied across species. Diplodus sargus exhibited a faster development 263 with  $PLD_{simu}$  ranging from 6 to 83 days, while Pagellus erythrinus had a 264 broader range from 49 to 231 days. Such differences are linked to parameter 265 values (Table 2), as *P. erythrinus* invests more energy to attain metamor-266 phosis than D. sargus and S. umbra. 267

Additionally, the models reproduced reasonably well the  $PLD_{mean}$  of the three species and the few observed PLDs taken from the literature (Table 3, Fig. 3) that overall fall within the range of the simulated values. *P. erythrinus* has a mean duration of 58.25 days, which is represented in an area



Figure 3:  $PLD_{simu}$  under constant conditions for a range of temperatures (13-28°C) and functional response (f = 0 - 1). Red continuous line represents the  $PLD_{mean}$ , the red dotted line represents the development criterion of mortality ( $PLD_{mean} + 2std$ ) and in dark blue and green are the conditions associated with the PLD reported in different studies. White area represents conditions where larvae did not reach metamorphosis. Note that for *Pagellus erythrinus*, the few PLDs reported in the literature were shorter than the simulated ones.

characterized by high temperatures and a high level of functional response. 272 In contrast, D. sargus displayed a mean duration of 21.13 days, represented 273 for a broader range of temperatures and levels of functional response. When 274 considering the *development* criterion in constant conditions, we observe a 275 similar pattern of variability across species. P. erythrinus, a species with 276 a long development, exhibited a limited range of viable conditions, charac-277 terized by a high level of functional response between  $\sim 0.65$ -1 and elevated 278 temperatures ranging from 25-28 °C. In contrast, D. sargus demonstrated a 279 broader range of viable conditions with values of functional response ranging 280 from  $\sim 0.25$  to 1 and across all temperatures tested. At an intermediary point, 281 our models showed that S. umbra individuals survive over an intermediate 282

#### <sup>283</sup> range of conditions.

#### <sup>284</sup> 3.2. PLD and ELS mortality estimates by coupled models

Using simulations with varying food density and temperature dynamics in 285 the western Mediterranean PLDs (Fig. 4) and total mortality (Fig. 5) were 286 obtained for one-peak spawning behavior every month of 2005.  $PLD_{simu}$ 287 estimates for the three species for living particles (Fig. 4) showed a winter 288 maximum, a decrease in late winter/early spring and an increase in the fall, 289 with the shortest PLDs simulated in late spring-early summer. When com-290 paring the average PLD (Fig. 4) with the values obtained from the literature 291 (Table 3), we observe that the average estimated PLD aligns with the aver-292 age from those reported in previous studies. However, there are differences 293 among studies (e.g. for Sciaena umbra, 10 days between studies). 294

Associated with these seasonal variations of PLDs, mortality estimates 295 based on the *development* criterion showed similar seasonal cycles with the 296 lowest mortality modeled in late spring / early summer (Fig. 5). Conversely, 297 mortality associated with ELS dispersal showed the opposite pattern, reach-298 ing their maximum during summer but with a less marked seasonality. Mor-299 tality caused by a long period of starvation did not occur here. Finally, total 300 mortality percentages for all species displayed a bi-modal pattern, reaching 301 its minimum ( $\simeq 35-60\%$ ) during the late spring-early summer periods, and 302 larger values ( $\simeq 40-100\%$ ) during the rest of the year. 303

When comparing mortality between species, slow development species such as *P. erythrinus* presented higher total mortality and daily mortality rates (50-100%; Fig. 5A and 0.057 d<sup>-1</sup>; Table 4) in comparison to fast development species such as *S. umbra* whose total and daily mortality rates



Figure 4: Average PLD estimate of alive ELS particles for P. erythrinus (A) in red, D. sargus (B) in green and S. umbra (C) in blue for each month of 2005, black error bars represent the associated standard deviations. Bars on the right represent the annual mean of all PLDs.

are lower (Fig. 5C), or *D. sargus* with the lowest total mortality across the months and the lowest daily mortality rate (60% maximum; Fig. 5B) and 0.017 d<sup>-1</sup>). Furthermore, as mentioned in Section 3.1, *D. sargus* survived under more variable conditions than *S. umbra* and *P. erythrinus*. The latter, for example at low food and high temperature (Fig. 3), presented a decreasing  $PLD_{simu}$  insufficient to survive in comparison to *D. sargus*.

Additionally, by taking into consideration the *development criterion*, statistics of temperature, food density and  $PLD_{simu}$  associated to alive and dead larvae were evaluated (Fig. 6). This analysis suggested that between April and September, temperatures encountered by larvae were elevated (around 20-25°C) and  $PLD_{simu}$  decreased for the three species, while being associated



Figure 5: ELS mortality percentage estimates for P. erythrinus (A), D. sargus (B) and S. umbra (C) for monthly spawning events (considering simulations initialized on the 1st and 15th of each month) over 2005. Note the partitioning of the different mortality sources: dispersion mortality (light blue), development mortality (blue), which have been estimated independently, and the total mortality (dark blue) considering the intersection of both criterions.

with the lowest total mortality (Fig. 5). In fall and winter, PLDs lengthen in concert with cooling temperatures. Remarkably, the months when seawater temperatures spanned 10-18°C coincides with highest mortality for the three species, with some species having less tolerance to low temperatures. None of the larvae of *P. erythrinus* survived during January-February (Fig. 6A) with a mean temperature of ~ 14°C, in contrast with *D. sargus*, with 40% of

Table 4: Mean daily mortality rate  $(z_{my})$  for the three species and the associated standard deviation (n=12 months).

Species	$z_{my} (d^{-1})$	std
Pagellus erythrinus	0.057	0.076
Diplodus sargus	0.017	0.005
Sciaena umbra	0.054	0.026

larvae not surviving when experiencing temperatures between 11-13°C. Concerning food availability, a weaker seasonal cycle was simulated but there was no obvious relationship nor concomitant evolutions with our prognostic variables (PLD or mortality). It is probably related to the fact that food is not a limiting factor here, as indicated in the previous section.

#### 330 3.3. Effect of spawning behavior

When exploring different spawning duration, the total mortality percent-331 ages and daily mortality rate patterns illustrated in Fig. 7 are similar to 332 those represented in Fig. 5. There is a decrease in total mortality percentage 333 throughout the year, with minimum mortality in late-spring early-summer, 334 and an increase in mortality in fall and winter. Moreover, as the spawning 335 duration extends, the variability in mortality diminishes, resulting in less 336 variable total mortality. Regarding differences among species, *Pagellus ery*-337 thrinus and Sciaena umbra exhibited total, mean and daily mortality rates 338 higher and more variable than that of *Diplodus sargus*, across all considered 339 spawning durations. When comparing total mortality percentages with cur-340 rent knowledge on species' spawning periods (Table 3), the tested months 341 and duration configurations indicate a potential successful dispersal. 342

#### 343 4. Discussion

#### 344 4.1. Estimating mortality

The offline coupling of a biophysical model of environmental conditions into a growth species-specific model allows us to explore the effect of different conditions on larval mortality considering individual trajectories. Larvae



Figure 6: Environmental conditions and PLD of *P. erythrinus* (A, D, G), *D. sargus* (B, E, H) and *S. umbra* (C, F, I) of alive and dead larvae for monthly spawning events (considering simulations of the 1st and 15th of each month) over 2005. First row: temperature (°C); second row: food density (mol.C.L<sup>-1</sup>); third row:  $PLD_{simu}$  (days). Boxplot range represents the 25th and 75th percentile and the median is represented by a horizontal bar; the red dot represents the mean value.

experiencing increasing temperatures associated with late-spring and early summer spawning months had a faster development and lower mortality in comparison to low-temperature spawning periods (Fig. 6 and Fig. 7). Our



Figure 7: Early-life stages total mortality percentages (%) for *Pagellus erythrinus* (A, D, G), *Diplodus sargus* (B, E, H) and *Sciaena umbra* (C, F, I) for spawning durations of 2 (first row), 4 (second row) and 8 (third row) months and the associated daily mortality rate (red line, in  $d^{-1}$ ).

simulated PLDs show that the mean  $PLD_{simu}$  (Fig 4) decreases for each species as temperature increases throughout the year from 13-28°C (Fig. 6). This is consistent with a reduction of the PLD when water temperature increases (Raventos et al., 2021), leading to a higher recruitment percentage and a lower mortality (Lett et al., 2010). Specifically, Raventos et al. (2021)
reported a decline of 20-25% of the measured PLD of Mediterranean species
when simulating increasing temperatures from 14 to 28°C.

Food availability is also a source of mortality; however this condition was 358 never met as the reserve quantity to cover maintenance cost was always suf-359 ficient. Nonetheless, fluctuations of food density, particularly during periods 360 of low food availability, may have caused growth limitations, increasing time 361 to metamorphosis and thus contributing indirectly to total mortality. Previ-362 ous modeling studies using DEB-Ichthyop have shown sensitivity of Peruvian 363 anchovy growth to temporal food density variations thus showing that food 364 may not be the cause of mortality but a limiting factor when considering 365 temporal variation (Flores-Valiente et al., 2023). However, special attention 366 has to be taken as food assimilation is highly dependent on the parameters 367  $K_X$ , here estimated as a function of the most recurrent spawning month for 368 each species. Re-evaluating this parameter thus have an effect on mortality 360 estimation due to starvation conditions or change in  $PLD_{simu}$ , as species 370 with higher  $K_X$  take longer to reach metamorphosis. 371

The *dispersal criterion* results in mortality estimates that were lower in 372 winter when species develop slowly and higher in spring-summer when tem-373 peratures and food density results in a fast development. This may indicate 374 complex interactions between the seasonal variability of temperature, food 375 availability and of the oceanic circulation (Pinardi and Masetti, 2000), with 376 larvae spawned in summer having greater probabilities to be exported outside 377 of the coastal area. Indeed, the Northern Current in the Mediterranean sea 378 is stronger in winter than summer, limiting the cross shelf transport (Birol 379

et al., 2010; Bourg et al., 2024) and this generalizes to other coastal currents. These results are in accordance with the *fast growth-high survival* hypothesis stating that faster growing species experience less mortality as they spend less time in the water column exposed to predation, harsh environment or unfavorable advection (Houde, Edward, 1987; Houde, 1997; Robert et al., 2023).

Mortality of planktonic organisms is currently estimated based on size 386 dependent models and catch-curve estimations established on length or age 387 with daily mortality rates varying between  $z \simeq 1 \ d^{-1}$  and 0.01  $d^{-1}$  (Peterson 388 and Wroblewski, 1984; Pepin, 1991; Houde, 1997; Pepin, 2016). Previous 389 studies have coupled a DEB model with Ichthyop trajectories, estimating 390 larval recruitment with different physical and biological processes, using a 391 constant mortality rate (Flores-Valiente et al., 2023). In our study, the use 392 of a coupled model allows us to simultaneously account for individual, spa-393 tial, and temporal variability driven by intertwined biological and physical 394 factors and to separately quantify mortality percentages based on these com-395 ponents. Following these methods, our estimated z ranged between 0.02 for 396 faster development species such as D. sargus and 0.06 for slow development 397 species such as *P. erythrinus*. These estimates are within the lower range 398 of previously published values (Peterson and Wroblewski, 1984; Pepin, 1991; 399 Houde, 1997; Pepin, 2016); for instance, it is an order of magnitude below 400 those reported for other species using advection models and common mor-401 tality estimation methods (White et al., 2014). 402

#### 403 4.2. Model implementation evaluation

Using parameters values available in the AddmyPet (AmP) database for 404 simulations of embryo and larval growth under constant conditions allowed 405 the simulation of realistic ranges of PLDs for three Mediterranean fish species. 406 The discrepancies between  $PLD_{mean}$  and  $PLD_{simu}$  may result from differ-407 ences in approaches and data used. AmP parameters used to simulate growth 408 and to estimate  $PLD_{simu}$  were derived from various sources, including meso-409 cosm experiments for P. erythrinus and S. umbra and data of adult otoliths 410 collected in the wild for *D. sargus* (Gordoa and Molí, 1997; Lika et al., 2014). 411 In mesocosm studies, ELS are reared under controlled conditions to optimize 412 larval growth, often resulting in faster development than in wild populations 413 (Papandroulakis et al., 2014), hence suggesting larger errors for  $PLD_{simu}$  of 414 P. erythrinus and S. umbra, than for D. sargus. Moreover,  $PLD_{mean}$  for 415 all three species was mainly estimated from in-situ observations (Di Stefano 416 et al., 2024), which implies PLD estimations closer to what one would expect 417 in the wild. In practice, both PLD estimates have distinct sources of error 418 that are difficult to evaluate and integrate in a coupled model. 419

The simulated PLD and mortality results from the species-specific pa-420 rameters. Differences in  $PLD_{simu}$ , are linked to peculiar parameters' values 421 in Table 2 (Kooijman, 2009). Indeed, P. erythrinus invests more energy to 422 attain metamorphosis than D. sargus and S. umbra. Moreover, the different 423 mortality percentages for *Diplodus sargus* are the results from high assimila-424 tion rates and small acceleration factor, resulting in rapid development and 425 low mortality with little variations of mortality among spawning behaviors. 426 In comparison, *Sciaena umbra* was distinguished as an intermediate species 427

with slower development and a metabolic acceleration parameter comparable to fast-growing species such as *D. sargus*. However, it has a lower maximum assimilation rate, meaning that the assimilation of food takes longer, which lengthens PLDs and results in higher total mortality than *D. sargus*.

The estimation of ELS mortality was based on three criteria and existing 432 knowledge of fish ELS growth (Fig. 2). The development criterion was set 433 as  $PLD_{mean} + 2std$  due to proven intra-specific variability of the PLD in 434 other species, exhibiting variations across spatial and temporal scales (Bay 435 et al., 2006; Di Franco and Guidetti, 2011). To account for this variabil-436 ity, we considered the upper limit of variation, representing the maximum 437 time larvae can delay metamorphosis under varying environmental conditions 438 (Searcy and Sponaugle, 2000). However, the mean and standard deviation 439 values used here were derived from a compilation of observed PLDs col-440 lected in various areas of the western Mediterranean Sea (Di Stefano et al., 441 2024) that may not represent well the full range of plasticity expected from 442 dispersal traits in such variable marine environments. Thus, dividing the 443 Mediterranean in different areas according to spawning and settlement be-444 havior (Di Stefano et al., 2022), as well as oceanographical regions (Avata 445 et al., 2018), and using the PLD according to these zones may result in more 446 realistic mortality estimates. For instance, theoretical expectations are to 447 model higher mortality in oligotrophic regions due to low food availability 448 potentially leading to starvation, and lower mortality in zones characterized 449 by more favorable environmental conditions. 450

As for the *starvation* criterion that does not appear significant in this study, it may be due to the estimation of  $K_X$ , that depends on the food out<sup>453</sup> put. Indeed, significant uncertainties remain regarding the total zooplankton <sup>454</sup> from the Eco3M-MED model, which is used as a proxy of food density. First, <sup>455</sup> due to the model spatial resolution ( $\sim 8$  km), modeled food is not as variable <sup>456</sup> as in reality. Second, it is possible that the model overestimates the amount <sup>457</sup> of food available for ELS growth and development (Guyennon et al., 2015; <sup>458</sup> Pagès et al., 2020). To illustrate this, future simulations with different food <sup>459</sup> availability scenarios in the Mediterranean may be of interest.

Regarding the *dispersal* criterion, we considered the bathymetry at po-460 sition  $PLD_{simu}$ . As larvae may decrease swimming capacities before meta-461 morphosis (Ducos et al., 2022), and given that the three studied species are 462 demersal, we assumed that larvae would not have the swimming capabili-463 ties to return to the settlement site if the metamorphosis occurs at depths 464 exceeding 100 m (Rochette et al., 2012). Even so, using maximum larvae 465 bathymetry and settlement species-specific sites could improve the reliability 466 of modeled mortality estimates. 467

Finally, using the coupled growth biophysical model has allowed us to test 468 different spawning strategies and explore their impacts on dispersal success. 460 Our findings provide insights on how various spawning strategies, along with 470 species-specific characteristics, can result in contrasted mortality estimates 471 and daily mortality rates, exemplifying the classical match-mismatch hypoth-472 esis (Peck et al., 2012). Our simulations also suggest that spawning periods 473 differing from those commonly reported for Mediterranean species (typically 474 late spring-early summer) (Tsikliras et al., 2010; Mouine et al., 2012) may be 475 more viable than previously thought. 476

#### 477 4.3. Models' limitations and future improvements

Observations were used here to validate the main models' outputs, namely 478 our simulated PLDs (see also Fig. 3) and mortality estimates (see also Section 479 4.1). The large spreads exemplified in the range of values found in the liter-480 ature suggest that both the mortality and typical durations of ELSs are still 481 not well constrained or understood. To narrow down these uncertainties, a 482 more thorough collection of datasets derived from different sources (e.g. lab-483 oratory experiments, compilation of field and aquaculture data) should help 484 refine our knowledge of larval traits (Mounier et al., 2020). Additionally, the 485 quantity of initial energy  $E_0$  provided by the mother at the time of spawning 486 was considered identical among particles, without considering the effect of 487 the individual reproductive outputs on offspring conditions (Maddams and 488 McCormick, 2012; Burton et al., 2013). This effect could be simulated based 489 on biotic or abiotic factors experienced by the mother as for example, eggs 490 that begin their dispersal with lower energy content may be more susceptible 491 to long periods of starvation, resulting in a decrease in PLD and therefore 492 an increase in mortality (Augustine et al., 2011). Similarly, the inclusion 493 of larval swimming capacities, which was not considered here, could improve 494 trajectory estimates, and thus change the abiotic conditions encountered dur-495 ing dispersal (e.g. increasing the number of settled fish) (Berenshtein et al., 496 2018; Faillettaz et al., 2018; Leis, 2020). 497

In this study, we considered mortality sources related to development time, advection, and starvation. However, one mortality factor not accounted for here is the effect of lethal temperatures. High temperatures can accelerate ELS development time up to a certain limit, beyond which enzyme activity

becomes inhibited (Kooijman, 2009; Illing et al., 2020; Flores-Valiente et al., 502 2023). Including an upper thermal limit based on the species-specific ther-503 mal thresholds could improve estimates of PLDs and mortality. Additionally, 504 another important source of mortality for fish ELS is predation, which has 505 been neglected in this study. Such a term could be included in this type 506 of modeling by setting a function of mortality based on length (i.e. "bigger 507 is better") and/or growth rate (i.e. "growth-dependent" mortality) of the 508 organism (Cowan, 1996). Alternatively, predator-prey fields could be evalu-509 ated to study prey-predator interactions; however, these interactions remain 510 a challenge due to a mismatch in model resolutions (Peck and Hufnagl, 2012). 511

#### 512 5. Conclusions

We modeled the Pelagic Larval Duration and mortality of Fish ELS using 513 a multidisciplinary approach thanks to the off-line coupling of two Individual-514 Based Models simulating larval physiology and current-driven dispersal. The 515 spatially- and temporally-explicit forcing variables (e.g. seawater tempera-516 ture, planktonic food and currents) were provided by an external state-of-the-517 art coupled biogeochemical-hydrodynamical model. Focusing on three dem-518 ersal coastal Mediterranean fishes, our study allowed us to estimate ELSs' 519 duration and mortality under constant conditions within the ranges reported 520 in the literature, while exemplifying significant differences among species re-521 lated to physiological parameters. When considering the full variability of 522 conditions encountered during dispersal in a highly heterogeneous seascape, 523 we analyzed how simulated growth and mortality vary over a realistic sea-524 sonal cycle while testing different spawning phenology. Counter-intuitive 525

results suggest that this framework is well adapted to investigate further the classical "match-mismatch" hypothesis and the complex growth-survival relationship (Robert et al., 2023). Finally, while just one exemplary year was used here, such coupled models can be run over longer periods to decipher the variability of ELS survival, and the processes behind it, at inter-annual as well as climatic time-scales (Rose et al., 2024).

#### 532 6. CRediT authorship contribution statement

MJL: Investigation, Conceptualization, Methodology, Visualization, Writing - Original Draft, Writing - Review & Editing. LB: Funding acquisition,
Supervision, Conceptualization, Writing - Review & Editing. MDS: Resources, Writing - Review & Editing. VR: Funding acquisition, Supervision,
Conceptualization, Writing - Review & Editing.

#### 538 7. Declaration of Competing Interests

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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