

Remote sensing of assimilation number for marine phytoplankton

Stéphane Saux Picart, Shubha Sathyendranath, Mark Dowell, Trevor Platt

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Challenge: Estimate phytoplankton primary production from space

Primary production can be computed using a photosynthesis-light model:

$$P^B(z) = P^B(I(z); \alpha^B, P_m^B)$$

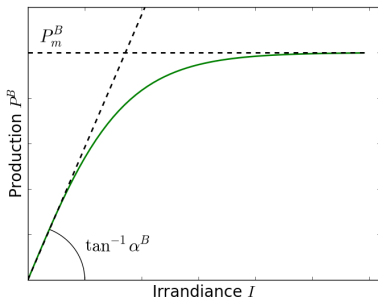
Superscript B indicates normalisation to chlorophyll biomass B .

P^B Normalised production;

z : depth; I : irradiance;

α^B : **initial slope**;

P_m^B : **assimilation number**



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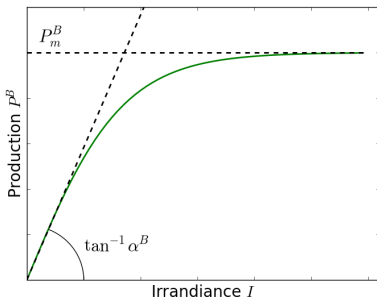
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Specific objective of the study:

Estimate the assimilation number globally from remote sensing data

- ▶ If no photo-inhibition, maximum primary production $P_{max} = BP_m^B$
- ▶ Maximum primary production is also given by $P_{max} = \left. \frac{dC_p}{dt} \right|_{max}$
where C_p is the phytoplankton carbon concentration
- ▶ Maximum growth rate: $\mu_{max} = \left. \frac{1}{C_p} \frac{dC_p}{dt} \right|_{max}$

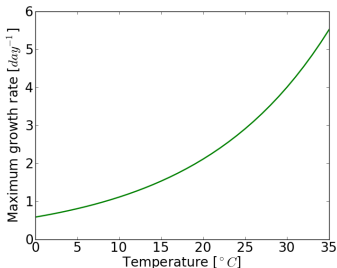
Assimilation number: $P_m^B = \mu_{max} \frac{C_p}{B} = \chi \mu_{max}$
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Eppley (1972) defines the maximum growth rate as a function of temperature:

$$\mu_{max} = 0.851(1.066^T) \frac{\ln 2}{24}$$



Two ways of estimating carbon-to-chlorophyll ratio:

1. Sathyendranath et al. 2004: $\chi^s = \frac{10^{(1.81+0.63*\log_{10}(Chl))}}{Chl}$
(gives an upper limit of χ)
2. Cloern et al. 1995: $\chi^c = \left[0.003 + 0.0154 \exp(0.05 T) \exp(-0.059 I) \frac{[M]}{K_N + [N]} \right]^{-1}$
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Combining these two model and the maximum growth rate formulation from Eppley (1979), we can approach computation of assimilation number as follows:

- ▶ **Model 1:** $P_m^B = f(Chl, T) = \chi^s \mu_{max}$
- ▶ **Model 2:** $P_m^B = f(I, N, T) = \chi^c \mu_{max}$
- ▶ **Model 3:**

$$P_m^B = f(I, N, Chl, T) = \left[(\chi^s)^{-1} + 0.0154 \exp(0.05 T) \exp(-0.059 I) \frac{[N]}{K_N + [N]} \right]^{-1} \mu_{max}$$

Model applied to a large database (> 700 measurements): P_m^B , *Chl*, *T*, mixed layer depth, surface PAR, nitrates

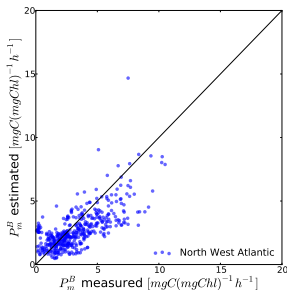
- ⇒ Gaps filled with climatological data (for surface PAR and nitrates)
- ⇒ North West Atlantic, subtropics (Gulf of Mexico and Arabian Sea), Middle Atlantic

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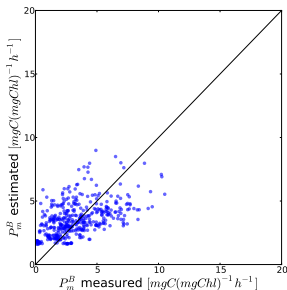
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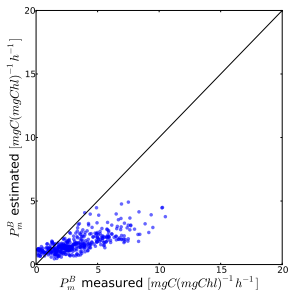
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 $f(Chl, T)$



Model 2
 $f(I, N, T)$



Model 3
 $f(I, N, Chl, T)$

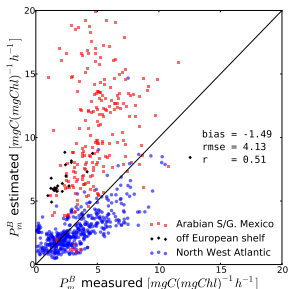


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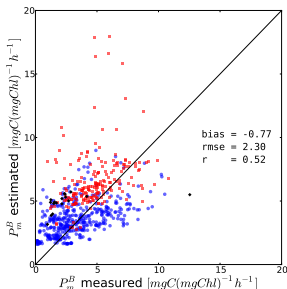
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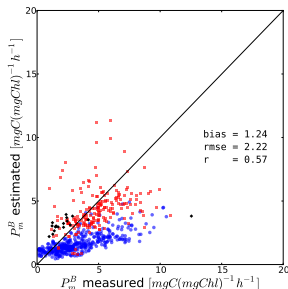
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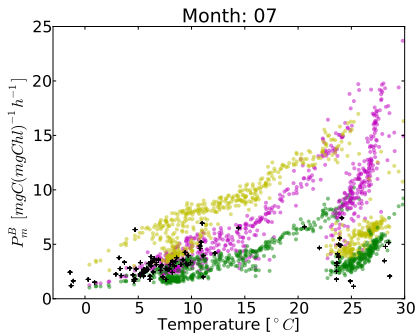
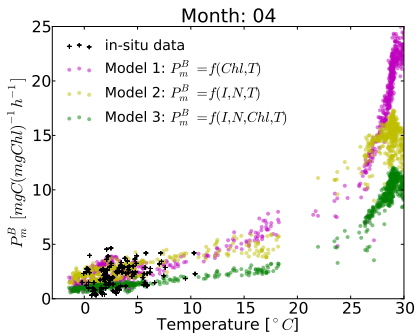


Data used (all monthly composites), 2004:

- ▶ SeaWiFS chlorophyll-a concentration
- ▶ MODIS sea surface temperature
- ▶ SeaWiFS surface PAR
- ▶ World ocean atlas surface nitrate concentration

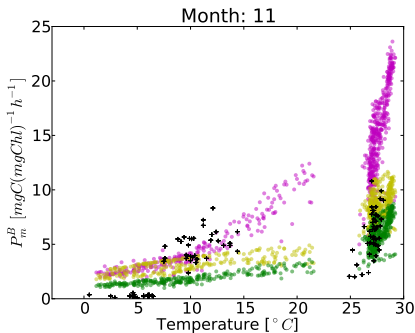
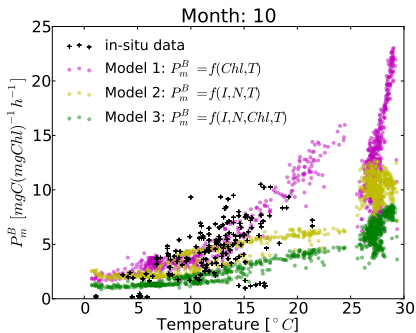
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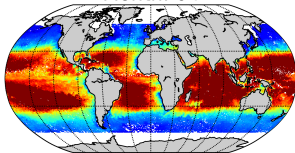
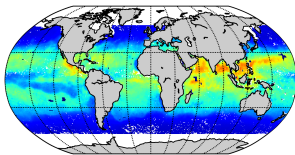
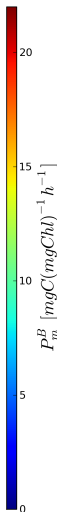
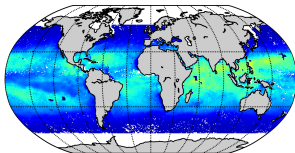


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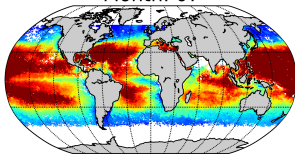
Month: 04

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 $f(Chl, T)$ **Model 2**
 $f(I, N, T)$ **Model 3**
 $f(I, N, Chl, T)$ 

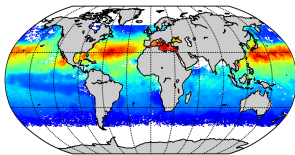
- ▶ Model 1 ($f(Chl, T)$) overestimates P_m^B in oligotrophic waters
- ▶ Model 2 and 3 have stronger latitudinal seasonal variations because of the light
- ▶ Model 3: estimates of P_m^B are too low

Month: 07

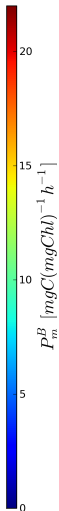
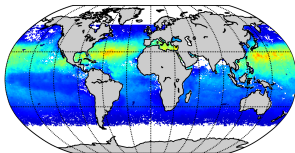
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$$\text{Assimilation number: } P_m^B = f(B, T, N, I)$$

B	\implies	Coastcolour product (case 2 water)
I	\implies	$I(z) = I(0) \exp(-Kz)$
$I(0), K$	\implies	Coastcolour products (case 2 water)
T	\implies	Satellite sea surface temperature
N	\implies	Climatological data (World Ocean Atlas)

- ▶ We have tested three different models for estimating P_m^B
- ▶ Comparison with in-situ data has shown three contrasting results, and each model has skill in a different region of the globe
- ▶ Overall **Model 2** ($f(I, N, T)$) seems to be able to estimate the assimilation number reasonably well at global scale

Future work:

- ▶ Develop a model to estimate the initial slope of the photosynthesis-light curve (α^B)
- ▶ Estimate primary production

CoastColour - ESA project

NERC Earth Observation Data Acquisition and Analysis Service (NEODAAS)

Thank you

Contact

Stéphane SAUX PICART: stux@pml.ac.uk