



**→ 4th ESA ADVANCED TRAINING
ON OCEAN REMOTE SENSING**

Ocean colour retrievals in Case 1 waters

David Doxaran

Marine Optics & Remote Sensing Group

Laboratoire d'Océanographie de Villefranche (CNRS/UPMC)

doxaran@obs-vlfr.fr

<http://www.obs-vlfr.fr/LOV/OMT/>

7–11 September 2015 | IFREMER | Brest, France

1. Definition and spectral signatures of Case-1 waters

Introduction

Definition

Spectral signatures = $f(\text{Chla})$

2. Atmospheric corrections

Methods / Algorithms

Validation

3. Level-2 products (inversion algorithms)

Seawater reflectance

Diffuse attenuation coefficient / Euphotic depth

IOPs

Chla concentration / Phytoplankton groups

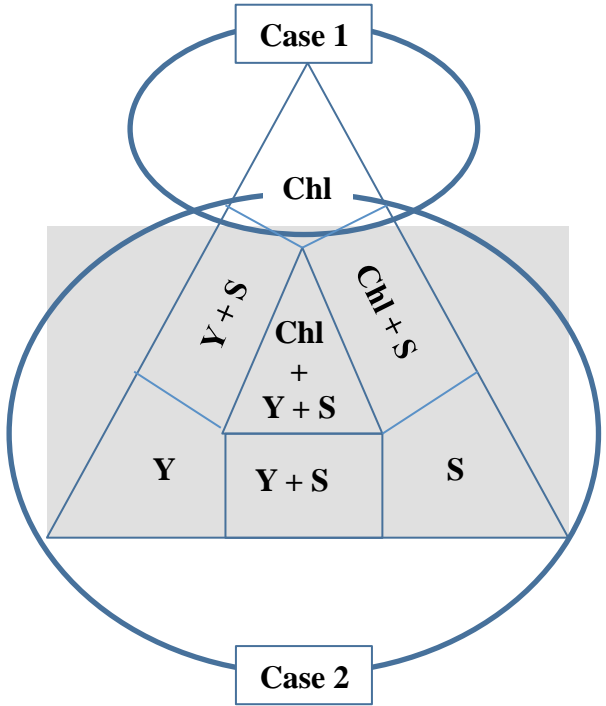
4. Derived (level-3) products and applications

- Primary production(s)

- Biogeochemical cycles / Climate change

5. References

Classification of natural waters



- **Phytoplankton chlorophyll (and degraded products) is the unique coloured constituent in Case 1 waters**

(Morel & Prieur 1977)

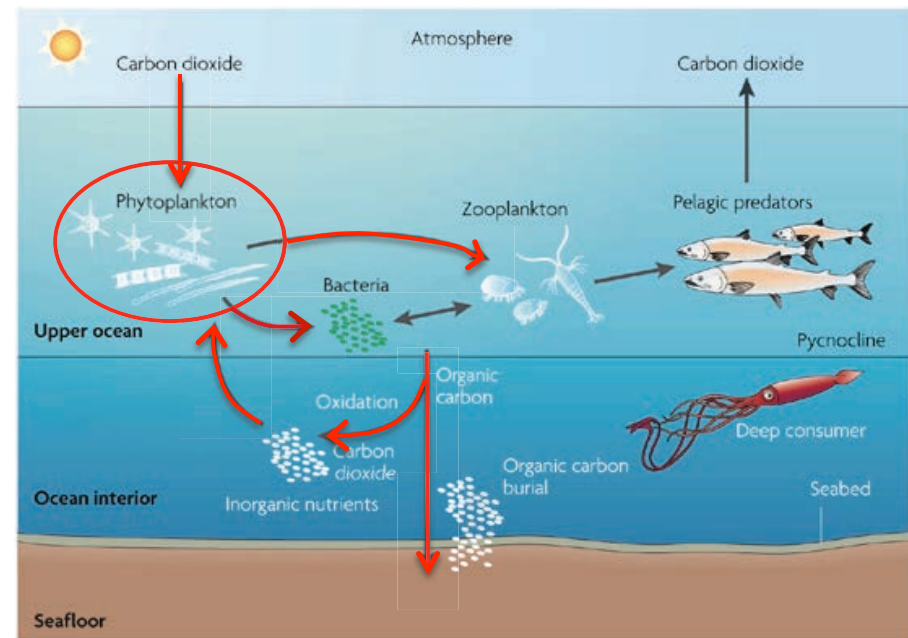
- **Case 2 waters are also influenced by terrestrial substances (NAP, gelbstoff)**

Morel / Antoine MERIS Case 1 water ATBD

Morel / Antoine MERIS Case 1 water ATBD

BIOGEOCHEMICAL SIGNIFICANCE OF PHYTOPLANKTON

- + Phytoplankton are key players in the ocean's carbon pump
- + Phytoplankton diversity is an important factor that affects carbon cycling
- + What's the role of phytoplankton in today's oceans?
- + How phytoplankton will respond to future climate changes with interactions between climate and biogeochemistry?
- + We need observations of phytoplankton and associated processes on appropriate spatial and temporal scales



Falkowski et Oliver (2007) - The carbon biological pump

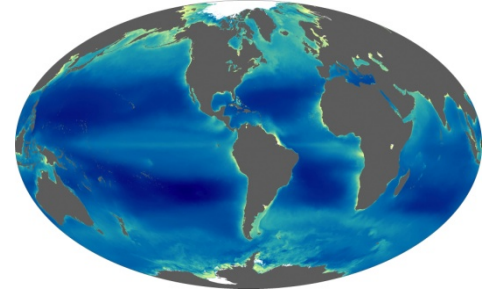
Nature Reviews | Microbiology

SATELLITE REMOTE SENSING OF OCEAN COLOR: A POWERFUL TOOL FOR STUDYING PHYTOPLANKTON

- + Provide information of
 - Surface Chl (proxy for phytoplankton biomass)
 - Spatial domain: fine (km) to **global ocean**
 - Temporal domain: day to decade

- + Global estimates of ocean-color based primary production

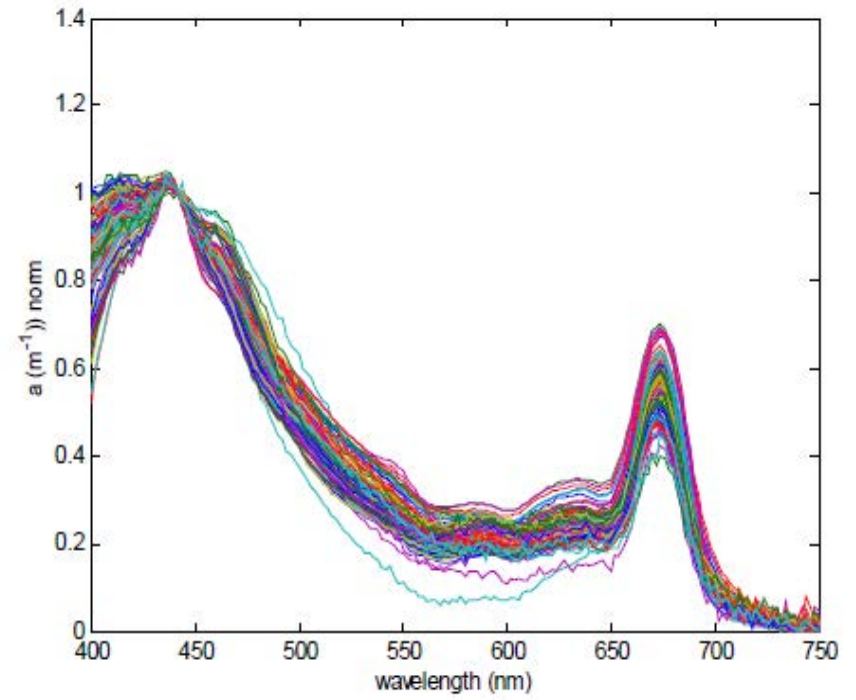
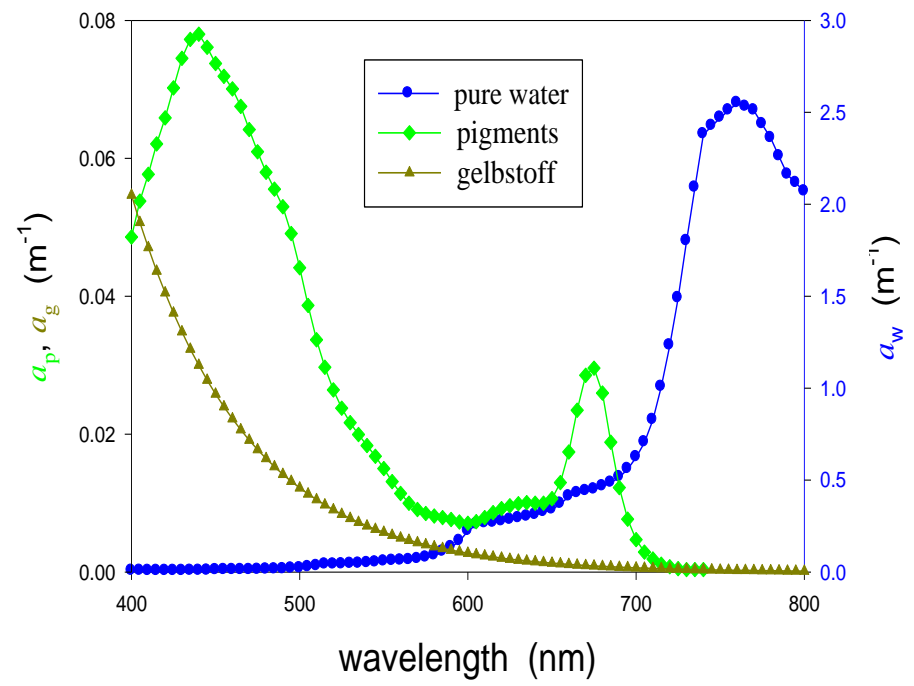
- + Active development of new biogeochemical products, (phytoplankton diversity, POC, carbon export)



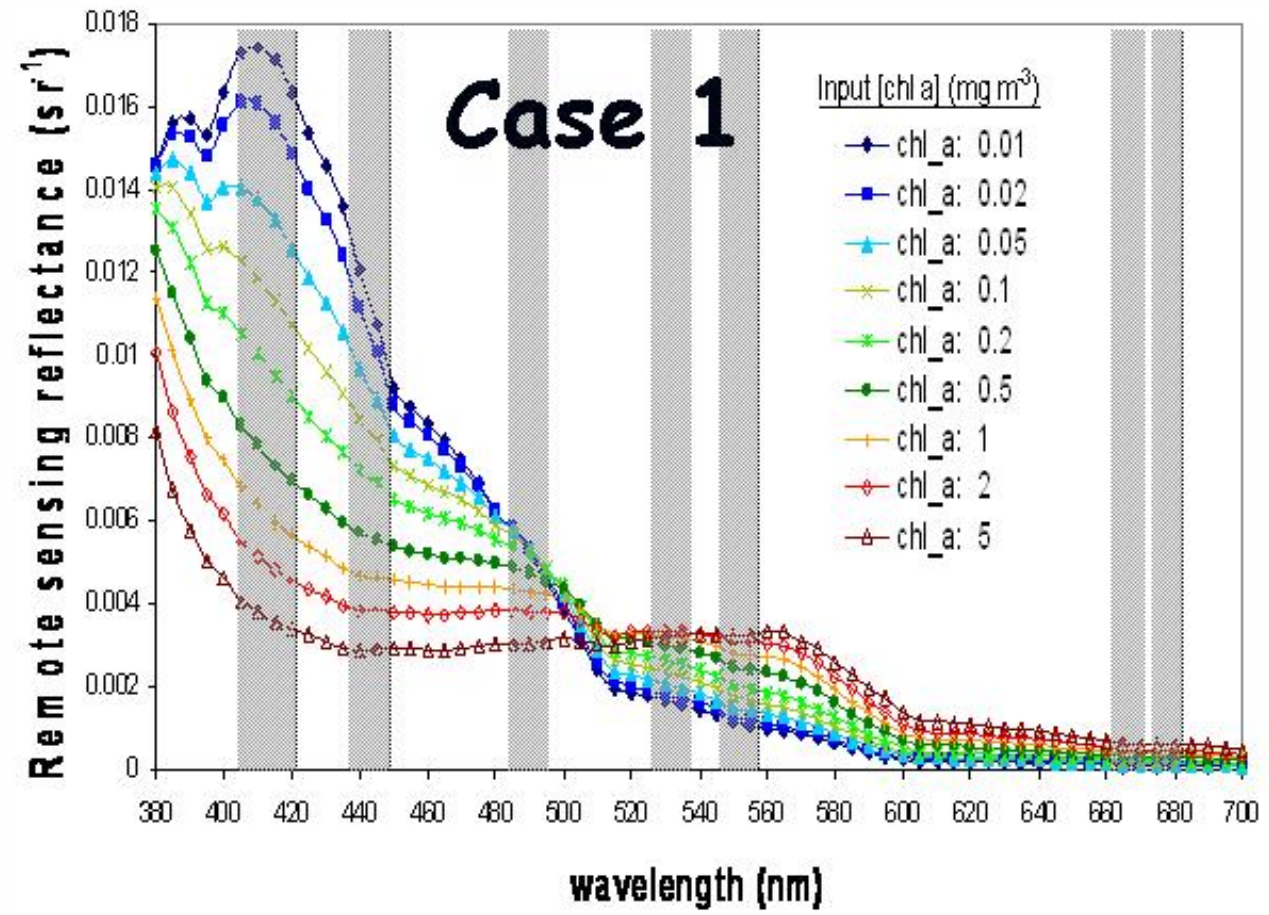
See review:

McClain (2009). A decadal of satellite ocean color observations. Annual Reviews of Marine Sciences, 1, 19-42

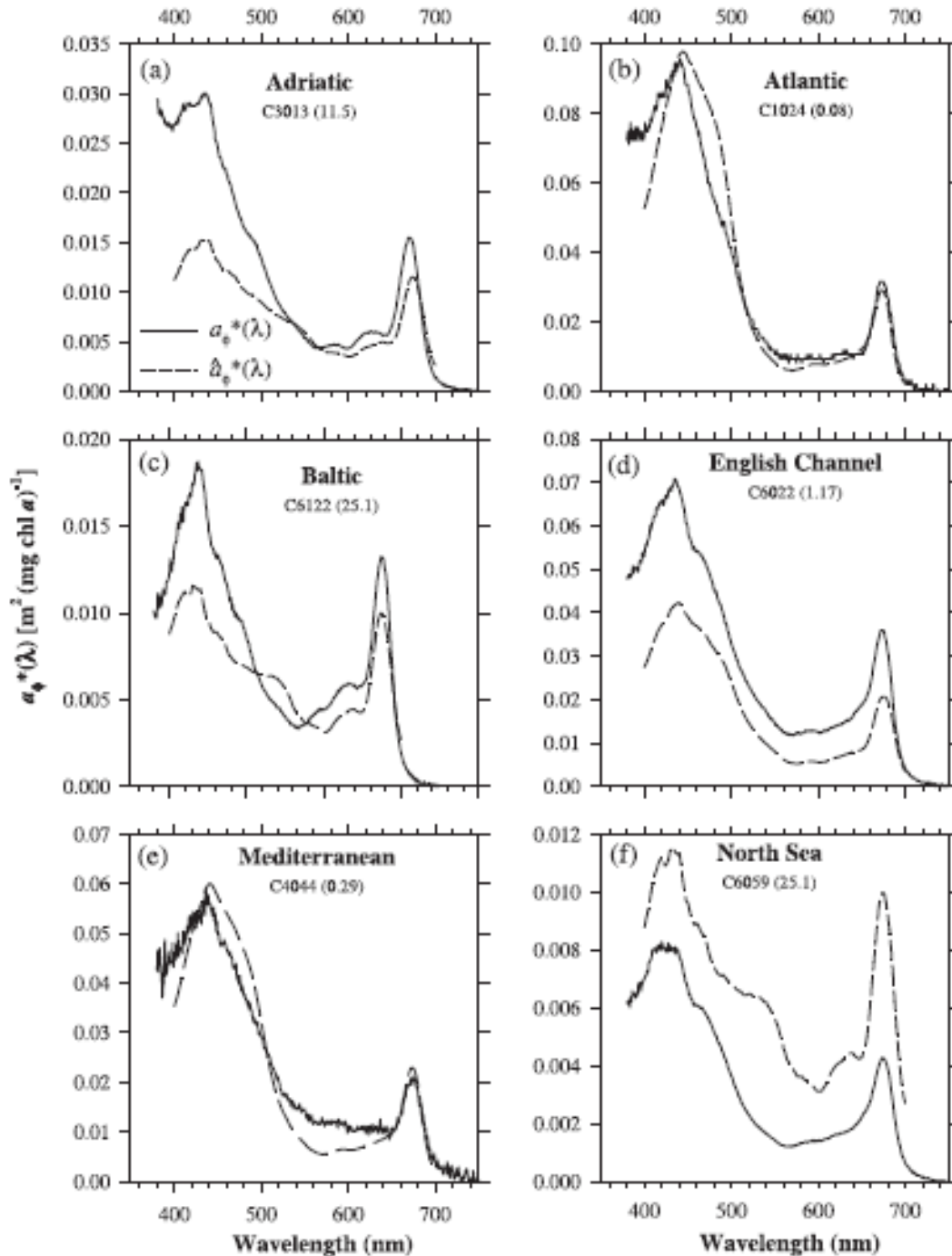
absorption spectra



Results from light absorption by pure water and light absorption (and backscattering) by phytoplankton cells



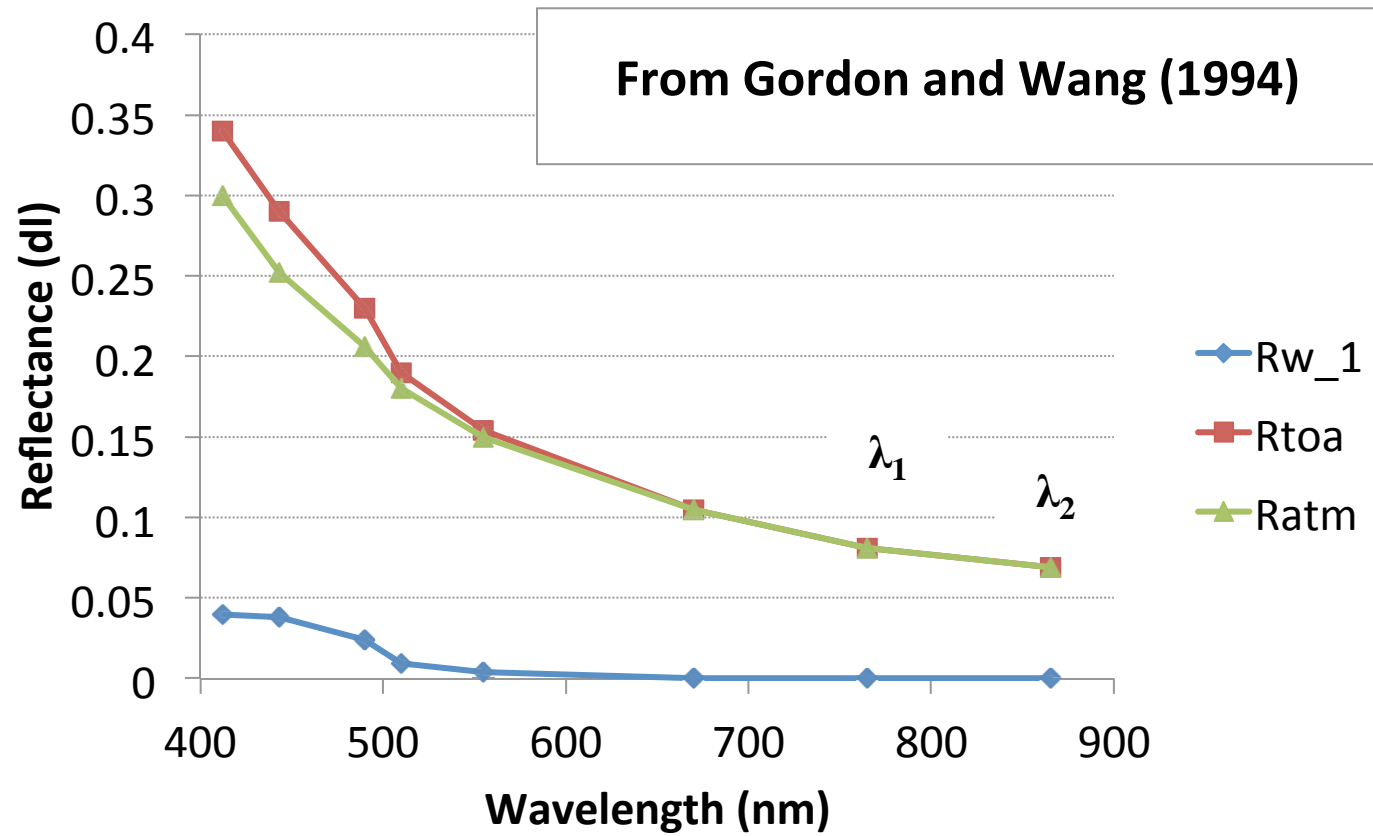
Slopes between blue and green wavelengths decrease with increasing chlorophyll



**Different
phytoplankton
species absorb light
slightly differently...
resulting in different
Rrs spectral
signatures (regional
and seasonal natural
variations)**

Babin et al. 2003

2. Atmospheric corrections



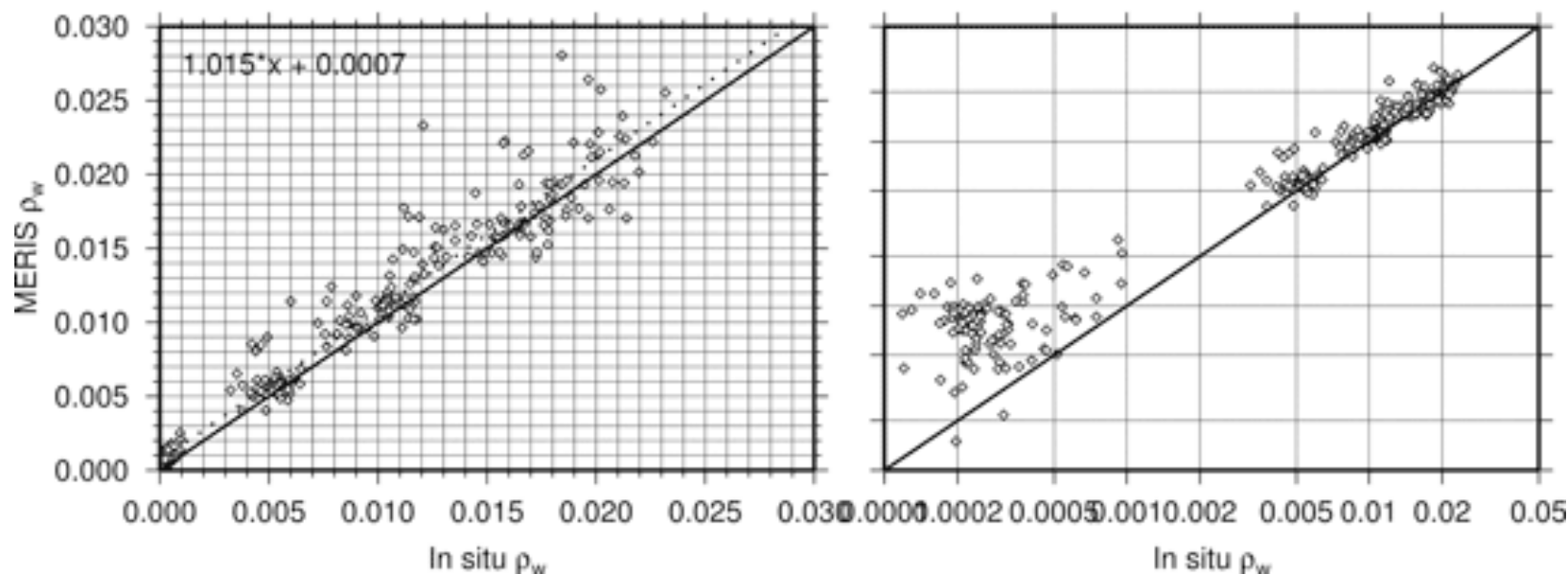
$$R_{toa}(\lambda) = \text{Rr}(\lambda) + R_{ra}(\lambda) + t \times R_w(\lambda),$$

Light absorption and scattering by air molecules (Rayleigh) is computed

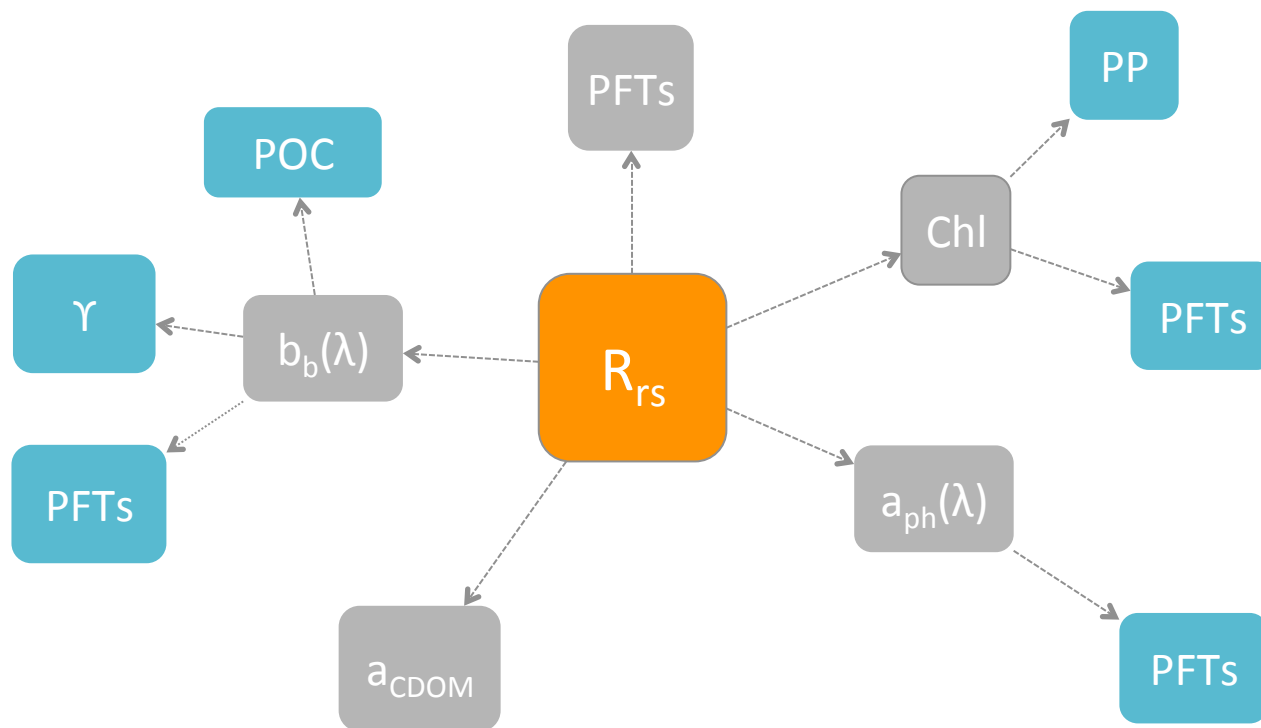
$$\epsilon(\lambda_1, \lambda_2) = R_{ra}(\lambda_1) / R_{ra}(\lambda_2) = (\lambda_1 / \lambda_2)^n$$

Light scattering by aerosols is computed in the NIR and extrapolated to the visible

Validation (match-ups with in situ data)



MERIS matchups (in terms of ρ_w) at the BOUSSOLE site, including the following wavelengths : 412, 443, 490, 510, 560, 670, 683 nm. The same data are plotted with a linear scale on the left and a log scale on the right, in order to highlight the low reflectance values of the red wavelengths. The solid line is the 1:1 line. The dotted line is a simple linear fit on the data. The slope and intercept of this curve are also indicated.

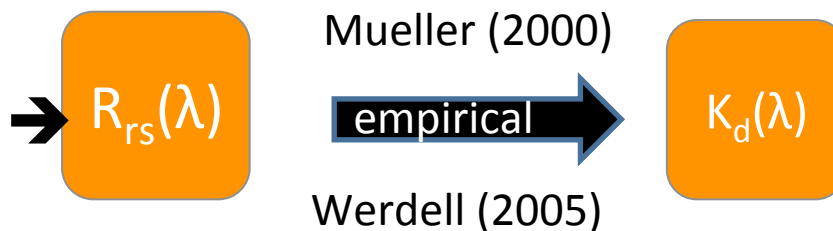


POC: Particulate Organic Carbon
 γ : b_{bp} spectral slope

PFTs: Phytoplankton Functional Types
 PP: Primary Production

AOPS then IOPS

1. Atmospheric corrections
Directional effects



$$K_d(490) = K_{d_w}(490) + 0.1853 \times [R_{rs}(490)/R_{rs}(555)]^{1.349}$$

2. Semi-analytical relationships:

$$K_d \cong (a + b_b) / \cos(\theta_{sw})$$

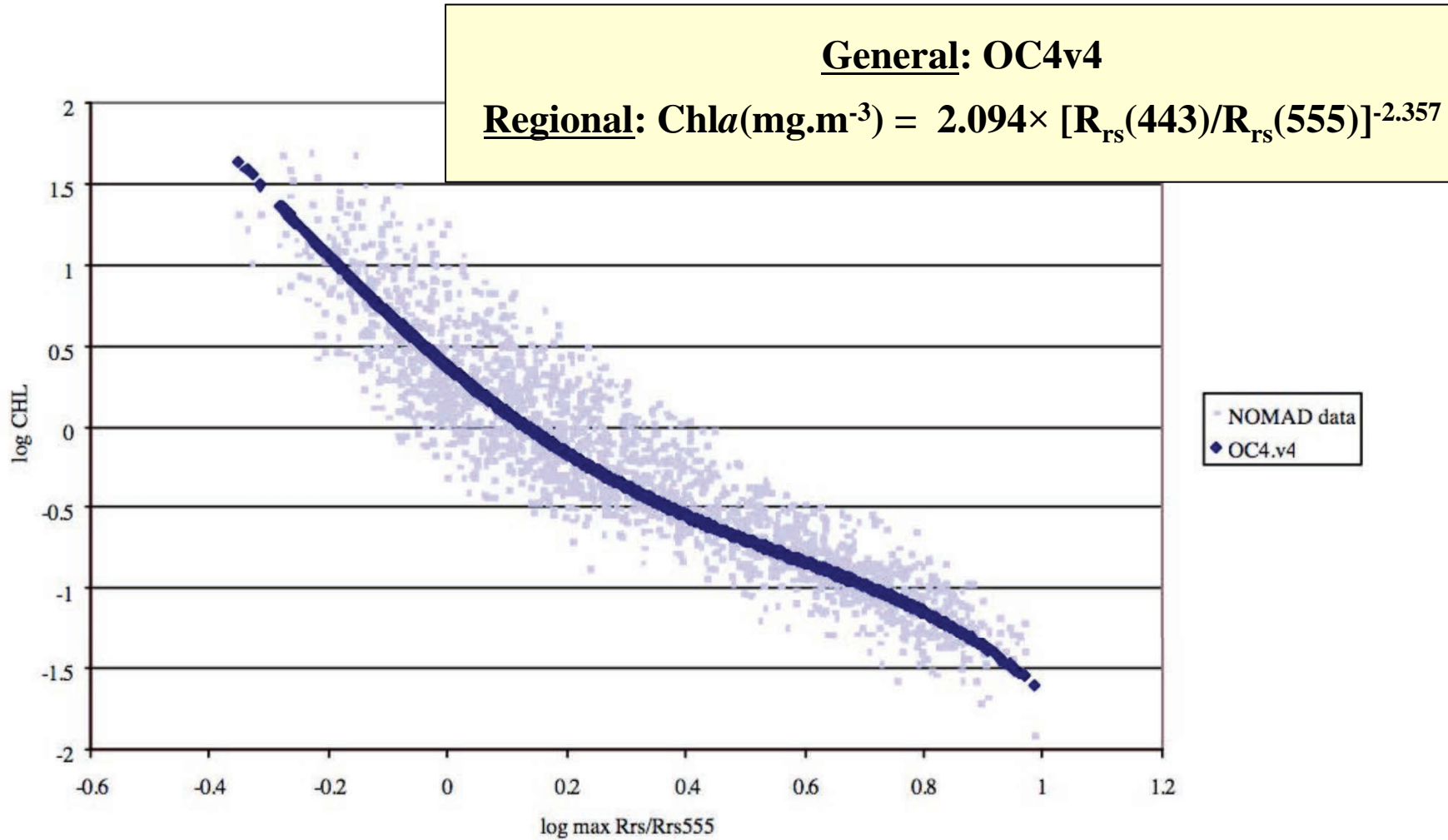
$$R \cong f \times b_b / (a + b_b)$$



$$a = a_w + a_{Chla} + a_{NAP} + a_y$$

$$b_b = b_{bw} + b_{bChla} + b_{bNAP}$$

3. Inversion algorithms

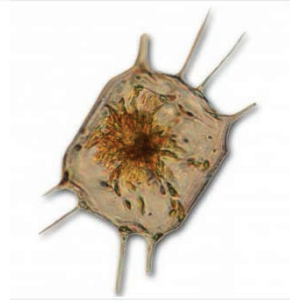


Going further....to phytoplankton groups

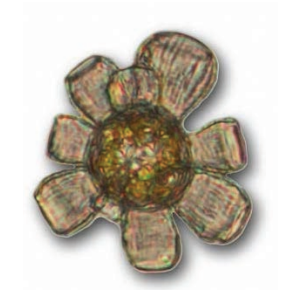
The so-called **Phytoplankton Functional Types (PFTs)** are conceptual groupings of phytoplankton species, which have a ecological functionality in common (either in terms of the food web or biogeochemical cycles).

- + Size-based classification (Sieburth et al. 1978)
 - Picophytoplankton (< 2 μm ; prochlorophytes, *Prochlorococcus*, *Synechococcus*)
 - Nanophytoplankton (2–20 μm ; chromophytes, nanoflagellates, chryptophytes)
 - Microphytoplankton (> 20 μm ; diatoms, dinoflagellates)

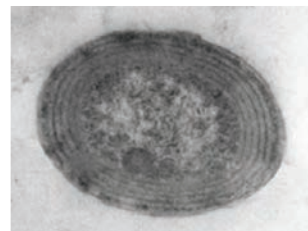
- + Size is recognized to influence many processes
 - Optical properties
 - Ecological distribution (light-nutrient regime)
 - Photophysiological properties
 - Carbon fluxes



Diatom *Odontella*
(Photo: S. Marro)



Coccolithophorid
(Photo: S. Marro)



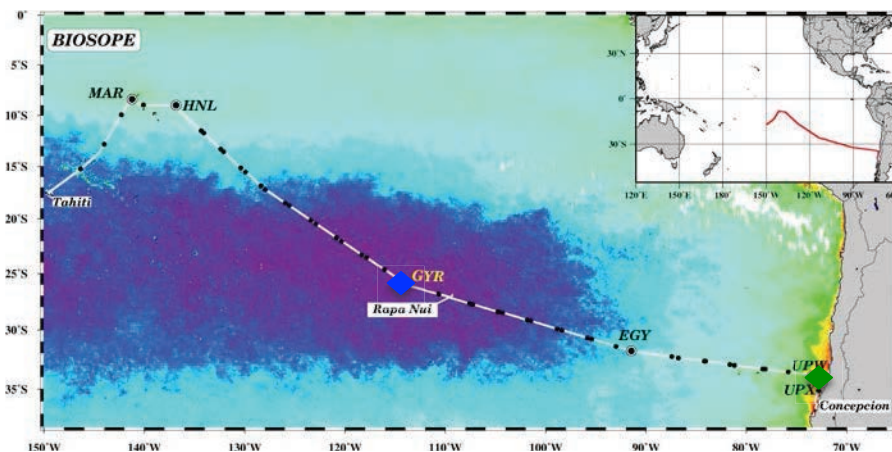
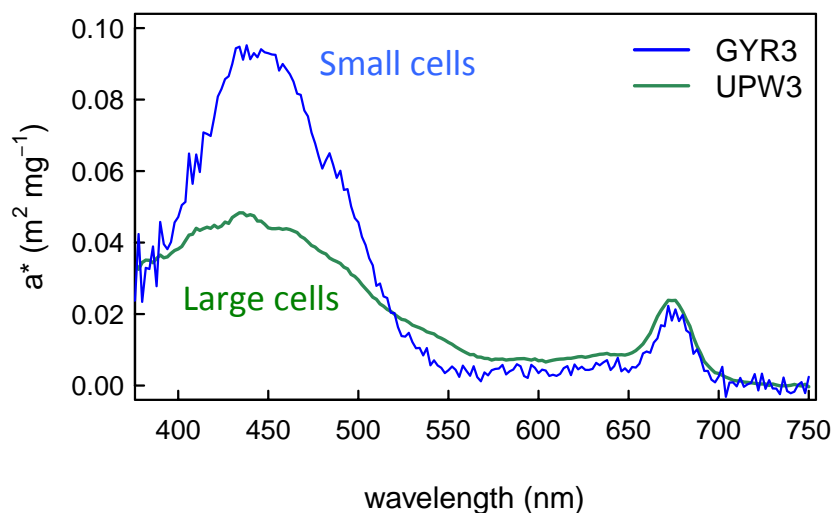
Prochlorococcus marinus
(Photo: Li & Partenski)

More info in:
 IOCCG Working Group Report 15 (2014). Phytoplankton functional types from space.
www.ioccg.org/reports/IOCCG_Report_15_2014.pdf

OVERVIEW OF PFT ALGORITHMS

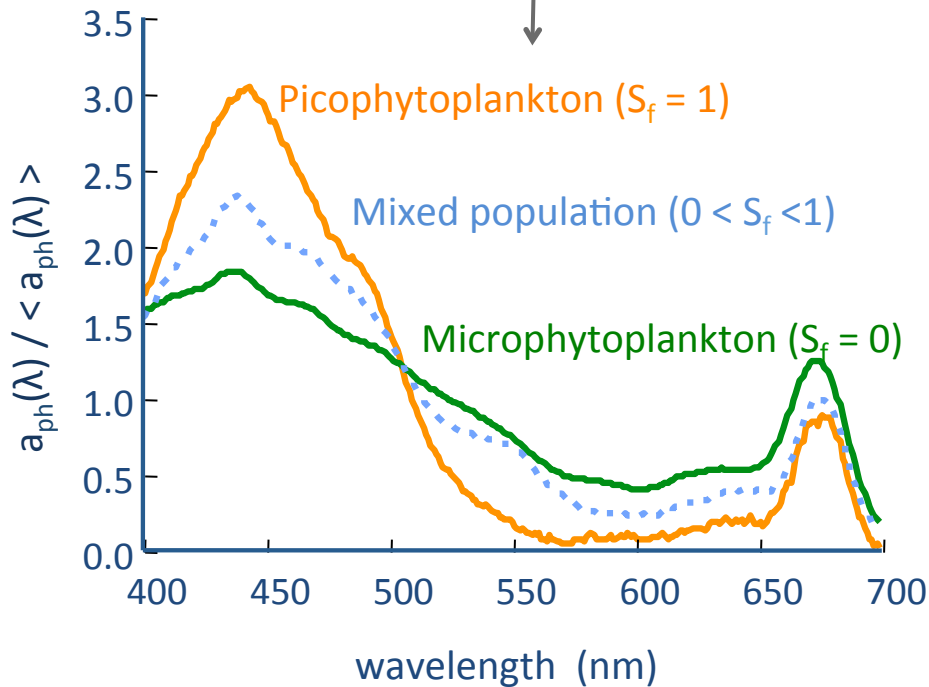
Approach	Product	References (non-exhaustive list)
Abundance-based	Size classes	<i>Uitz et al. (2006)</i> <i>Hirata et al. (2008, 2011)</i> <i>Brewin et al. (2010, 2011)</i>
Spectral-based	Single group (<i>Trichodesmium</i> , diatom, coccolithophorid)	<i>Subramaniam et al. (1999)</i> <i>Sathyendranath et al. (2004)</i> <i>Brown & Yoder (1994)</i>
	Taxonomic groups	<i>Alvain et al. (2005, 2008)</i> <i>Bracher et al. (2009)</i>
	Size classes	<i>Ciotti et al. (2002)</i> <i>Ciotti & Bricaud (2006)</i> <i>Devred et al. (2006, 2011)</i> <i>Uitz et al. (2008)</i> <i>Mouw & Yoder (2010)</i> <i>Kostadinov et al. (2010)</i> <i>Roy et al. (2013)</i>
ANN-based	Taxonomic groups	<i>Raitsos et al. (2008)</i> <i>Palacz et al. (2013)</i>

SPECTRAL-BASED PFT ALGORITHMS



- + Large changes in the shape of phytoplankton absorption spectra
 - Dominance of small cells: Large peak in the blue
 - Dominance of large cells: Flat spectra

Field data of concomitant phytoplankton absorption spectra and size fractionation experiments



R_{rs}

Loisel & Stramski (2006)

$a(\lambda)$

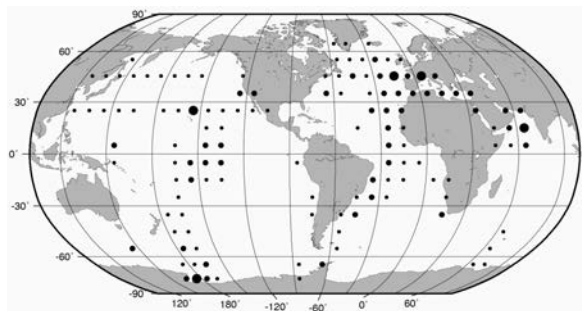
Optimisation
Ciotti & Bricaud (2006)

$S_f a_{ph}(\lambda)$
 $a_{CDM}(\lambda)$

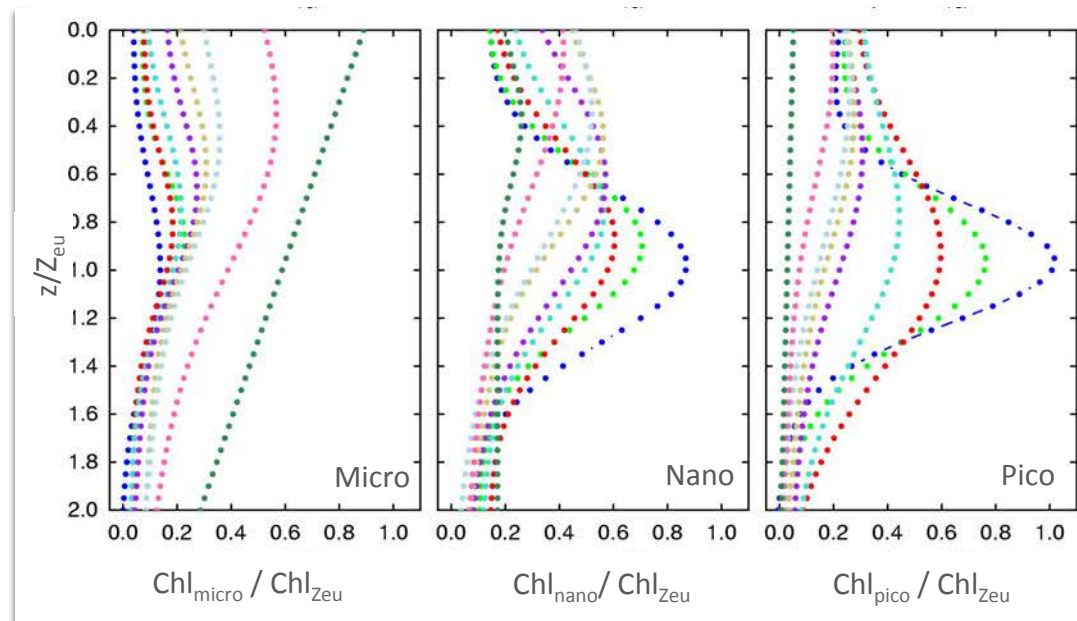
Sources:
Ciotti and Bricaud (2006). *Limnology and Oceanography Methods*, 4, 237-253
Ciotti et al. (2002). *Limnology and Oceanography*

Uitz et al. approach: Based on the analysis of a “global” HPLC pigment database

- Chl biomass
- Accessory pigments



Surface Chl → Phytoplankton group-specific vertical profiles of Chl



Surface Chl
(mg m^{-3})



Source:

Uitz et al. (2006). Vertical distribution of phytoplankton communities in open ocean: An assessment based on surface chlorophyll, *Journal of Geophysical Research*, doi:10.1029/2005JC003207

- + Ocean color coupled bio-optical primary production model

$$P(\lambda, z, t) = \text{Chl}(z, t) a^*(\lambda, z, t) E(\lambda, z, t) \varphi_c(z, t)$$

↓
↓

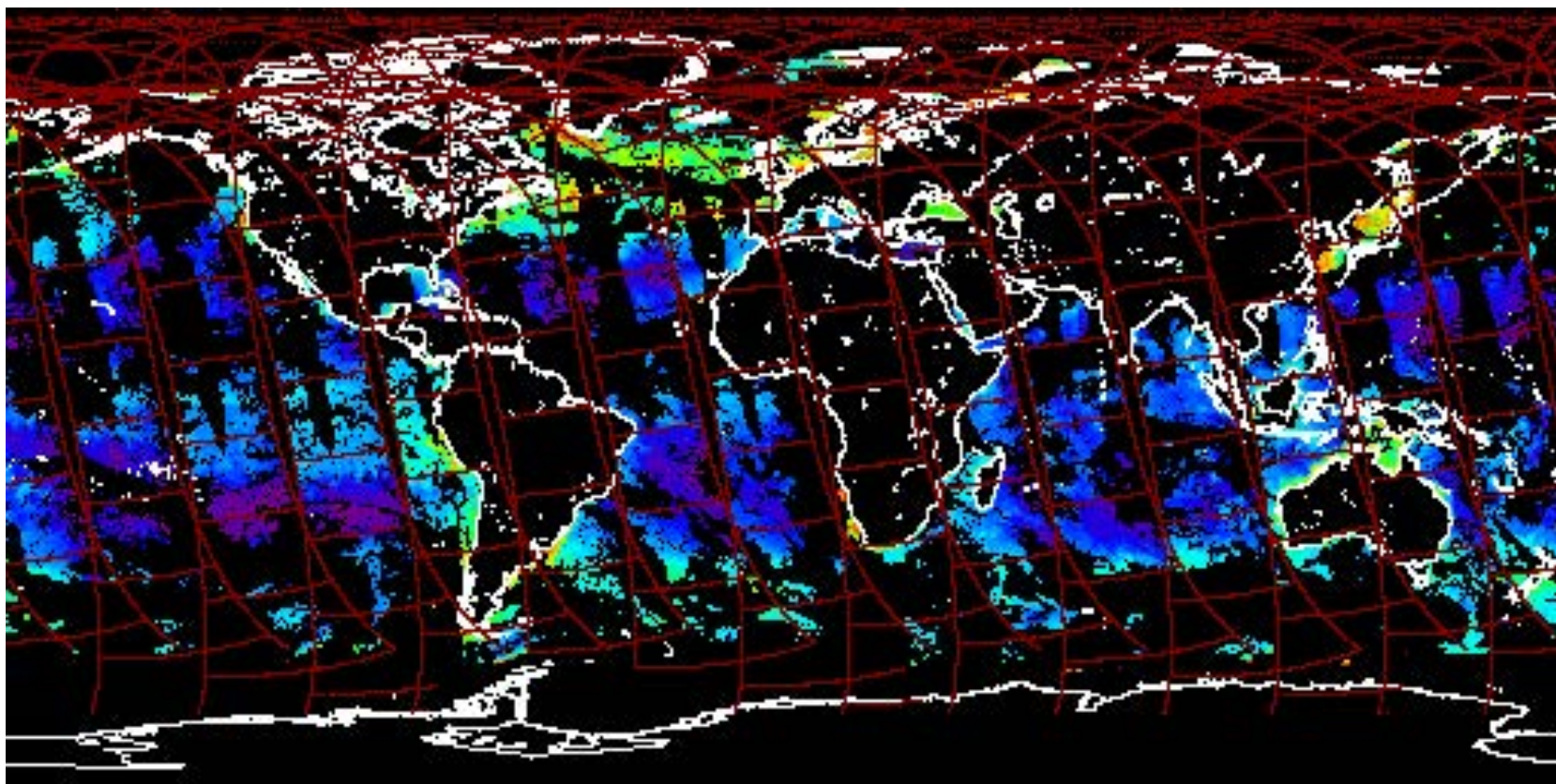
Absorbed light energy
Conversion to carbon

- P : Primary production rate ($\text{g C m}^{-3} \text{s}^{-1}$)
- Chl : Concentration of chlorophyll *a* (mg m^{-3})
- E: Irradiance ($\text{mol quanta m}^{-2} \text{s}^{-1}$)
- a^* : Phytoplankton absorption coefficient [$\text{m}^2 (\text{mg Chl}a)^{-1}$]
- φ_c : Quantum yield for carbon fixation [$\text{mol C (mol quanta)}^{-1}$]

Source:

Morel A. (1991). Light and marine photosynthesis: A spectral model with geochemical and climatological implications, Progress in Oceanography, 26, 263-306

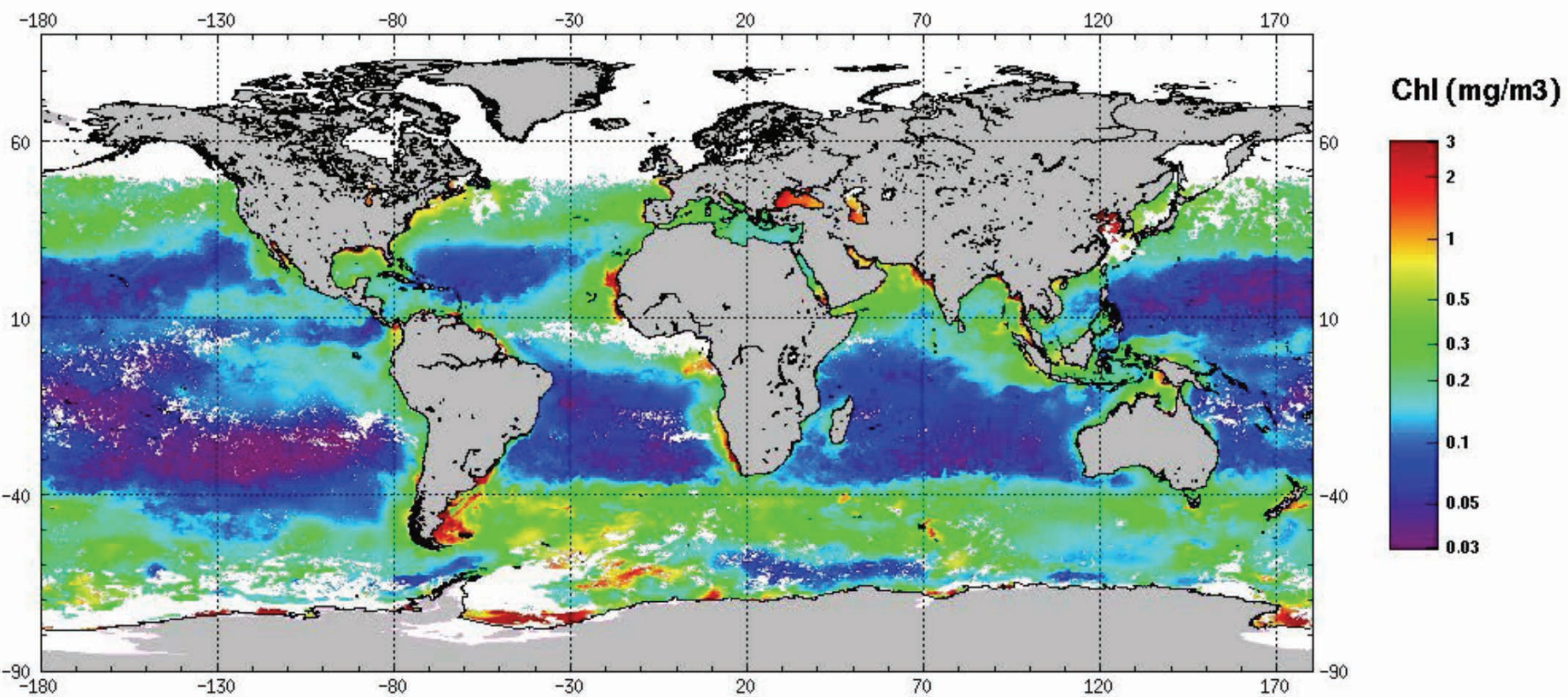
Mapping and analyzing bio-optical and biogeochemical products at different spatial and temporal scales...



Daily mapping of Chlorophyll-a concentration by MODIS-AQUA
7 May 2015

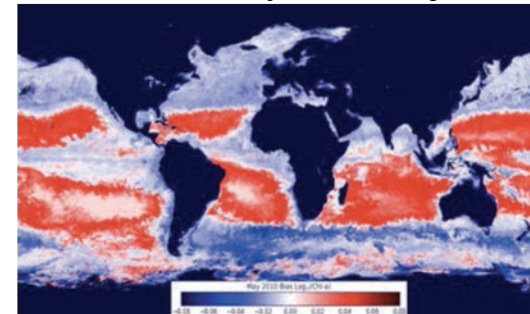
4. Applications

MyOcean - GlobColour OceanColour Products
Chlorophyll-a Concentration - Case 1 Water - AVW Method
19980117-19980124

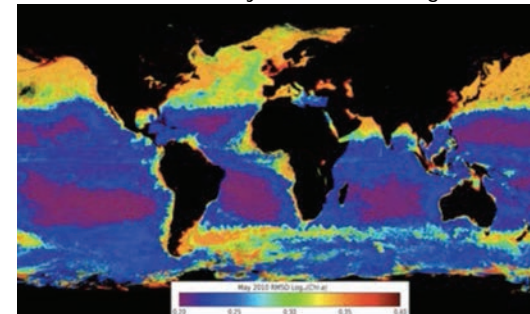


Acknowledgment: ACRI & the GlobColour. GlobColour is funded by ESA with data from NASA, ESA and GeoEye

May 2010 bias, log₁₀ Chl



May 2010 RMSD, log₁₀ Chl

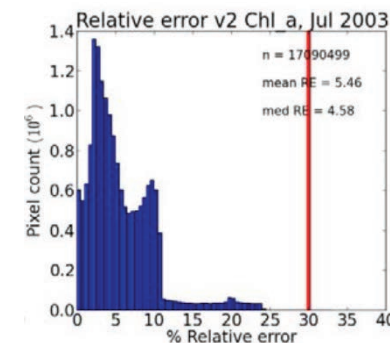


Objective: produce an uncertainty-characterised, inter-sensor bias-corrected, merged time series of ocean-colour products for climate research, and engage with users

V2 of the merged time series (SeaWiFS, MERIS and MODIS-A) released in March 2015

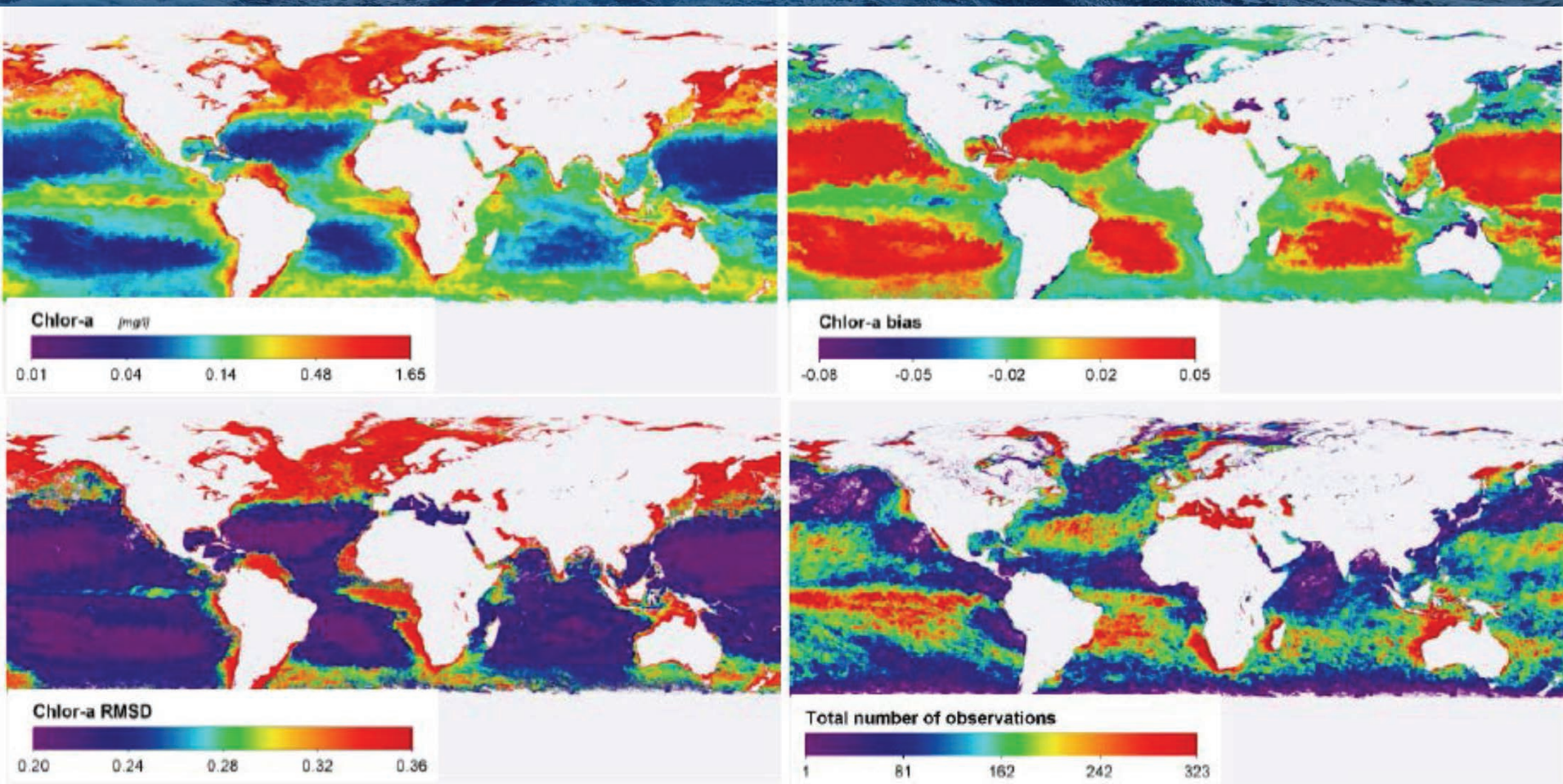
Specific aims of this version 2.0 release:

- improves the in situ database used for uncertainty characterisation
- optimizes the uncertainty generation for the CCI data
- improves consistency in many areas, including unifying the binning/mapping processing
- improves bias correction, able to respond to temporal variation (primarily seasonal)
- incorporates an improved cloud mask for MERIS
- benefits from a more automated quality assurance process
- extends the time series to the end of 2013
- refreshes the input datasets to the latest versions



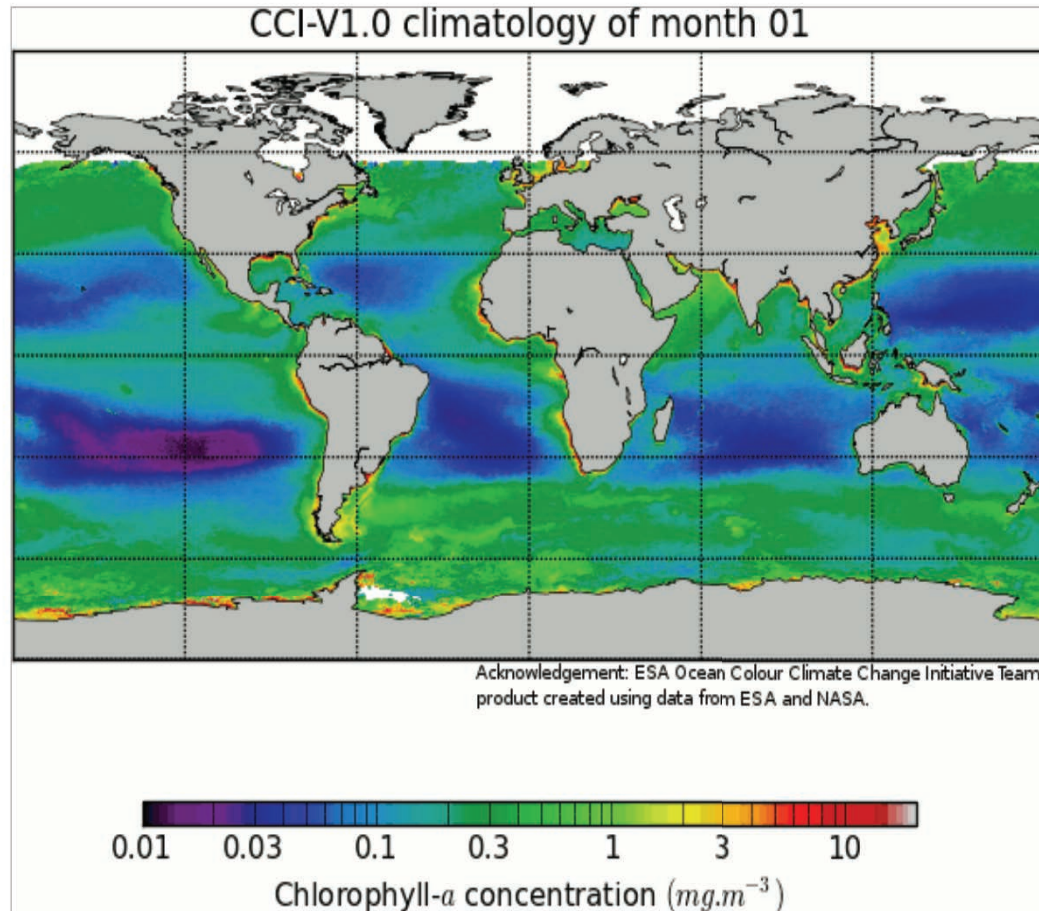
Relative error in V2 Chl based on bias.

Red vertical line: GCOS requirement for accuracy



Global maps of (top left) Chlorophyll-a concentration, (top right) Chlorophyll-a bias, (bottom left) RMSD and (bottom right) total number of observations for the merged monthly v2 products, June 2003.

Produced by the Ocean Colour CCI Team, 2015



<http://www.esa-oceancolour-cci.org>

Primary production of the global ocean (Antoine et al. 1996)

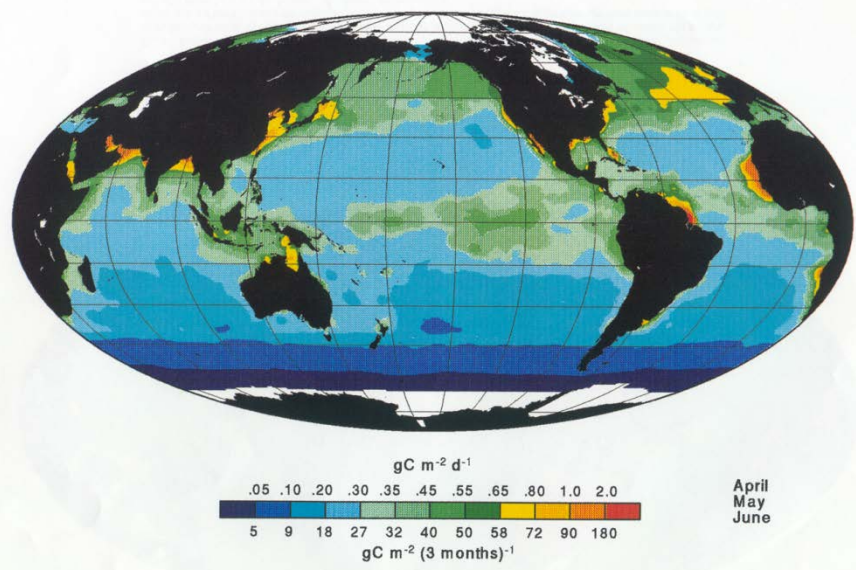


Plate 1b. As in Plate 1a, but for the April - May - June period.

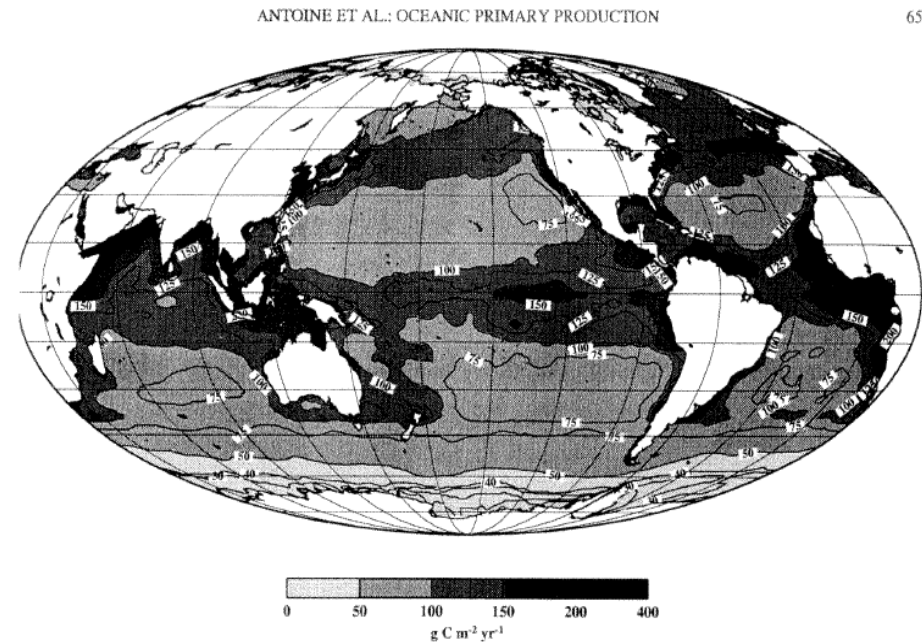


Figure 3. Annual primary production within the world ocean (equal surface “Mollweide” projection), obtained by summing the 12 monthly maps. This map shows the values obtained through the “standard” computation, which leads to a global annual carbon fixation of 36.5 Gt C yr⁻¹ (Table 1, line 1). This map can be compared to the historical primary production maps, as derived from compilations of in situ carbon fixation [e.g., *Koblentz-Mishke et al.*, 1970; *Berger et al.*, 1987].

4. Applications

Bosc et al.
(2004)

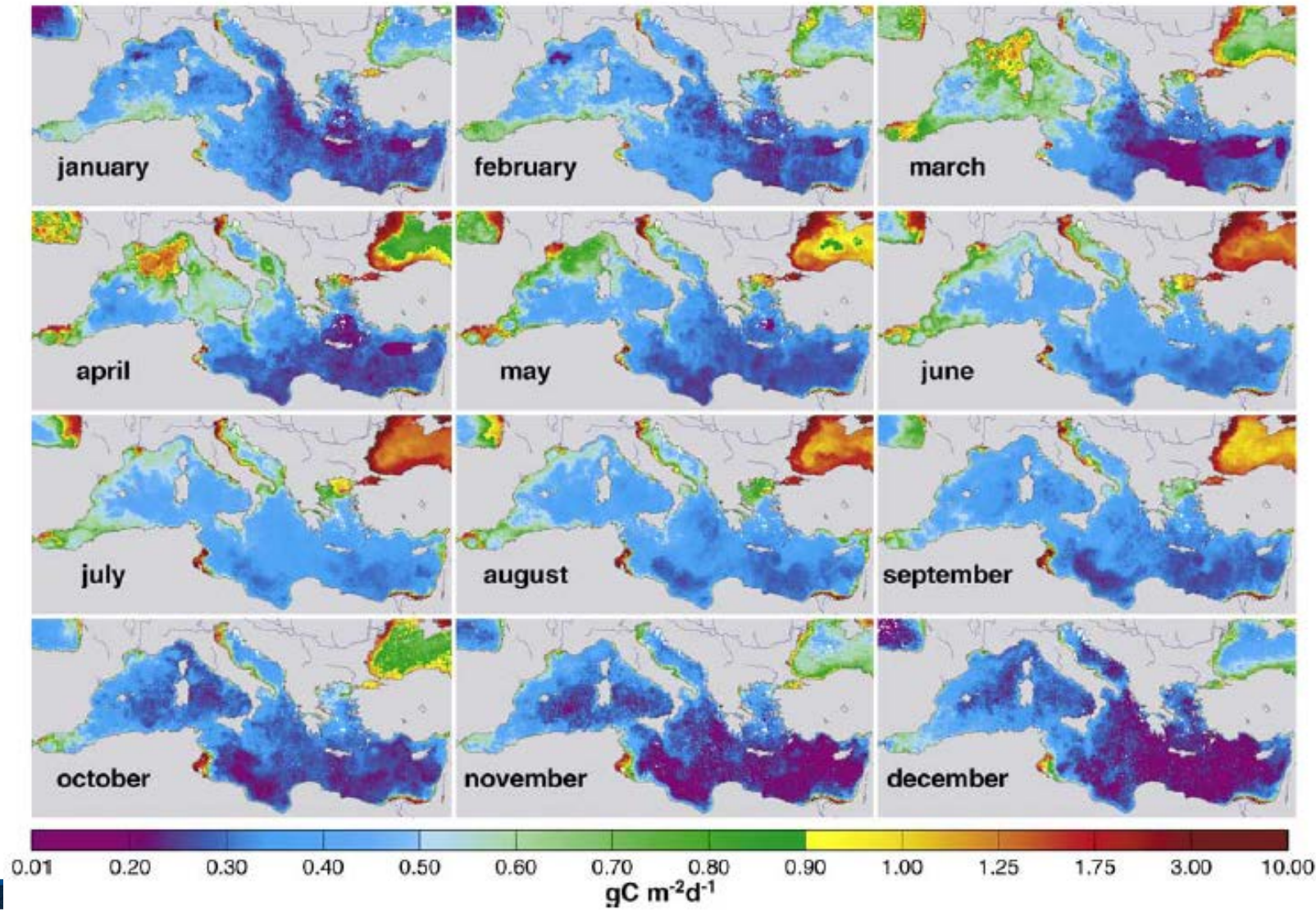
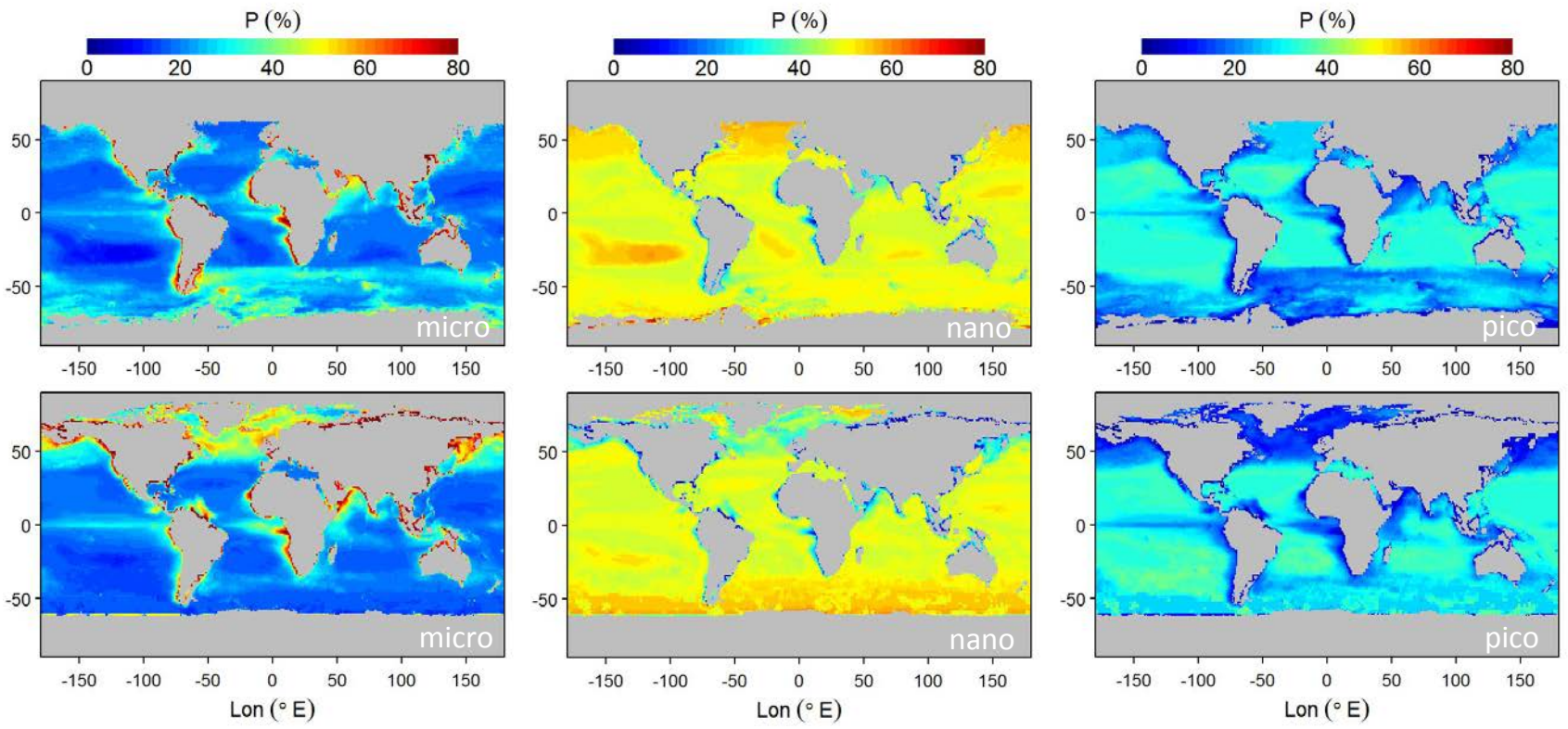


Figure 11. Monthly maps of primary production, for the year 1999.

PHYTOPLANKTON GROUP-SPECIFIC PRIMARY PRODUCTION

Boreal winter/Austral summer



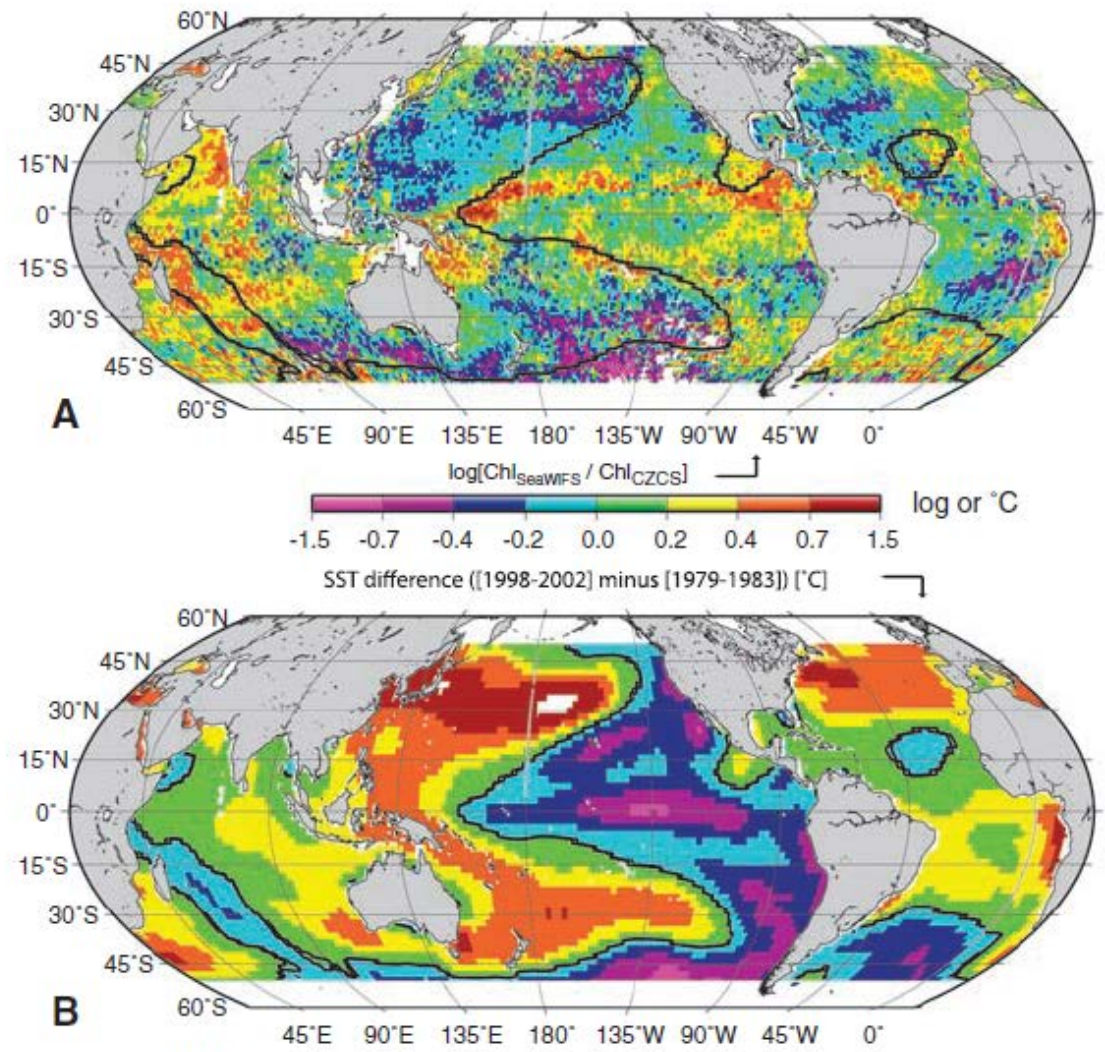
Boreal summer/Austral winter

:Uitz et al. (2010). Phytoplankton class-specific primary production in the world's oceans: Seasonal and interannual variability from satellite observations, Global Biogeochemical Cycles, doi:10.1029/2009GB003680

Impact of Climate Change (Martinez et al. 2009, Science)

Multidecadal changes in global phytoplankton abundances are related to basin-scale oscillations of the physical ocean, specifically the Pacific Decadal Oscillation and the Atlantic Multidecadal Oscillation.

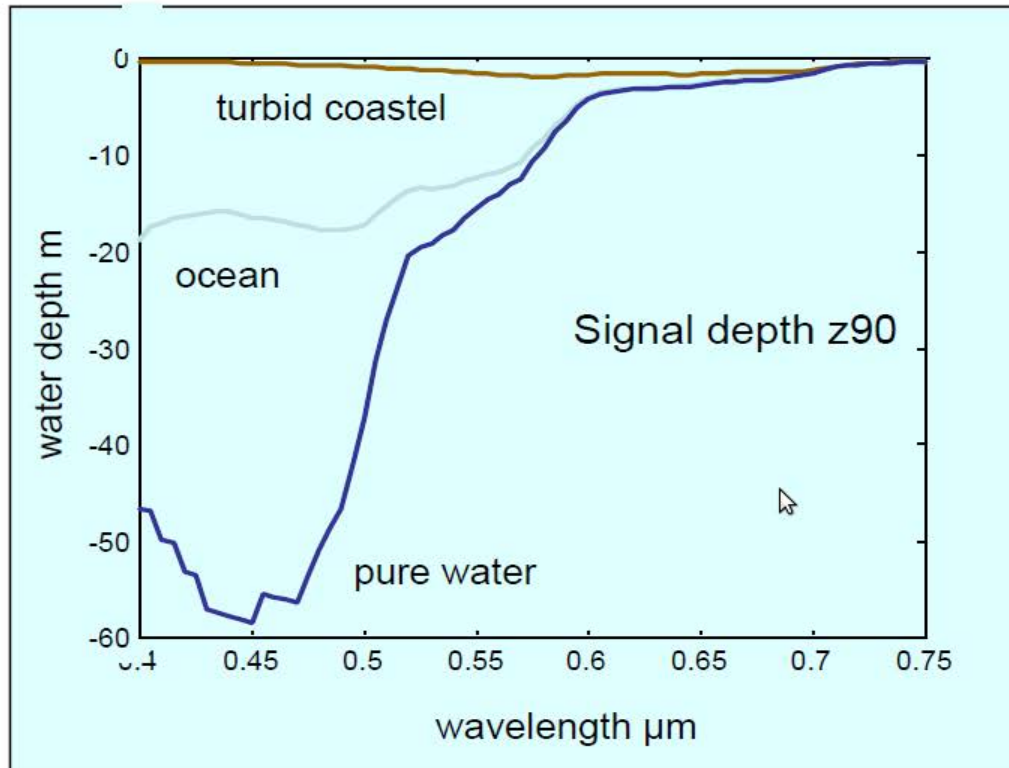
This relationship is revealed in ~20 years of satellite observations of chlorophyll and sea surface temperature.



But optical depth is a limit of ocean colour satellite observations

Signal depth at different spectral bands

Multiband algorithms: the information for each band may come from a different water layer



$$z_{90} = 1/k$$

coastal:
TSM=5 mg/l
Chlor.=5 μ g/l
Gelb= a_{380} =1m⁻¹

open ocean:
Chlor.=1 μ g/l

SATELLITE REMOTE SENSING OF OCEAN COLOR

COLLECTING FIELD OBSERVATIONS

+ Strong requirement for in situ data representative of “global” open ocean conditions

HPLC Analytical Service

Network of Bio-Argo profiling floats

The screenshot shows the SAPIGH website. At the top, there are logos for SAPIGH, CNRS, INSU, and UPMC. Below the logos is a navigation menu with links for Home, Presentation, Cooperation, Training, Scientific communication, Application for analyses, and Contacts. A search bar is also present. The main content area features a large image of a laboratory with a person working at a station. Text on the left reads: "A very precise sampling protocole. The quality of the results begins with a careful and meticulous work at sea. Our extraction protocole is optimal for." Below this is a "Read more..." link. Further down, there is a "Who are we?" section with a brief description of the service and a list of recent projects including "Projet DeWEX", "Campagne STRASSE", "Campagne en Mer du Labrador", and "The KEOPS2 cruise".

The screenshot shows the Oceanographic Autonomous Observations (OAO) website. The header includes the OAO logo and navigation links for HOME, NEWS, ABOUT US, PROJECTS, ROBOTS & SENSORS, DATA, PAPERS & TALKS, MEDIA & OUTREACH, and PART. The main heading is "Oceanographic Autonomous Observations" with a sub-heading "OAO represents a kind of a virtual platform and also stands for". Below this are three main sections: "REAL-TIME DATA" (describing remote-acquisition of real-time data in the Ocean interior), "UNDERSEA ROBOTS" (describing specific instruments used for oceanographic observations), and "TEAM OF SCIENTISTS" (describing a multi-disciplinary team of scientists and scientific engineers). Each section has a "MORE" button at the bottom.

Profiling floats



A profiling float is a cylinder-shaped submersible robot equipped with specific ...

READ MORE

Ocean colour validation float



Source:
<http://www.sapigh.obs-vlfr.fr>
<http://www.oao.obs-vlfr.fr/web/index.php>

OCEAN COLOUR REMOTE SENSING OF CASE-1 WATERS



OC sensors measure
the color of the ocean = light



Excellent space-time
coverage – SYNOPTIC!

Great variety of
biogeochemical products



**Data assimilation
into models**



Surface layer only
Some areas are not seen

ABSOLUTE REQUIREMENT
for large in situ datasets



**Bio-optical profiling
floats**

**International Ocean Colour Coordinating
Group**

<http://www.ioccg.org/>

**European Space Agency MERIS
Handbook**

<https://earth.esa.int/handbooks/meris/>

**NASA Ocean Color
homepage**

<http://oceancolor.gsfc.nasa.gov/cms/>

**IOV: Remote Sensing Group publications as pdf
files**

<http://omtab.obs-vlfr.fr/>

Thank you for attention!