

Decrease in diatom palatability contributes to bloom formation in the Western English Channel

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Abstract:

The aim of this paper is to investigate the role of phytoplankton nutritional status in the formation of the spring bloom regularly observed at the station L4 in the Western English Channel. Using a modelling approach, we tested the hypothesis that the increase in light from winter to spring induces a decrease in diatom nutritional status (i.e., an increase in the C:N and C:P ratios), thereby reducing their palatability and allowing them to bloom. To this end, a formulation describing the Stoichiometric Modulation of Predation (SMP) has been implemented in a simplified version of the European Regional Seas Ecosystem Model (ERSEM). The model was coupled with the General Ocean Turbulence Model (GOTM), implemented at the station L4 and run for 10 years (2000–2009). Simulated carbon to nutrient ratios in diatoms were analysed in relation to microzooplankton biomass, grazing and assimilation efficiency. The model reproduced *in situ* data evolutions and showed the importance of microzooplankton grazing in controlling the early onset of the bloom. Simulation results supported our hypothesis and provided a conceptual model explaining the formation of the diatom spring bloom in the investigated area. However, additional data describing the microzooplankton grazing impact and the variation of carbon to nutrient ratios inside phytoplanktonic cells are required to further validate the proposed mechanisms.

Highlights

► Abiotic and biotic mechanisms underpin bloom dynamics. ► Phytoplankton nutritional status contributes to bloom formation and evolution. ► High C:P in diatoms reduces the transfer of carbon to the higher trophic levels.

32 INTRODUCTION

Phytoplankton blooms are important events triggering a series of processes and trophic interactions which impact the whole marine ecosystem, from biogeochemical cycles to secondary production and fisheries (Legendre, 1990; Irigoien et al. 2005). These blooms manifest as a dramatic increase in the phytoplankton standing stock over a relatively short period of time.

Some studies have emphasised the role of the physical environment in creating the conditions required for a bloom (Huisman et al., 1999; Taylor and Ferrari 2011; Smyth et al, 2014) while others have suggested that biotic factors such as grazing and phytoplankton physiology could also play a critical role (Irigoien et al., 2005; Mitra and Flynn 2006). However, a conceptual model integrating the contribution of abiotic and biotic elements to the formation and evolution of a phytoplanktonic bloom is still lacking.

Recently, Smyth et al (2014) suggested that the air-sea heat flux play a crucial role in 44 triggering phytoplankton blooms in the Western English Channel. By analysing historical 45 time series data, station I.4 south of Plymouth 46 at (http://www.westernchannelobservatory.org.uk), these authors found that the beginning of the 47 phytoplankton blooms regularly (on average by 30 days) follows the inversion of the net heat 48 flux (NHF) into the ocean from negative to positive. Positive NHF (i.e., heat flux from 49 atmosphere to ocean) decreases the turbulence and hence vertical mixing. This leads to an 50 increase in the residence time of phytoplankton in the euphotic zone allowing some 51 phytoplanktonic groups (such as diatoms) to escape grazing control and form blooms. In 52 contrast, phytoplankton stocks are likely to be controlled by microzooplankton during winter 53 when the NHF is negative (i.e., heat flux from ocean to atmosphere) and increase in vertical 54 mixing prevents an adequate light exposure for growth. 55

All the above mentioned physical factors not only affect directly the timing and amplitude of the bloom but also have the potential to modulate biotic responses which facilitate phytoplankton growth. In particular, the increased residence time in the well-lit layer of the water column and the consequent increase in light exposure might have significant effects on the interactions between phytoplankton and grazers, potentially favouring the increase of phytoplankton biomass.

Previous laboratory and field studies have shown that under increasing light and temperature, 62 the ratio of carbon to nutrient in phytoplankton increases (Urabe and Sterner, 1996; Hessen et 63 al., 2002; Martiny et al., 2013) with significant consequences for the performance of grazers 64 feeding on them (Urabe and Sterner, 1996; Hessen et al., 2002). Urabe and Sterner (1996), 65 studying a predator-prey system comprising an alga prey consumed by a predatory 66 zooplankton, found that (under experimental conditions) the growth of the grazer was related 67 68 to the ratio between light and the limiting nutrient. Interestingly, the grazer growth rate was linearly related to the algal biomass only at low light intensity while, at increasing light 69 70 levels, it started to decrease due to the decrease in the nutrient quality of the prey. This result 71 was interpreted by invoking decoupling between photosynthesis and nutrient uptake which occurs under high light to nutrient ratio. 72

The cellular imbalance between carbon and nutrient made the algae less palatable for 73 zooplankton. Unlike phytoplankton, zooplankton physiology does not allow a substantial 74 variability of internal stoichiometry (Loladze et al., 2000, Siuda and Dam, 2010) and 75 therefore requires nutrient rich prey to grow efficiently. Various studies have demonstrated 76 77 that even small changes in phytoplankton stoichiometry can be associated with significant changes in food palatability and therefore affect zooplankton prey selection, physiological 78 processes and thus efficiency (Flynn et al., 1996; Jones and Flynn, 2005). Loladze et al. 79 (2000) proposed a model in which an increase in the carbon to nutrient ratio in 80

phytoplankton, triggered by an increase in light, induces a decrease in zooplankton (carbon)
assimilation efficiency, concluding that an increase in energy (light) is not of advantage to the
whole system but only for the primary producers (i.e. the paradox of energy enrichment).

Although these mechanisms are experimentally well documented and various theoretical and 84 mechanistic models have been developed on them (Loladze et al., 2004; Hall et al., 2004; 85 Mitra, 2006; Diehl, 2007; Stief et al., 2010; Elser et al., 2012), they have never been tested in 86 relation to the phytoplankton bloom formation under realistic seasonally changing 87 environmental conditions (i.e., nutrient and light). Furthermore, the effect of phytoplankton 88 nutritional quality on grazers has never been implemented in a fully structured marine 89 ecosystem model. Typically, marine ecosystem models are poor at describing zooplankton 90 grazing as they often have very rigid food webs (Sailley et al., 2013; Mitra et al., 2014) and 91 this strongly limits their utilization for the investigation of predator-prey dynamics. 92

The effect of phytoplankton quality (described as nutrient stoichiometry) on the ingestion and 93 94 assimilation efficiencies of a consumer has been termed Stoichiometric Modulation of Predation (SMP, Mitra 2006). The importance of inclusion of SMP when simulating 95 planktonic predator-prey interactions against experimental datasets has been demonstrated for 96 97 both micro- and meso-zooplankton (Mitra, 2006; Mitra and Flynn 2006; Mitra and Flynn 2007). Mitra (2006) in particular has shown that the inclusion of SMP in a zooplankton 98 model significantly improved the simulation of the interactions between 99 the microzooplankton Oxyrrhis marina and the phytoplankton Isochrysis galbana observed by 100 Flynn and Davidson (1993). However, these studies have mainly focussed on model 101 validation using laboratory data; i.e., SMP has not been tested in a realistic ecosystem 102 framework. 103

104 In this paper, we have integrated the SMP (Mitra, 2006) into the European Regional Seas Ecosystem Model (ERSEM, Blackford et al., 2004) with the aim to explore how the 105 combination of abiotic factors (e.g., NHF) and biotic mechanisms (e.g., SMP) impact on 106 107 plankton bloom dynamics. To this end, the revised version of ERSEM (hereafter ERSEM-SMP) has been coupled with the General Ocean Turbulence Model (GOTM, Burchard et al 108 1999), implemented at the station L4 (50° 15'N, 4° 13'W) and tested against the high 109 frequency observations at that site. Our working hypothesis is that the increase in light 110 exposure experienced by diatoms in the transition between winter and spring may result in 111 changes in the internal stoichiometry of the diatoms, reducing grazing pressure and thence 112 favouring increase in their biomass. 113

We focus on station L4 because it has an extensive time series data of phytoplankton and 114 zooplankton abundance, coupled with measurements of physical properties and nutrients. In 115 116 addition to diatoms, the dominant primary producers, *Phaeocystis* blooms are also regularly observed at this site with intense but short-lived peaks during spring. Coccolithophorids may 117 118 also occasionally bloom but rarely attain the high cellular density of diatoms (Widdicombe et al., 2010). Microzooplankton are observed to peak concomitantly (typically ciliates) or just 119 after (heterotrophic dinoflagellates) the diatom bloom, albeit with high variability in timings 120 from year to year (Atkinson et al. this issue). This group achieves a higher biomass at L4 than 121 mesozooplankton (Atkinson et al. this issue) and due to higher specific metabolic rates is 122 likely to dominate the grazing impact (Calbet and Landry, 2004; Irigoien et al., 2005; 123 Bautista and Harris, 1992; Atkinson et al., unpublished data). Simulation of phytoplankton 124 internal stoichiometry and biomass, along with microzooplankton biomass, grazing and 125 assimilation efficiency were critically analysed and used to test our hypothesis. Simulated 126 diatoms, microzooplankton and nutrients were compared with available in situ data. 127

129 THE MODEL

ERSEM is a bulk biomass functional group ecosystem model describing the nutrient and 130 carbon cycle within the lower trophic levels of the marine ecosystem. Model state variables 131 include living organisms, dissolved nutrients, organic detritus, oxygen and CO2. A key 132 feature of ERSEM is the decoupling between carbon and nutrient dynamics allowing the 133 simulation of variable stoichiometry within the modelled organisms. Chlorophyll is also 134 treated as an independent state variable following the formulation proposed by Geider et al. 135 (1996). Consequently, each plankton group is modelled using up to five state variables 136 describing each cellular component: carbon, nitrogen, phosphorus, silicon (only for diatoms) 137 138 and chlorophyll-a. These features make ERSEM particularly suitable for this work.

In order to test our hypothesis which specifically focuses on the diatoms-microzooplankton 139 grazing interactions, we have simplified the standard ERSEM food web described in 140 Blackford et al (2004) as shown in Fig. 1. The rationale behind this is to "isolate", as far as 141 142 possible, the biotic processes to be investigated (e.g., diatom quality and allied impact on microzooplankton growth dynamics) and therefore making it easier to quantify their 143 relevance. Thus, our model is based on a predator-prey system (accounting for SMP) 144 comprising of diatoms (P1), considered as the dominant bloom-forming phytoplankton at L4 145 and microzooplankton (Z1) considered as the dominant grazers of diatoms; Z1 represents the 146 fraction of microzooplankton (e.g., dinoflagellates such as Gyrodinium and Protoperidinium; 147 $\sim ESD > 20 \,\mu m$) large enough to graze diatoms. To make the system more realistic and 148 consistent with the L4 observations, we have also introduced a second phytoplankton 149 functional group accounting for small (non-diatoms) phytoplankton (P2) and their grazers 150 (Z2). P2 includes a variety of groups (e.g., nanoflagellates and Phaeocystis) expressing a 151 wide range of traits and thus represents generic autotrophic activity at a lower size range; i.e., 152

P2 has been included to ensure that diatoms have competitors for nutrients at the beginning of the bloom. Z2 represents the smaller fraction of microzooplankton (i.e., ciliates such as *Strombidium*) assumed to be specialised to feed on phytoplankton (mainly nanoflagellates) smaller than blooming diatoms.

Finally, a top closure mimicking the mesozooplankton grazing on microzooplankton is represented by Z3. The interactions between P2 and Z2, and Z3 and Z1 are modelled through the standard ERSEM formulation (Blackford et al., 2004) without the inclusion of SMP. Z2 and Z3 do not have predators within the model but they are assumed to cannibalize (Fig 1) and thus mimicking a density dependent top down closure. Bacteria are not explicitly modelled but are implicitly represented through remineralisation of detritus (equal to 0.05 d^{-1}) producing dissolved nutrients and CO₂.

As we focus on the formation and evolution of diatom blooms occurring between April and July we did not consider the autotrophic dinoflagellates, which usually bloom in late summer and/or early autumn (Widdicombe et al., 2010). It is worthwhile to recall that this simplified food web is not meant to represent the entire plankton community with allied complexities in their interactions as observed at L4, rather our aim is to focus on one specific process.

Silica regeneration in the water column is not considered in the standard ERSEM formulation where biogenic silica is assumed to be regenerated only via the benthic compartment. However, in order to prevent extreme silica limitation we have assumed a simple first order silica remineralisation converting biogenic particulate silica to dissolved silica at a fixed rate of 0.1 d⁻¹. This simple assumption is consistent with experimental evidences suggesting that up to 50% of the biogenic silica (opal) is re-generated in the euphotic zone (Sarmiento and Gruber, 2006).

A complete description of the equations, basic assumptions and underlying philosophy of ERSEM can be found in Blackford et al. (2004). Here we limit our description to the formulation describing Z1 which is the only part of the model altered with respect to the original model. The general equation for Z1 carbon biomass is given by the balance between grazing (gra), and loss terms due to respiration (res), excretion (exc), natural (nonpredation) mortality (*mort*) and predation mortality (*pred*):

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$$\frac{dZ}{dt} = \frac{dZ}{dt} \Big|_{t}^{gra} - \frac{dZ}{dt} \Big|_{t}^{res} - \frac{dZ}{dt} \Big|_{t}^{exc} - \frac{dZ}{dt} \Big|_{t}^{mort} - \frac{dZ}{dt} \Big|_{t}^{pred}$$
(1)

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Grazing is described using a "potential" grazing term (*grazing*') multiplied by a factor
taking into account the nutritional quality of the prey:

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$$\left. \frac{dZ}{dt} \right|^{gra} = grazing' * FQ$$
 (2)

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FQ is the function linking the potential grazing to the stoichiometry of phytoplankton described below (equation 6). grazing' is described using the classical Michaelis-Menten formulation as reported in Blackford et al., (2004):

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$$grazing' = Z * temp * r \frac{P'}{P' + K}$$
 (3)

Where Z is the zooplankton biomass, *temp* is a function accounting for the temperature dependency, r the potential grazing rate and P' the available food. K is the half saturation constant for food. P' is given by the biomass of the prey (P) multiplied by a parameter representing the "preference" for that particular prey ( $P_f$ ) and scaled by a Michaelis Menten 198 function accounting for a food threshold parameter (*minfood*) which prevents excessive199 grazing of scarce prey:

$$200 \quad P' = P_f * P * \frac{P}{P + minfood} \tag{4}$$

The function *temp* describes an enhancement of physiological processes with the increase of
 temperature following a Q<sub>10</sub> function:

203 
$$temp = Q_{10}^{\left(\frac{(T-10)}{10}\right)}$$
 (5)

*FQ* is a function linking the grazing with the nutritional quality of the phytoplankton,described here using nutrient stoichiometry and is given by:

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$$FQ = 1 + \left[1 - \min\left(\frac{qpP}{qpZ}, \frac{qnP}{qnZ}, 1\right)\right] * a$$
(6)

where qpP and qpZ are the phosphorus to carbon (P:C) ratios of phytoplankton and zooplankton respectively, and qnP and qnZ are the nitrogen to carbon (N:C) ratios in phytoplankton and zooplankton respectively. *a* is the parameter describing the response of the grazers to the decrease in quality of the prey (Mitra, 2006). In this work we have assumed a decrease of ingestion associated with low nutrient content of the prey (i.e., decrease in palatability) and as such, we have considered *a* equal to -1.

Respiration is composed of a basal component (depending on biomass) and a metabolic-activity related component (depending on ingestion):

215 
$$\frac{dZ}{dt}\Big|^{res} = R_r * temp * Z + \frac{dZ}{dt}\Big|^{gra} * A_r * AE$$
(7)

Assimilation efficiency (AE) is assumed to vary between a minimum and a maximum value
(assumed to be 0.25 and 0.75, respectively) and is given by:

218 
$$AE = AE_{min} + (AE_{max} - AE_{min}) * FQ_{AE}$$
(8)

where  $FQ_{AE}$  is the function linking the phytoplankton quality (C:N:P) to the assimilation efficiency of zooplankton (Mitra, 2006) and is given by:

221 
$$FQ_{AE} = \min(1, N_{lim}, P_{lim}) * (1 + K_{AE}) \min\left(1, \frac{qpP}{qpZ}, \frac{qnP}{qnZ}\right)$$
 (9)

In Eq. 9,  $K_{AE}$  is the half saturation constant as described in Mitra (2006)

223  $N_{lim}$  and  $P_{lim}$  are two Michaelis Menten-like functions given by:

224 
$$N_{lim} = \frac{\frac{qnP}{qn_{max}}}{\frac{qnP}{qn_{max}} + K_{AE}}$$
(9.1)

225 and

226 
$$P_{lim} = \frac{\frac{qpP}{qp_{max}}}{\frac{qpP}{qp_{max}} + K_{AE}}$$
(9.2)

227  $qp_{max}$  and  $qn_{max}$  are the maximum phytoplankton P and N quota (i.e., N:C and P:C ratios), 228 respectively, assumed to be equal to the double of the nutrient content implied by the 229 Redfield ratio (Blackford et al., 2004, Table 3)

230 Loss term due to excretion is governed by the following equation:

$$231 \quad \left. \frac{dZ}{dt} \right|^{exc} = \left. \frac{dZ}{dt} \right|^{gra} * (1 - AE) \tag{10}$$

Non-predation mortality loss is assumed to be composed by a constant term plus anadditional fraction triggered by low oxygen concentration

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$$\left. \frac{dZ}{dt} \right|^{mort} = Z * \left( (1 - eO_2) * r_{mortox} + r_{mort} \right)$$
(11)

 $r_{mort}$  and  $r_{mortox}$  are the background mortality rate and the mortality rate at low oxygen concentration, respectively.  $eO_2$  is an oxygen limitation factor calculated from the relative oxygen saturation ( $O_{rel}$ ) and the half saturation mortality rate constant ( $h_{oxmort}$ ):

238 
$$eO_2 = (1 + h_{oxmort}) * \left(\frac{O_{rel}}{O_{rel} + h_{oxmort}}\right)$$
(12)

The ingestion of nutrient via grazing is derived by equation 3 and reflects the nutrient content of the ingested prey. In the same way, the loss of nutrient via excretion, mortality and predation is depending on the carbon to nutrient ratio of zooplankton. Additionally, any nutrient in excess of a threshold value  $(qZ_{max}^{N,P})$  is assumed to be directly excreted to the inorganic pool (phosphate and ammonium).

Model parameters describing the communities Z1, Z2 and Z3 are listed in Table 1. The 244 parameters for the phytoplankton functional groups P1 and P2 are the same as in Blackford et 245 al., (2004). However, a few changes were required to improve our simulation at L4: i) the 246 potential photosynthetic rate of P2 was lowered from 2.7 to 2.0 d<sup>-1</sup>; ii) different maximum 247 chlorophyll to carbon ratios were employed for the two phytoplankton groups (0.04 for P1 248 and 0.03 for P2; consistent with literature values (Geider et al. 1997)), and iii) the reference 249 silica to carbon ratio for diatoms has been lowered to 0.01 (mmol S (mg C)<sup>-1</sup>) as reported in 250 251 Vichi et al. (2006).

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### 257 PHYSICAL SETUP AND OBSERVATIONAL DATA

The GOTM-ERSEM set up used in this work is identical to that described in Polimene et al., (2014). The model is forced with reanalysis meteorological data (ECMWF) and initialised with temperature, salinity and nutrient concentrations observed *in situ* (Smyth et al., 2010). At the lower boundary of the water column a simple remineralisation closure is applied exporting sinking detritus that is re-injected into the water column as dissolved nutrients and inorganic carbon at a fixed rate of 0.05 d<sup>-1</sup>.

Surface radiation is calculated by an astronomical formula (Rosati and Miyacoda, 1988) 264 taking into account latitude, longitude, time, fractional cloud cover and albedo. Light 265 extinction through the water column is assumed to be dependent on water mass, i.e. organic 266 particulates in the water column (both living and detritus) and silt, as described in Blackford 267 et al (2004). The total surface heat flux  $Q_{tot}$  is calculated as the sum of the latent heat flux  $Q_E$ , 268 the sensible heat flux Q<sub>H</sub>, and the long wave back radiation Q<sub>b</sub>. Each of these fluxes are 269 270 calculated by using the bulk formulae of Kondo (1975). The net heat flux (NHF) is then 271 calculated by summing the incident short wave radiation to the total heat fluxes. The model was run for 10 years (2000-2009) after 4 years of spin up. 272

The observational data used in this work (Woodward et al., 2013; Widdicombe et al 2010) were obtained under the weekly sampling strategy of the Western Channel Observatory (WCO, <u>http://www.westernchannelobservatory.org.uk/</u>). The description of the methodology used for samples collection and cell enumeration of phytoplankton and microzooplankton can be found in Widdicombe et al., (2010). Cell volumes are calculated according to the equations of Kovala and Larrance (1996) and converted to carbon using the equations of Menden-Deuer and Lessard (2000).

### 281 SENSITIVITY ANALYSIS

A quantitative sensitivity analysis (SA) was carried out to investigate the changes introduced 282 by the SMP formulation to the ERSEM simulations. We applied a Monte-Carlo based 283 approach (see, e.g., Saltelli et al, 2005, Pastres and Ciavatta, 2005) to rank the sensitivities of 284 a target model output y (the annual average of the grazing efficiency) with respect to the 285 model parameters that were handled in this work (i.e., the parameters in Table 1 and the 286 phytoplankton parameters altered with respect to Blackford et al., (2004)). The SA included 287 also the initial conditions of nitrate and phosphate. The m model parameters and nutrient 288 initial conditions defined the "input factor" vector (Table 2) of the SA,  $X_i = (X_{1,..., X_j}, X_{j,..., X_j})$ 289  $\dots, X_m$ ). A number (i=1,2,...,) of n random realizations of the vector were obtained by 290 sampling uniform probability distributions defined for the input factors (Table 2). Each 291 realization is used to run a model simulation that provides a scalar output  $y_i$ . 292

The input-output relationship was represented by means of a multiple linear regression model 293  $y = X b + \varepsilon$ , and the *m* absolute values of the standardized regression coefficients  $\beta_i$  are the 294 sensitivity indices that provides the rank of the input factors (e.g. Saltelli et al., 2000; Pastres 295 and Ciavatta, 2005). The SA was carried out, for both ERSEM and ERSEM SMP, by running 296 n=1000 model simulations of the year 2000, after a four year spin-up. The same probability 297 density functions of the input factors were applied in the two model configurations to make 298 the rankings inter-comparable. The rankings of the parameters for the two models (ERSEM 299 and ERSEM-SMP) were compared to discuss the importance of the SMP "mechanism" with 300 respect to the tuning of the model parameters in simulating the target variable. 301

We note that the regression coefficients provide meaningful rankings only when the linear model explains relatively large fractions of the model output variability (Saltelli et al., 2000). In our application we verified that the determination coefficients ( $R^2$ ) of the linear models were higher than 70% and statistically significant (F-statistic for linear versus constant model; p<0.001).

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### 308 RESULTS

Simulated and observed, monthly averaged, diatoms and microzooplankton biomass, nitrate phosphate and silicate are displayed in Fig 2. The qualitative agreement between model and observations is evaluated through the Spearman's correlation index between simulated and observed variables shown in Table 3. The correlation coefficient is higher than 0.6 for microzooplankton and nutrients and equal to 0.35 for diatoms. The correlation indices concerning the simulations carried out with the standard ERSEM model are also reported for comparison.

The seasonal evolution of simulated air-sea net heat flux (NHF), surface turbulent kinetic 316 317 energy (TKE) and mixed layer depth (MLD) is depicted in Fig 3. NHF is negative from January to March, switching to positive in April. After the summer, NHF reverts back to 318 negative in September. The transition between winter and spring (March-April) is also 319 characterized by a reduction in TKE (from 0.0007 to  $< 0.0004 \text{ m}^{-2} \text{ s}^{-2}$ ).TKE increases after 320 the summer, returning to values comparable with those simulated in winter. The simulated 321 seasonal cycle of the MLD implies that in April and May phytoplankton are exposed more to 322 light due to being "confined" in the first 10-15 metres of the water column. Simulated 323 average irradiance within the mixed layer depth is 24 W m<sup>-2</sup> in March and 115 W m<sup>-2</sup> in 324 April. These results are consistent with the description of the physical conditions 325 underpinning the onset of phytoplankton bloom reported in Smyth et al. (2014). 326

327 Figure 4 shows that the diatom carbon to phosphorus and carbon to nitrogen ratios are low in winter, they start to increase in spring (corresponding with the bloom) reaching the maximum 328 level in summer. It is worth noting that the carbon to nutrient ratios simulated in all our 329 330 experiments are comparable with the values reported in literature for marine particulate organic matter (Geider and La Roche, 2002). Microzooplankton assimilation efficiency 331 follows the opposite trend being high in winter, decreasing in spring (in correspondence of 332 the sharp increase of diatoms biomass) and reaching the lowest level in summer. The grazing 333 flux, in contrast, reaches the maximum level in May, corresponding to the highest diatom 334 335 biomass.

Higher phytoplankton biomass (Fig. 5) does not correspond to higher nutrient content which, 336 in contrast, coincides with the higher zooplankton assimilation efficiency. Notably, the 337 grazing flux, when taken on a daily basis, is less tightly related to the prey biomass. Higher 338 grazing rates, correspond to intermediate levels of biomass (between 50 and 150 mg C m<sup>-3</sup>) 339 and an intermediate level of the prey nutrient quota (C:P ~80-95 and C:N ~4-5.5). Diatoms, 340 341 at the peak of the bloom (Fig. 6), are characterized by a decrease in the nutrient to carbon ratios with respect to pre bloom conditions. The declining part of the bloom is characterized 342 by a slow increase in cellular nutrient content due to the release of carbon via exudation (Fig. 343 6) which enhances grazing activity. As a result, the grazing flux and the microzooplankton 344 biomass reach the highest value at the end of the bloom. 345

The sensitivity of the ERSEM-SMP model to decrease in the concentrations of phosphate and nitrate, given as model initial conditions (50% reduction was investigated) is shown in Fig. 7 and Fig. 8. Lowering nutrient concentrations causes diatoms to become more nutritionally imbalanced and therefore, less palatable to zooplankton. This leads to a counterintuitive response that fewer nutrients produce a higher peak (in term of carbon) during the bloom (Fig. 7). A simulation carried out by decreasing nitrate and phosphate initial conditions by

25% (data not shown) showed the same qualitative (but less intense) response, with a slight 352 increase in diatom carbon biomass and a concomitant decrease in zooplankton biomass. Only 353 when the initial nitrate and phosphate conditions are decreased by 75% (data not shown) do 354 we see a clear decrease in diatom biomass. Model simulations performed with the standard 355 ERSEM formulation (i.e. without SMP, and a fixed assimilation efficiency of 50%) applied 356 to the same model foodweb (Fig 1) are shown in Fig 9. In this case diatoms never manage to 357 bloom and the system is dominated by microzooplankton. By decreasing the initial 358 concentration of nitrate and phosphate by 50%, the system does not show substantial changes 359 360 in behaviour (Fig. 10).

A Monte Carlo based sensitivity analysis on both ERSEM-SMP and ERSEM has been 361 performed in order to assess to what extent the above described results are affected by the 362 choice of selected parameters and nutrient initial conditions (Table 2). As the essence of the 363 364 SMP is the effect of the phytoplankton nutritional status on the grazing activity, we have selected as target variable of our analysis the grazing efficiency of the model 365 366 microzooplankton Z1. The results of this analysis are presented in Table 4 where each input factor (Table 2) is ranked on the base of its capacity to affect the simulation of the target 367 variable. In both the models, the parameters defining the half saturation constant for food and 368 prey "preference" (K(Z1) and Pf(P1-Z1), respectively) are the most important. However, 369 Table 4 highlights that with the addition of the SMP, the initial condition of the limiting 370 nutrient is considerably more important for the simulation of the grazing activity of Z1 over 371 P1. PO<sub>4</sub> in table 4 ranked 6<sup>th</sup> and 18<sup>th</sup> for ERSEM-SMP and ERSEM, respectively. 372 Furthermore, the ERSEM-SMP simulations of grazing efficiency have relatively low 373 sensitivity with respect to the values of the SMP-parameters. Indeed, the new parameters 374 introduced for the implementation of the SMP (AE<sub>max</sub>, AE<sub>min</sub>, and K<sub>AE</sub>) ranked relatively low 375 (9, 17 and 24, respectively). This suggests that the ERSEM-SMP simulations depend more on 376

the process/mechanism described in the model than on the numerical values of theparameters.

An additional sensitivity analysis has been performed by manually altering some key zooplankton parameters and nutrient initial condition (Table 5) in the ERSEM model (Fig. 11). The rationale behind this experiment was to further investigate whether, by tuning specific parameters, the standard ERSEM can produce simulations comparable to the ones of ERSEM-SMP.

384 Figure 11 shows that by changing the half saturation constant for food (K) and the food threshold (minfood), the simulation does not display significant changes: the system is, in 385 all the three experiments, dominated by microzooplankton. Only by assuming a greater 386 predatory pressure on microzooplankton (by increasing the value of the parameter  $P_f$ , 387 experiment S5) do diatoms manage to bloom exceeding zooplankton biomass. The sensitivity 388 experiment S5 is the model setup under which ERSEM produces the closest simulation to 389 ERSEM-SMP. However, even under these conditions, by reducing the initial nutrient 390 conditions by 50% the standard ERSEM does not display the behaviour simulated by the 391 SMP-ERSEM model, further confirming the results displayed in Table 4. 392

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### 394 DISCUSSION

Our simulations suggest that the increase in light exposure experienced by diatoms between March and April decouples photosynthesis from nutrient uptake, thereby altering cellular stoichiometry. The increase in the cellular carbon to nutrient ratio of the diatoms decreases their palatability thence reducing both grazing and assimilation efficiency of the microzooplankton. We suggest that these changes contribute to the formation of the diatom

bloom regularly observed at the station L4. A conceptual model describing the formation andevolution of a diatom bloom is depicted in Fig. 12.

During winter, diatoms are limited by the amount of light but are also controlled through 402 grazing pressure exerted by large microzooplankton (modelled through the variable Z1). 403 During this time of the year, high environmental nutrient concentrations allow diatoms to be 404 rich in nutrients (such as N and P) and, consequently, zooplankton assimilation efficiency is 405 also high. Changes in physical conditions, such as reduced turbulence and increased surface 406 water temperature (Smyth et al., 2014 and Fig 3), increases the phytoplankton residence time 407 in the well-lit zone of the water column (Fig 3) and desynchronize photosynthesis from 408 409 nutrient uptake. This increases the amount of cellular carbon with respect to nutrients. Less nutrient content, decreasing diatom palatability, reduces the activity of microzooplankton, 410 allowing diatoms to "escape" from being top down controlled and thus to bloom. 411

Bloom conditions for diatoms are therefore a compromise between attaining high nutrient cellular content (i.e., high food quality), where the diatom population are controlled by zooplankton grazing, and poor nutrient cellular content under which diatoms (although "escaping" zooplankton grazing) are too nutrient stressed for growth. The former condition takes place in winter, the latter in summer. The conditions leading to the bloom occur in the spring period when the nutrient condition of diatoms are at an intermediate level which still allows a positive growth but, at the same time, a reduced palatability.

The idea that reduced cell nutrient content be advantageous for primary producers has been previously used in evolutionary modelling work (Branco et al., 2010). The generic model proposed by these authors implied that phytoplankton with intermediate nutrient uptake rates are less palatable for herbivores. In this way, some phytoplankton species gain a competitive advantage over competitors that have higher affinity for nutrients and are therefore more susceptible to grazers. Here, we have shown that the same concept can be important within asingle phytoplankton group on a seasonal scale.

Including SMP makes the modelled predator-prey interactions sensitive to the availability of 426 nitrate and phosphate. As expected, the simulations with low nutrient concentrations show 427 that diatoms are more stoichiometrically imbalanced and therefore less palatable for 428 zooplankton when the availability of nitrate and phosphate is low. Consequently, diatoms 429 produce a higher peak (in terms of carbon) during the bloom (Fig. 5). This suggests that 430 decreasing the food quality (more than the quantity) of primary producers, reduces the 431 transfer of carbon from the algal producers to the higher trophic levels of the food chain. This 432 433 may have profound effects on the ecosystem responses to climate change, particularly in regions where the surface waters are expected to become more oligotrophic (Polovina et al., 434 2008). Sensitivity experiments showed in Table 4 and Fig. 11 show that the standard ERSEM 435 436 grazing parameterisation does not reproduce this kind of dynamics. More in general, the sensitivity analysis highlights that the SMP as "mechanism" is more relevant in impacting the 437 438 model simulation of the grazing efficiency then the numerical values of the parameters used. 439 This strengthens the case for exploring the inclusion of SMP in marine ecosystem models used for climate change simulations. 440

Particular attention should be paid to the role of silica in the aforementioned mechanism. 441 Silica is not required for zooplankton growth and therefore is not included in the SMP 442 formulation implemented here. Furthermore, silica is assumed to limit directly primary 443 production in ERSEM (Ebenhoh et al., 1997; Blackford et al., 2004) with the consequence 444 445 that silica is coupled more with carbon than nitrogen or phosphorous. Reduced availability of silica also implies a reduced fixation of carbon and therefore a more balanced carbon to 446 nitrogen and phosphorus cellular ratio. Consequently, the above described dynamics is not 447 448 simulated when silica is the limiting nutrient.

449 The importance of food quality as a consequence of skewed nutrient stoichiometry which in turn is induced by an "imbalance" in the supply of nutrients and light has previously been 450 stressed in laboratory experiments (Urabe and Sterner, 1996; Hessen et al., 2002) and 451 452 theoretical modelling studies (Loladze et al., 2000; Loladze et al., 2004; Hall et al., 2004; Mitra, 2006; Diehl, 2007; Elser et al., 2012). We have related phytoplankton palatability to 453 the physical environment (Fig. 3) and have proposed a conceptual model (Fig. 12), describing 454 bloom formation and evolution, which connects physical constrains (heat flux, turbulence, 455 mixed layer depth) physiological status of phytoplankton (i.e., cellular stoichiometry) and 456 457 grazing. These connections are summarised in Fig. 13 which shows the correlation between heat fluxes and cellular stoichiometry(r=0.88, p<0.001), an emergent property of our model. 458 459 While confirming that the switch of NHF from negative to positive described by Smyth et al. 460 (2014) is a prerequisite for the bloom formation, our model also suggests that, after the onset 461 of the proper physical conditions, phytoplankton decrease in palatability and reduced zooplankton grazing pressure play a significant role in the formation of a bloom. 462

463 We have shown that a combination of abiotic and biotic factors work synergistically to impact on the plankton bloom dynamics. The behaviour shown by the present model is 464 consistent with the "paradox of energy enrichment" hypothesised by Loladze et al. (2000): 465 when more energy is supplied to the system (steep increase in light) a decoupling between 466 carbon and nutrient is induced. The latter decreases the "quality" of the prev which, being 467 less suitable for the predator, reaches its highest concentration. Our model also supports the 468 general concept of the "loophole" hypothesis (Irigoien et al., 2005; Kiørboe, 2008). These 469 470 authors, investigating the biological dynamics underpinning a phytoplankton bloom invoked a set of mechanisms including physical (e.g., size, colony-formation, spines, frustules and 471 472 coccoliths) and chemical (e.g., DMSP production) defence leading to a decrease of palatability of phytoplankton and to a decrease (loophole) of the grazing pressure. Our 473

simulations and the consequent conceptual model depicted in Fig.12 suggest that the decrease
of the phytoplankton nutrient to carbon ratio (and the subsequent decrease in phytoplankton
palatability) could play a pivotal role in creating the "loophole" through which diatoms
manage to bloom.

Although these results support our hypothesis, we recognise that only with specific, 478 purposely performed, field measurements will we be able to properly assess the mechanism 479 described in Fig. 12. In particular, we require data on the temporal evolution of the 480 phytoplankton cellular nitrogen and phosphorus with respect to carbon content; these are 481 currently lacking. Also, time series measurements of micro- and meso-zooplankton grazing, 482 looking both at mass specific ingestion rates and total grazing pressure, would shed light on 483 the complex dynamics surrounding the start of a bloom. One of the advantages of modelling 484 work like this is to highlight gaps and inconsistencies in current knowledge and datasets, and 485 486 thence to inform and drive future experimental research.

487

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# **Table 1.** Zooplankton parameters

| Prameter                                                              | Notation            | Unit                                                                         | <b>Z</b> 1 | Z2     | Z3     | Reference                          |
|-----------------------------------------------------------------------|---------------------|------------------------------------------------------------------------------|------------|--------|--------|------------------------------------|
| Q <sub>10</sub> value                                                 | $Q_{10}$            | adim                                                                         | 2          | 2      | 2      | Blackford et al (2004)             |
| Grazing rate at 10 C                                                  | r                   | $d^{-1}$                                                                     | 1.2        | 2.0    | 0.5    | Blackford et al (2004)             |
| Half saturation constant for food                                     | K                   | mg C m <sup>-3</sup>                                                         | 10         | 10     | 40     | This study/ Blackford et al (2004) |
| Food threshold                                                        | minfood             | mg C m <sup>-3</sup>                                                         | 2.5        | 10     | 1.0    | This study/ Blackford et al (2004) |
| Fraction of food respired                                             | A <sub>r</sub>      | $d^{-1}$                                                                     | 0.5        | 0.4    | 0.6    | This study/ Blackford et al (2004) |
| Constant Assimilation<br>efficiency (Z2 and Z3)                       | AE                  | adim                                                                         | N/A        | 0.5    | 0.5    | Blackford et al (2004)             |
| Min Assimilation<br>efficiency                                        | AE <sub>min</sub>   | adim                                                                         | 0.25       | N/A    | N/A    | This study                         |
| Max Assimilation<br>efficiency                                        | AE <sub>max</sub>   | adim                                                                         | 0.75       | N/A    | N/A    | This study                         |
| Half saturation constant for AE                                       | K <sub>AE</sub>     | adim                                                                         | 1          |        |        | Mitra (2006)                       |
| Rest respiration rate                                                 | $R_r$               | d <sup>-1</sup>                                                              | 0.02       | 0.02   | 0.02   | Blackford et al (2004)             |
| Mortality rate                                                        | r <sub>mort</sub>   | d <sup>-1</sup>                                                              | 0.05       | 0.05   | 0.05   | Blackford et al (2004)             |
| Mortality rate due to low oxygen                                      | r <sub>mortox</sub> | $d^{-1}$                                                                     | 0.25       | 0.25   | 0.25   | Blackford et al (2004)             |
| Michaelis Menten constant<br>for oxygen limitation                    | h <sub>oxmort</sub> | mmol m <sup>-3</sup>                                                         | 7.8125     | 7.8125 | 7.8125 | Blackford et al (2004)             |
| Max N:C                                                               | $qZ_{max}^N$        | mmol N (mg<br>C) <sup>-1</sup>                                               | 0.0167     | 0.0167 | N/A*   | Blackford et al (2004)             |
| Max P:C                                                               | $qZ_{max}^P$        | $\begin{array}{c} \text{mmol } P \text{ (mg} \\ C \text{)}^{-1} \end{array}$ | 0.001      | 0.001  | N/A*   | Blackford et al (2004)             |
| Available fraction of prey<br>(P1 for Z1, P2 for Z2 and<br>Z1 for Z3) | $P_f$               | adim                                                                         | 1          | 1      | 0.5    | This study                         |

\*Mesozooplankton are assumed to have a fixed internal stoichiometry (Blackford et al.,
2004)

....

| are specified in Table 1 (b |         |         |          |        |
|-----------------------------|---------|---------|----------|--------|
| Notation                    | Nominal | minimum | Maximum  | Notes  |
| K(Z1)                       | 10      | 1       | 60       |        |
| Pf(P1-Z1)                   | 1       | 0.1     | 1        |        |
| Chl:Cmax(P1)                | 0.04    | 0.01    | 0.07     | С      |
| K(Z3)                       | 40      | 1       | 60       |        |
| Pf(P2-Z2)                   | 1       | 0.1     | 1        |        |
| PO <sub>4</sub>             | 0.4     | 0.2     | 0.6      | d      |
| r(Z1)                       | 0.02    | 0.014   | 0.026    | *      |
| K(Z2)                       | 10      | 1       | 60       |        |
| AEmax(Z1)                   | 0.25    | 0.1     | 0.499    | а      |
| qZPmax(Z1)                  | 0.0167  | 0.01169 | 0.02171  | *      |
| Ar(Z1)                      | 0.5     | 0.35    | 0.65     | *      |
| rmort(Z1)                   | 0.25    | 0.175   | 0.325    | *      |
| minfood(Z1)                 | 2.5     | 1       | 20       |        |
| Pf(Z1-Z3)                   | 0.5     | 0.1     | 1        |        |
| qsP1c                       | 0.01    | 0.01    | 0.03     | С      |
| NO <sub>3</sub>             | 8       | 4       | 12       | d      |
| AEmin(Z1)                   | 2       | 1.4     | 2.6      | *a     |
| r(Z2)                       | 1.2     | 0.84    | 1.56     | *      |
| Q10(Z1)                     | 0.4     | 0.28    | 0.52     | *      |
| Rr(Z1)                      | 0.05    | 0.035   | 0.065    | *      |
| Ar(Z2)                      | 0.5     | 0.35    | 0.65     | *      |
| Q10(Z2)                     | 2       | 1.4     | 2.6      | *      |
| r(Z3)                       | 0.5     | 0.35    | 0.65     | *      |
| KAE(Z1)                     | 0.75    | 0.5     | 0.09     | а      |
| minfood(Z3)                 | 0.75    | 0.5     | 10       | a      |
|                             | 0.0012  | 0.00084 | 0.00156  | *      |
| qZPmax(Z2)                  | 2       | 1.4     | 2.6      | *      |
| qZNmax(Z1)                  | 0.03    | 0.01    | 0.07     |        |
| Chl:Cmax(P2)                | 0.03    |         | 3        | С      |
| r(P2)                       |         | 1.5     |          | C<br>* |
| rmortox(Z3)                 | 0.25    | 0.175   | 0.325    | *      |
| rmort(Z3)                   | 0.05    | 0.035   | 0.065    |        |
| AE(Z3)                      | 0.5     | 0.1     | 0.9      | *      |
| hoxmort(Z3)                 | 7.8125  | 5.46875 | 10.15625 | ~      |
| hoxmort(Z1)                 | 7.8125  | 5.46875 | 10.15625 | *      |
| Rr(Z2)                      | 0.02    | 0.014   | 0.026    | *      |
| Rr(Z3)                      | 0.02    | 0.014   | 0.026    | *      |
| minfood(Z2)                 | 10      | 1       | 20       |        |
| rmort(Z2)                   | 0.25    | 0.175   | 0.325    | *      |
| AE(Z2)                      | 0.5     | 0.1     | 0.9      |        |
| rmortox(Z1)                 | 0.001   | 0.0007  | 0.0013   | *      |
| qZNmax(Z2)                  | 0.0167  | 0.01169 | 0.02171  | *      |
| Q <sub>10</sub> (Z3)        | 2       | 1.4     | 2.6      | *      |
| hoxmort(Z2)                 | 7.8125  | 5.46875 | 10.15625 | *      |
| rmortox(Z2)                 | 0.05    | 0.035   | 0.065    | *      |
| AE(Z5)                      | 0.5     | 0.1     | 0.9      | b      |

**Table** 2 Input factors of the Monte Carlo based sensitivity analysis, their nominal values and the range minimum-maximum of their uniform probability distributions. The notations of the parameters are specified in Table 1 (but see notes c and d)

Notes. \* : the range minimum-maximum is defined as the nominal value  $\pm 30\%$  of the value itself; a) parameters included in ERSEM SMP only; b) parameters included in ERSEM only; c) phytoplankton parameters for P1 and P2 not defined in Table 1 (Chl:Cmax = maximum chlorophyll-to-carbon ratio [mgChl (mgC)<sup>-1</sup>]; r = potential photosynthetic rate [d<sup>-1</sup>]; qsP1c = maximum silica to carbon ratio in diatoms [mmolSi (mgC)<sup>-1</sup>]; d) initial conditions of nutrients (PO4 = phosphate [mmol m<sup>-3</sup>]; NO3 = nitrate [mmol m<sup>-3</sup>]).

**Table 3**. Spearman rank correlation between modelled and observed variables (p<0.001)

|     |           | diatoms | microzoo | PO <sub>4</sub> | NO <sub>3</sub> | Si   |
|-----|-----------|---------|----------|-----------------|-----------------|------|
|     | ERSEM-SMP | 0.35    | 0.80     | 0.61            | 0.80            | 0.67 |
|     | ERSEM     | -0.16*  | 0.82     | 0.65            | 0.81            | 0.65 |
| 518 | *p=0.07   |         |          |                 |                 |      |
| 519 |           |         |          |                 |                 |      |
| 520 |           |         |          |                 |                 |      |
| 521 |           |         |          |                 |                 |      |
| 522 |           |         |          |                 |                 |      |
| 523 |           |         |          |                 |                 |      |
| 524 |           |         |          |                 |                 |      |
| 525 |           |         |          |                 |                 |      |
| 526 |           |         |          |                 |                 |      |
| 527 |           |         |          |                 |                 |      |
| 528 |           |         |          |                 |                 |      |
| 529 |           |         |          |                 |                 |      |
| 530 |           |         |          |                 |                 |      |
| 531 |           |         |          |                 |                 |      |
| 532 |           |         |          |                 |                 |      |
| 533 |           |         |          |                 |                 |      |
| 534 |           |         |          |                 |                 |      |
| 535 |           |         |          |                 |                 |      |
| 536 |           |         |          |                 |                 |      |
| 537 |           |         |          |                 |                 |      |
| 538 |           |         |          |                 |                 |      |
| 539 |           |         |          |                 |                 |      |
|     |           |         |          |                 |                 |      |

| ERSEM SMP       | gnificantly different from zero<br>Rank | $\frac{(1-\text{statistic; } p < 0.05)}{\text{ERSEM}}$ | Rank |
|-----------------|-----------------------------------------|--------------------------------------------------------|------|
| K(Z1)           | 1                                       | K(Z1)                                                  | 1    |
| Pf(P1-Z1)       | 2                                       | Pf(P1-Z1)                                              | 2    |
| Chl:Cmax(P1)    | 3                                       | K(Z3)                                                  | 3    |
| K(Z3)           | 4                                       | Pf(P2-Z2)                                              | 4    |
| Pf(P2-Z2)       | 5                                       | K(Z2)                                                  | 5    |
| $PO_4$          | 6                                       | Chl:Cmax(P1)                                           | 6    |
| r(Z1)           | 7                                       | minfood(Z1)                                            | 7    |
| K(Z2)           | 8                                       | Pf(Z1-Z3)                                              | 8    |
| AEmax(Z1)       | 9                                       | r(Z1)                                                  | 9    |
| qZPmax(Z1)      | 10                                      | qsP1c                                                  | 10   |
| Ar(Z1)          | 11                                      | Ar(Z1)                                                 | 11   |
| rmort(Z1)       | 12                                      | r(Z3)                                                  | 12   |
| minfood(Z1)     | 13                                      | minfood(Z2)                                            | 13   |
| Pf(Z1-Z3)       | 14                                      | r(Z2)                                                  | 14   |
| qsP1c           | 15                                      | r(P2)                                                  | 15   |
| NO <sub>3</sub> | 16                                      | Ar(Z2)                                                 | 16   |
| AEmin(Z1)       | 17                                      | minfood(Z3)                                            | 17   |
| r(Z2)           | 18                                      | PO <sub>4</sub>                                        | 18   |
| Q10(Z1)         | 19                                      | NO <sub>3</sub>                                        | 19   |
| Rr(Z1)          | 20                                      | AE(Z3)                                                 | 20   |
| Ar(Z2)          | 21                                      | rmort(Z1)                                              | 21   |
| Q10(Z2)         | 22                                      | Chl:Cmax(P2)                                           | 22   |
| r(Z3)           | 23                                      | Q10(Z1)                                                | 23   |
| KAE(Z1)         | 24                                      | rmort(Z3)                                              | 24   |
| minfood(Z3)     | 25                                      | Rr(Z1)                                                 | 25   |
| qZPmax(Z2)      | 26                                      | Q10(Z2)                                                | 26   |
| qZNmax(Z1)      | 27                                      | rmortox(Z3)                                            | N.S  |
| Chl:Cmax(P2)    | 28                                      | Rr(Z2)                                                 | N.S  |
| r(P2)           | 29                                      | $Q_{10}(Z3)$                                           | N.S  |
| rmortox(Z3)     | N.S                                     | qZPmax(Z1)                                             | N.S  |
| rmort(Z3)       | N.S                                     | hoxmort(Z3)                                            | N.S  |
| AE(Z3)          | N.S                                     | rmort(Z2)                                              | N.S  |
| hoxmort(Z3)     | N.S                                     | hoxmort(Z1)                                            | N.S  |
| hoxmort(Z1)     | N.S                                     | AE(Z2)                                                 | N.S  |
| Rr(Z2)          | N.S                                     | Rr(Z3)                                                 | N.S  |
| Rr(Z3)          | N.S                                     | qZPmax(Z2)                                             | N.S  |
| minfood(Z2)     | N.S                                     | qZNmax(Z2)                                             | N.S  |
| rmort(Z2)       | N.S                                     | rmortox(Z2)                                            | N.S  |
| AE(Z2)          | N.S                                     | qZNmax(Z1)                                             | N.S  |
| rmortox(Z1)     | N.S                                     | hoxmort(Z2)                                            | N.S  |
| qZNmax(Z2)      | N.S                                     | AE(Z1)                                                 | N.S  |
| $Q_{10}(Z3)$    | N.S                                     | rmortox(Z1)                                            | N.S  |
| hoxmort(Z2)     | N.S                                     | . /                                                    |      |
| rmortox(Z2)     | N.S                                     |                                                        |      |

**Table 4**. Results of the Monte Carlo sensitivity analysis of ERSEM SMP (left) and ERSEM (right). Ranking of the input factors (i.e. model parameters and initial conditions of nitrate and phosphate) based on computed standardized linear regression coefficients  $\beta$ . N.S. indicates parameters having  $\beta$  values that were not significantly different from zero (t-statistic; p < 0.05).

|            | experiment |          | Parameters |                         |
|------------|------------|----------|------------|-------------------------|
|            |            | K        | minfood    | $P_f$ (Z1 for Z3)       |
|            | S1         | 45       | 2.5        | 0.5                     |
|            | S2         | 60       | 2.5        | 0.5                     |
|            | <u>S3</u>  | 60       | 10         | 0.5                     |
|            | S4<br>S5   | 60<br>60 | 10<br>10   | 0.8                     |
|            | <u>S6</u>  |          |            | nt (N and P) conditions |
| 542        |            |          |            |                         |
| 543        |            |          |            |                         |
| 544        |            |          |            |                         |
| 545        |            |          |            |                         |
| 546        |            |          |            |                         |
| 547        |            |          |            |                         |
| 548        |            |          |            |                         |
| 549<br>550 |            |          |            |                         |
| 551        |            |          |            |                         |
| 552        |            |          |            |                         |
| 553        |            |          |            |                         |
| 554        |            |          |            |                         |
| 555        |            |          |            |                         |
| 556        |            |          |            |                         |
| 557        |            |          |            |                         |
| 558        |            |          |            |                         |
| 559        |            |          |            |                         |
| 560        |            |          |            |                         |
| 561        |            |          |            |                         |
| 562        |            |          |            |                         |
| 563        |            |          |            |                         |
| 564        |            |          |            |                         |
| 565        |            |          |            |                         |
| 566        |            |          |            |                         |
| 567<br>568 |            |          |            |                         |
| 500        |            |          |            |                         |

**Table** 5. Sensitivity experiments on key zooplankton parameters for the standard ERSEM model

## 569 **FIGURE CAPTIONS**

Fig 1. Schematic of the modelled food interactions. Dotted arrows indicate density-dependentmortality closure, for example cannibalism

Fig 2. Modelled and observed time series of (A) diatom biomass; (B) microzooplankton
biomass; (C) phosphate; (D) nitrate; (E) silicate. Both observations and simulations are
monthly averages for the period 2000-2009. Units are mg C m<sup>-3</sup> for biomasses and mmol m<sup>-3</sup>
for nutrients. Modelled microzooplankton is the sum of Z1 and Z2.

Fig 3. Climatological, monthly averaged, simulated (A) Net Heat Flux (NHF, W m<sup>-2</sup>); (B)
surface Turbulent Kinetic Energy (TKE, m<sup>-2</sup> s<sup>-2</sup>) and (C) Mixed Layer Depth (MLD, metres)

Fig 4. Climatological, monthly averaged, simulated diatom (P1) and microzooplankton (Z1)
(mg C m<sup>-3</sup>) seasonal cycles. Colours refer to (A) diatom molar C:P; (B) diatom molar C:N
ratios; (C) microzooplankton (Z1) assimilation efficiency (Zeff) and (D) grazing (Z1 over P1,
mg C m<sup>-3</sup> d<sup>-1</sup>).

**Fig 5**. Scatter plots of modelled diatom (P1) biomass (mg C m<sup>-3</sup>) and carbon to nutrient molar ratios. Colour scales indicate: (A) and (B) microzooplankton (Z1) assimilation efficiency (Zeff); (C) and (D) grazing (Z1 over P1, mg C m<sup>-3</sup> d<sup>-1</sup>). Simulations refer to daily averaged surface values for the period 2000-2009

**Fig. 6.** (A) simulated Z1-P1 predator-prey system (biomasses and grazing) and (B) specific carbon exudation rate subsampled from the modelled time series. Biomass is given in mg C  $m^{-3}$ , grazing in mg C  $m^{-3} d^{-1}$  and the carbon specific exudation rate in  $d^{-1}$ . Colours refer to diatom molar C:P.

- Fig. 7. Simulated diatom (P1) and microzooplankton (Z1) seasonal cycle as in Fig. 4, but
  with reduced (by 50%) nitrate and phosphate as initial conditions.
- Fig. 8. Scatter plots as in Fig. 5 but with reduced nitrate and phosphate concentration asinitial condition. Nutrient concentrations were reduced by 50%.
- **Fig. 9.** Climatological (2000-2009) diatom (P1) and microzooplankton (Z1) monthly averaged seasonal cycles simulated with the standard ERSEM formulation. Colours refer to: (A) C:P diatom molar ratio; (B) C:N diatom molar ratios and (C) grazing (Z1 over P1, mg C  $m^{-3} d^{-1}$ ).
- **Fig. 10.** Simulated diatom (P1) and micrzooplankton (Z1) seasonal cycle as in Fig 8 but with reduced (by 50%) nitrate and phosphate initial conditions.
- Fig. 11. Monthly averaged, diatoms (P1) and microzooplankton (Z1) biomass (mg C m<sup>-3</sup>)
   simulated in the sensitivity experiments described in Table 3.
- Fig. 12. Conceptual model describing the formation and evolution of a diatom bloom. Biotic
   processes are highlighted in blue. Red arrows imply the action of physical forcing such as
   NHF, TKE and MLD.
- **Fig. 13.** Scatter plot (r=0.8, p<0.001) between simulated diatom (P1) carbon to phosphorus ratio (mol mol<sup>-1</sup>) and NHF (W m<sup>-2</sup>). Colorbar refers to microzooplankton (Z1) assimilation efficiency (Zeff).

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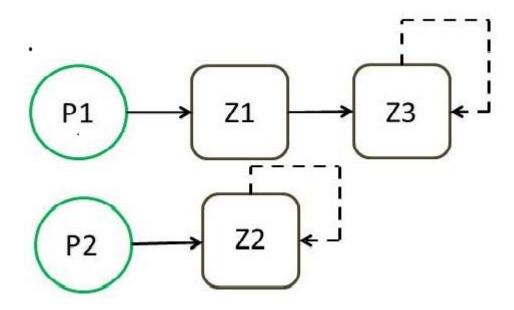
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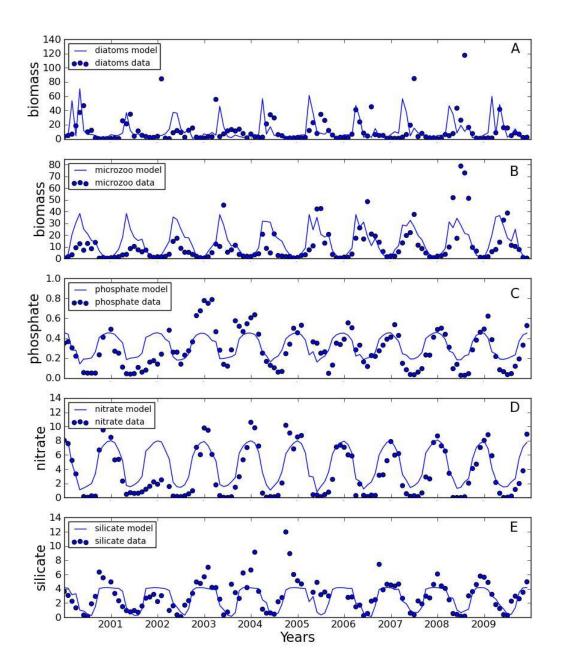
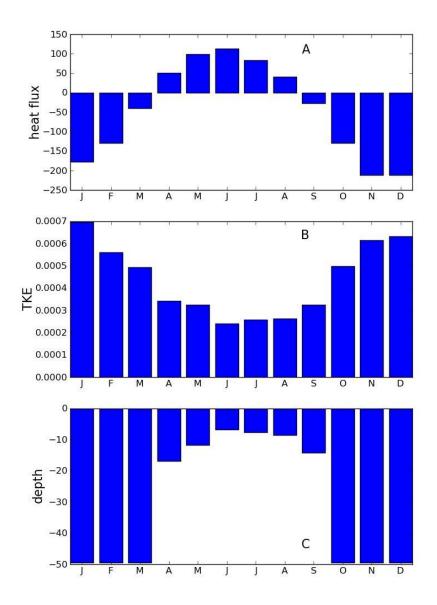


Fig 2





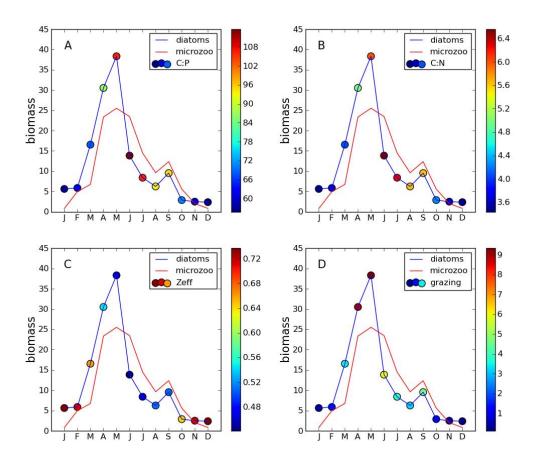
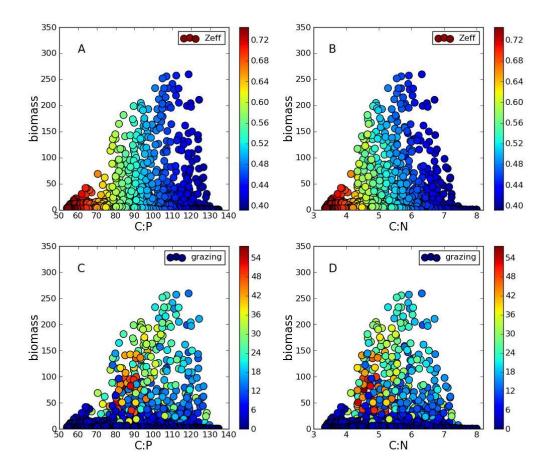


Fig 4





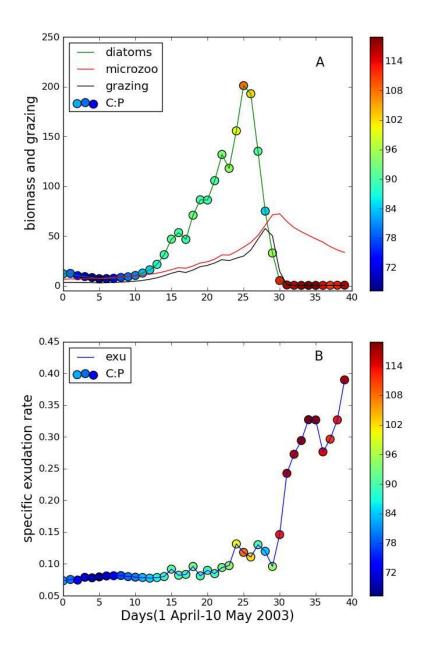


Fig 6

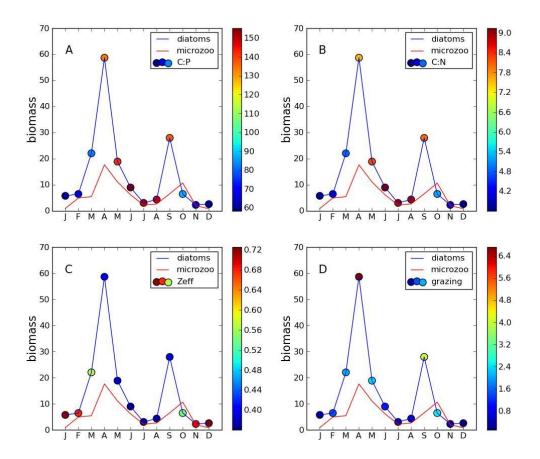
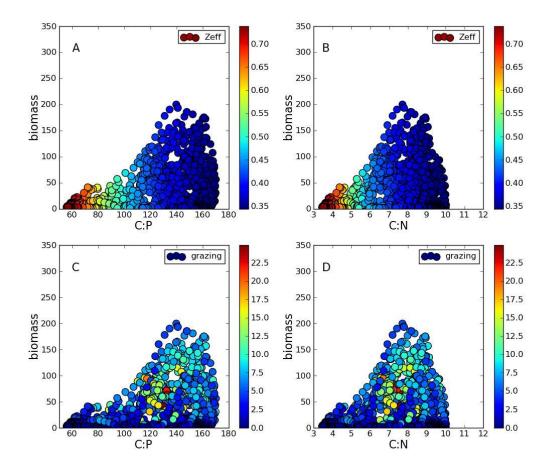


Fig 7





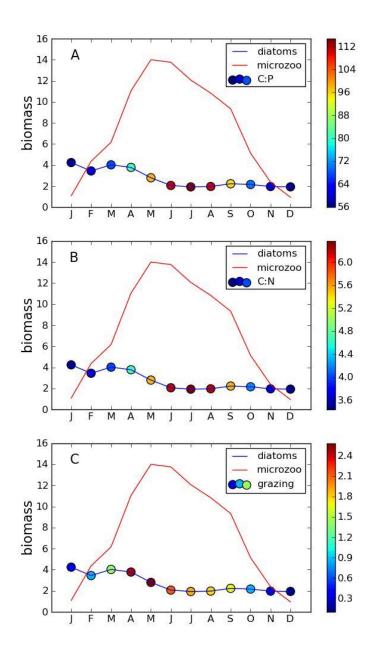


Fig 9

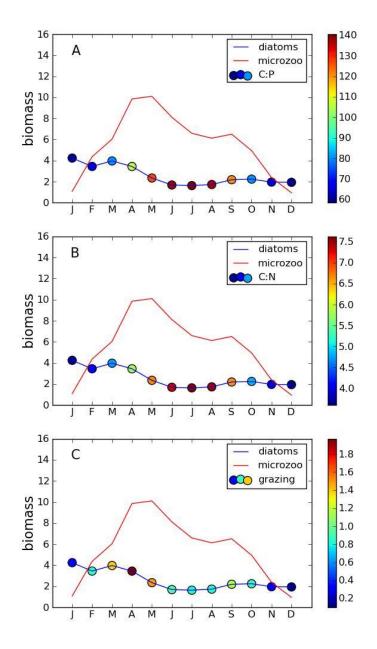


Fig 10

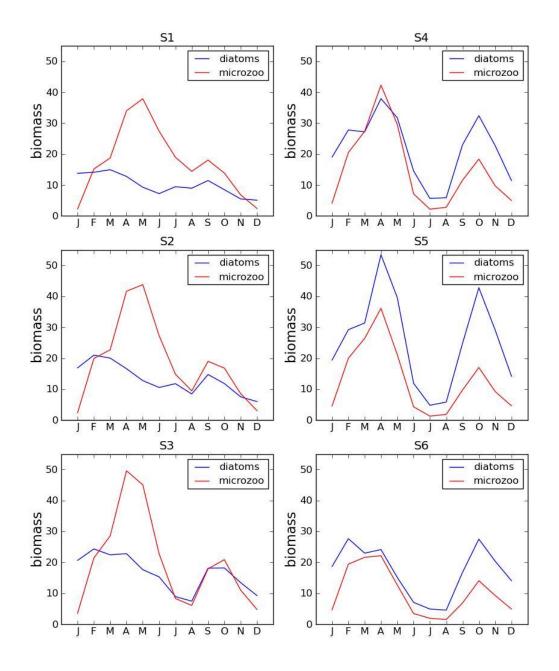


Fig 11

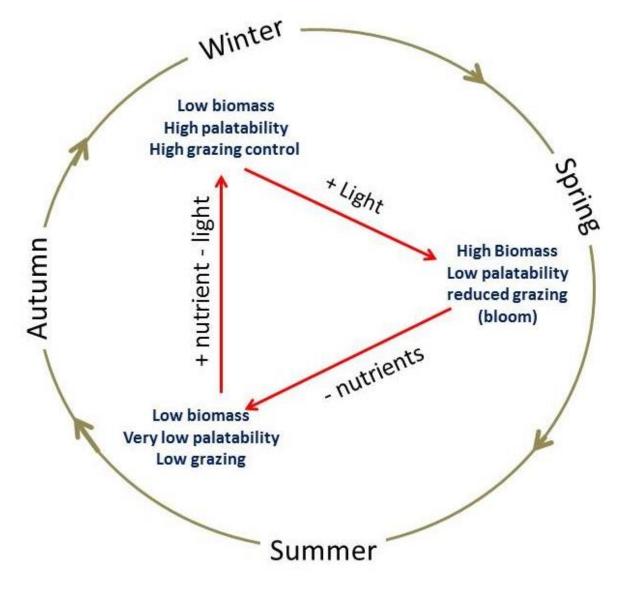


Fig 12

