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# ***MEDUSA*: a new intermediate complexity plankton ecosystem model for the global domain**

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## **Abstract**

The ongoing, anthropogenically-driven changes to the global ocean are expected to have significant consequences for plankton ecosystems in the future. Because of the role that plankton play in the ocean's "biological pump", changes in abundance, distribution and productivity will likely have additional consequences for the wider carbon cycle. Just as in the terrestrial biosphere, marine ecosystems exhibit marked diversity in species and functional types of organisms. Predicting potential change in plankton ecosystems therefore requires the use of models that are suited to this diversity, but whose parameterisation also permits robust and realistic functional behaviour. In the past decade, advances in model sophistication have attempted to address diversity, but have been criticised for doing so inaccurately or ahead of a requisite understanding of underlying processes. Here we introduce *MEDUSA* (**M**odel of **E**cosystem **D**ynamics, nutrient **U**tutilisation, **S**equestration and **A**cidification), a new "intermediate complexity" plankton ecosystem model that expands on traditional nutrient-phytoplankton-zooplankton-detritus (NPZD) models, and remains amenable to global-scale evaluation. *MEDUSA* includes the biogeochemical cycles of nitrogen, silicon and iron, broadly structured into "small" and "large" plankton size classes, of which the "large" phytoplankton class is representative of a key phytoplankton group, the diatoms. A full description of *MEDUSA*'s state variables, differential equations, functional forms and parameter values is included, with particular attention focused on the submodel describing the export of organic carbon from the surface to the deep ocean. *MEDUSA* is used here in a multi-decadal hindcast simulation, and its biogeochemical performance evaluated at the global scale.

## **1 Introduction**

Marine biota play a key role in the cycling and sequestering carbon in the ocean via the so-called "biological pump" (Raven and Falkowski, 1999). Fuelled by nutrients upwelled from the deep, phytoplankton produce organic matter via photosynthesis in the sunlit

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surface ocean. This is then processed by components of the marine ecosystem including grazing zooplankton, and a fraction exported back to depth via sinking detrital particles and dissolved organic matter. This biogenic flux of carbon into the deep ocean serves to elevate the ocean's storage of carbon beyond that sequestered through physics and chemistry alone. While the large-scale role of biology can be studied from its effects on tracer distributions (e.g. Gruber et al., 1996), mathematical modelling provides an important means of investigating the dynamics of the biological pump and its response to changing climate.

For many years, nutrient-phytoplankton-zooplankton-detritus (NPZD) models were the mainstay of basin- and global-scale biogeochemical modelling studies (e.g. Sarmiento et al., 1993; Six and Maier-Reimer, 1996; Palmer and Totterdell, 2001). Today, aggregating the wide taxonomic and functional diversity of organisms in marine ecosystems into such an idealised model structure is generally considered too simplistic an approach. In the case of phytoplankton, for example, there are numerous different groups, so called plankton functional types (PFTs) such as diatoms, nitrogen fixers and coccolithophores, which undertake specific roles in marine biogeochemical cycles (Hood et al., 2006). A new generation of complex models that include multiple PFTs has accordingly been developed (e.g. Moore et al., 2004; Gregg et al., 2003; Le Quéré et al., 2005), yet complexity in models has associated difficulties including poorly understood ecology, lack of data for validation and sensitivity to the parameterisations involved (Anderson, 2005; Flynn, 2005). Additionally, on a practical level, the greater the complexity of an ecosystem model, the greater the computation burden involved in its simulation, and therefore the less attractive the model is for long duration simulations of, for instance, future climate change (e.g. Cox et al., 2000).

The challenge is to derive model structures and parameterisations that are robust in the sense that the modelled ecosystem reacts realistically with the physico-chemical environment, yet which are based on sound mechanistic principles that maintain accuracy in prediction (Anderson, 2010). Here, we present a new ecosystem model, *MEDUSA*, and show results for its performance when incorporated

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into a global ocean general circulation model (GCM). The *MEDUSA* model is of intermediate complexity, building beyond the standard NPZD formulations, but without elaborating to the number of state variables and parameters in contemporary PFT models. The plankton ecosystem is divided into "small" and "large" portions, into which different planktonic components are organised. The small portion primarily includes (prokaryotic) nanophytoplankton and microzooplankton (protists and larval metazoans), together with small detrital particles that sink relatively slowly and are explicitly represented. The large portion primarily includes (eukaryotic) diatom phytoplankton and mesozooplankton (adult metazoans), together with large detrital particles that are assumed to sink sufficiently quickly that implicit representation is required. The phytoplankton components of *MEDUSA* include explicit representations of internal chlorophyll quotas, in order that light acclimation is permitted. The resulting plankton ecosystem is founded on the biogeochemical cycle of nitrogen, although the cycles of silicon and the micronutrient iron are also included.

The layout of the manuscript is as follows. First, *MEDUSA*'s structure, differential equations, functional forms and parameterisation are fully described. Since *MEDUSA* has a particular focus on the biologically-driven sequestration of carbon in the deep ocean, the particulate flux submodels are described in detail. Next, *MEDUSA* is used in a standard control simulation for the period 1958 to 2005 (inclusive), and its performance assessed for the global ocean. This simulation makes use of a medium resolution instance of the Nucleus for European Modelling of the Ocean (NEMO) physical model (Madec, 2008) into which *MEDUSA* is embedded. Finally, the results of this simulation are discussed within the context of the need to move beyond NPZD models and to include additional factors associated with the biological carbon pump, such as ecosystem structure and multiple nutrient interaction.

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## 2 MEDUSA

### 2.1 State variables

The model resolves 11 state variables distributed between the nitrogen (6), silicon (2) and iron (1) cycles. The remaining 2 state variables denote chlorophyll for each of the 2 phytoplankton classes. Nitrogen is the model's primary currency. The biogeochemical cycling of major elements in marine systems often exhibits relatively constant stoichiometry in which the ratios of utilisation of inorganic carbon, nitrogen and phosphorus by phytoplankton are matched by corresponding ratios of remineralisation in the deep ocean (Redfield, 1934). This has been particularly convenient for modellers because the cycling of nutrients by the marine ecosystem can be converted to carbon by simply multiplying by the so-called "Redfield ratio". Examples of this approach being used in GCMs include Six and Maier-Reimer (1996), Palmer and Totterdell (2001), Moore et al. (2004) and Le Quéré et al. (2005). We adopt the same approach here whereby the fluxes of carbon are calculated empirically from those of nitrogen without the need for explicit carbon tracers. Additional tracers for dissolved inorganic carbon (DIC) and alkalinity can be added for simulations that require a complete oceanic carbon cycle (e.g. for air-sea CO<sub>2</sub> fluxes). Figure 1 presents a diagrammatic representation of *MEDUSA*'s components and the relationships between them. The state variables are:

	Pn	Non-diatom phytoplankton	mmol N m <sup>-3</sup>
	Pd	Diatom phytoplankton	mmol N m <sup>-3</sup>
	Chl <sub>Pn</sub>	Chlorophyll in non-diatoms	mg chl m <sup>-3</sup>
20	Chl <sub>Pd</sub>	Chlorophyll in diatoms	mg chl m <sup>-3</sup>
	Pd <sub>Si</sub>	Diatom phytoplankton (silicon)	mmol Si m <sup>-3</sup>
	Z <sub>μ</sub>	Microzooplankton	mmol N m <sup>-3</sup>
	Z <sub>m</sub>	Mesozooplankton	mmol N m <sup>-3</sup>

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	D	Slow-sinking detritus	mmol N m <sup>-3</sup>
	N	Nitrogen nutrient	mmol N m <sup>-3</sup>
	S	Silicic acid	mmol Si m <sup>-3</sup>
	F	Iron nutrient	mmol Fe m <sup>-3</sup>

The model includes a number of notable features. First, *MEDUSA* includes a stoichiometric representation of the trophic transfer of carbon and nitrogen during feeding by zooplankton, based on the C:N ratios in predator and prey, and derived from the model of Anderson and Hessen (1995) (based on the implementation in Anderson and Pondaven, 2003). Second, *MEDUSA* adds an explicit diatom silicon state variable (Pd<sub>Si</sub>) to allow diatom cells to have a dynamic Si:N ratio, based on the model of Mongin et al. (2006). Third, *MEDUSA* includes both slow- and fast-sinking detrital pathways to represent the transport of particulate organic carbon in the ocean interior. The former is represented explicitly with a defined sinking rate, while the latter implicitly represents large particles that sink too quickly to be properly resolved within model time-stepping. The modifications adopted here for fast-sinking detritus are based on the ballast model of Armstrong et al. (2002), with the specific implementation derived largely from Dunne et al. (2007). Finally, *MEDUSA* adds an iron cycle submodel and explicit iron state variable (F) to permit regional phytoplankton limitation by this important micronutrient. As remarked upon by Galbraith et al. (2010), iron submodels are still rudimentary, and there is significant uncertainty concerning the detail of the ocean's iron cycle. Consequently, here we adopt the relatively simple iron submodel of Parekh et al. (2005) (based on the implementation in Dutkiewicz et al., 2005). In this, model iron is linked in a single fixed ratio to nitrogen throughout the ecosystem, but it also experiences processes that add (aeolian deposition) and remove (scavenging) it from the water column.

A key intention in this choice of framework is that *MEDUSA* separately represents populations of small phytoplankton that are strongly controlled by fast-growing microzooplankton, and those of large phytoplankton that are more weakly controlled

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$$+ \underbrace{\left[ (1 - D2_{\text{frac}}) \cdot Gm_{\text{PdSi}} \right]}_{\text{mzoo graze}} + \underbrace{\left[ LD_{\text{Si}}(z) \cdot T_{\text{Si}} \right]}_{\text{fast Si detritus remin}} \quad (10)$$

$$\frac{\partial F}{\partial t} = - \underbrace{\left[ R_{\text{Fe}} \cdot \frac{\partial N}{\partial t} \right]}_{\text{coupled to N}} + \underbrace{\left[ F_{\text{atmos}} \right]}_{\text{aeolian}} - \underbrace{\left[ F_{\text{scavenge}} \right]}_{\text{scavenging}} \quad (11)$$

- These differential equations are applied to the biogeochemical state variables within every ocean grid cell in the physical model, regardless of horizontal or vertical position.
- 5 This parallels the implementation of ecosystem models in some general circulation models (e.g. Yool et al., 2010), but is different from other studies in which different equations are applied at different depths, typically to separate the photic and aphotic zones (e.g. Popova et al., 2006).

### 2.3 Interaction functional forms

- 10 The following series of equations expand on the tendency terms described in the differential equations. Parameter definitions and values are described in Sect. 2.4.

#### 2.3.1 Non-diatom limitation and growth

- The chlorophyll and light-limited growth terms for non-diatom phytoplankton are derived from those in Taylor et al. (1997) and Fasham et al. (1990), and based on their
- 15 implementation in Popova et al., 2006. As per Eppley (1972), maximum phytoplankton growth rate is a simple exponential function of temperature. Nutrient limitation is factored in through standard Michaelis-Menten terms.

$$\theta_{\text{Pn}}^{\text{Chl}} = \frac{\text{Chl}_{\text{Pn}} \cdot \xi}{\text{Pn}} \quad (12)$$

$$\hat{\alpha}_{\text{Pn}} = \alpha_{\text{Pn}} \cdot \theta_{\text{Pn}}^{\text{Chl}} \quad (13)$$

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- $\theta_{\text{Pn}}^{\text{Chl}}$  is the scaled chlorophyll to biomass ratio, while  $\hat{\alpha}_{\text{Pn}}$  scales the initial slope of the photosynthesis-irradiance (P-I) curve,  $\alpha_{\text{Pn}}$ , by this ratio so that phytoplankton with a high chlorophyll content have an elevated response to irradiance.

$$V_{\text{Pn}}^{\tau} = V_{\text{Pn}} \cdot 1.066^{\tau} \quad (14)$$

- 5 This term calculates maximum phytoplankton growth rate as an exponential function of temperature and base growth rate at 0°C.

$$J_{\text{Pn}} = \frac{V_{\text{Pn}}^{\tau} \cdot \hat{\alpha}_{\text{Pn}}^2 \cdot I^2}{(V_{\text{Pn}}^{\tau} + \hat{\alpha}_{\text{Pn}}^2 \cdot I^2)^{1/2}} \quad (15)$$

- Given the (chlorophyll-related) initial slope of the P-I curve and (temperature-related) maximum phytoplankton growth rate, this function calculates realised growth rate given
- 10 local irradiance,  $I$ .

$$Q_{\text{N}, \text{Pn}} = \frac{N}{k_{\text{N}, \text{Pn}} + N} \quad (16)$$

$$Q_{\text{Fe}, \text{Pn}} = \frac{F}{k_{\text{Fe}, \text{Pn}} + F} \quad (17)$$

- Nutrient limitation of phytoplankton growth is specified here via standard, hyperbolic Michaelis-Menten terms that use ambient nutrient concentrations and parameters for
- 15 the concentration at which phytoplankton growth is half its theoretical maximum.

$$PP_{\text{Pn}} = J_{\text{Pn}} \cdot Q_{\text{N}, \text{Pn}} \cdot Q_{\text{Fe}, \text{Pn}} \quad (18)$$

- Light- and nutrient-limitation factors are brought together in a multiplicative term that determines nutrient uptake and, via Redfield coupling, primary production.

### 2.3.2 Diatom limitation and growth

Diatom phytoplankton growth terms are derived from the same sources as those of non-diatom phytoplankton. However, diatom growth is additionally coupled to the silicon cycle, and the submodel of silicon uptake and diatom growth from Mongin et al. (2006) has been adopted to represent these processes. This places constraints on growth and nutrient uptake based upon the Si:N ratio of the modelled diatom cells.

$$\theta_{Pd}^{Chl} = \frac{Chl_{Pd} \cdot \xi}{Pd} \quad (19)$$

$$\hat{\alpha}_{Pd} = \alpha_{Pd} \cdot \theta_{Pd}^{Chl} \quad (20)$$

$$V_{Pd^T} = V_{Pd} \cdot 1.066^T \quad (21)$$

$$J_{Pd} = \frac{V_{Pd^T} \cdot \hat{\alpha}_{Pd}^2 \cdot I^2}{(V_{Pd^T}^2 + \hat{\alpha}_{Pd}^2 \cdot I^2)^{1/2}} \quad (22)$$

$$Q_{N,Pd} = \frac{N}{k_{N,Pd} + N} \quad (23)$$

$$Q_{Si} = \frac{S}{k_S + S} \quad (24)$$

$$Q_{Fe,Pd} = \frac{F}{k_{Fe,Pd} + F} \quad (25)$$

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As noted above, the growth of diatom phytoplankton is additionally limited by the availability of the macronutrient silicic acid.

$$R_{Si:N} = \frac{Pd_{Si}}{Pd} \quad (26)$$

$$R_{N:Si} = \frac{Pd}{Pd_{Si}} \quad (27)$$

Silicon is largely used by diatom phytoplankton in the construction of their cell walls, or frustules, which can vary significantly in their ornamentation (e.g. spines, girdle bands; Martin-Jézéquel et al., 2000). As a result, diatoms have a degree of plasticity in their requirement for silicon, necessitating a separate state variable, and centred around the resulting stoichiometric ratios,  $R_{Si:N}$  and  $R_{N:Si}$ .

$$\text{if } R_{Si:N} \leq R_{Si:N}^0 \quad \text{then, } PP_{Pd} = 0 \quad (28)$$

$$\text{else if } R_{Si:N}^0 < R_{Si:N} < (3 \cdot R_{Si:N}^0) \quad \text{then, } PP_{Pd} = (J_{Pd} \cdot Q_{N,Pd} \cdot Q_{Fe,Pd}) \cdot \left( U_{\infty} \cdot \frac{R_{Si:N} - R_{Si:N}^0}{R_{Si:N}} \right) \quad (29)$$

$$\text{else if } R_{Si:N} \geq (3 \cdot R_{Si:N}^0) \quad \text{then, } PP_{Pd} = (J_{Pd} \cdot Q_{N,Pd} \cdot Q_{Fe,Pd}) \quad (30)$$

Here, the uptake of nitrogen (and iron) by diatom cells,  $PP_{Pd}$ , is governed by the Si:N ratio. If this falls below a critical value,  $R_{Si:N}^0$ , diatom cells cannot complete their cell division cycle and growth stops Martin-Jézéquel et al. (2000). Above this minimum ratio growth is scaled by a factor of the Si:N ratio, and above 3 times this ratio, growth is unimpeded by silicon dynamics.

$$\text{if } R_{Si:N} < (3 \cdot R_{Si:N}^0)^{-1} \quad \text{then, } PP_{Pd_{Si}} = (J_{Pd} \cdot Q_{Si}) \quad (31)$$

$$\text{else if } (3 \cdot R_{Si:N}^0)^{-1} \leq R_{Si:N} < (R_{Si:N}^0)^{-1} \quad \text{then, } PP_{Pd_{Si}} = (J_{Pd} \cdot Q_{Si}) \cdot \left( U_{\infty} \cdot \frac{R_{N:Si} - R_{N:Si}^0}{R_{N:Si}} \right) \quad (32)$$

$$\text{else if } R_{Si:N} \geq (R_{Si:N}^0)^{-1} \quad \text{then, } PP_{Pd_{Si}} = 0 \quad (33)$$

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In the upper 300 m of the water column, both models show similar fractional declines in sinking organic carbon, with approximately 40% of the 100 m flux surviving to this depth. Generally, the Dunne et al. (2007) model exhibits greater remineralisation, such that by 1000 m it estimates an organic carbon sinking flux less than one third of that of Martin et al. (1987). The right panel shows the decline of the biominerals with depth. Because of a longer dissolution length scale, a greater proportion of calcium carbonate reaches the seafloor than that of biogenic silicon (relative to the fluxes at 100 m). Also, while silicic acid is present at undersaturated concentrations throughout the water column and so biogenic silicon dissolves at all depths, calcium carbonate is saturated in shallower waters and only dissolves when it becomes undersaturated at greater depths. The saturation horizon used in Fig. 3 is 2700 m, the global average depth calculated from World Ocean Atlas and GLODAP sources, and the ballasting fraction of calcium carbonate only begins to attenuate below this depth. Figure 4 shows the global distribution of this saturation horizon. The geographical pattern occurs because deep water masses gradually accumulate DIC as they transit along the ocean's thermohaline circulation. This material is provided by the biological pump, and its influence gradually shifts the balance of DIC speciation in seawater towards lower carbonate ion ( $\text{CO}_3^{2-}$ ) concentrations. "Young", recently ventilated waters, such as those in the North Atlantic, have accumulated the least material, and  $\text{CO}_3^{2-}$  concentrations are supersaturated for most of the water column. By contrast, "old" waters that have been isolated from the atmosphere for centuries or more, such as those in the North Pacific, have accumulated the most material, and  $\text{CO}_3^{2-}$  concentrations are largely undersaturated.

The parameters used in this implementation of the Dunne et al. (2007) model are listed in Table 6.

### 3.2.3 Alternative models

Although the ballast model has been selected for use here, it is only one of a number of competing models that describe the attenuation of sinking particulate organic material in the ocean, and there is still considerable observational uncertainty concerning export

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production (e.g. Buesseler et al., 2007). Alternative models include variants of the original Martin et al. (1987) formulation (e.g. Parekh et al., 2005), models that consider the size spectra of sinking material (e.g. Kriest and Evans, 1999), and those that explicitly include the aggregation of sinking particles (e.g. Burd and Jackson, 2009). Furthermore, the particular parameterisation of the ballast model employed here is also only one among a number of subtly different variants. Alternatives include those of Moore et al. (2004) and Oka et al. (2008).

However, at the present time there is still considerable uncertainty surrounding water column remineralisation (e.g. Buesseler et al., 2007), and the most appropriate choice of export production model is unclear. To this end, the ballast model has been favoured for *MEDUSA* largely because of its relative simplicity, and because of its intrinsic connection with the silicon cycle.

## 4 Default simulation

The following section describes a simulation and evaluation of *MEDUSA* using the default equations, functional forms and parameter values described previously.

### 4.1 Physical model

The underlying physical model used in this simulation is version 3.2 of NEMO (Madec, 2008). This is comprised of an ocean general circulation model, OPA9 (Madec et al., 1998; Madec, 2008), coupled with a sea-ice model, Louvain-la-Neuve Ice Model version 2 (LIM2; Timmermann et al., 2005). This physical framework is configured at approximately  $1^\circ \times 1^\circ$  horizontal resolution ( $292 \times 362$  grid points), with a focusing of resolution around the equator to improve the representation of equatorial upwelling. Vertical space is divided into 64 levels, which increase in thickness with depth, from approximately 6 m at the surface to 250 m at 6000m. To improve the representation of deep water circulation, partial level thicknesses are used in the specification of bottom topography.

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The model is forced at the ocean surface using DFS4.1 fields developed by the European DRAKKAR collaboration (DRAKKAR Group, 2007). DFS combines elements from two sources: the CORE forcing dataset (Large and Yeager, 2004), from which precipitation and downward short- and long-wave radiation are extracted; and the ERA40 reanalysis, from which 10 m wind and 2 m air temperature and humidity are extracted. The latter fields are used in conjunction with the bulk formulae proposed by Large and Yeager (2004) to compute air/sea and air/sea-ice energy and freshwater fluxes. The frequency of DFS4.1 is monthly for precipitation, daily for radiation and 6-hourly for the turbulent variables. Climatological monthly runoff (Dai and Trenberth, 2002) is applied along the coastline of the land mask.

The sea-ice submodel used here, LIM2, is based upon viscous-plastic ice rheology (Hibler, 1979) and three layer (two layers of sea-ice, one layer of snow) thermodynamics (Semtner, 1976), with a number of updated physical processes (see Timmermann et al., 2005; and references therein). Model sea-ice is coupled to the ocean every 5 ocean timesteps through the non-linear quadratic drag law of the shear between sea-ice and ocean surface velocity (Timmermann et al., 2005). Freshwater exchange between the ocean and sea-ice is calculated from precipitation and ice formation/melting (Fichefet and Morales Maqueda, 1997), where sea-ice salinity is assumed to be 4 psu and rain/snow are assumed fresh. The heat flux between the sea-ice and ocean is proportional to the departure in temperature from salinity-dependent freezing point and the friction velocity at the ice-ocean interface. Solar radiation can penetrate sea-ice not covered by snow, and is dissipated by brine pockets within the ice where it increases latent heat storage (Fichefet and Morales Maqueda, 1997).

Temperature and salinity fields are initialised here from a monthly climatology that combines the World Ocean Atlas climatology with the PHC2.1 database (Steele et al., 2001; high latitudes) and the Medatlas climatology (Jourdan et al., 1998; Mediterranean Sea). To prevent unacceptable drifts in salinity caused by deficiencies in freshwater forcing, sea surface salinity is relaxed towards monthly mean climatology values. The relaxation timescale is 180 days for the open ocean, and 12 days under

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sea-ice. Further details concerning model configuration can be found in Barnier et al. (2006), Penduff et al. (2007) and Penduff et al. (2010), but note that these describe higher resolution instances of NEMO.

## 4.2 Spinup and simulation

Before *MEDUSA* was added to NEMO, a short, physics-only simulation was performed to provide a “moving” ocean circulation field into which the biogeochemistry could be added. The physical model was simulated from rest from the beginning of the forcing dataset (1 January 1958) for a period of 8 years (to 31 December 1965). This period is insufficient for the thermohaline circulation to be fully established, but it is long enough for strong transient behaviour to decline. In early tests with *MEDUSA*, it was found that the model’s behaviour was broadly similar between simulations initialised with physical states that had experienced significantly different spin-up periods.

After this initial phase, *MEDUSA* was coupled to the resulting physical state and the simulation was integrated a further 40 years (to 31 December 2005). For this latter phase, *MEDUSA* was initialised using the World Ocean Atlas climatology for dissolved inorganic nitrogen and silicic acid concentrations, and using an iron field derived from a long-duration simulation of a lower resolution GCM (Parekh et al., 2005; Dutkiewicz et al., 2005). All other model tracers were initialised to arbitrary small values.

In addition to the biogeochemical dynamics described previously, the concentrations of dissolved inorganic nitrogen and silicic acid were relaxed towards World Ocean Atlas climatology values in grid cells within 100 km of land. This was done to emulate the input of these nutrients to coastal locations by riverine sources. Since there is, as yet, no corresponding climatology for iron, this nutrient was not relaxed anywhere in the ocean.

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both correlates poorly and shows much less variability than the observed SeaWiFS fields. Although estimated productivity is based on the same SeaWiFS chlorophyll fields, *MEDUSA*'s agreement with the three productivity models is actually greater. The CbPM model agrees best, although correlations are still relatively weak.

5 Figures 16–23 show model properties of relevance to *MEDUSA*'s structure, but for which there is little or no observational information.

Figure 16 illustrates the difference in seasonality in the populations of diatom and non-diatom phytoplankton. The former show strongly seasonal behaviour, with high bloom concentrations in spring-summer and near-absence in winter. While the latter  
10 also show seasonality, it is considerably more modulated, with small but significant populations during the winter.

Unsurprisingly, this pattern is repeated in Fig. 17, which shows the separate primary production of both groups. Integrating, the diatoms are responsible for 17.0% of total primary production in *MEDUSA*. Estimates of this fraction in the real world are not  
15 common. Several estimates for specific locations exist and range from 13 to 34% (Nelson and Brzezinski, 1997; Blain et al., 1997; Brzezinski et al., 1998), though these estimates do not cover the full range of ocean ecosystems. Global estimates are rarer, though a survey by Mann (1999) suggested 40 to 45%, greater than that from the local studies, and much greater than that estimated by *MEDUSA*.

20 Although diatom primary production appears at the low end of literature estimates, biogenic opal production by *MEDUSA* slightly higher than that estimated. Figure 19 shows the global distribution of opal production, which largely follows diatom production, though areas such as the North Pacific and Southern Ocean show elevated production because of higher Si:N ratios (see Fig. 18). Globally integrated opal  
25 production is  $262.6 \text{ Tmol Si y}^{-1}$ , 9% higher than the  $240 \text{ Tmol Si y}^{-1}$  estimated by Tréguer et al. (1995).

Figure 19 also shows the split between primary production in the mixed layer and that deeper in the water column. The fraction is greatest at high latitudes in both summer and (especially) winter. Lower latitudes show much lower fractions especially

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in the oligotrophic subtropical gyres where nutrients are permanently limiting. Globally, 69.6% of primary production occurs in the mixed layer. Following up on nutrient limitation, Fig. 21 shows annual average limitations for both phytoplankton. Averaging  
5 spatially, non-diatoms are slightly more limited by iron (0.575) than nitrogen (0.628). Diatoms are most limited by iron (0.407), followed by silicon (0.518) then nitrogen (0.559).

Largely following the availability of their favoured prey, Fig. 20 shows the seasonal distributions of micro- and mesozooplankton. The former closely matches the availability of the small, non-diatom phytoplankton. However, although the  
10 mesozooplankton have a preference for microzooplankton equal to diatoms, their distribution closely resembles diatoms, with generally low concentrations elevated wherever diatoms are blooming. However, while the diatoms are the smaller fraction of the phytoplankton community, their grazers make up 55.5% of total surface zooplankton.

15 Another size-based aspect of *MEDUSA* lies in slow- and fast-sinking detritus. Figure 22 shows the production of both classes of detritus. Unsurprisingly, given *MEDUSA*'s foodweb, the distribution of slow-sinking detritus largely resembles that of the smaller scale portion of the ecosystem, while fast-sinking detritus follows diatoms and mesozooplankton. In terms of production, 74.9% of detrital particles are  
20 small but, as Fig. 23 shows, by 100 m the total sinking flux has fallen to 24.3% of the  $33.9 \text{ Gt C y}^{-1}$  produced, of which only 33.5% is made up of small particles.

25 Figures 24–26 show the time evolution of regionally averaged nutrient profiles across the whole simulated period. These are plotted to quantify the scale of vertical nutrient redistribution that occurs during *MEDUSA* simulations, and to assess the extent to which the model has equilibrated by the end of the simulated period. Since the resupply of surface nutrients is dependent on vertical gradients, changes in these wrought by the model can be very important.

Of the two macronutrients, nitrogen and silicon, profiles change only slightly during the simulation. The most striking changes occur in the Southern Ocean where both

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Similarly, also in part related to the change in surface nutrient conditions, another anticipated impact lies with the occurrence and distribution of nitrogen fixation (Capone et al., 2005). This process is an important source of fixed nitrogen for oligotrophic regions of the surface ocean, and offsets its consumption through denitification (Tyrrell, 1999). A declining supply of physically-supplied fixed nitrogen from depth driven by increasing stratification and, potentially, increasing anoxia-mediated denitrification (cf. Deutsch et al., 2007), may act to shift phytoplankton community structure in favour of groups capable of utilising dissolved dinitrogen gas.

The invasion of the ocean by anthropogenic CO<sub>2</sub> is increasing dissolved inorganic carbon concentrations (Key et al., 2004), and altering the pH of seawater. This process, known as ocean acidification (Caldeira and Wickett, 2003; Orr et al., 2005), is predicted to have a number of different effects on ocean biota (Raven et al., 2005), but a major one will be the increasing solubility of the biomineral calcium carbonate in surface (and deep) waters. Since a large number of planktonic species utilise this mineral for structural purposes, changes in seawater chemistry that accelerate its dissolution are liable to have a significant impact.

These latter changes to the ocean system mitigate in favour of ecosystem models that include more sophistication than conventional NPZD models, so that their consequences can be assessed. However, although research has outlined the ecosystem processes described above, there are still large gaps that preclude robust and reliable predictions. For instance, in the case of nitrogen fixation, there are a number of different phylogenetic groups engaged in this process (e.g. cyanobacteria, diatoms, even some metazoans; Kneip et al., 2007), with the result that functional behaviour is diverse and difficult to model within the confines of a single state variable. There are potentially even issues concerning seemingly established ideas about the correlation of nitrogen fixation with warm waters (cf. Le Quéré et al., 2005) that may be incorrect (cf. Monteiro et al., 2010). Similarly, while calcification may be expected to be straightforwardly related to the saturation state of calcium carbonate, experimental and field work has found a wide range of responses that, again, preclude

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simple modelling (e.g. Riebesell et al., 2000; Iglesias-Rodriguez et al., 2008).

Within this context, *MEDUSA* aims to expand upon classical NPZD models, while restricting itself to biogeochemical cycles and biological functional groups that are more completely understood (cf. Anderson, 2005; Flynn, 2005). Hence, *MEDUSA*'s incorporation of diatoms and the silicon cycle (cf. Smetacek, 1985; Dugdale and Wilkerson, 1998), and a microbial loop of smaller phytoplankton and zooplankton (cf. Pomeroy, 1974; Azam et al., 1983). However, as noted by Hood et al. (2006), even these expansions are not without uncertainty. The silicon cycle, for instance, ignores the contributions to opal production of both the silicoflagellates and (more significantly) the radiolarians. Furthermore, *MEDUSA* also omits a detailed consideration of internal cell physiology (cf. Flynn, 2001). Nonetheless, the intention of *MEDUSA* is to provide a post-NPZD plankton ecosystem model, with a parameterisation that is robust, and whose major state variables are amenable to analysis and comparison with observational data throughout the global domain.

In general, *MEDUSA*'s performance is acceptable, with global patterns of nutrients and productivity that closely follow those observed. Major features such as oligotrophic gyres and the seasonal progression of plankton blooms and nutrient depletion are reproduced. And at the global scale, *MEDUSA*'s productivity falls well within the range estimated from observations, both in terms of organic carbon and biogenic opal. Furthermore, although indirect, the multi-decadal stability of vertical macronutrient gradients (except in the Southern Ocean; see below) suggests that *MEDUSA*'s export production successfully balances nutrient resupply by physical mechanisms. Drifts in deep iron concentrations suggest an insufficient spin-up period, but surface gradients equilibrate quickly as with the macronutrients. However, there are a number of significant discrepancies between *MEDUSA* and observations that should be noted.

Firstly, *MEDUSA* tends to accumulate nutrients, especially silicic acid, in the surface waters of the Southern Ocean. Since *MEDUSA*'s productivity is similar to that estimated from satellite observations, this tends to suggest that either the export fraction of *MEDUSA* is too low in this region (i.e. the biological pump does not transfer

1974

organic material deep enough), or that NEMO's upwelling is too strong (i.e. excessive quantities of nutrient are upwelled, and cannot be processed by surface biology). Given the good agreement between NEMO and observed physical fields, the former explanation may guide future improvement.

5 Secondly, the oligotrophic gyres in *MEDUSA* have lower concentrations of chlorophyll and are less productive than observed. Again, this may be the result of either biological or physical deficiencies in the model. For instance, the low nutrient concentrations in these regions may be insufficient to permit even slow growth of *MEDUSA*'s phytoplankton on recycled nutrients. Alternatively, the resolution of NEMO  
10 used here may omit mesoscale processes that supply nutrients to the surface ocean (e.g. McGillicuddy et al., 2003). As noted already, the former suggestion is supported by work that permits adaptation of model phytoplankton to oligotrophic conditions (Smith et al., 2009). The latter suggestion may be investigated in future using higher resolution instances of NEMO.

15 As noted, both of these deficiencies may have biogeochemical roots. At present, *MEDUSA* has not been objectively tuned to more closely match observational fields. Current parameterisation is instead derived from literature values and from subjective "tuning" where parameter values have been found to cause systematic errors. Previous studies have found that the localised optimisation of a biogeochemical model at  
20 particular locations can be successful at improving model performance when the model is then simulated in 3-D at large scale (Oschlies and Schartau, 2005). Consequently, objective tuning, coupled to validation in 3-D, may be a future avenue to improve the performance of *MEDUSA* and to diminish the most significant current errors.

25 A further issue with the simulation of *MEDUSA* examined here is the suggestion that the spin-up period used is insufficient, most clearly apparent in the drift of deep iron concentrations, but also in the more gradual adjustment of DIN and silicic acid distributions. In the specific case of iron, given an initial condition derived from a different model, the operation of iron scavenging throughout the model domain, and the long ventilation timescale of the deep ocean (2000 y; Ostlund and Stuiver, 1980), this is

1975

perhaps unsurprising. The medium resolution used here, as well as the high resolution used in other applications of *MEDUSA* (e.g. Popova et al., 2010), preclude spin-ups of more than a few decades. However, lower resolution instances of the NEMO GCM are  
5 available, and future investigation of up-scaled *MEDUSA* output from longer spin-ups of coarser grids may provide one solution to this problem. Nonetheless, and as noted already, despite deep ocean drifts, the biogeochemical cycles of *MEDUSA*'s surface ocean, where most biological activity takes place, reach quasi-equilibrium well within the time-scale of the simulation described here.

10 In summary, despite the deficiencies noted above, we believe that *MEDUSA* represents a valuable tool for global scale simulations of the plankton ecosystem. One that is intermediate between the simplicity of NPZD models, and the expensive complexity of PFT models, but whose complexity provides a "good fit" with our current ability to validate models at the global scale. Future work with *MEDUSA* will include its application to a range of contemporary topics, including Arctic climate change (Kwok  
15 and Rothrock, 2009) and ocean acidification (Orr et al., 2005).

## 6 Conclusions

- *MEDUSA*, a novel, size-based plankton ecosystem model of the nitrogen, silicon and iron cycles for the global ocean is introduced
- The performance of *MEDUSA* is evaluated using global-scale observational fields  
20 following a multi-decadal simulation (1966 to 2005 inclusive).
- *MEDUSA* reliably produces global patterns of surface nutrients and productivity, and (generally) preserves vertical nutrient gradients.
- *MEDUSA*'s major deficiencies are excessive surface nutrients in the Southern Ocean (especially silicic acid), and low productivity in oligotrophic gyres.
- 25 – *MEDUSA* estimates that surface productivity is dominated by small plankton, but that the deep biological pump is driven by large plankton.

1976





2007. 1973  
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1986



**Table 1.** Phytoplankton growth parameters.

$\xi$	Chl:N conversion factor (Redfield ratio of 6.625) g chl (mol N) <sup>-1</sup>	0.0256
$\alpha_{Pn}, \alpha_{Pd}$	chl-specific initial slope of P-I curve g C (g chl) <sup>-1</sup> (W m <sup>-2</sup> ) <sup>-1</sup> d <sup>-1</sup>	10.0, 7.5
$V_{Pn}, V_{Pd}$	maximum phytoplankton growth rate d <sup>-1</sup>	0.53, 0.50
$\theta_{\max, Pn}^{\text{Chl}}, \theta_{\max, Pd}^{\text{Chl}}$	maximum chl:C ratio g chl (g C) <sup>-1</sup>	0.10, 0.10
$R_{\text{Si:N}}^0$	minimum diatom Si:N ratio mol Si (mol N) <sup>-1</sup>	0.2
$R_{\text{N:Si}}^0$	minimum diatom N:Si ratio mol N (mol Si) <sup>-1</sup>	0.2
$U_{\infty}$	hypothetical growth ratio at $\infty$ Si:N ratio –	1.5
$k_{N, Pn}, k_{N, Pd}$	N nutrient uptake half-saturation constants mmol N m <sup>-3</sup>	0.50, 0.75
$k_{\text{Si}}$	Si nutrient uptake half-saturation constant mmol Si m <sup>-3</sup>	0.75
$k_{\text{Fe}, Pn}, k_{\text{Fe}, Pd}$	Fe nutrient uptake half-saturation constants $\mu\text{mol Fe m}^{-3}$	0.33, 0.67

1987

**Table 2.** Zooplankton grazing parameters.

$g_{\mu}, g_m$	maximum zooplankton grazing rate d <sup>-1</sup>	2.0, 0.5
$k_{\mu}, k_m$	zooplankton grazing half-saturation constants mmol N m <sup>-3</sup>	0.8, 0.3
$\phi$	zooplankton grazing inefficiency –	0.20
$\beta_N$	zooplankton N assimilation efficiency –	0.69
$\beta_C$	zooplankton C assimilation efficiency –	0.69
$k_C$	zooplankton net C growth efficiency –	0.80
$\rho_{\mu Pn}, \rho_{\mu D}$	microzooplankton grazing preferences –	0.75, 0.25
$\rho_{mPn}, \rho_{mPd},$ $\rho_{mZ\mu}, \rho_{mD}$	mesozooplankton grazing preferences –	0.15, 0.35, 0.35, 0.15

1988

**Table 3.** Plankton and detritus loss parameters.

$\mu_{1,Pn}, \mu_{1,Pd}$	phytoplankton loss rates $d^{-1}$	0.02, 0.02
$\mu_{1,Z\mu}, \mu_{1,Zm}$	zooplankton loss rates $d^{-1}$	0.02, 0.02
$\mu_{2,Pn}, \mu_{2,Pd}$	phytoplankton maximum loss rates $d^{-1}$	0.1, 0.1
$k_{Z\mu}, k_{Zm}$	phytoplankton loss half-saturation constants $mmol\ N\ m^{-3}$	0.5, 0.5
$\mu_{2,Z\mu}, \mu_{2,Zm}$	zooplankton maximum loss rates $d^{-1}$	0.5, 0.75
$k_{Z\mu}, k_{Zm}$	zooplankton loss half-saturation constants $mmol\ N\ m^{-3}$	0.2, 0.75
$\mu_D$	detrital N remineralisation rate $d^{-1}$	0.016

1989

**Table 4.** Miscellaneous parameters.

$\theta_{Pn}, \theta_{Pd}$	phytoplankton C:N ratio $mol\ C\ (mol\ N)^{-1}$	6.625
$\theta_{Z\mu}, \theta_{Zm}$	zooplankton C:N ratio $mol\ C\ (mol\ N)^{-1}$	6.625
$\theta_D$	detritus C:N ratio $mol\ C\ (mol\ N)^{-1}$	6.625
$R_{Fe}$	phytoplankton Fe:N uptake ratio $\mu mol\ Fe\ (mol\ N)^{-1} m$	30.0
$L_{total}$	total ligand concentration $\mu mol\ m^{-3}$	1.0
$k_{FeL}$	dissociation constant for (Fe + ligand)	100.0
$k_{scav}$	scavenging rate of "free" Fe $d^{-1}$	0.001
Diss	diatom frustule dissolution rate $d^{-1}$	0.006
$w_g$	detrital sinking rate $m\ d^{-1}$	2.5

1990

**Table 5.** MEDUSA switches.

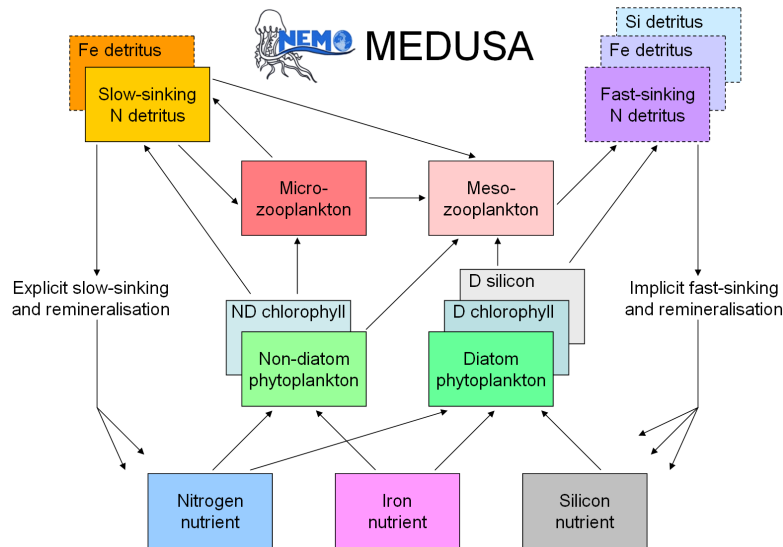
$j_{\text{phy}}$	switches phytoplankton maximum growth between temperature independence (= 0) and dependence (= 1); the default is $j_{\text{phy}} = 1$
$j_{\text{mpn}}$	switches non-diatom phytoplankton density-dependent mortality between linear (= 1), quadratic (= 2), hyperbolic (= 3) and sigmoid (= 4) forms; the default is $j_{\text{mpn}} = 3$
$j_{\text{mpd}}$	as $j_{\text{mpn}}$ but for diatom phytoplankton
$j_{\text{mzmi}}$	as $j_{\text{mpn}}$ but for microzooplankton
$j_{\text{mzme}}$	as $j_{\text{mpn}}$ but for mesozooplankton
$j_{\text{md}}$	as $j_{\text{phy}}$ but for detrital remineralisation; the default is $j_{\text{md}} = 1$

1991

**Table 6.** Fast detritus submodel parameters.

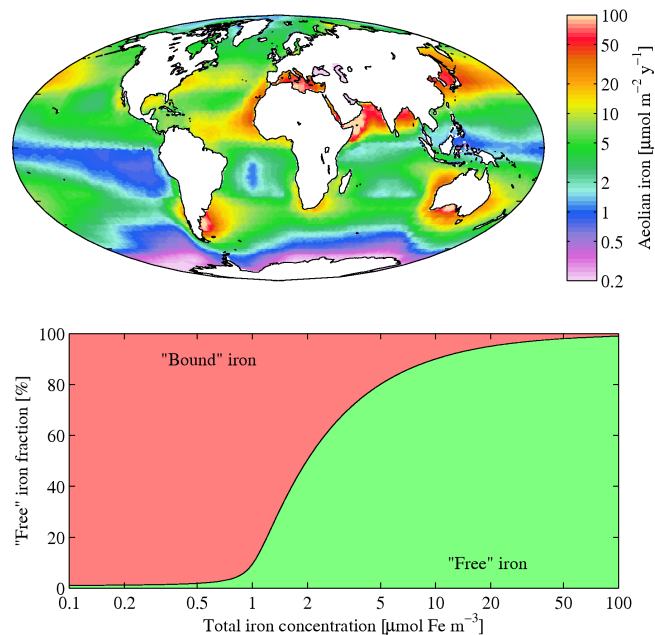
$D1_{\text{frac}}$	fast detritus fraction of diatom losses	0.25
—	—	—
$D1_{\text{frac}}$	fast detritus fraction of mesozooplankton losses	1.00
—	—	—
$fc(90^\circ)$	polar calcium carbonate:organic C fraction	0.02
	$\text{mol CaCO}_3 (\text{mol C})^{-1}$	
$fc(0^\circ)$	equatorial calcium carbonate:organic C fraction	0.10
	$\text{mol CaCO}_3 (\text{mol C})^{-1}$	
$M_{\text{org}}$	organic carbon mass:mole ratio, C	12.011
	$\text{g} (\text{mol C})^{-1}$	
$M_{\text{CaCO}_3}$	calcium carbonate mass:mole ratio, $\text{CaCO}_3$	100.086
	$\text{g} (\text{mol C})^{-1}$	
$M_{\text{Si}}$	biogenic Si mass:mole ratio, $\text{SiO}_2$	60.084
	$\text{g} (\text{mol Si})^{-1}$	
$f_{\text{CaCO}_3}$	calcium carbonate protection ratio	0.070
	$\text{g C} (\text{g C})^{-1}$	
$f_{\text{Si}}$	biogenic Si protection ratio	0.026
	$\text{g C} (\text{g Si})^{-1}$	
$d_{\text{excess}}$	excess organic carbon dissolution length scale	188
	m	
$d_{\text{CaCO}_3}$	calcium carbonate dissolution length scale	3500
	m	
$d_{\text{Si}}$	biogenic Si dissolution length scale	2000
	m	

1992



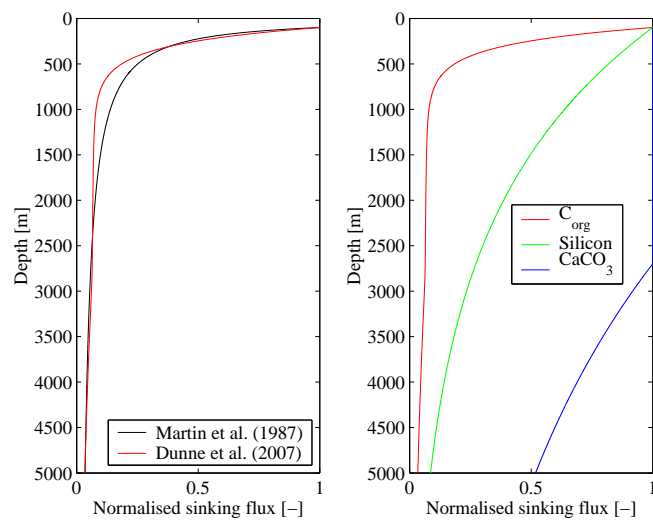
**Fig. 1.** Schematic diagram of the components and interactions in the *MEDUSA* model. Boxes with solid borders indicate explicitly modelled state variables, while boxes with dashed borders indicate implicitly modelled components. Overlapping boxes indicate components for which multiple currencies are modelled (e.g. different elements, chlorophyll).

1993



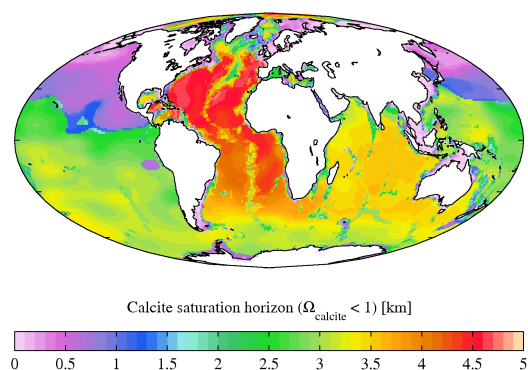
**Fig. 2.** The top panel shows mean annual aeolian iron input to the ocean (i.e. the quantity of iron that dissolves into seawater from deposited dust). The input is shown on a logarithmic scale in units of  $\mu\text{mol m}^{-2} \text{y}^{-1}$ , and integrated input is  $2.564 \text{ Gmol Fe y}^{-1}$ . The bottom panel shows the fractionation of total iron between "free" and ligand-bound forms across a logarithmic range of total iron concentrations.

1994



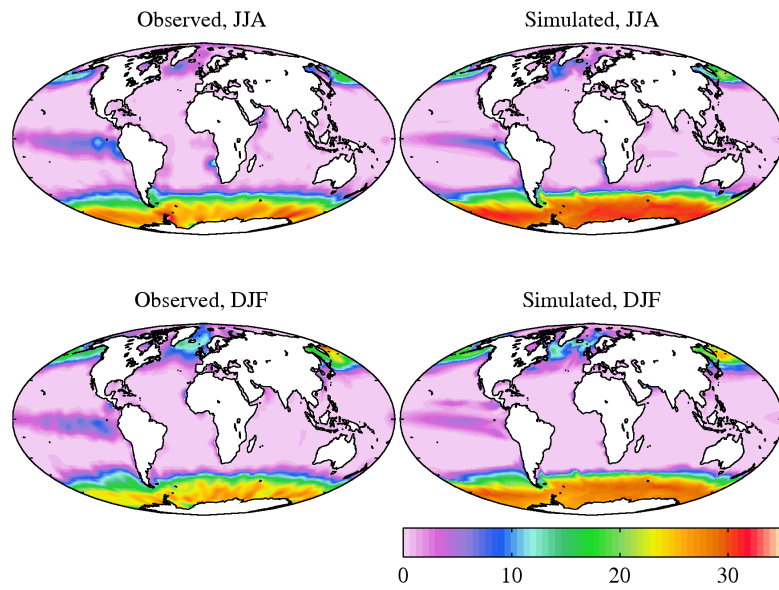
**Fig. 3.** Vertical attenuation of the sinking flux. The left panel compares the Dunne et al. (2007; red) parameterisation for organic carbon with that of Martin et al. (1987; black). The right panel shows the attenuation of organic carbon (red), biogenic silicon (green) and calcium carbonate (blue). In all cases, fluxes are normalised to those at 100 m.

1995



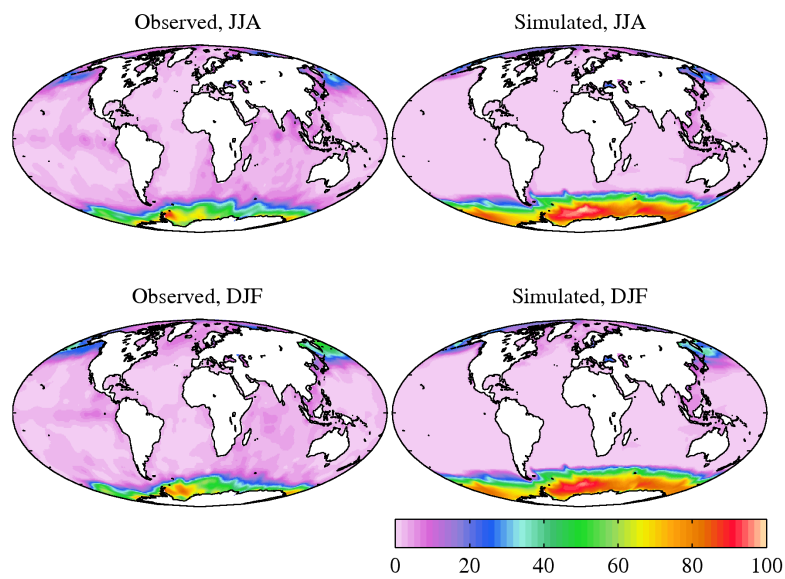
**Fig. 4.** The global distribution of the depth of the calcite saturation horizon. This is calculated as the shallowest depth at which  $\Omega_{\text{calcite}}$  is less than 1. The three dimensional field of  $\Omega_{\text{calcite}}$  is calculated using the CSYS package (Zeebe and Wolf-Gladrow, 2001) together with fields of ocean properties from the World Ocean Atlas (Locarnini et al., 2006; Antonov et al., 2006; temperature and salinity) and GLODAP (Key et al., 2004; DIC and alkalinity) climatologies. Interpolation has been used to fill gaps in the GLODAP climatology including the Arctic, Caribbean, Mediterranean seas and the Malay Archipelago.

1996



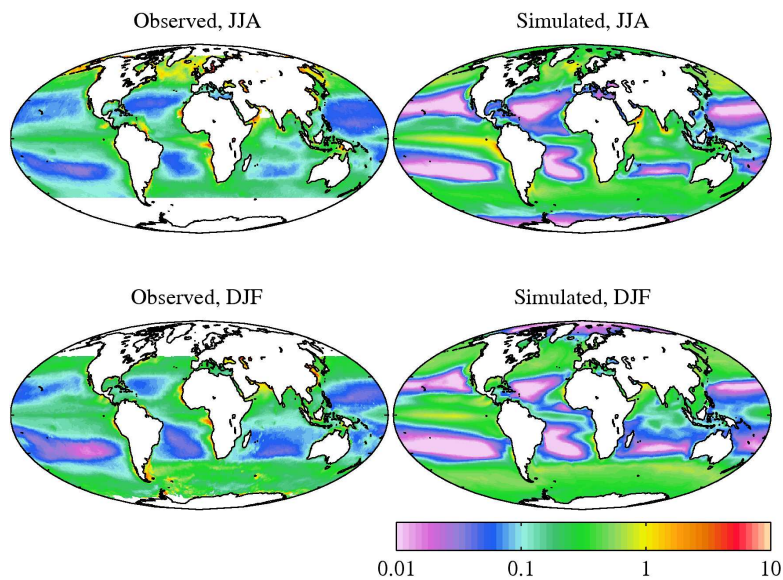
**Fig. 5.** Observational (World Ocean Atlas, 2005; left) and simulated (right) surface dissolved inorganic nitrogen for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). Concentrations in  $\text{mmol m}^{-3}$ .

1997



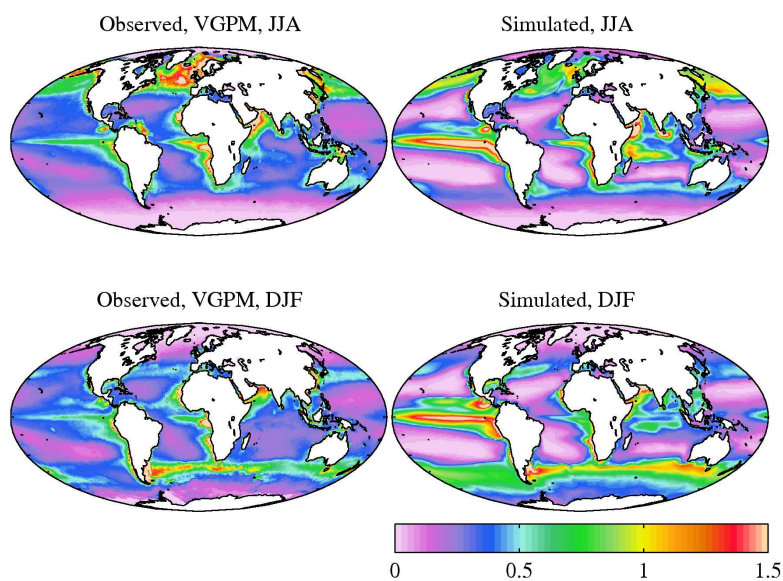
**Fig. 6.** Observational (World Ocean Atlas, 2005; left) and simulated (right) surface silicic acid for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). Concentrations in  $\text{mmol m}^{-3}$ .

1998



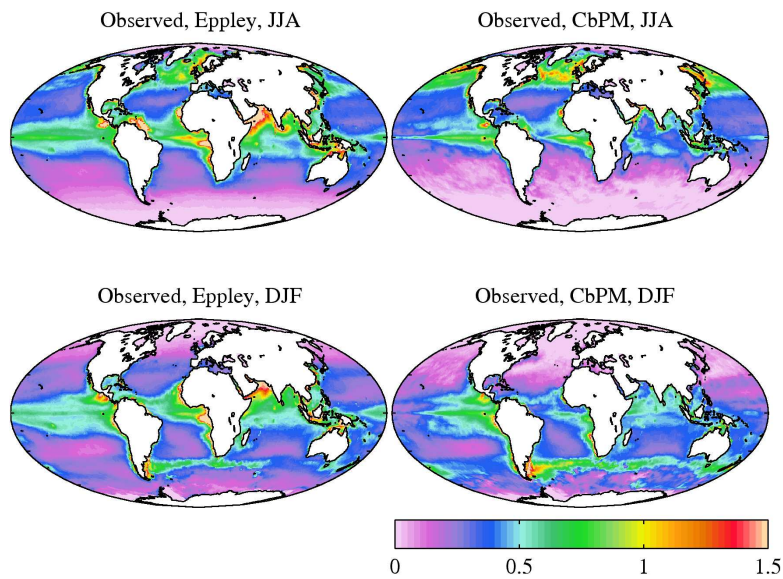
**Fig. 7.** Observational (SeaWiFS ; left) and simulated (right) surface chlorophyll for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). Concentrations in  $\text{mg chl m}^{-3}$ .

1999



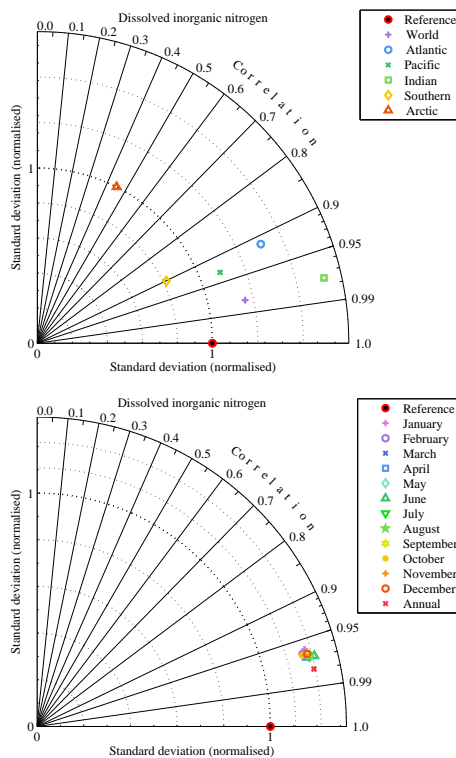
**Fig. 8.** Observational (VGPM model; left) and simulated (right) integrated primary production for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). The observational field here is estimated using the VGPM model and SeaWiFS chlorophyll observations. Production in  $\text{g C m}^{-2} \text{d}^{-1}$ .

2000



**Fig. 9.** Observational integrated primary production as per Fig. 8 but for the Eppley-VGPM (left) and CbPM (right) models. Production in  $\text{g C m}^{-2} \text{d}^{-1}$ .

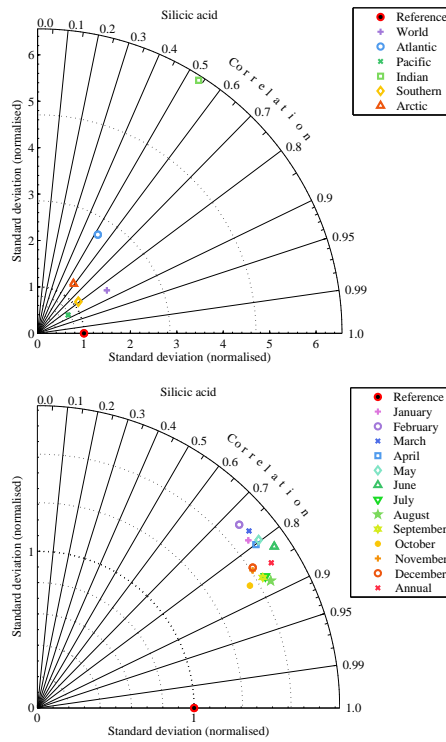
2001



**Fig. 10.** Taylor diagrams of spatial (top) and temporal (bottom) model-observation comparisons for surface dissolved inorganic nitrogen. In the upper panel, simulated annual means for different regions are compared to corresponding observational fields. In the lower panel, simulated global average means for different months are compared to corresponding observational fields.

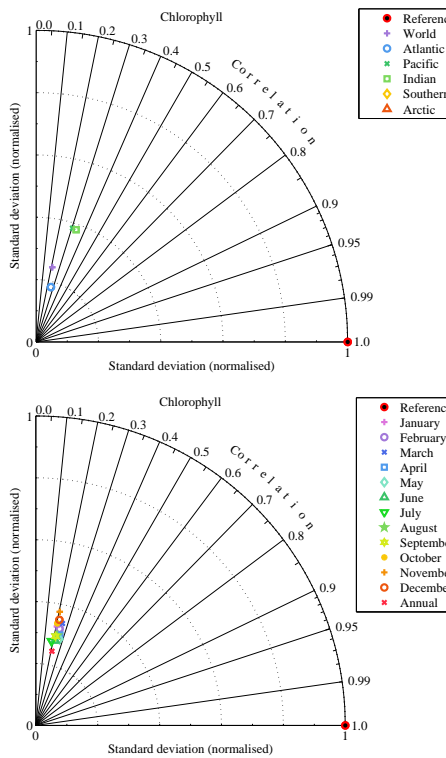
2002





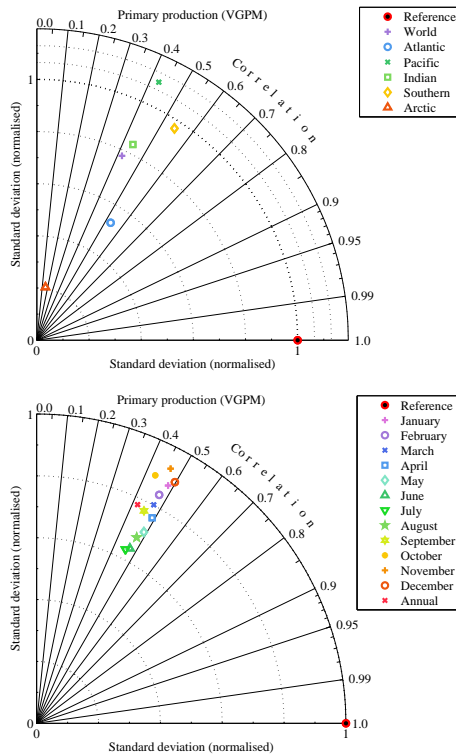
**Fig. 11.** Taylor diagrams of spatial (top) and temporal (bottom) model-observation comparisons for surface silicic acid. In the upper panel, simulated annual means for different regions are compared to corresponding observational fields. In the lower panel, simulated global average means for different months are compared to corresponding observational fields.

2003



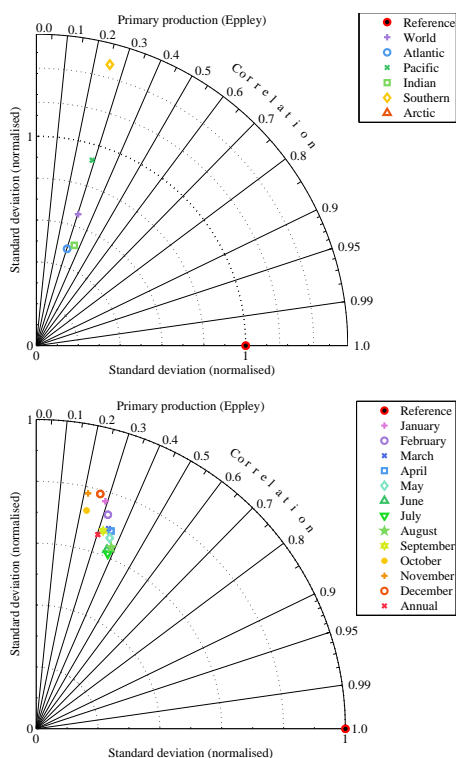
**Fig. 12.** Taylor diagrams of spatial (top) and temporal (bottom) model-observation comparisons for surface chlorophyll. In the upper panel, simulated annual means for different regions are compared to corresponding observational fields. In the lower panel, simulated global average means for different months are compared to corresponding observational fields.

2004



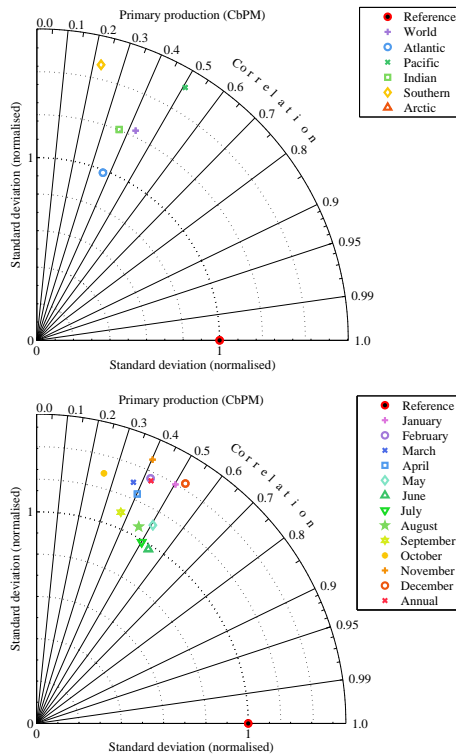
**Fig. 13.** Taylor diagrams of spatial (top) and temporal (bottom) model-observation comparisons for integrated primary production (VGPM estimated). In the upper panel, simulated annual means for different regions are compared to corresponding observational fields. In the lower panel, simulated global average means for different months are compared to corresponding observational fields.

2005



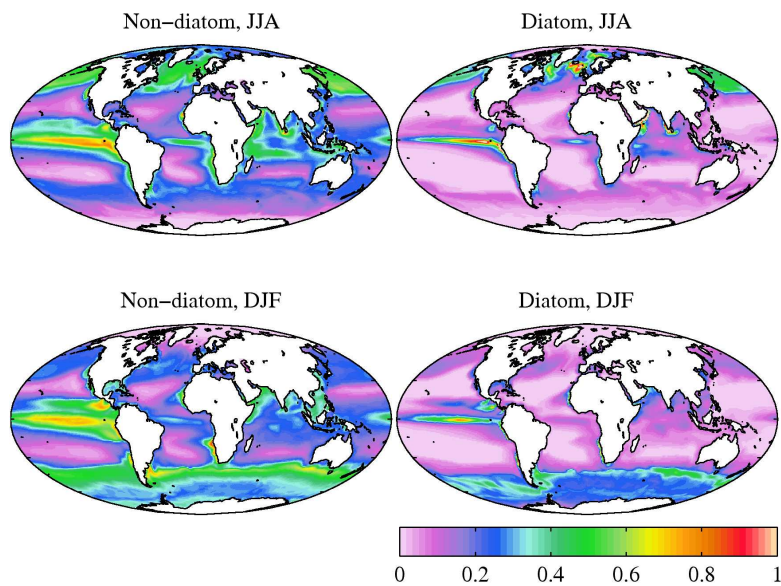
**Fig. 14.** Taylor diagrams of spatial (top) and temporal (bottom) model-observation comparisons for integrated primary production (Eppley-VGPM estimated). In the upper panel, simulated annual means for different regions are compared to corresponding observational fields. In the lower panel, simulated global average means for different months are compared to corresponding observational fields.

2006

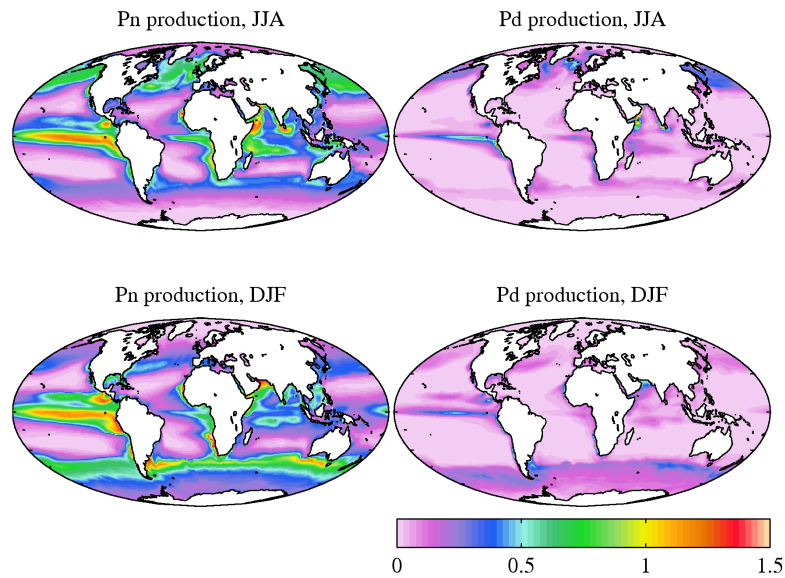


**Fig. 15.** Taylor diagrams of spatial (top) and temporal (bottom) model-observation comparisons for integrated primary production (CbPM estimated). In the upper panel, simulated annual means for different regions are compared to corresponding observational fields. In the lower panel, simulated global average means for different months are compared to corresponding observational fields.

2007

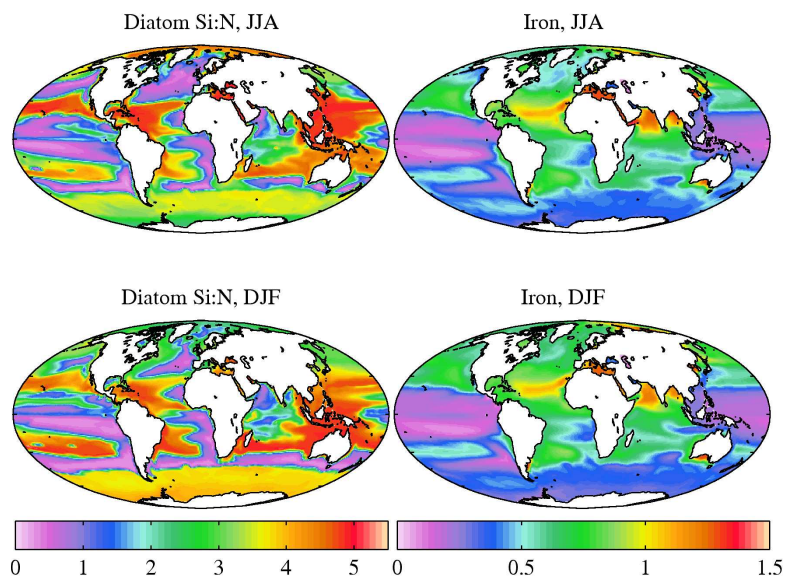


**Fig. 16.** Simulated surface non-diatom phytoplankton (left) and diatom phytoplankton (right) concentrations for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). Concentrations in  $\text{mmol m}^{-3}$ .



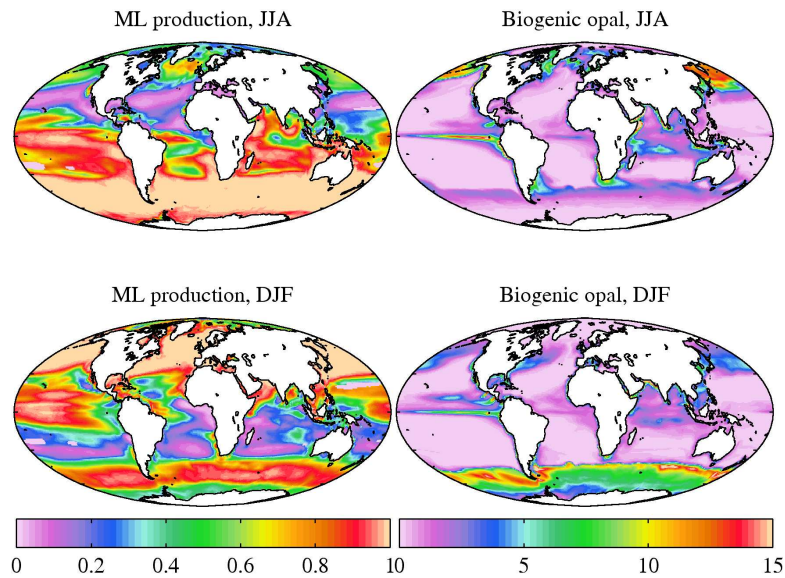
**Fig. 17.** Simulated non-diatom (left) and diatom (right) primary production for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). Production in  $\text{g C m}^{-2} \text{d}^{-1}$ .

2009



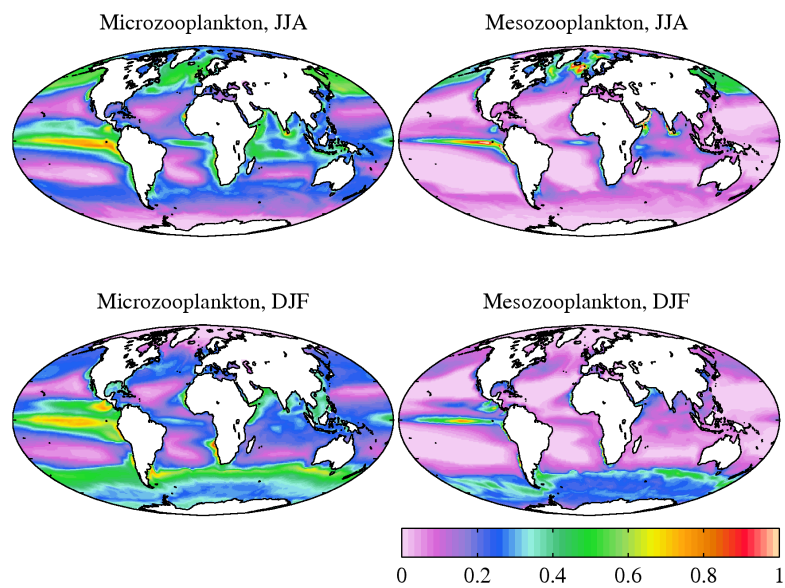
**Fig. 18.** Simulated surface diatom phytoplankton Si:N ratio (left) and iron concentration (right) for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). Ratio in  $\text{mol Si (mol N)}^{-1}$ ; concentration in  $\mu\text{mol m}^{-3}$ .

2010



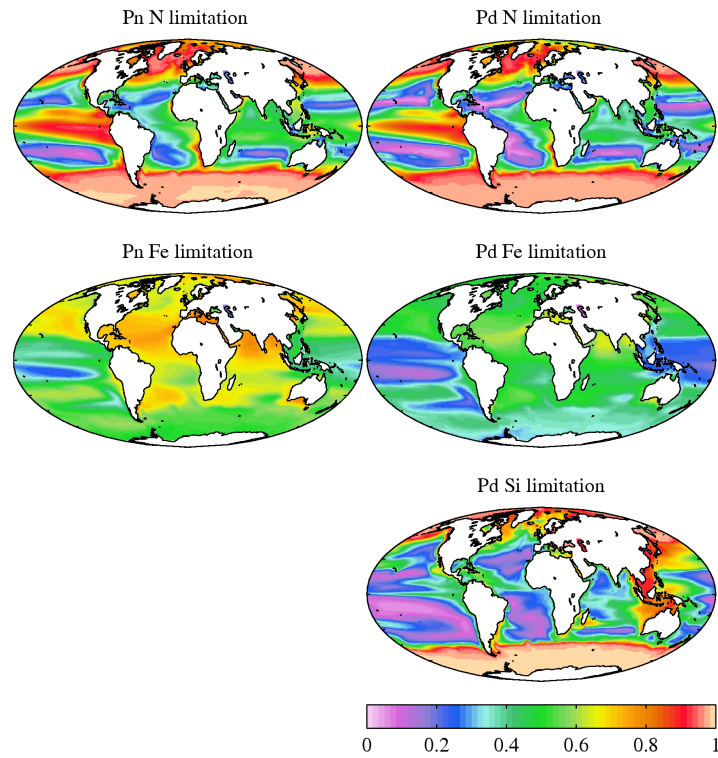
**Fig. 19.** Simulated mixed layer primary production fraction (left) and diatom biogenic opal production (right) for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). Production fraction is unitless; biogenic opal production in  $\text{mmol Si m}^{-2} \text{d}^{-1}$ .

2011



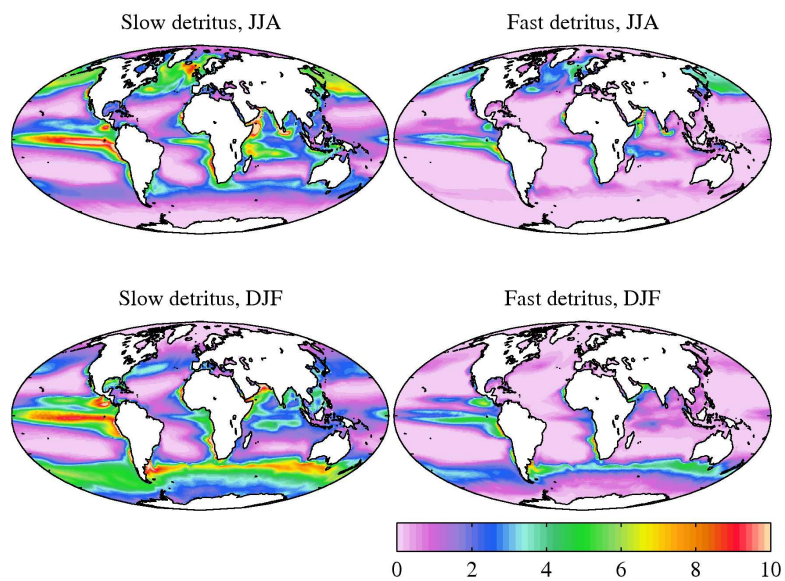
**Fig. 20.** Simulated surface microzooplankton (left) and mesozooplankton (right) concentrations for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). Concentrations in  $\text{mmol m}^{-3}$ .

2012



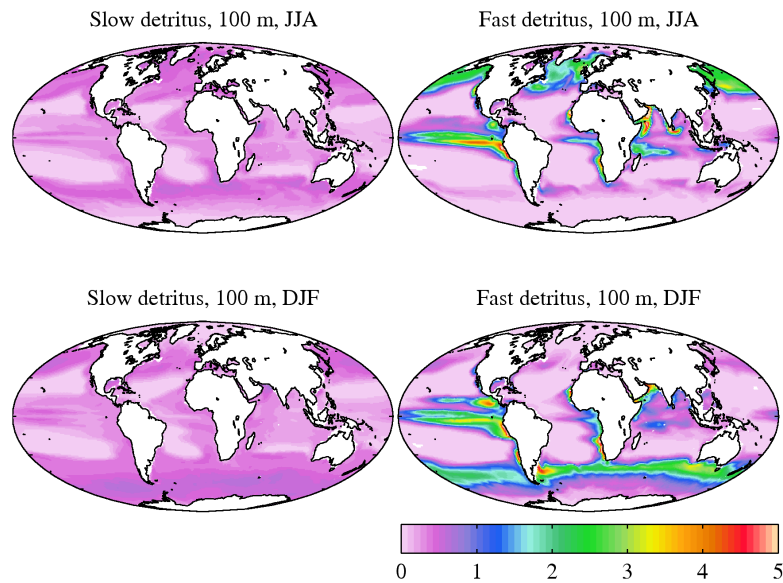
**Fig. 21.** Simulated annual average non-diatom (left) and diatom (right) limitation factors for nitrogen (top), iron (middle) and silicon (bottom) nutrients. Limitation is weighted by biomass and integrated for the full water column. Limitation is unitless.

2013



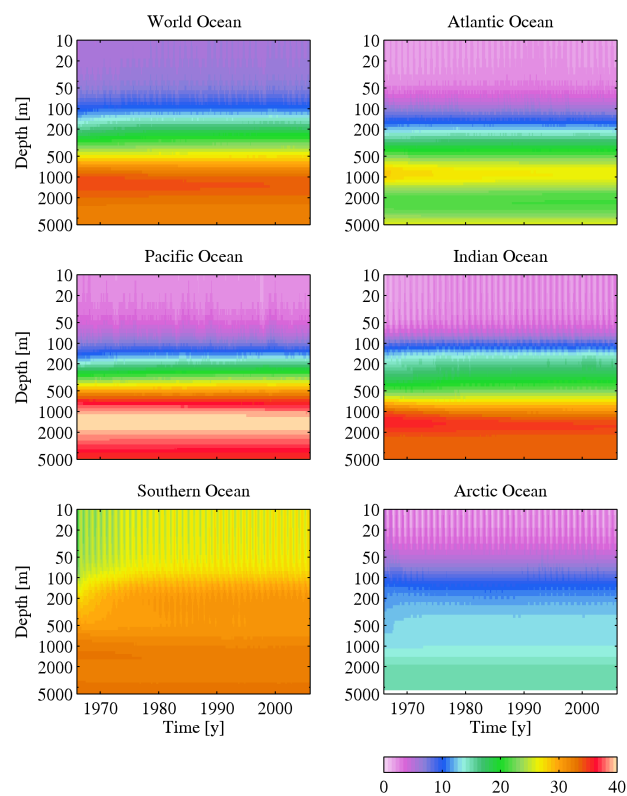
**Fig. 22.** Simulated slow (left) and fast (right) detritus production for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). Detritus production in  $\text{mmol N m}^{-2} \text{d}^{-1}$ .

2014



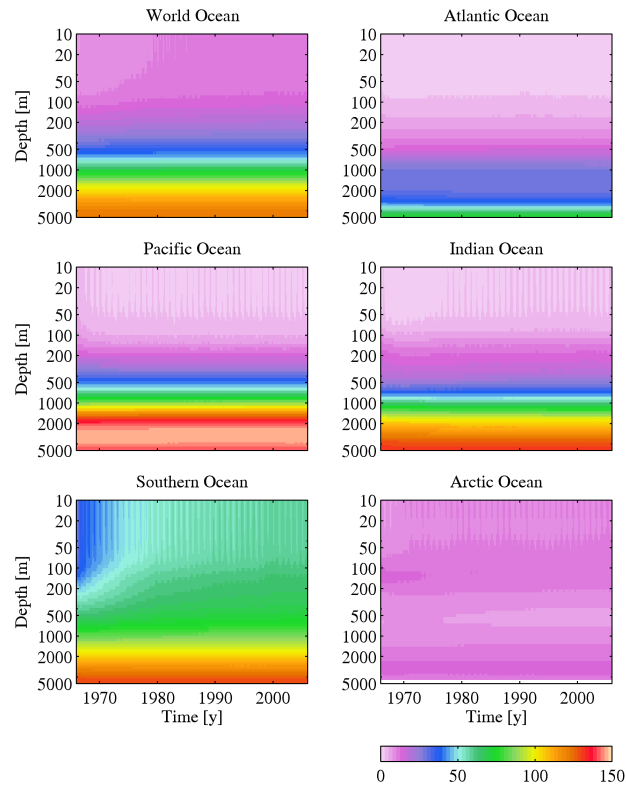
**Fig. 23.** Simulated slow (left) and fast (right) detrital sinking fluxes at 100 m for northern summer (June-July-August; top) and northern winter (December-January-February; bottom). Detritus production in  $\text{mmol N m}^{-2} \text{d}^{-1}$ .

2015



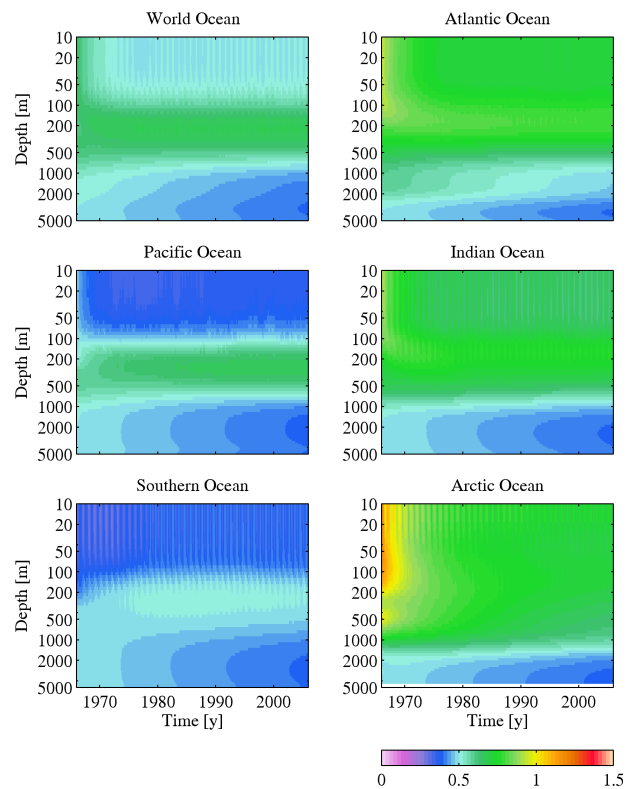
**Fig. 24.** Simulated vertical profiles of dissolved inorganic nitrogen concentration averaged for the World Ocean (top left) and 5 major regions. Concentrations in  $\text{mmol N m}^{-3}$ . Note that depth is shown on a logarithmic scale.

2016



**Fig. 25.** Simulated vertical profiles of silicic acid concentration averaged for the World Ocean (top left) and 5 major regions. Concentrations in  $\text{mmol Si m}^{-3}$ . Note that depth is shown on a logarithmic scale.

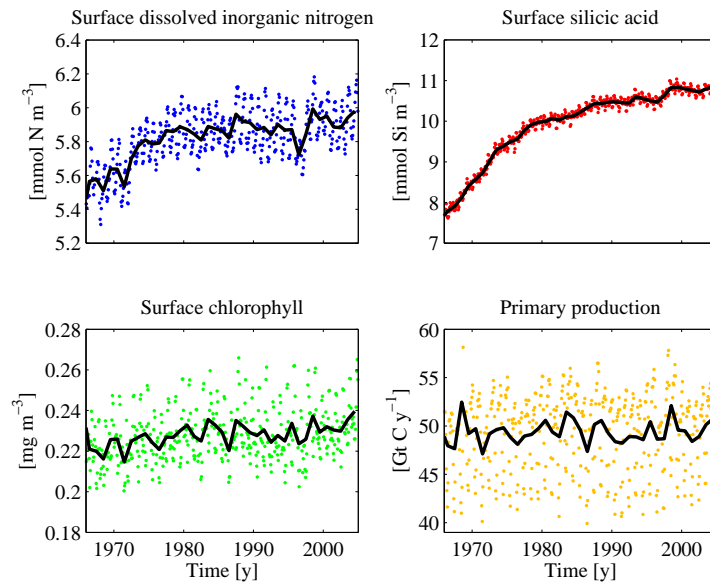
2017



**Fig. 26.** Simulated vertical profiles of iron concentration averaged for the World Ocean (top left) and 5 major regions. Concentrations in  $\mu\text{mol Fe m}^{-3}$ . Note that depth is shown on a logarithmic scale.

2018





**Fig. 27.** Globally averaged surface dissolved inorganic nitrogen (top left), surface silicic acid (top right), surface chlorophyll (bottom left) and integrated primary production (bottom right). Solid black lines are annual averages/integral; individual points are individual months. Note that individual monthly primary production values have been normalised so that they appear on the same scale as annual integrals.