



**The Abdus Salam
International Centre for Theoretical Physics**



2066-3

**Workshop and Conference on Biogeochemical Impacts of Climate and
Land-Use Changes on Marine Ecosystems**

2 - 10 November 2009

**Introduction to ocean color remote sensing
(theory and data sources)**

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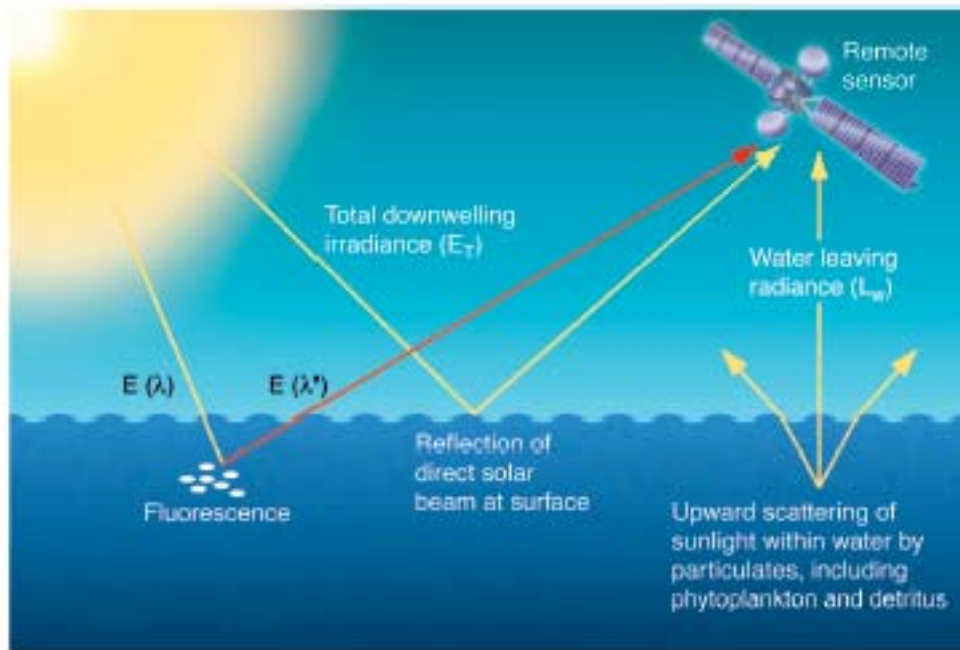
Introduction to ocean color
remote sensing
Part 1 - theory and data sources

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The color of the ocean is recorded by a satellite sensor by measuring the "remote sensing reflectance (R_{rs})" at specific wavelengths. R_{rs} is the ratio of light leaving the water (L_w) to the light incident on it (E_T) and is determined by the absorption (a) and backscattering (b_b) of light in the water column ($R_{rs} = L_w/E_T \propto b_b/(a + b_b)$).

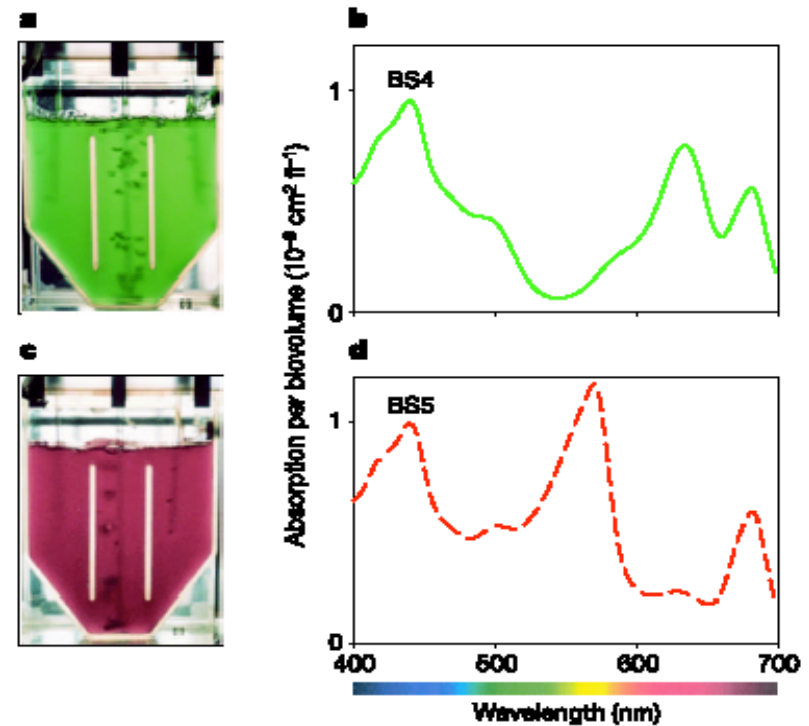
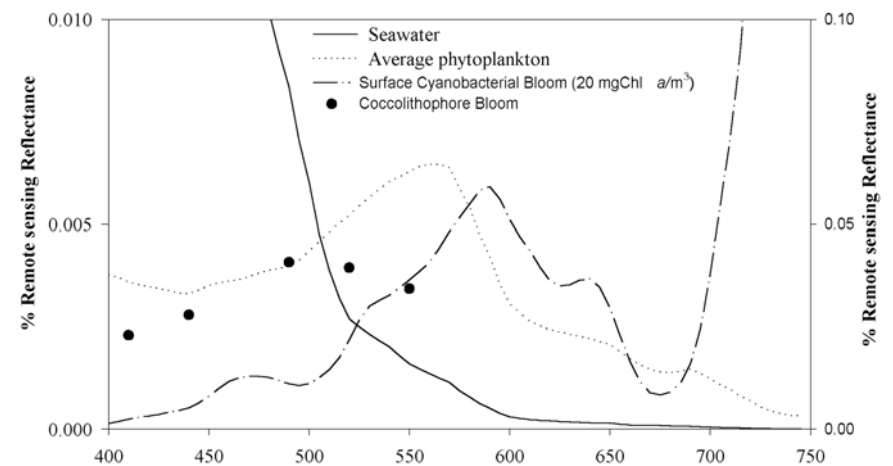
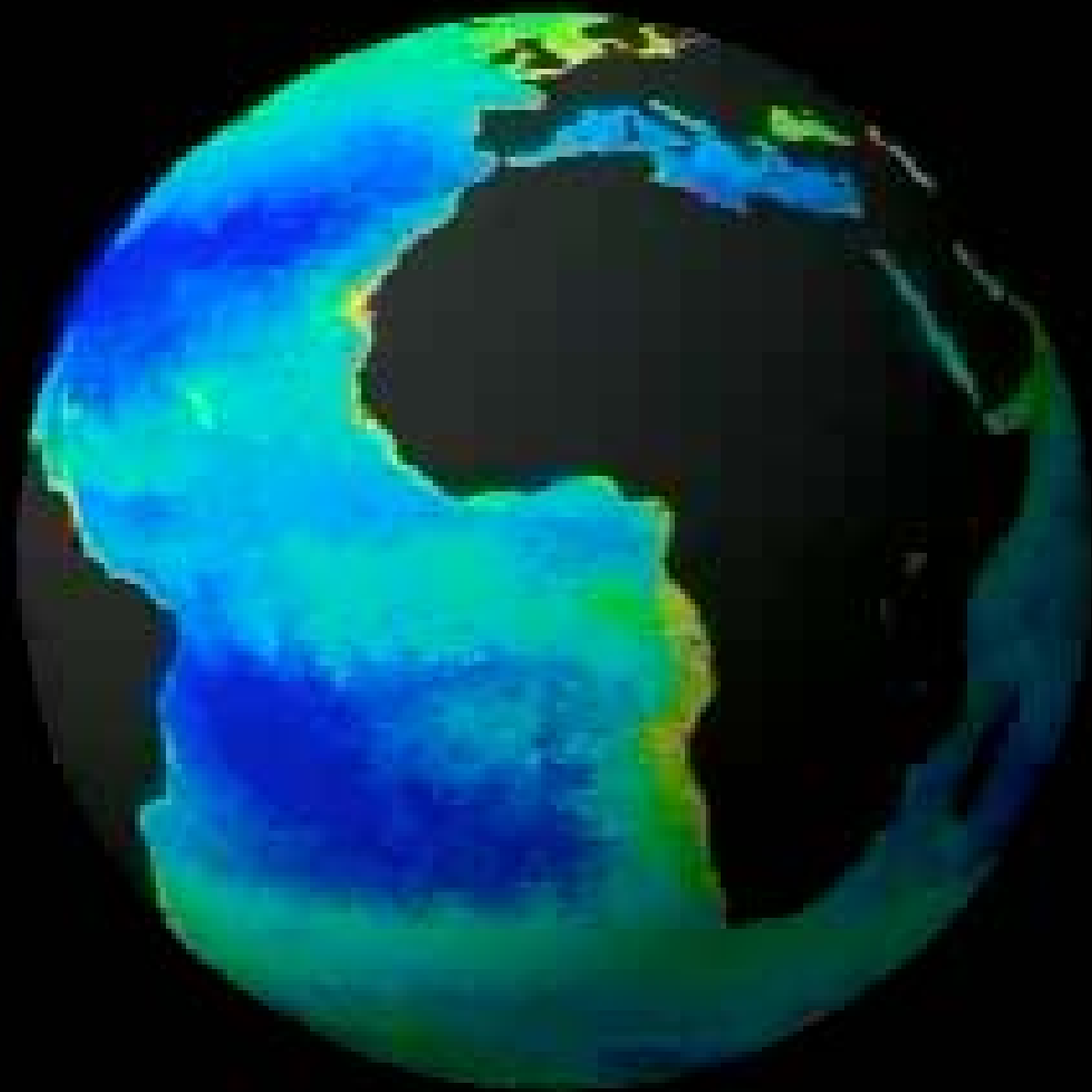


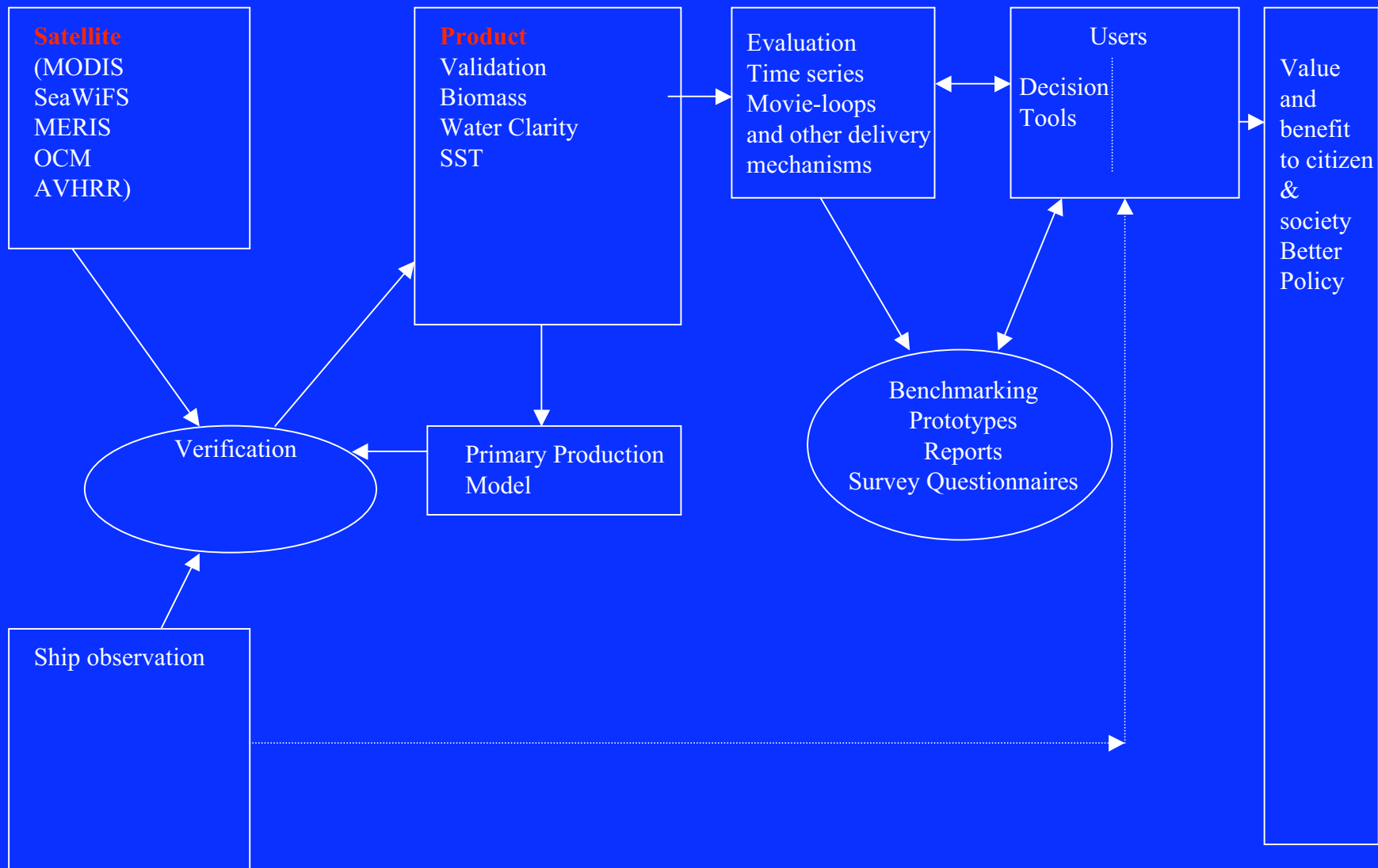
Figure 1 Optical characteristics of the picocyanobacteria BS4 and BS5. Monocultures of BS4 (a) and BS5 (c) grown in chemostats, and the light absorption spectra of BS4 (b) and BS5 (d).

Reflectance model for Chl=10 mg/m³





- The use of remote sensing, ocean optics, knowledge of phytoplankton physiology, biological and physical oceanography and geographical information systems to better understand and manage the coastal marine ecosystem



- Once placed in service, satellites provide regular, regionally synoptic data that can complement conventional shipboard surveys by filling the gaps between surveys.
- Satellite based sensors can be a very cost effective method for collecting environmental data.
- Remote sensing techniques can be used to monitor coastal water quality

- Regional synoptic data can help distinguish between nearfield and farfield effects and separate local production from that advected into the region.
- Satellite sensors can also be a continuous source of information for decadal scale monitoring of the dynamics of natural and anthropogenic changes in the ecosystem, often providing baseline data for “before” and “after” conditions.
- We will go over the basic principles of bio-optics to understand and interpret satellite data and how to validate it with field data

A term project for the final class grade that would require the processing, analysis, display, and interpretation of ocean color data.

The students will form two person teams for a total of six projects

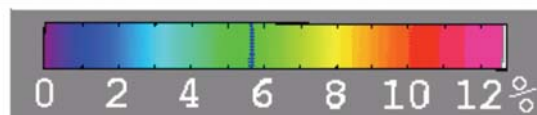
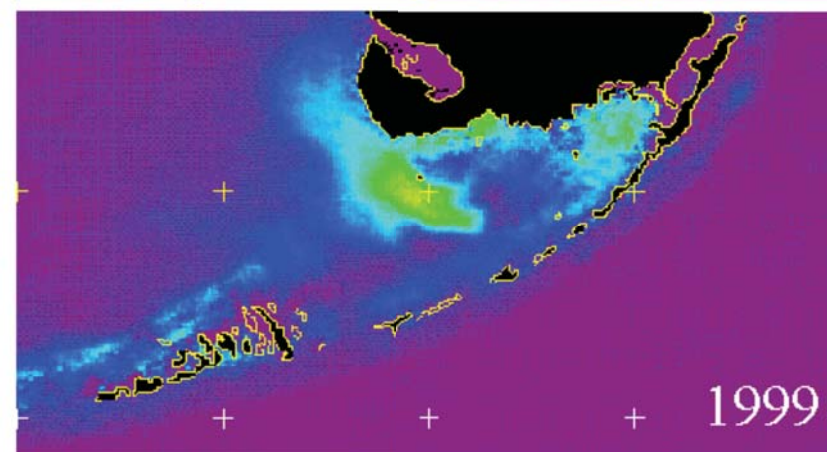
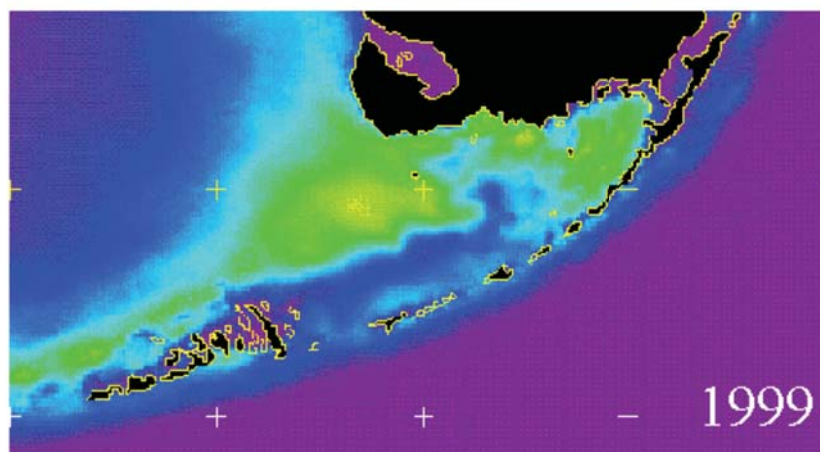
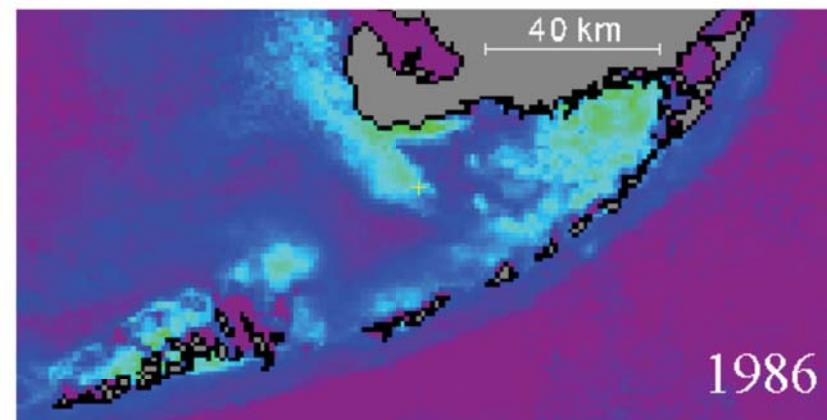
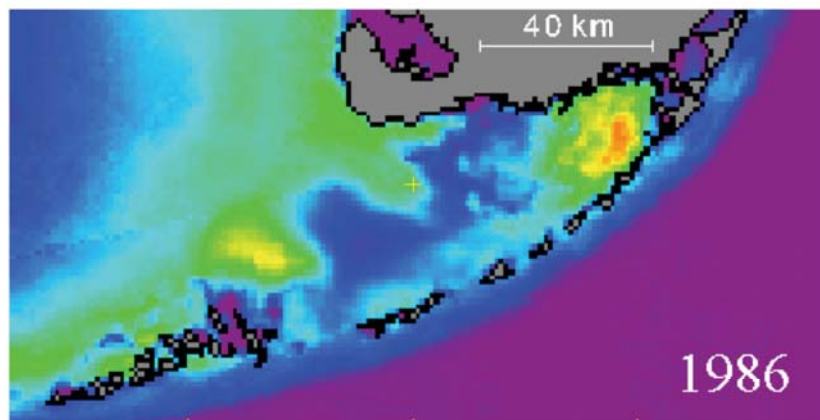
Come up with ideas for projects that have a clear application and validation datasets needed for it.

AVHRR 1986 and 1999, Averages

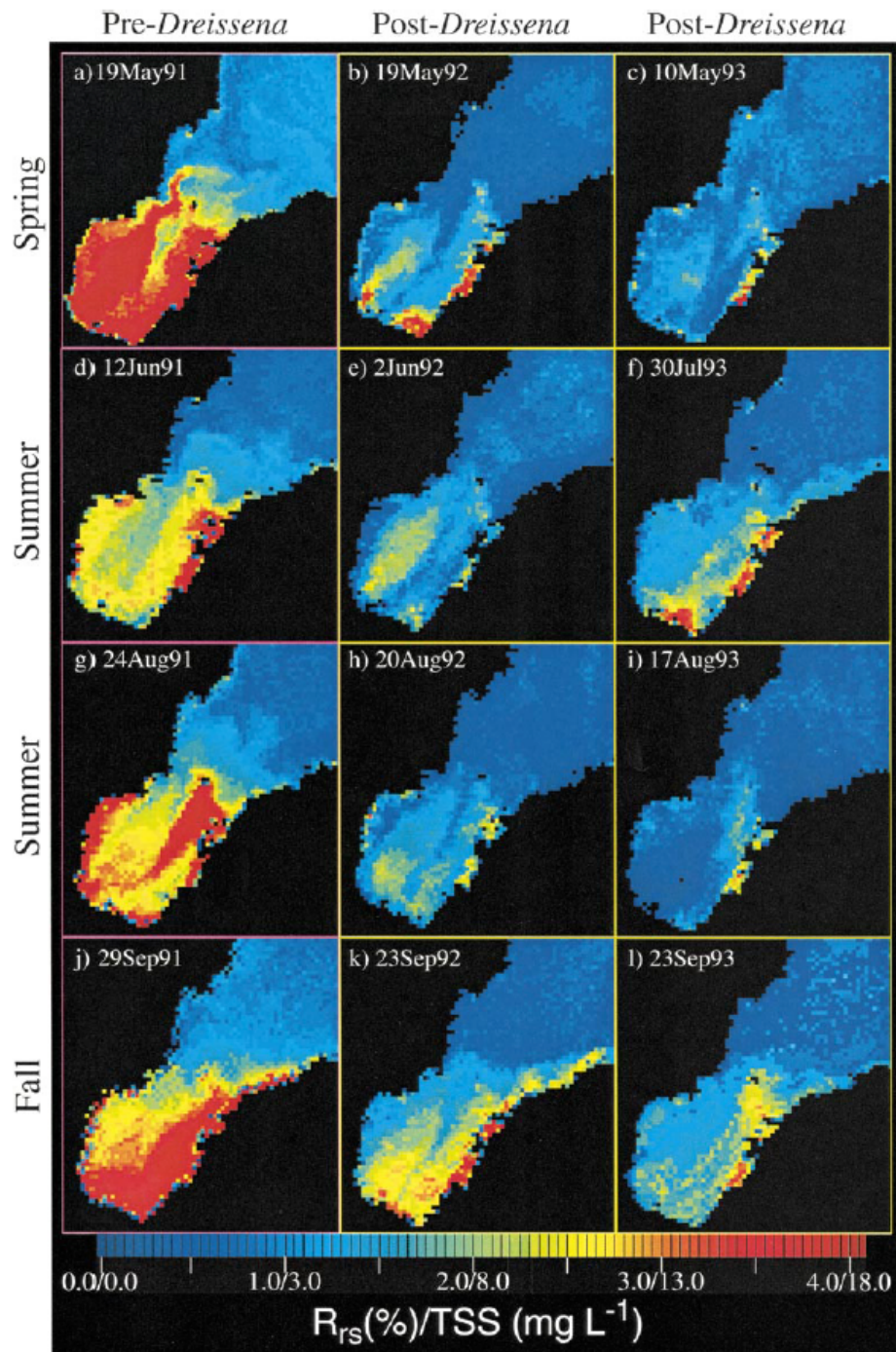


Winter

Summer



1999 processed USGS & NOAA



Spatial and temporal trends in the data indicate distinct and persistent increases in water clarity in the inner bay after the first large recruitment of zebra mussels in the fall of 1991. The pre-*Dreissena* imagery show that turbidity in the inner bay was influenced by the Saginaw River discharge in spring, phytoplankton in summer, and wind-driven resuspension in fall. Spatial patterns in the post-*Dreissena* images were more similar regardless of season, with low reflectances in the shallow regions of the inner bay where zebra mussel densities were highest. Budd et al. 2001 Limnol. Oceanogr., 46(2), 213–223.

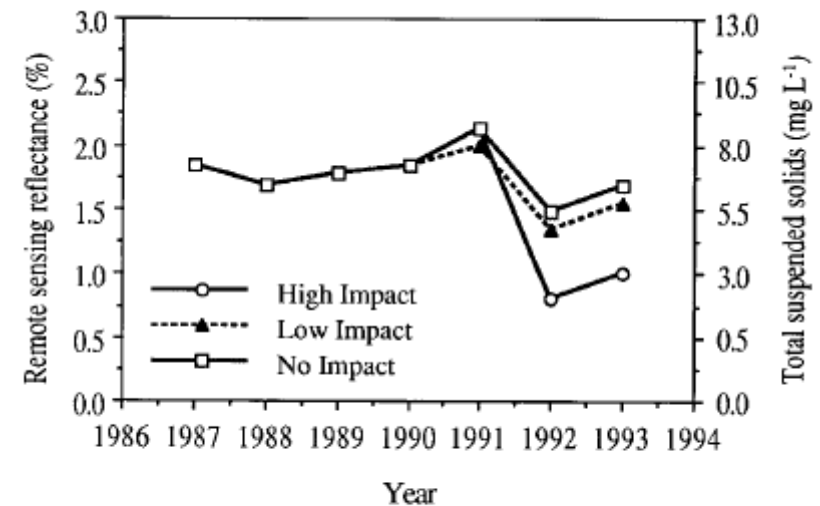
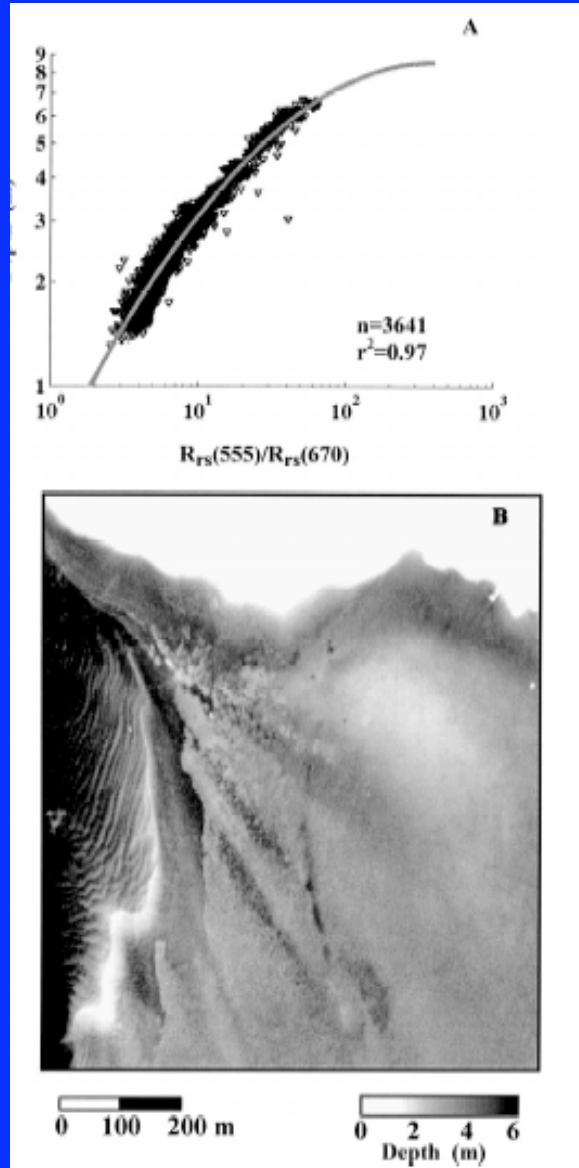


Fig. 5. Model-based changes in reflectance for average high-, low-, and no-density stations by year during midsummer (day of year = 200 or July 19).

Hot Button Issues in Coastal Zone

- **Water quality/ human health**
- **Hypoxia**
- **HABs**
- **Invasive species**
- **Fish farms**
- **Dredging**
- **Climate change/ Greenhouse gases**



(A) Relationship between bottom depth and ratio of $R_{rs}(555)/R_{rs}(670)$. (B) Remotely sensed bathymetry estimated using the PHILLS 99 data.

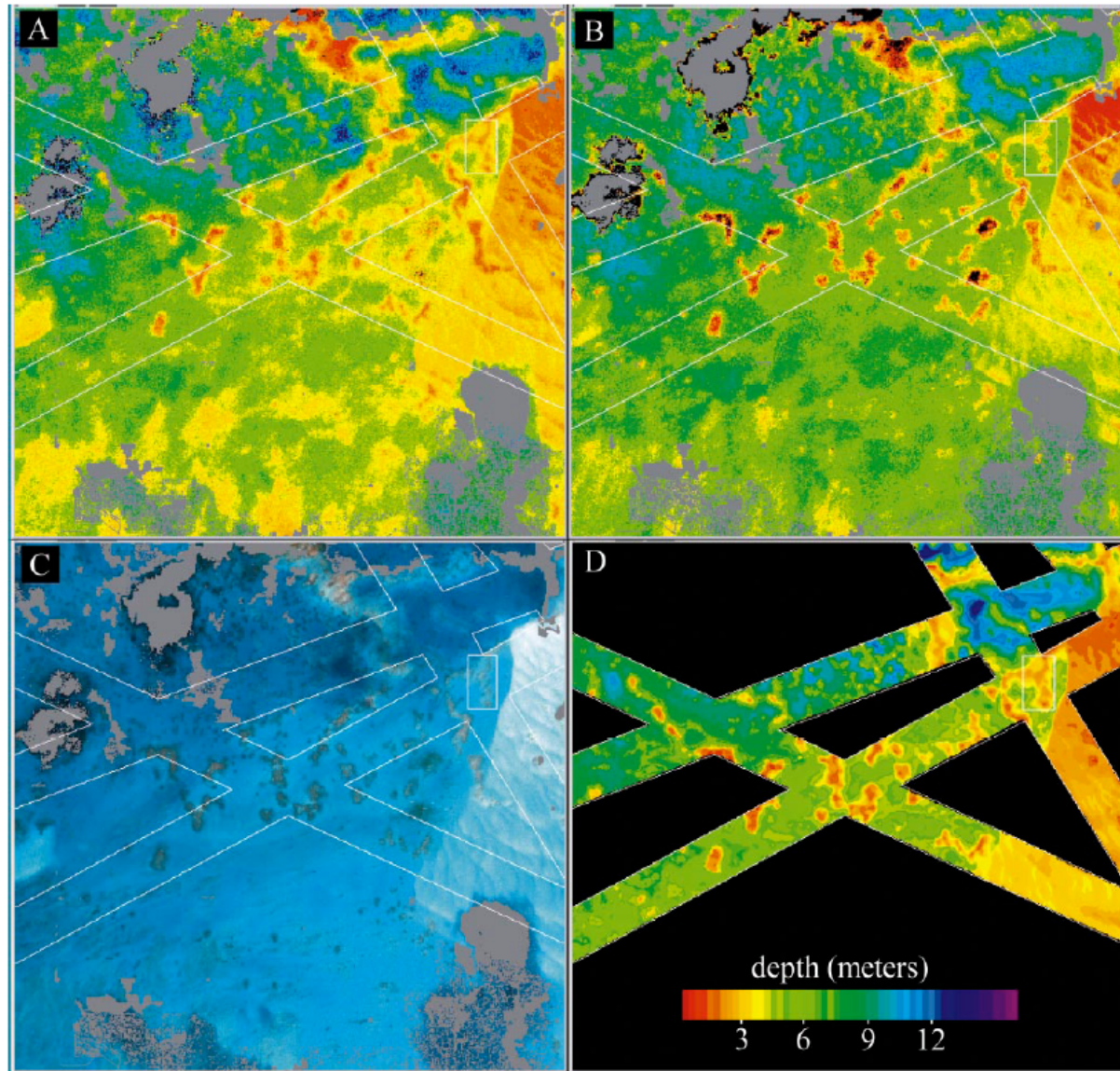


Fig. 7. Depths from the three methods and “true-color” water reflectance for central Kure: (A) ratio, (B) linear, (C) true-color, and (D) lidar. The lidar swaths are 200 m wide and marked on each image. Depths are shown in meters with scale bar at lower right. The box (at upper right in each image) marks a patch reef of low reflectance. IKONOS imagery courtesy of Space Imaging.

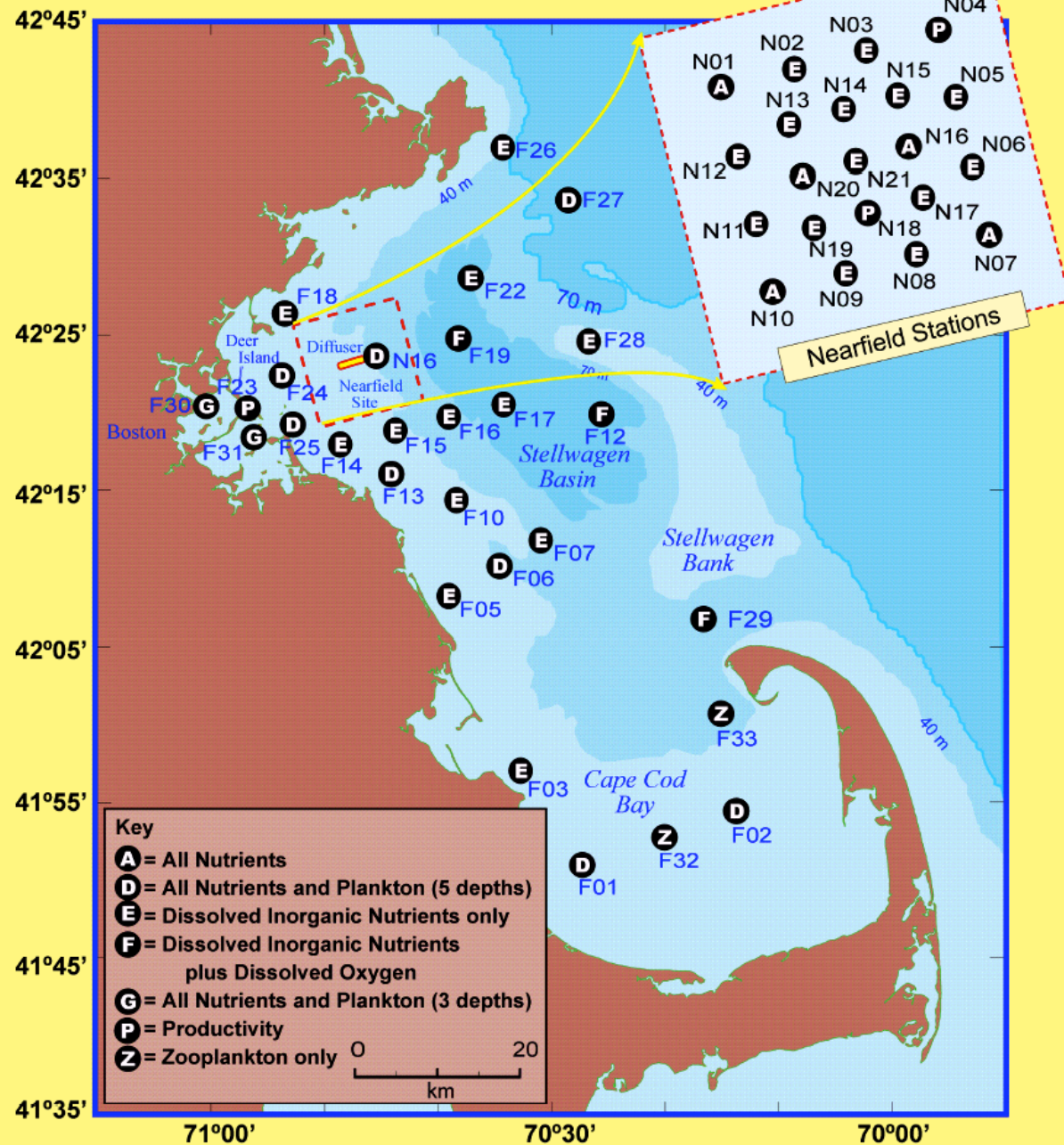


Deer Island

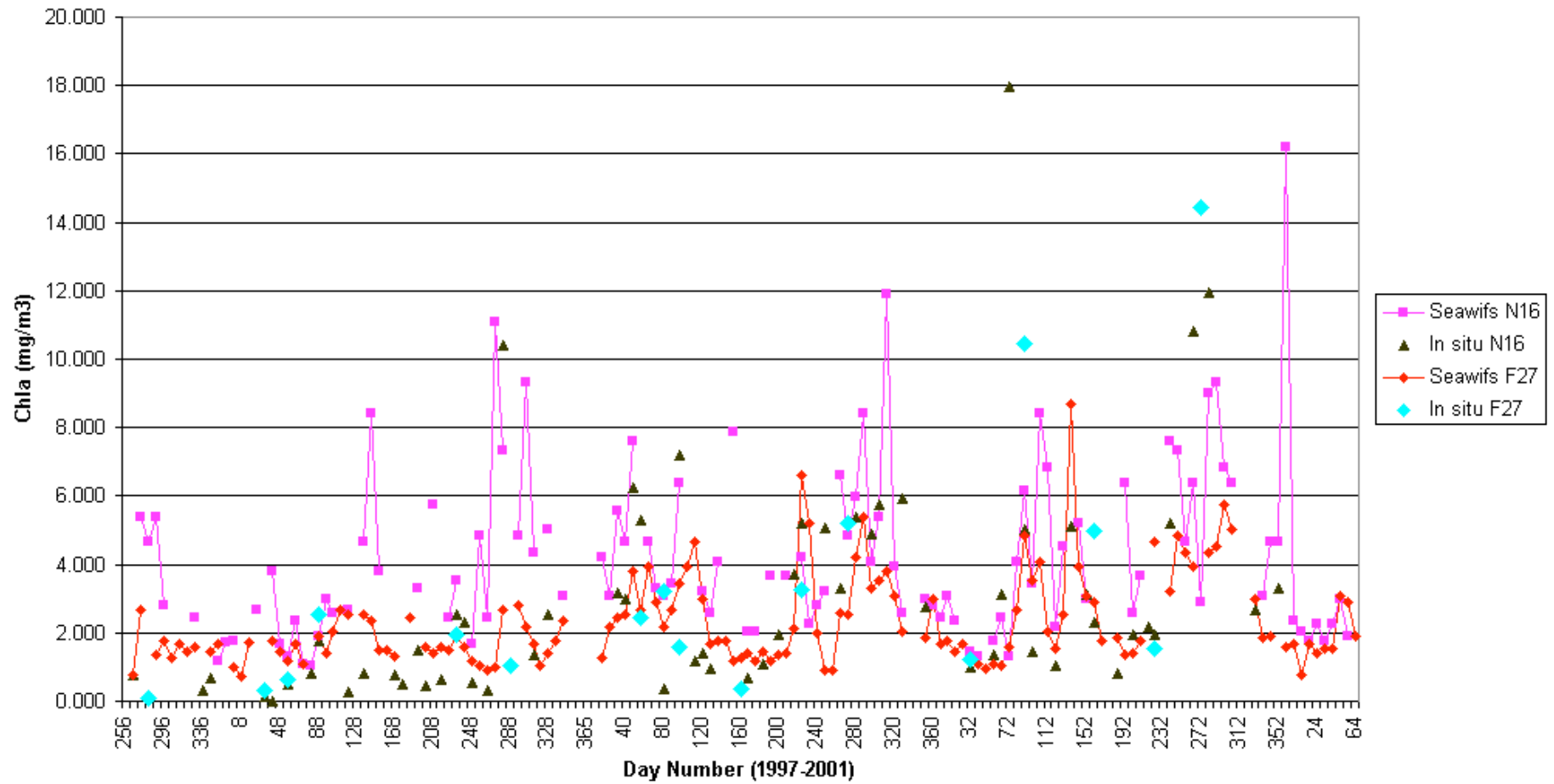
#29,627

May 26, 2000

MWRA Water Column Stations



Mass Bay Chl



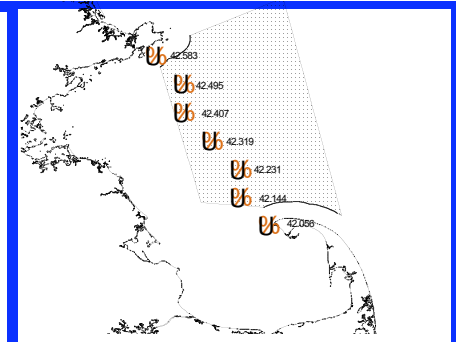
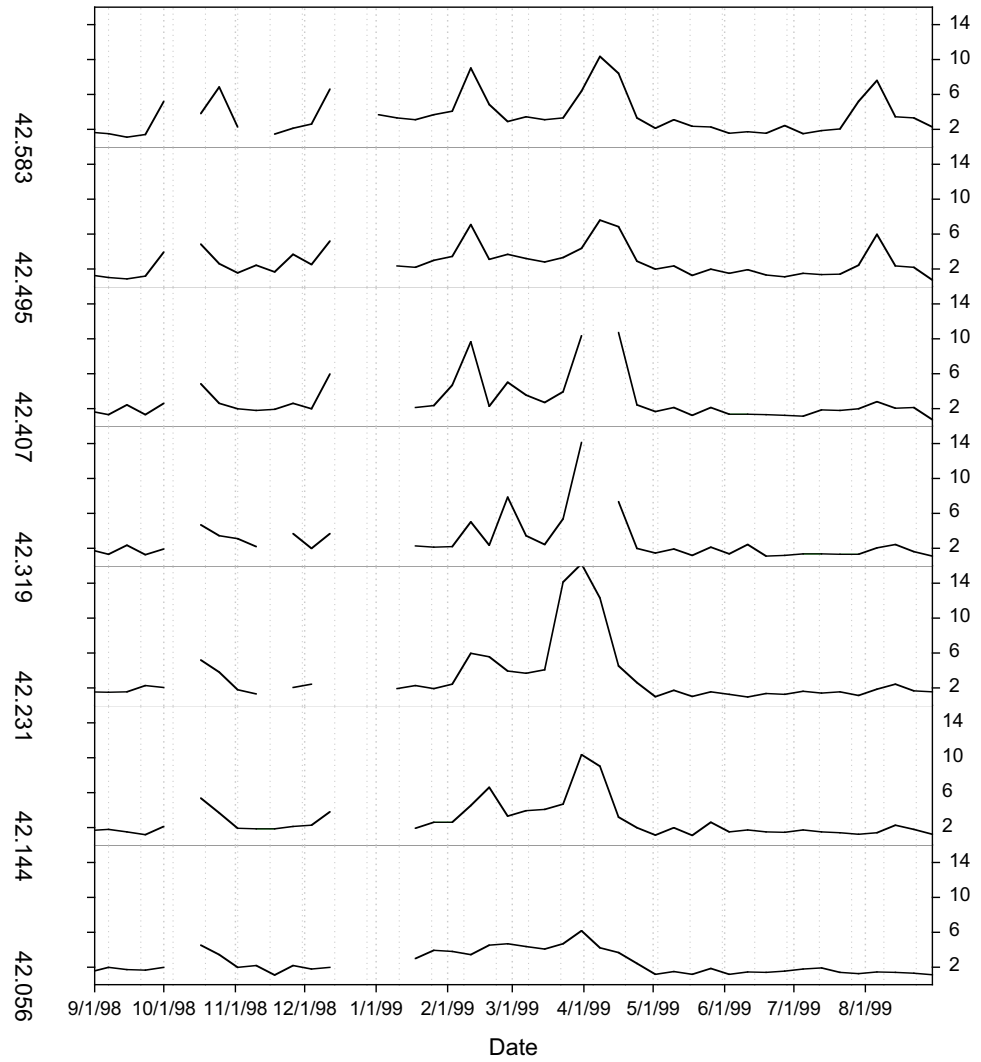
0 Days	F02	N16	F26	GoMOOS
F02	1	0.20	0.20	0.14
N16		1	0.55	0.41
F26			1	0.52
GoMOOS				1
-8 Days	F02	N16	F26	GoMOOS
F02	0.43	0.18	0.12	0.16
N16	0.07	0.30	0.31	0.43
F26	0.17	0.43	0.46	0.37
GoMOOS	0.16	0.30	0.42	0.46
-16 Days	F02	N16	F26	GoMOOS
F02	0.25	0.06	0.04	0.22
N16	0.09	0.24	.018	0.15
F26	0.15	0.28	0.24	0.21
GoMOOS	0.14	0.22	0.22	0.25

Values in bold are 95% significant

The GoMOOS B Buoy site is significantly correlated 8 days ahead of N16.

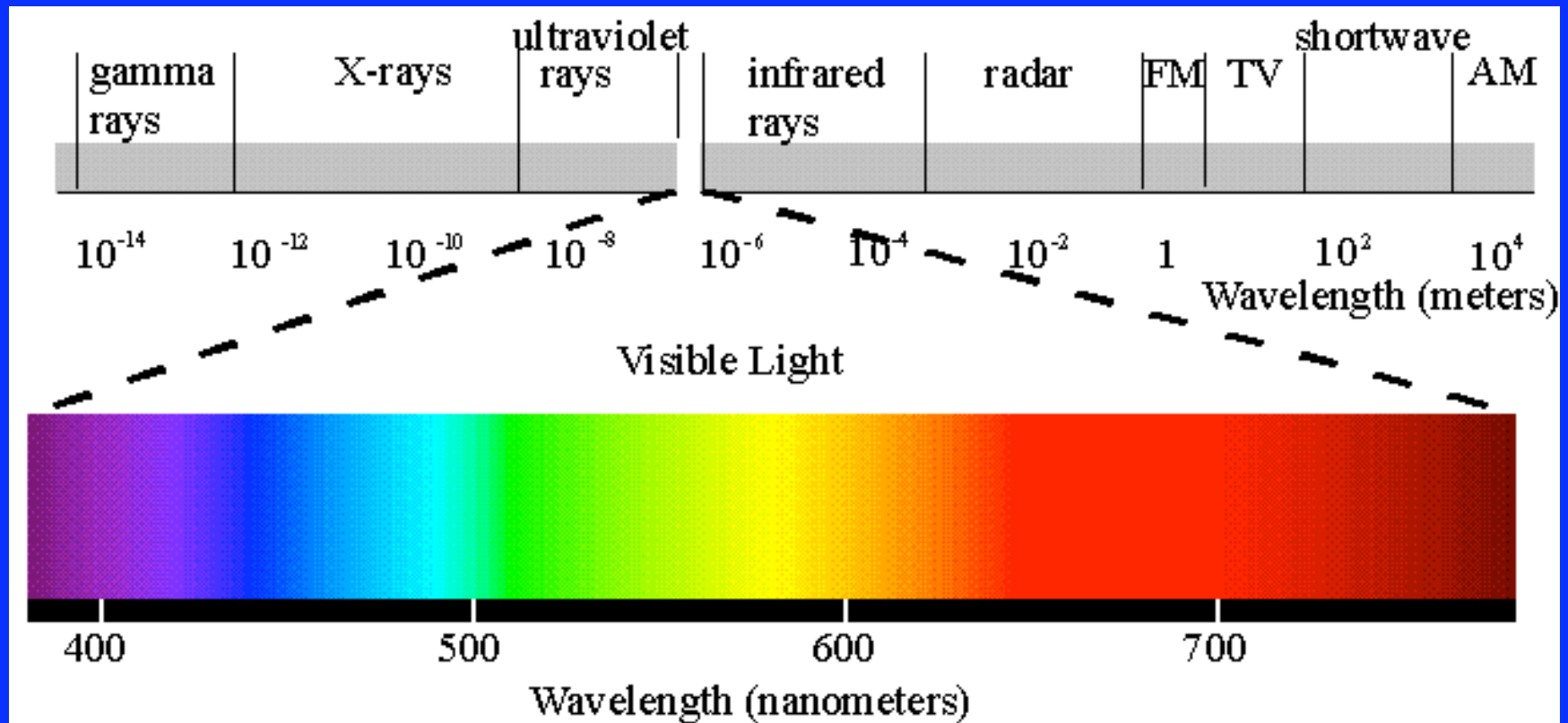
1998-
1999

Variation in Chlorophyll Concentrations along a
Transect From Cape Ann to Cape Cod
1998 - 1999



What is ocean color?

Remote sensing of the visible part of the electromagnetic spectrum



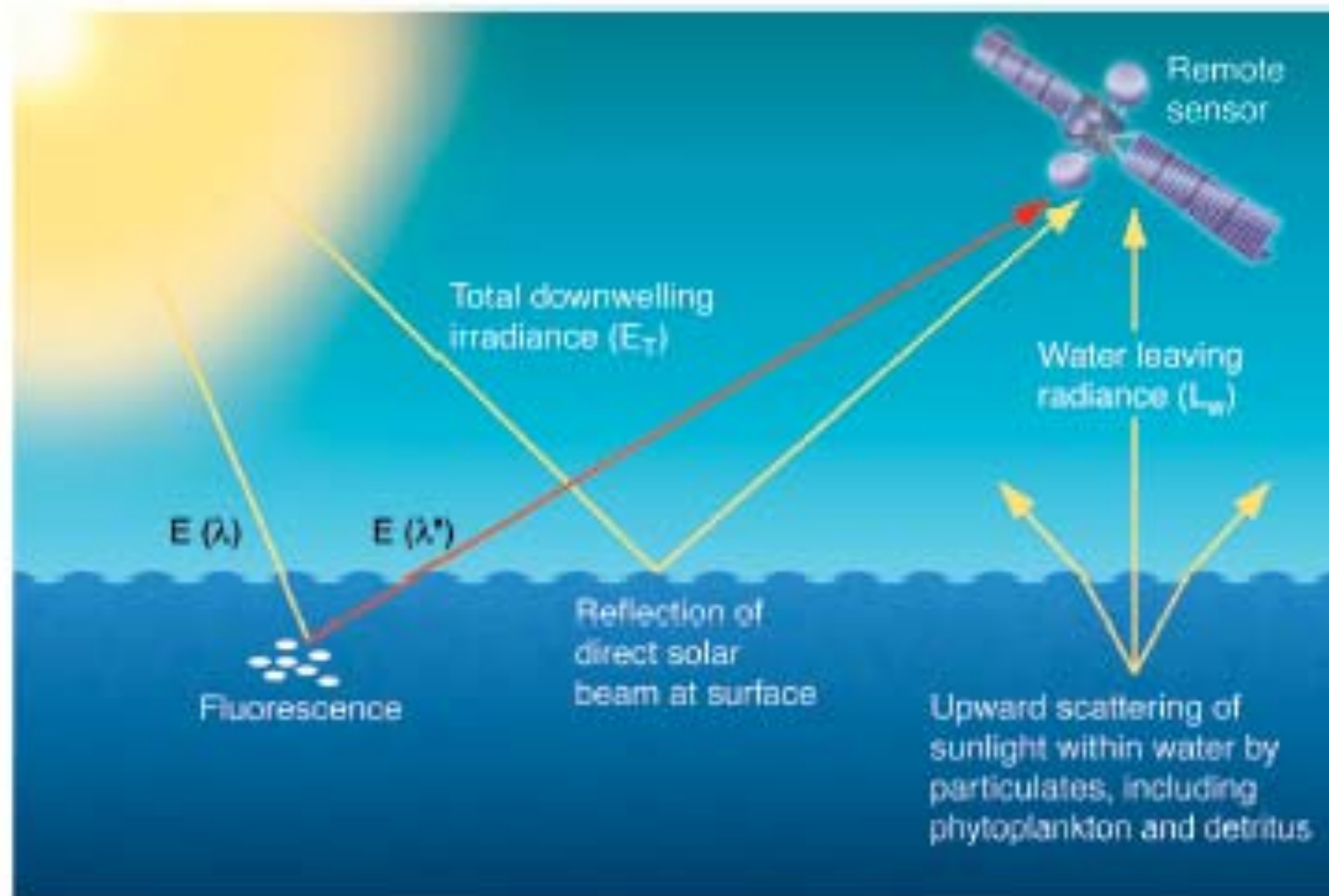
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[Visual Stimulus](#)

What is ocean color?

Remote sensing of the visible part of the electromagnetic spectrum

- AVHRR 1979 – present (~ 1km,
- SPOT 1986 – present (20m, 500-590, 610-680)
- Landsat
 - MSS 1972-1983 (30m, 500-600, 600-700)
 - TM 1982-present (30m, 450-520, 520-600, 630-690)
- GOES 1975 – present (~1 km, 550-750)
- Meteosat 1977 – present (2.4 km, 400-1100, 570-710)



The color of the ocean is recorded by a satellite sensor by measuring the "remote sensing reflectance (R_{rs})" at specific wavelengths. R_{rs} is the ratio of light leaving the water (L_w) to the light incident on it (E_T) and is determined by the absorption (a) and backscattering (b_b) of light in the water column ($R_{rs} = L_w/E_T \propto b_b/(a + b_b)$).

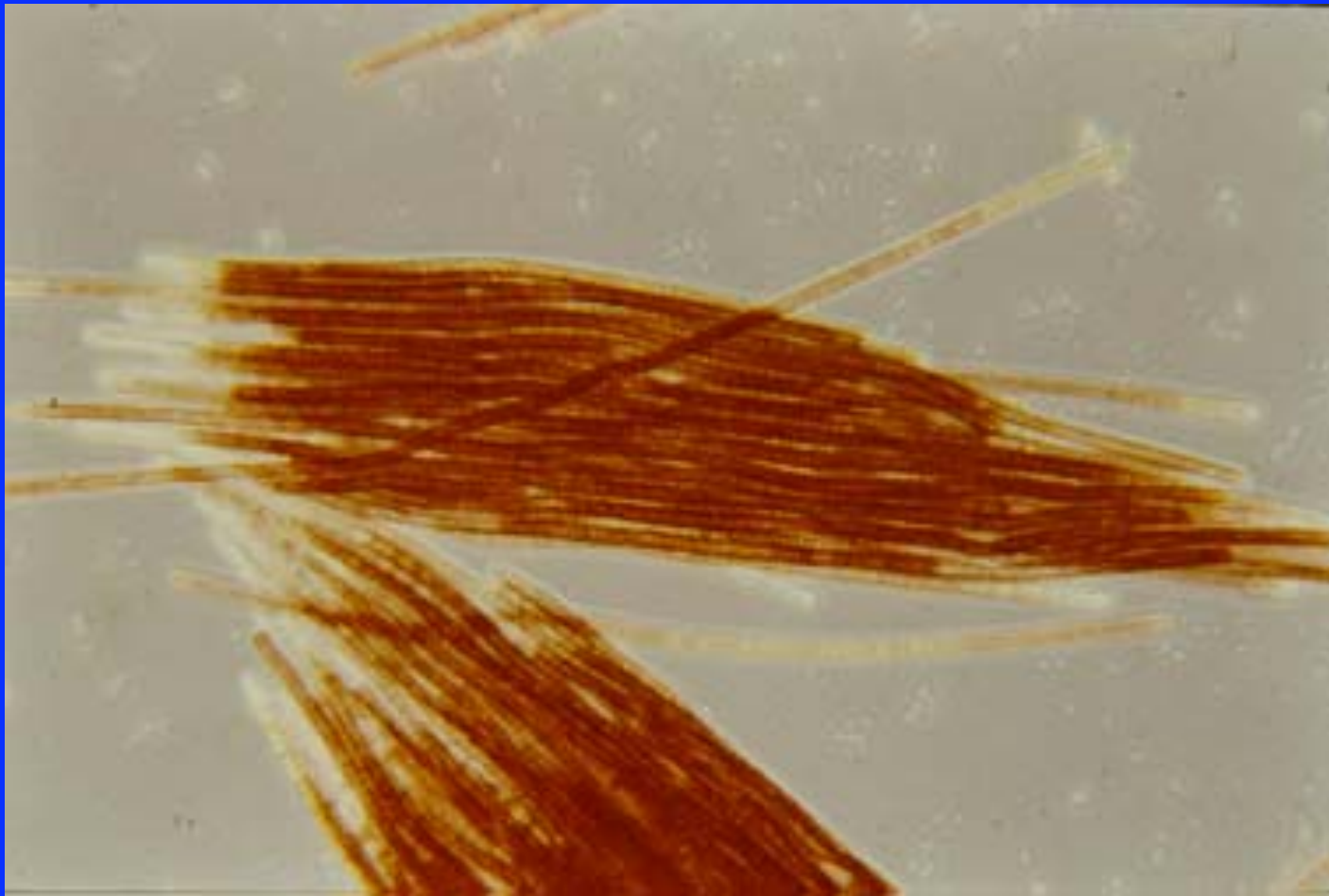
Historical Ocean-Color Sensors

Sensor	Agency	Satellite	Operating Dates	Swath (km)	Resolution (m)	# of Bands	Spectral Coverage (nm)
CZCS	NASA (USA)	Nimbus-7 (USA)	10/24/78-06/22/86	1556	825	6	433-12500
MOS	DLR (Germany)	IRS P3 (India)	03/21/96-05/31/04	200	500	18	408-1600
OCTS	NASDA (Japan)	ADEOS (Japan)	08/17/96-07/01/97	1400	700	12	402-12500
Polder	CNES (France)	ADEOS (Japan)	08/17/96-07/01/97	2400	6000	9	443-910
CMODIS	CNSA (China)	Shen Zhou-3	03/25/02-09/15/02	-	400	34	403-12500
CZI	CNSA (China)	Hai Yang-1	05/15/02-12/01/03	500	250	4	420-890
GLI	NASDA (Japan)	ADEOS II (Japan)	12/14/02-10/25/03	1600	250/1000	36	375-12500
Polder II	NASDA (Japan)	ADEOS II (Japan)	12/14/02-10/25/03	2400	6000	9	443-910

Current and Future Ocean-Color Sensors

Sensor	Agency	Satellite	Operating Dates	Swath (km)	Resolution (m)	# of Bands	Spectral Coverage (nm)
SeaWiFS	NASA (USA)	OrbView-2 (USA)	08/1997	2806	1100	8	402-885
OCI	NSPO (Taiwan)	ROCSAT-1 (Taiwan)	01/1999	690	825	6	433-12500
OCM	ISRO (India)	IRS-P4 (India)	05/1999	1420	350	8	402-885
OSMI	KARI (Korea)	KOMPSAT (Korea)	12/1999	800	850	6	400-900
Terra	NASA (USA)	MODIS	12/1999	2330	1000	36	405-14385
MERIS	ESA (Europe)	Envisat -1 (Europe)	03/2002	1150	300/1200	15	412-1050
Aqua	NASA (USA)	MODIS	05/2002	2330	1000	36	405-14385
COCTS	CNSA (China)	HaiYang-1 (China)	05/2002	1400	1100	10	402-12500

Trichodesmium colonies

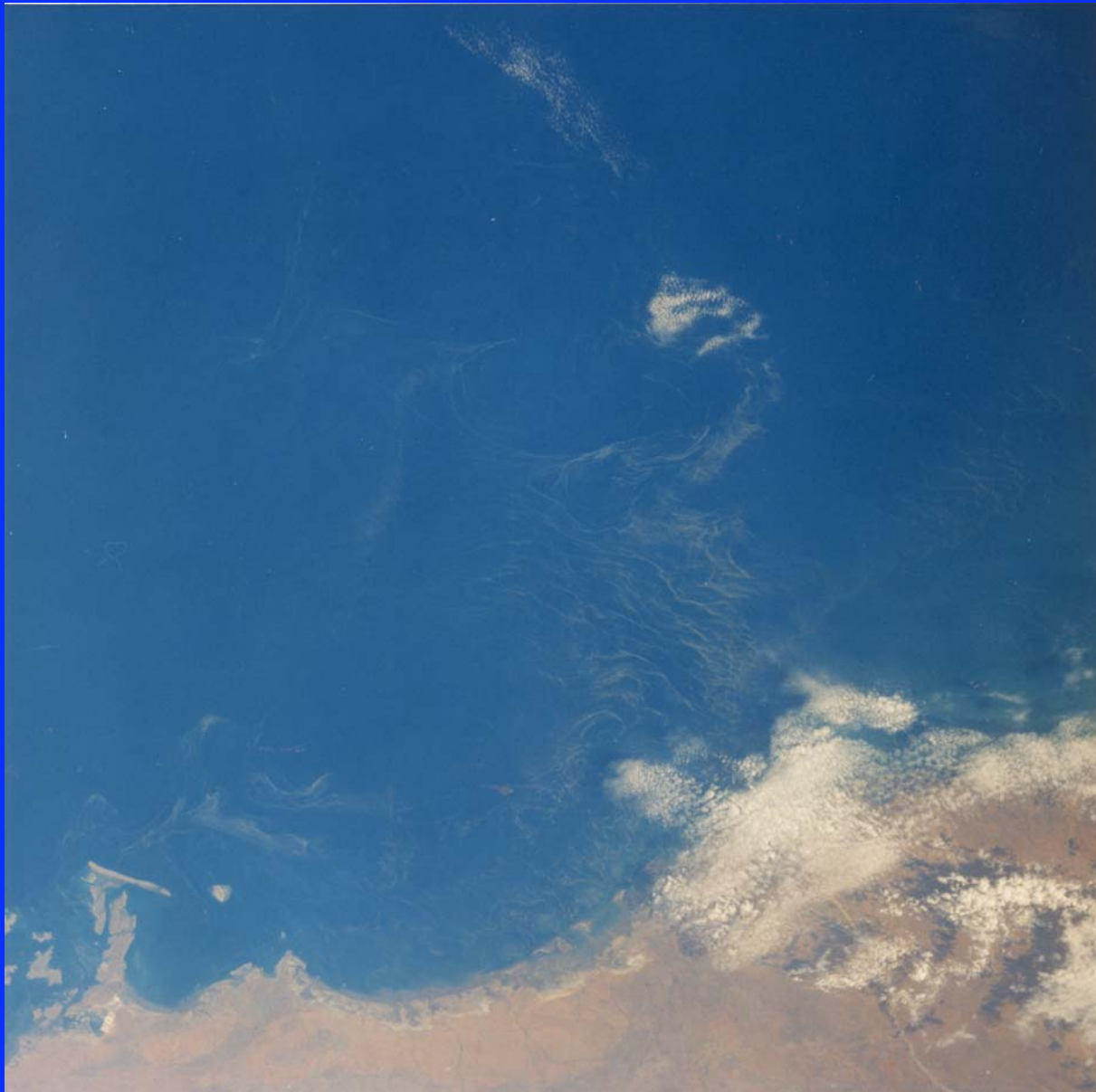




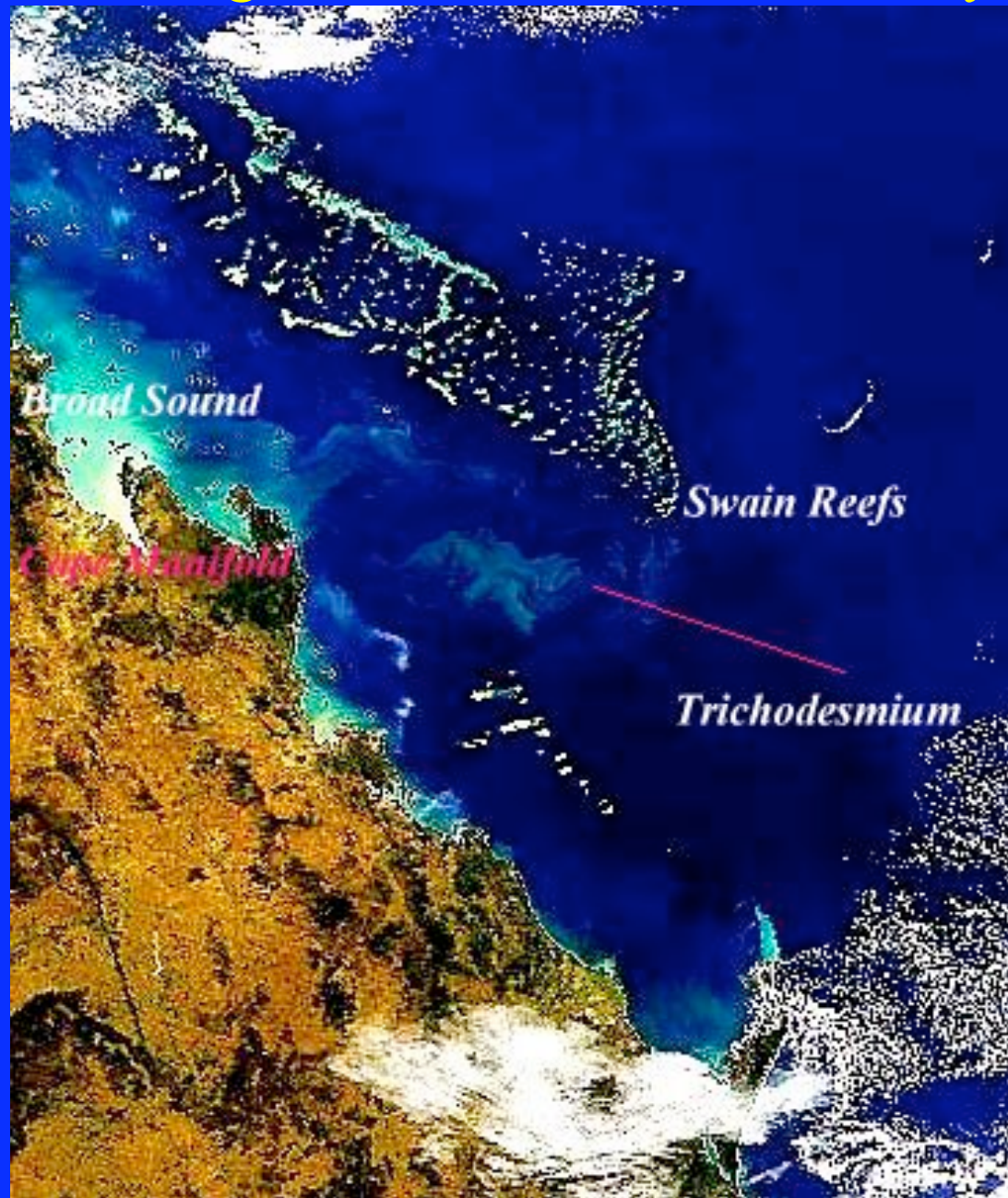
Tricho slick



Space shuttle photo



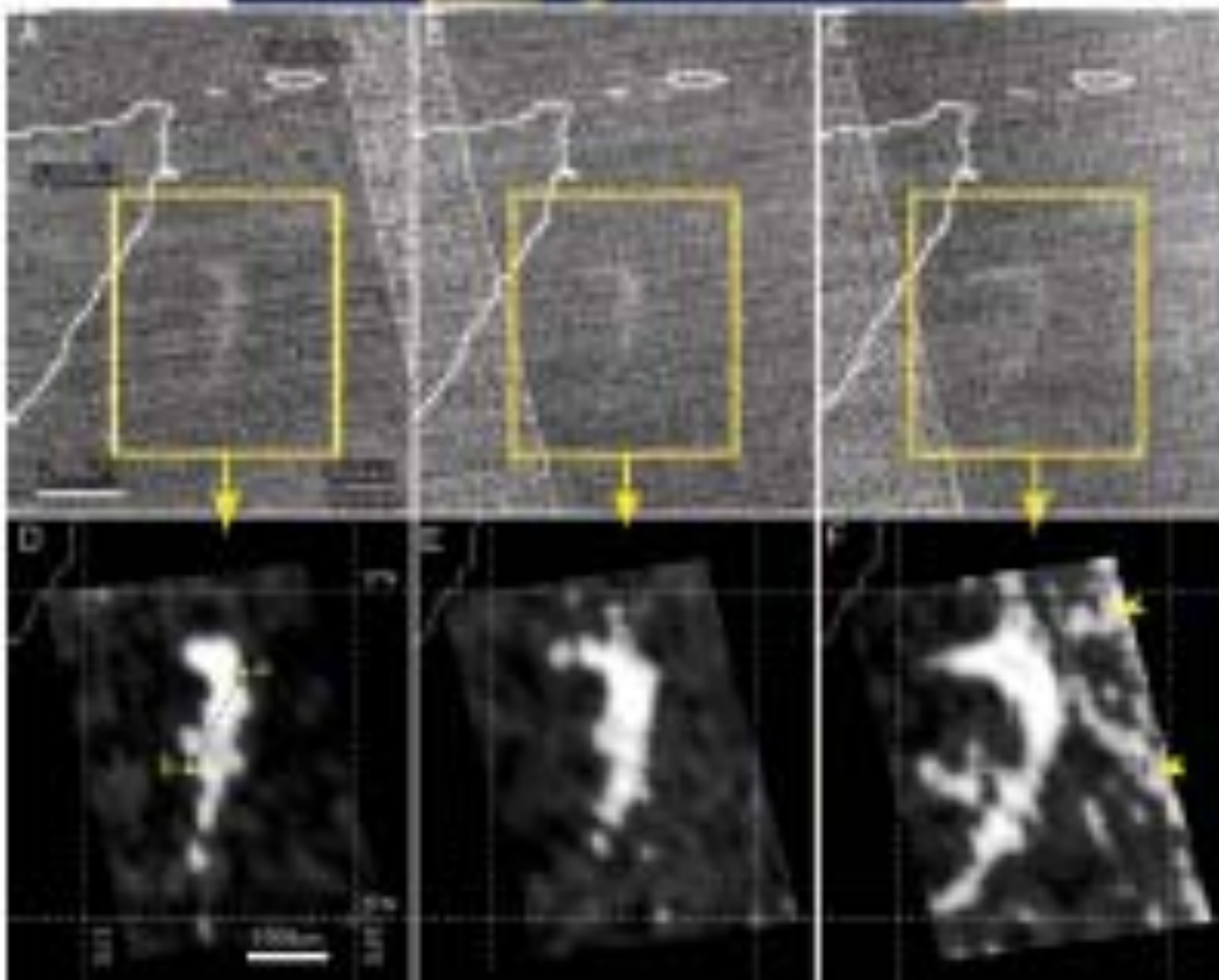
Satellite Image - *Trichodesmium* 14 July 1998





Earth at Night
More information available at:
<http://antwrp.gsfc.nasa.gov/apod/ap001127.html>

Astronomy Picture of the Day
2000 November 27
<http://antwrp.gsfc.nasa.gov/apod/astropix.html>



"The 27th of January, at the entrance of the vast Bay of Bengal ..., about seven o'clock in the evening, the Nautilus ... was sailing in a sea of milk Was it the effect of the lunar rays? No: for the moon ... was lying hidden under the horizon ... The whole sky, though lit by the sidereal rays, seemed black by contrast with the whiteness of the waters.

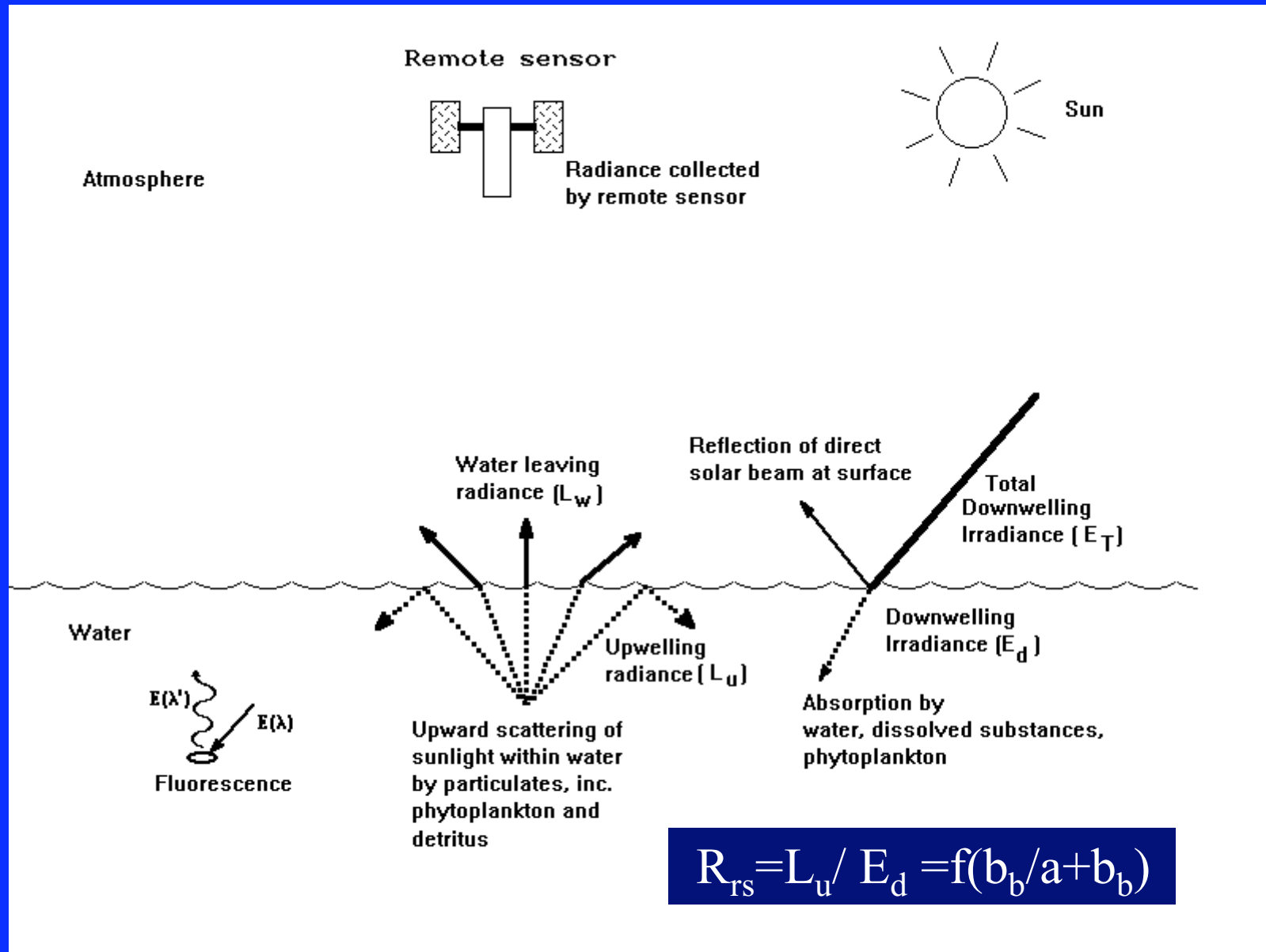
'It is called a milk sea', I explained ...

'But sir, ... can you tell me what causes such an effect? For I suppose the water is not really turned into milk.'

'No, my boy: and the whiteness which surprises you is caused only by the presence of myriads of infusoria, a sort of luminous little worm, gelatinous and without colour, of the thickness of a hair whose length is not more than seven-thousands of an inch. These insects adhere to one another sometimes for several leagues'

'... and you need not try to compute the number of these infusoria. You will not be able, for ... ships have floated on these milk seas for more than forty miles'.

From Jules Verne Twenty Thousand Leagues Under the Sea – Indian Ocean, January 24th.



$$R_{rs} = L_u / E_d = f(b_b/a + b_b)$$

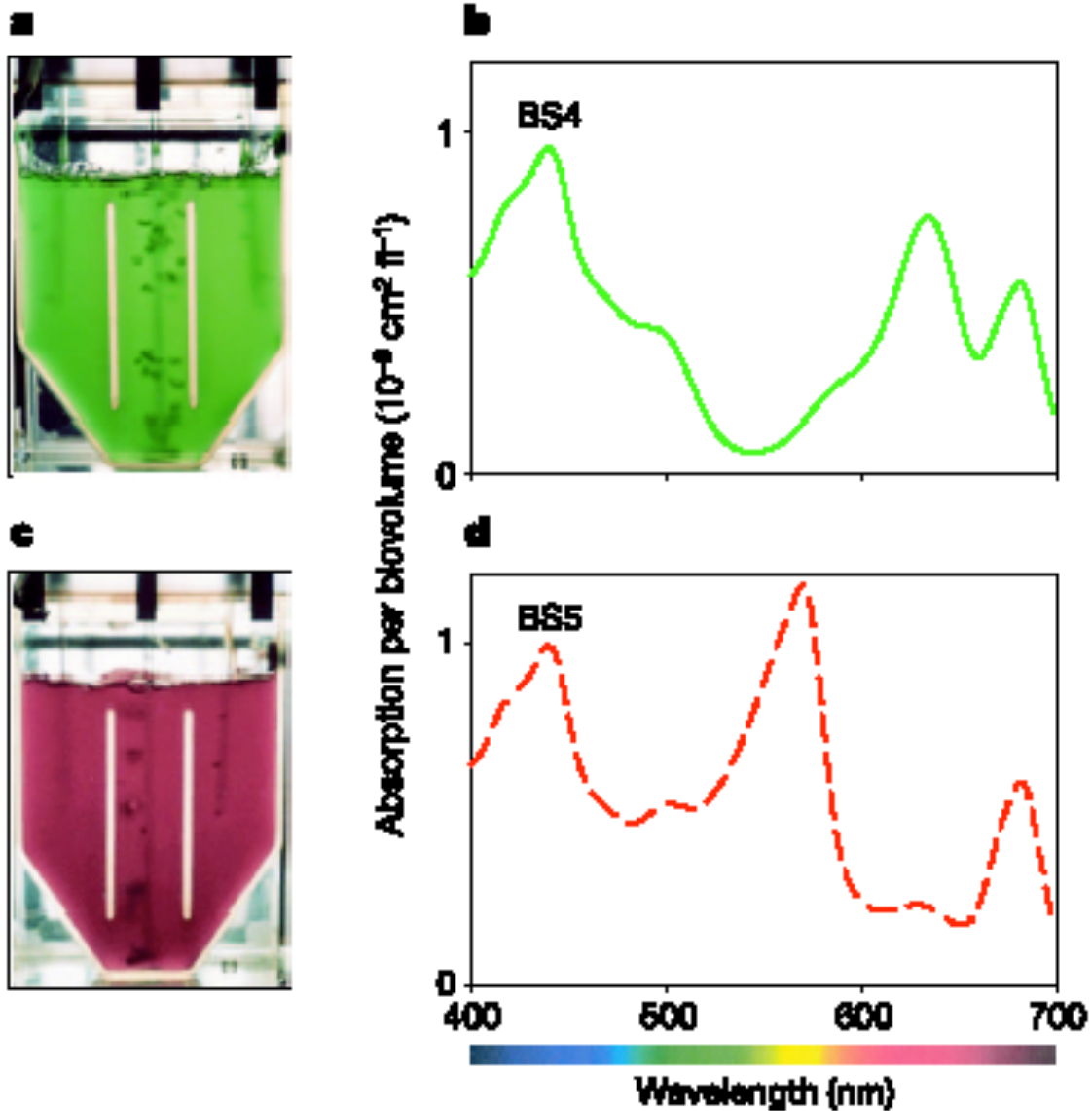


Figure 1 Optical characteristics of the picocyanobacteria BS4 and BS5. Monocultures of BS4 (a) and BS5 (c) grown in chemostats, and the light absorption spectra of BS4 (b) and BS5 (d).

From Stomp et al Nature 2004

FORWARD AND INVERSE SEMI-ANALYTICAL OCEAN COLOR MODELS

Forward models:

Generate R or Lw from Chl and/or IOPs

$$\text{Chl, } a, b_b \rightarrow R(\lambda) \text{ or } Lw(\lambda)$$

- Forward models can be useful to test if specific situations result in different Lw or reflectance spectra.

Inverse models:

Generate Chl and/or IOPs from R or Lw

$$R(\lambda) \text{ or } Lw(\lambda) \rightarrow \text{Chl, } a, b_b, \dots$$

FORWARD AND INVERSE SEMI-ANALYTICAL OCEAN COLOR MODELS

Ocean color is very simple:

$$1) \quad a + b = c \quad (\text{IOPs})$$

$$2) \quad R \propto \frac{b}{a + b}$$

$$3) \quad a = f(R_1/R_2)$$

(AOPs =
f[IOPs])
From radiative
transfer models
Inverse model

Ok, ok, it's not always that simple !

The R_{rs} to b_b/a relationship exists in various flavors

$$R_{rs} = \frac{t}{n_w^2} \frac{f}{Q} \left(\frac{b_b}{a + b_b} \right)$$

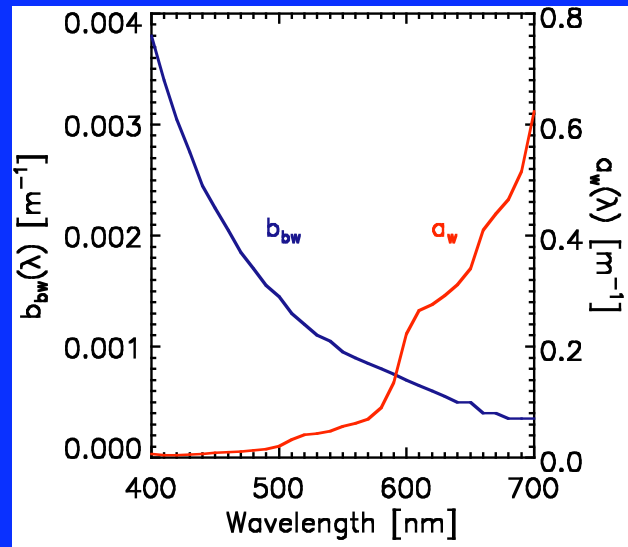
Water-air transmission term "Geometry" factor

Can be reasonably well estimated based on viewing and illumination geometry, wind speed and salinity

It's not always that simple and most terms have their own spectral dependence

$$R_{rs}(\lambda) = \frac{t}{n_w^2} \frac{f(\lambda)}{Q(\lambda)} \left[\frac{\underline{b_{bw}}(\lambda) + b_{bp}(\lambda)}{\underline{a_w}(\lambda) + a_\varphi(\lambda) + a_d(\lambda) + a_g(\lambda) + \underline{b_{bw}}(\lambda) + b_{bp}(\lambda)} \right]$$

- Reflection by bright shallow bottom was not considered here.
- Various ways exist to fill the right-end side of the equation and get a forward model.
- Optical properties of water is fixed and assumed to be well known
Tricky part:
 - parameterization of b_{bp} and non-water absorption terms.
 - Their relative variations need to be realistic



From Stephane Maritorena

Particulate backscattering, b_{bp}

$$b_p(550) = 0.416 \text{ chl}^{0.766}$$

$$b_{bp}(\lambda) = \{0.002 + 0.01[0.5 - 0.25 \log_{10}[\text{chl}]] (\lambda/550)^\nu\} b_p(550)$$

$$\nu = 0.5 (\log_{10}[\text{chl}] - 0.3) \text{ and } \nu = 0 \text{ when } [\text{chl}] > 2 \text{ mg m}^{-3}$$

(Morel, 1988; Morel & Maritorena, 2001)

$$b_{bp}(\lambda) = b_{bp}(\lambda_0)(\lambda/\lambda_0)^\nu$$

$$b_{bp}(\lambda_0) = f(\text{chl}) \text{ and } \nu = f(b_{bp}(\lambda_0)) \quad (\text{Reynolds et al., 2001})$$

$$b_{bp}(\lambda) = \underbrace{0.039 b_{ps}^o(\lambda) P_s}_{\text{Small particles}} + \underbrace{0.00064 b_{pl}^o(\lambda) P_l}_{\text{Large particles}} \quad (\text{Haltrin \& Kattawar, 1991})$$

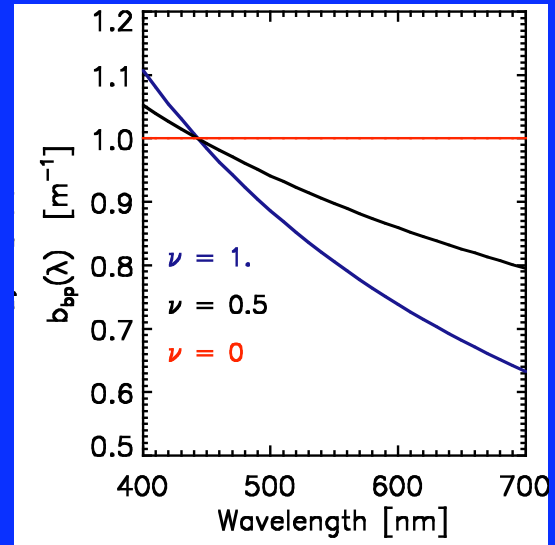
Small particles

Large particles

$$b_b = b_{bw} + b_{b\varphi1} + b_{b\varphi2} + \dots + b_{b\varphi n} + b_{b\text{det}} + b_{b\text{min}} + b_{b\text{bub}} \quad (\text{Stramski et al., 2001})$$

$$b_{bp}(\lambda) = b_{bp} [c_p(\lambda) - a_p(\lambda)] \quad (\text{Roesler \& Boss, 2003})$$

Other parameterizations of b_{bp} exist (H. Loisel, Z. Lee, ...)



$$R_{rs}(\lambda) = \frac{t}{n_w^2} \frac{f(\lambda)}{Q(\lambda)} \left[\frac{b_{bw}(\lambda) + b_{bp}(\lambda)}{a_w(\lambda) + a_\varphi(\lambda) + a_d(\lambda) + a_g(\lambda) + b_{bw}(\lambda) + b_{bp}(\lambda)} \right]$$

Absorption

Phytoplankton

$$a_\varphi(\lambda) = A(\lambda) \text{chl}^B(\lambda)$$

Absorption

$$a = a_w + a_{\varphi 1} + a_{\varphi 2} + \dots + a_{\varphi n} + a_{\text{det}} + a_{\text{min}} + a_y$$

Phytoplankton

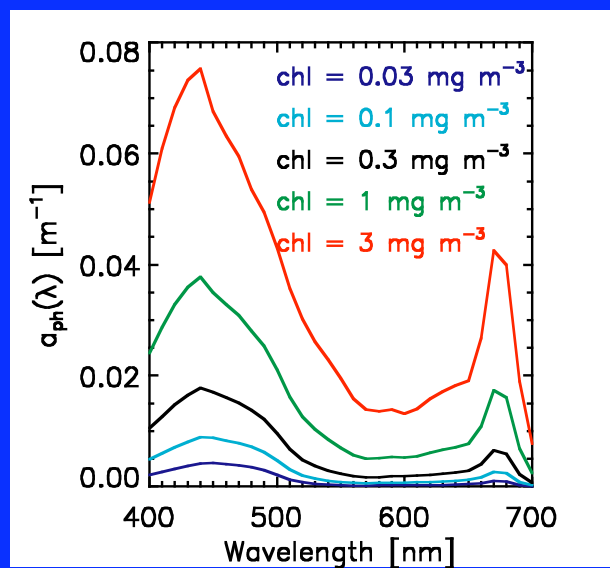
$$a_{\varphi}(\lambda) = A(\lambda) \text{chl}^{B(\lambda)}$$

Detritus

$$a_d(\lambda) = a_d(\lambda_0) \exp[S_d (\lambda_0 - \lambda)]$$

Dissolved organic matter

$$a_y(\lambda) = a_y(\lambda_0) \exp[S_y (\lambda_0 - \lambda)]$$



$$R_{rs}(\lambda) = \frac{t}{n_w^2} \frac{f(\lambda)}{Q(\lambda)} \left[\frac{b_{bw}(\lambda) + b_{bp}(\lambda)}{a_w(\lambda) + a_\phi(\lambda) + \underline{a_d(\lambda)} + \underline{a_g(\lambda)} + b_{bw}(\lambda) + b_{bp}(\lambda)} \right]$$

Absorption

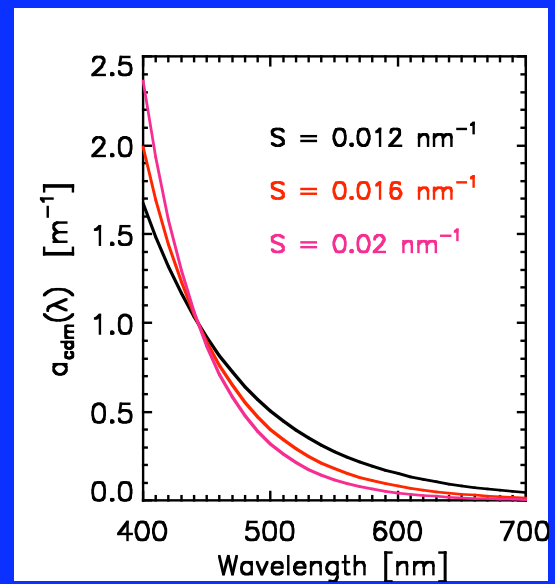
Detritus

$$a_d(\lambda) = a_d(\lambda_0) \exp[S_d (\lambda_0 - \lambda)]$$

Dissolved organic matter

$$a_g(\lambda) = a_g(\lambda_0) \exp[S_g (\lambda_0 - \lambda)]$$

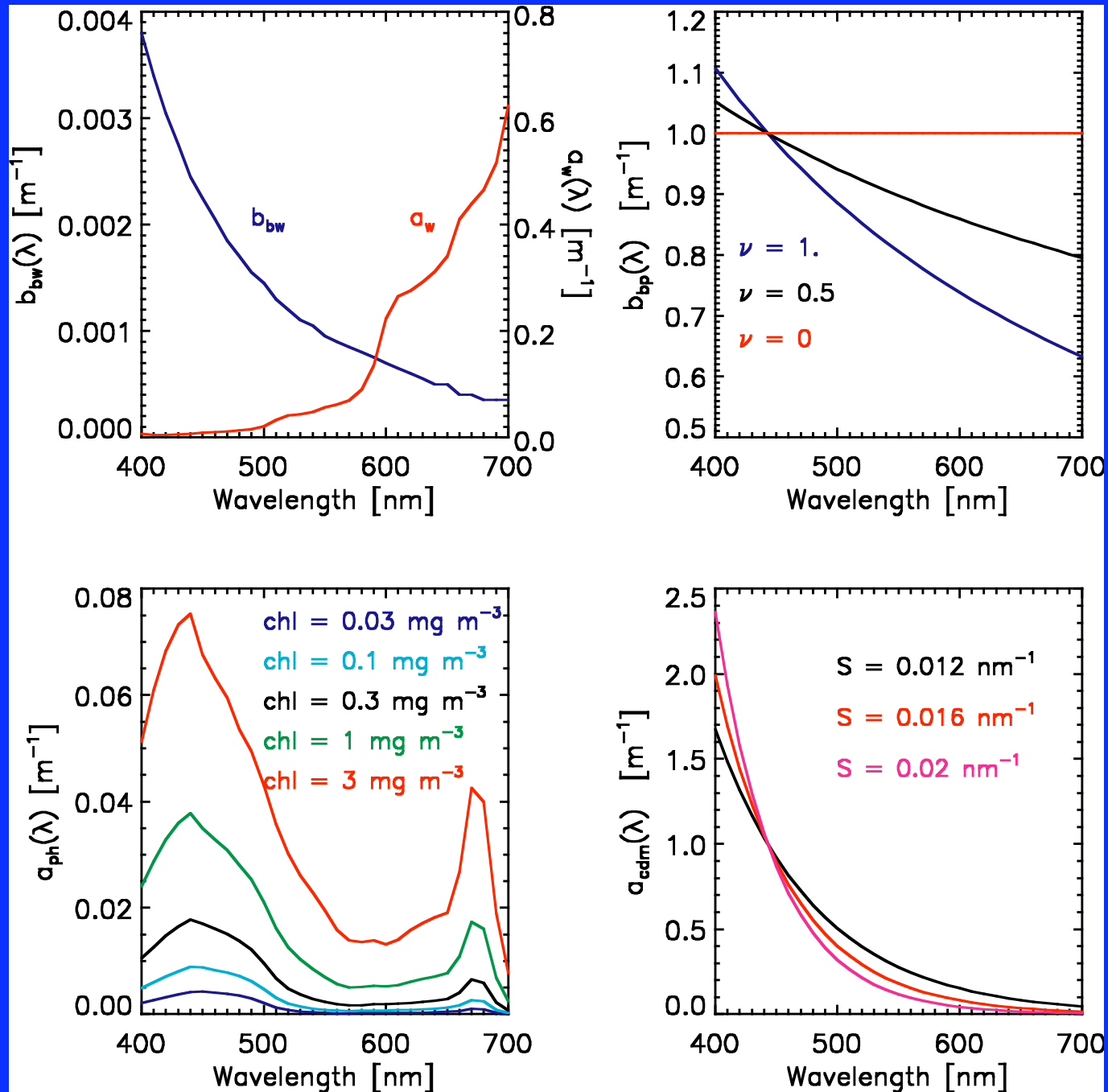
From Stephane Maritorena



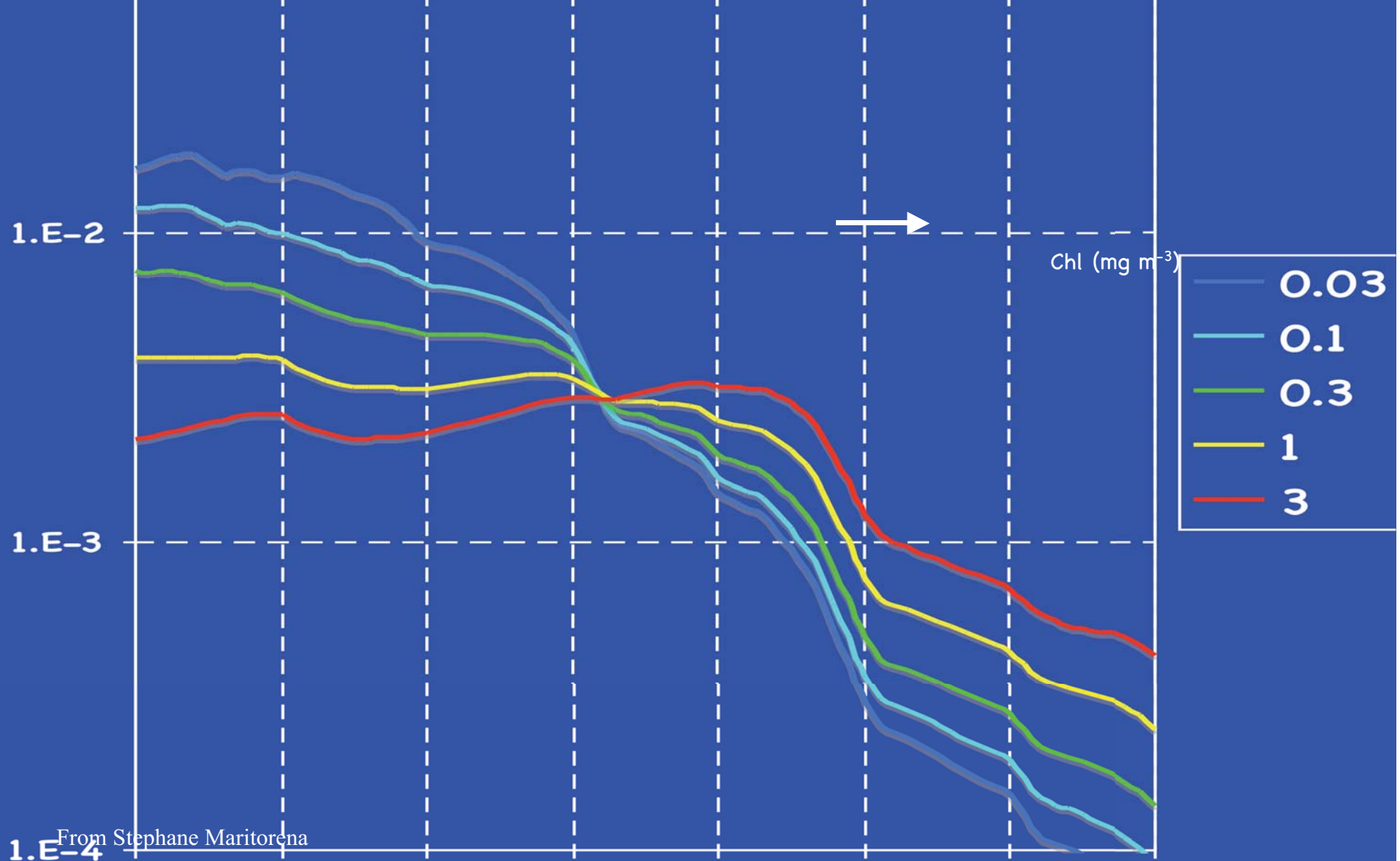
FORWARD SEMI-ANALYTICAL OCEAN COLOR MODELS

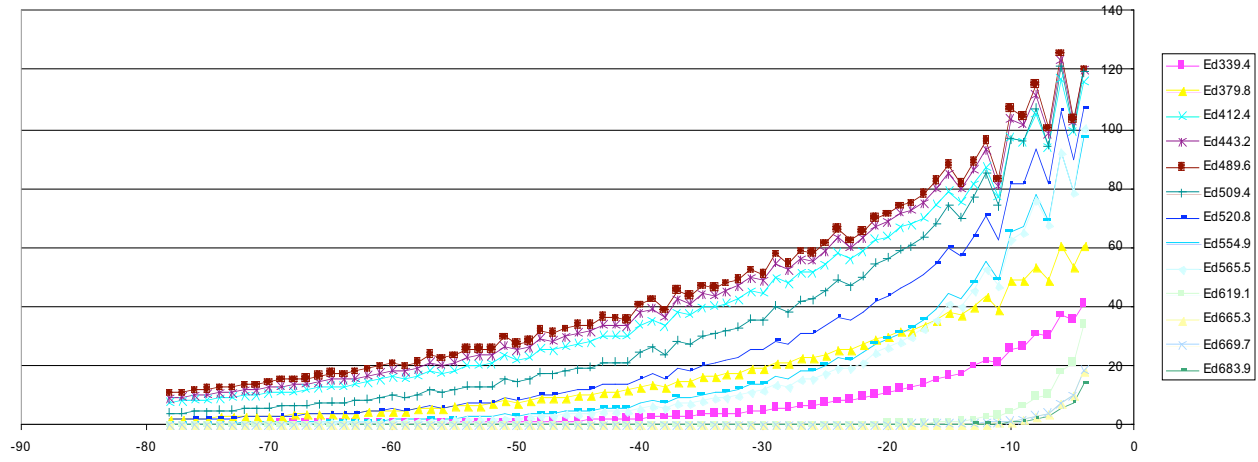
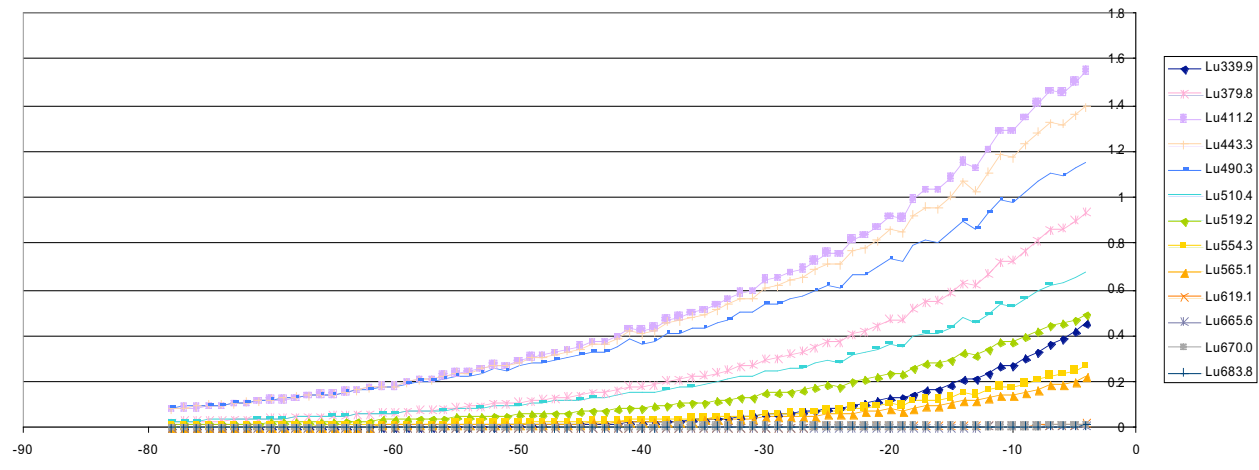
Putting all together,

$$R_{rs}(\lambda) = \frac{t}{n_w^2} \frac{f(\lambda)}{Q(\lambda)} \left(\frac{b_{bw}(\lambda) + b_{bp}(\lambda)}{a_w(\lambda) + a_\varphi(\lambda) + a_d(\lambda) + a_g(\lambda) + b_{bw}(\lambda) + b_{bp}(\lambda)} \right)$$

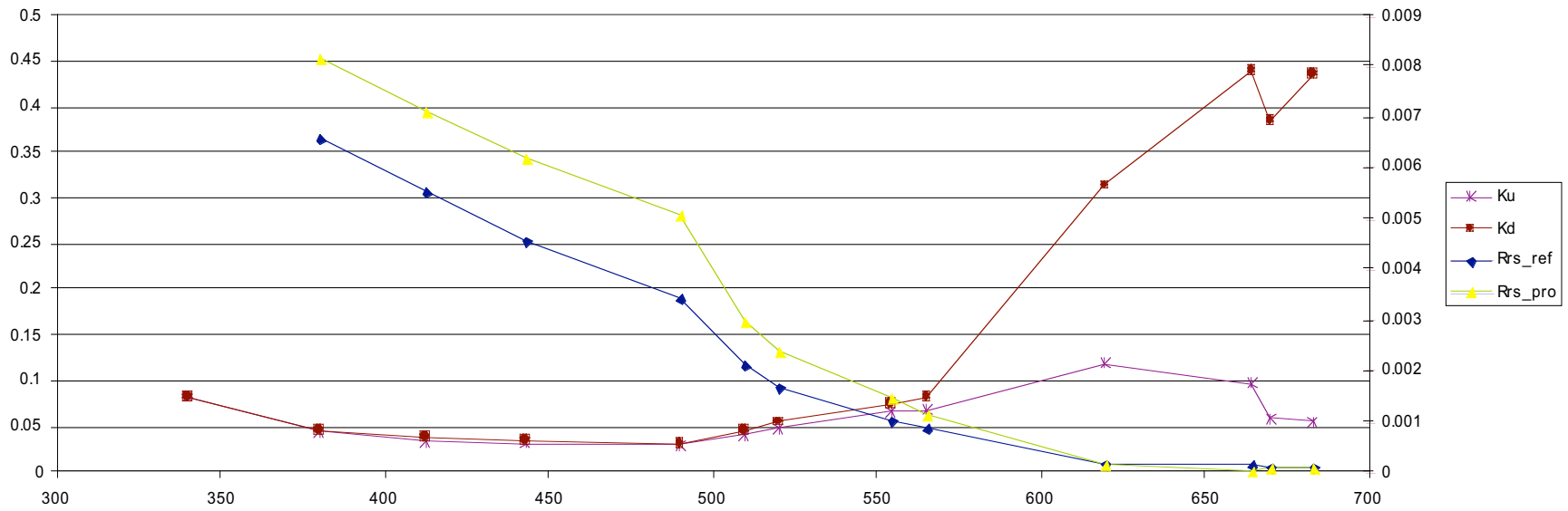


1.E-1
"Historical" forward models (Gordon et al., 1988; Morel, 1988) are chlorophyll-based: Chl $R(\lambda)$

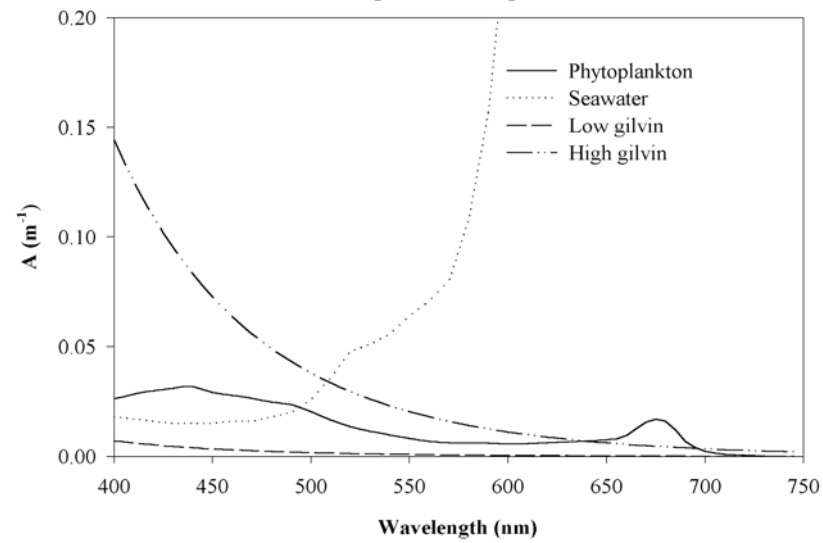




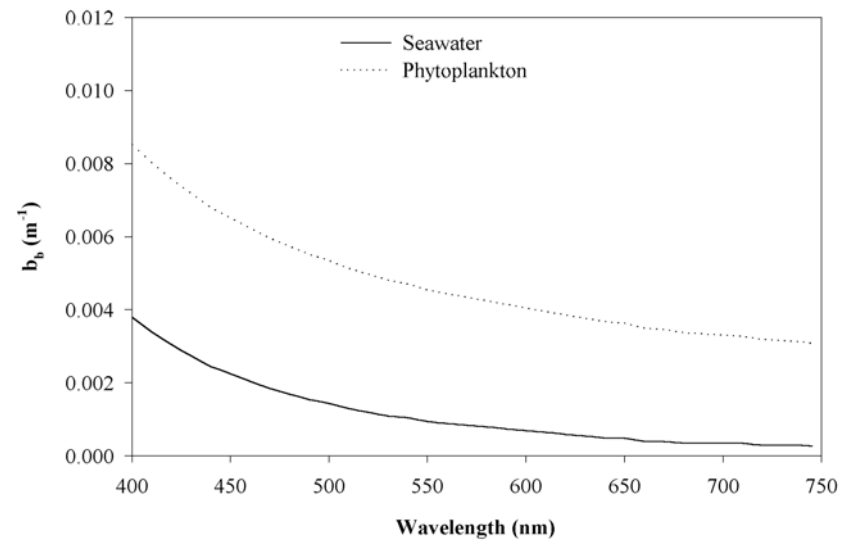
Sta27A JAN01SJ



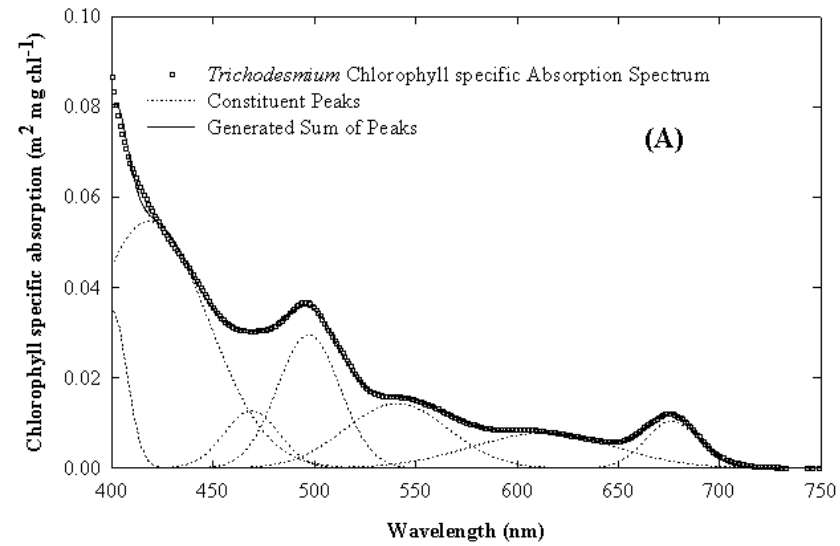
Absorption Components



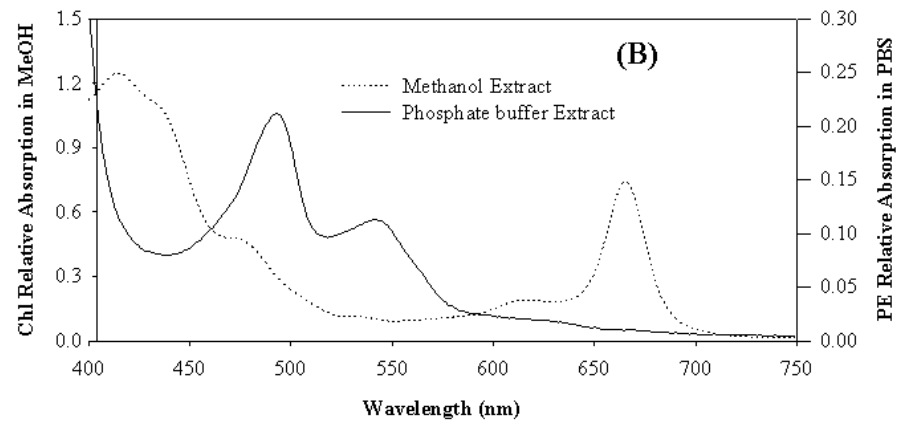
Backscattering Components



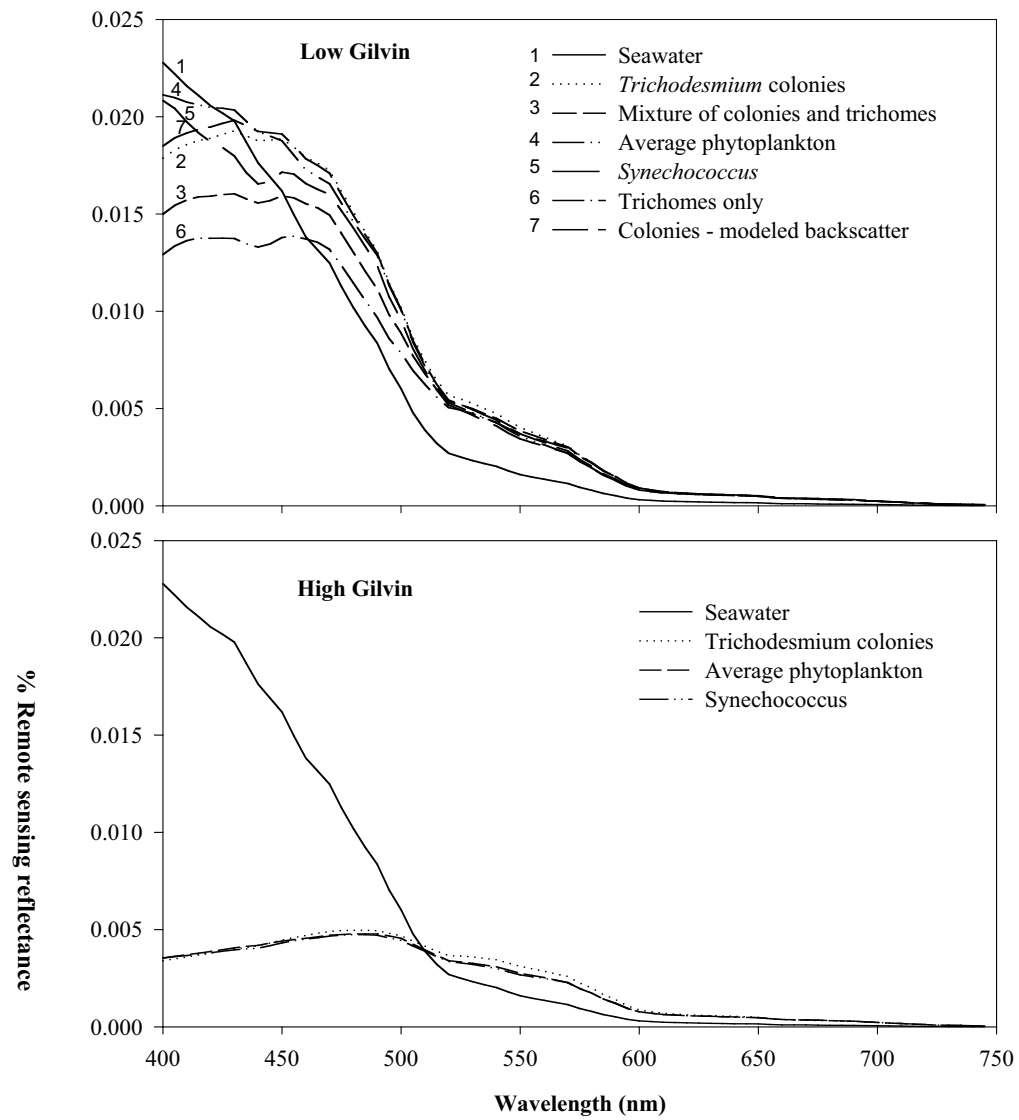
Gaussian Curve Fit to *Trichodesmium*
Chlorophyll Specific Absorption



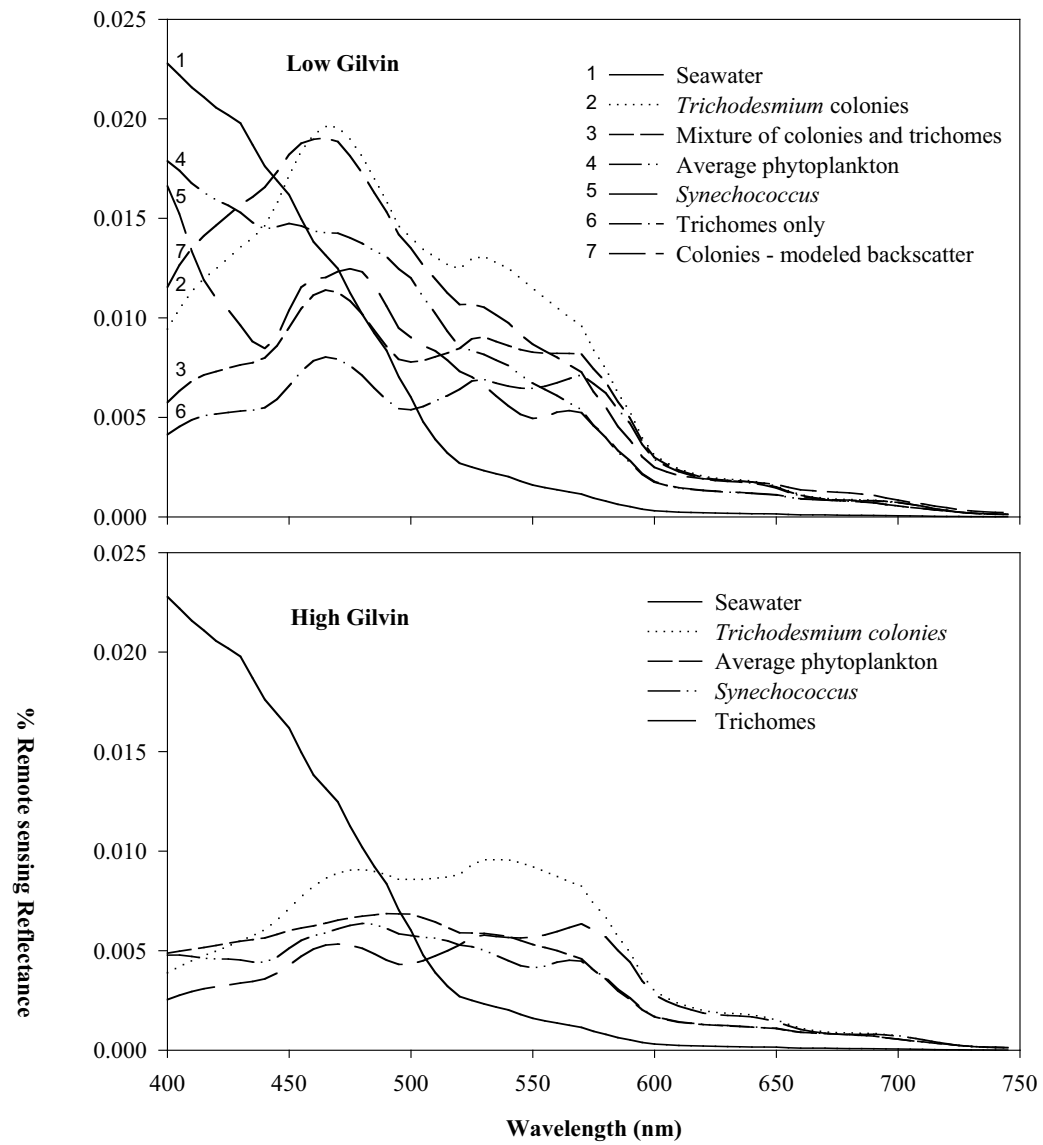
Extracted pigment absorption



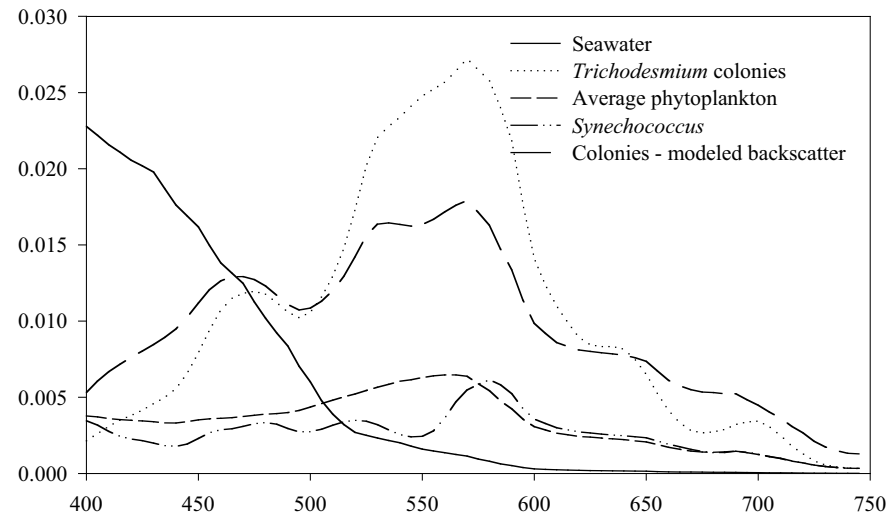
Reflectance model for Chl=0.1 mg/m³



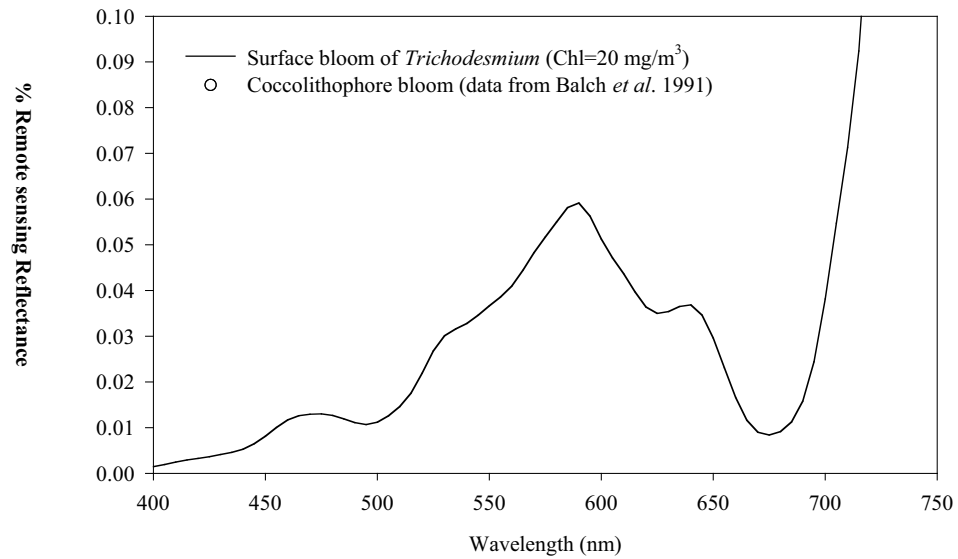
Reflectance Model for Chl=1.0 mg/m³



Reflectance model for Chl=10 mg/m³



Reflectance model for special cases



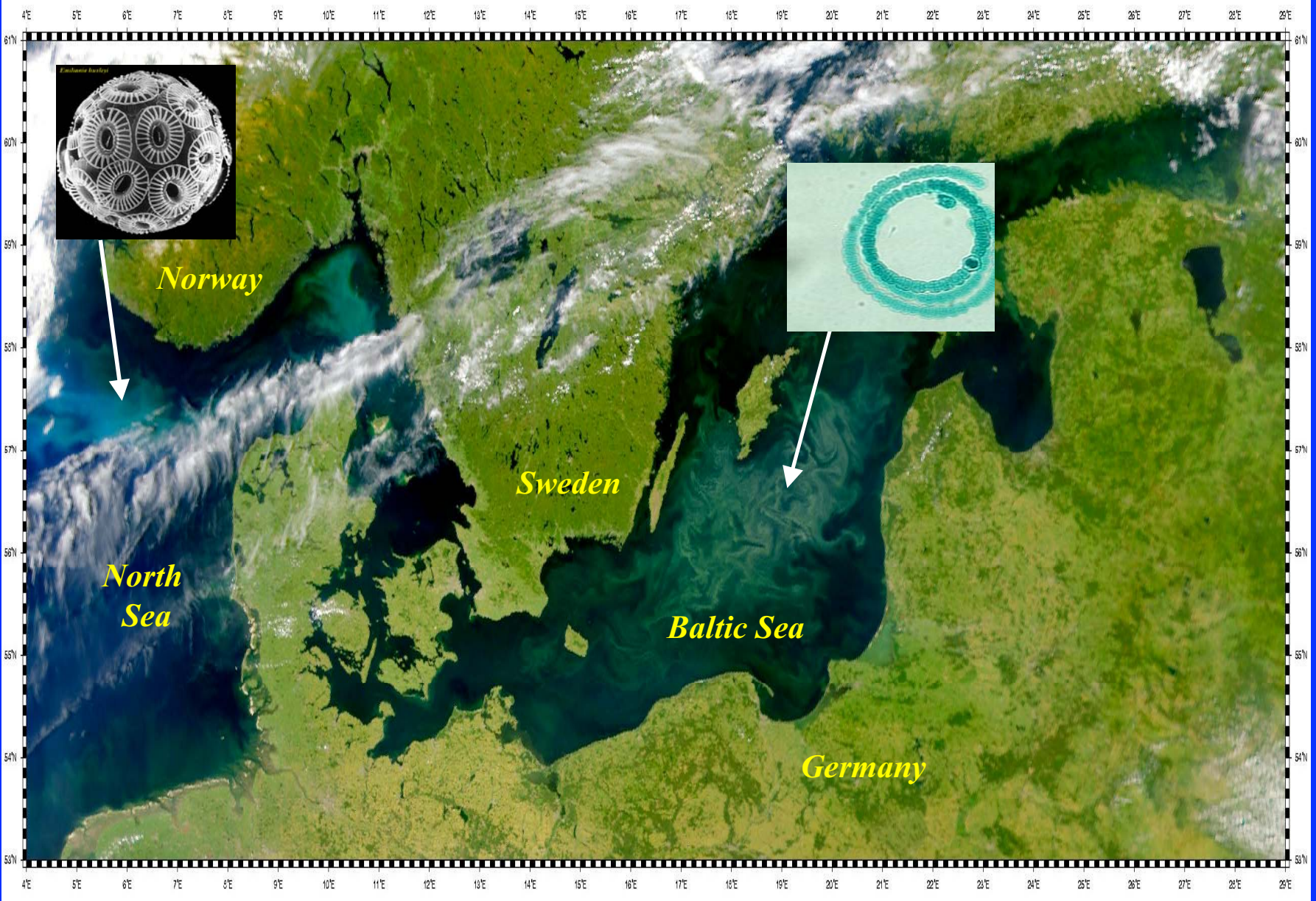
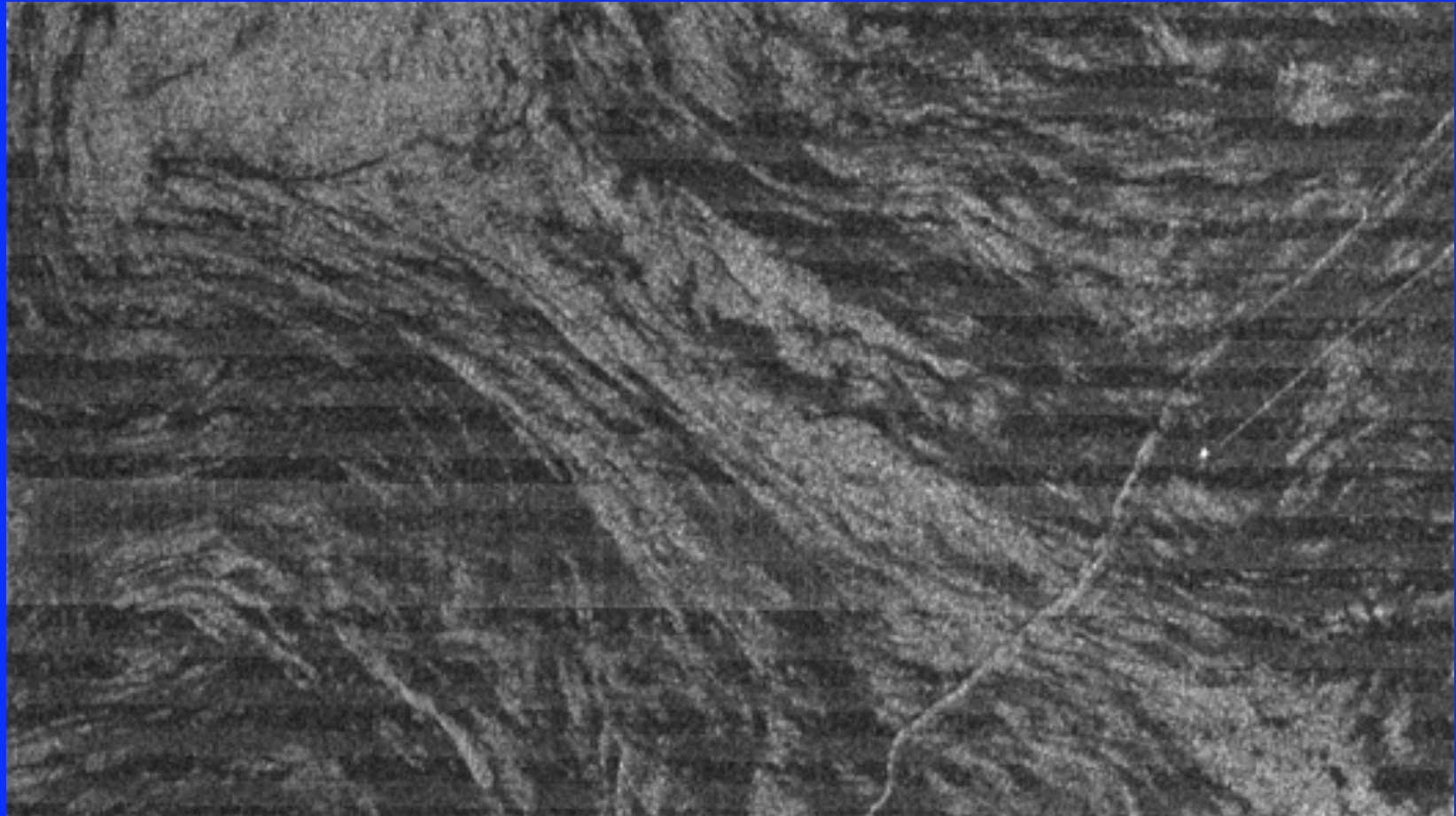


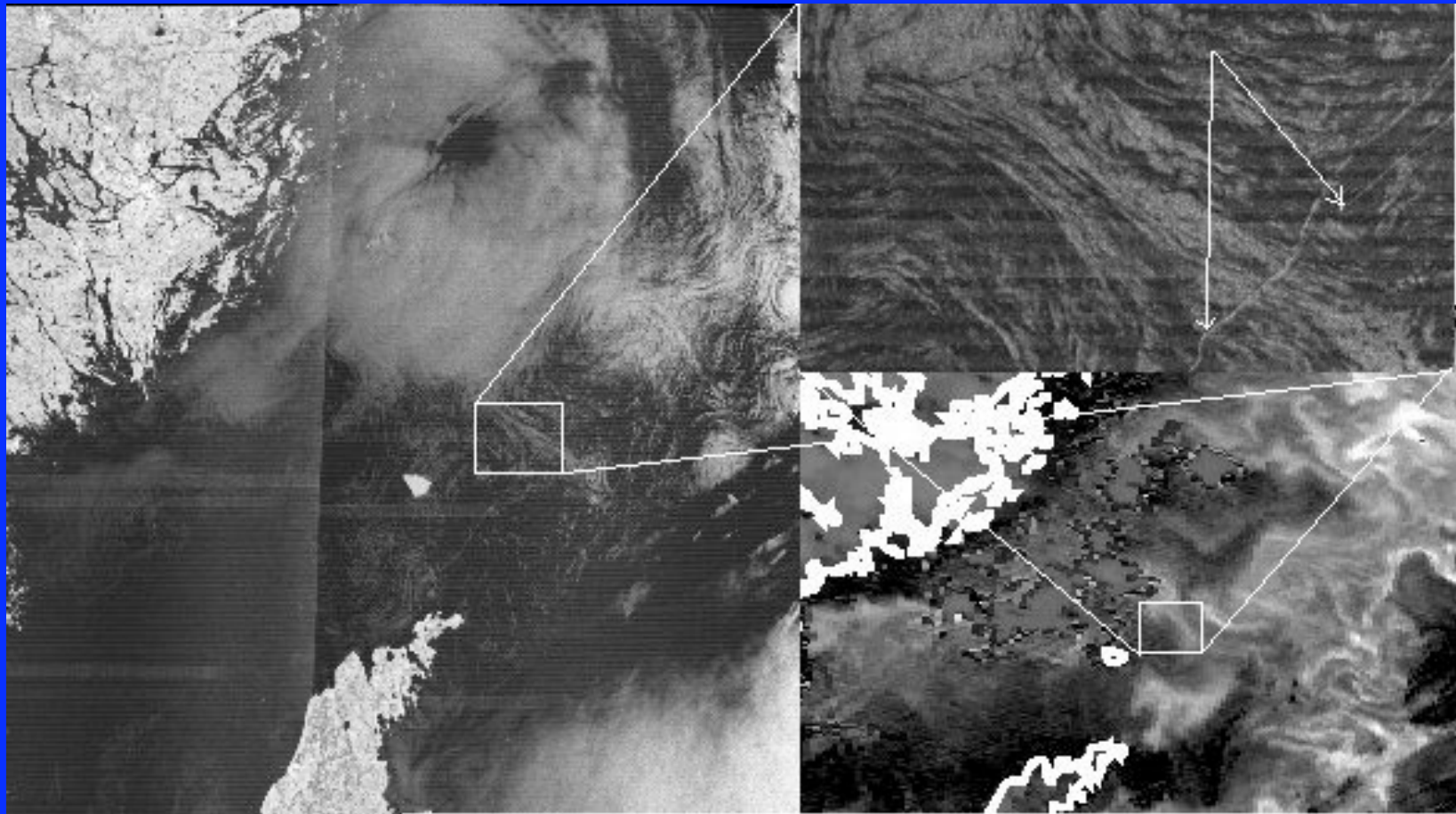


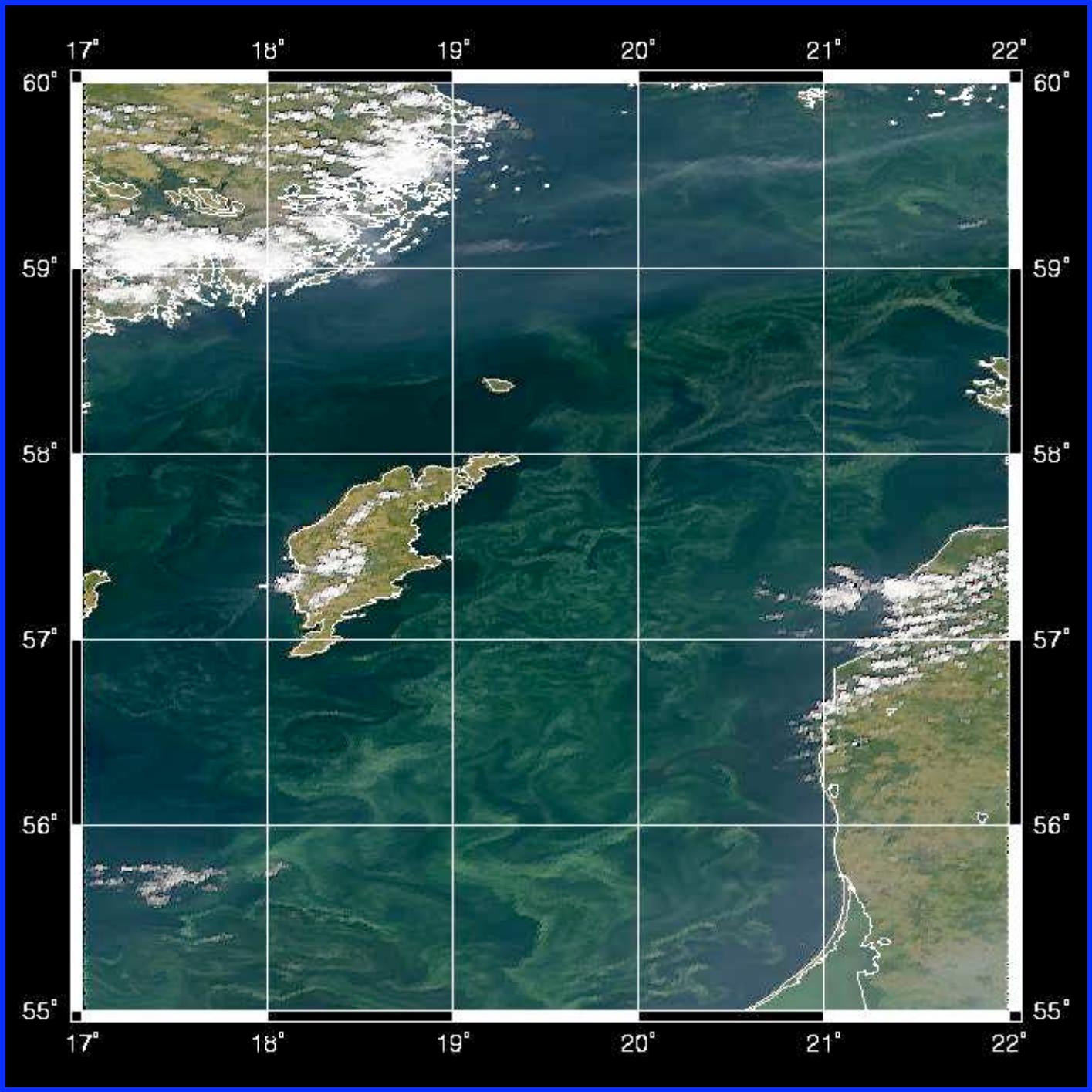
FOTO: KUSTBEVAKNINGSELYGET

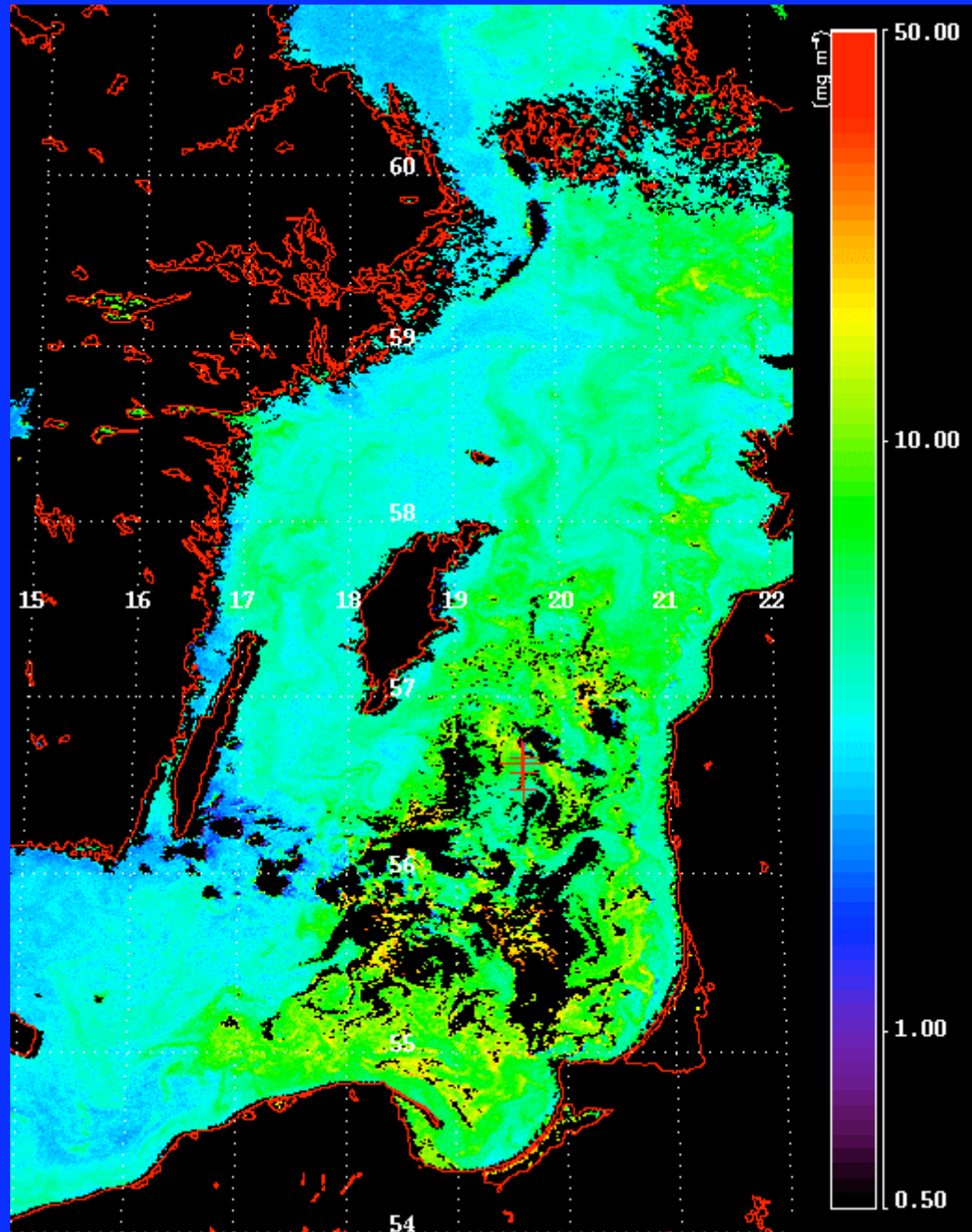
Synthetic Aperture RADAR



SAR Image from 3 August 1999







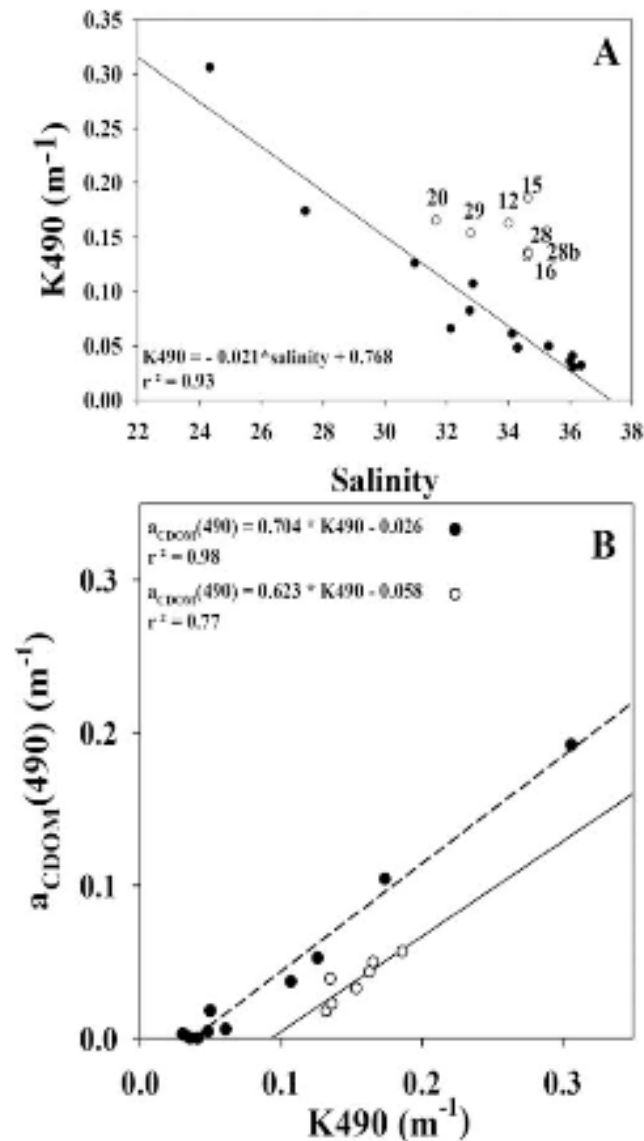


Figure 5. (a) K_{490} to salinity dependence and (b) $a_{\text{CDOM}}(490)$ to K_{490} dependence in the WTNA during May 2003. Solid circles represent the Amazon River plume (Transect A) and offshore waters (Region A and Region B without intense diatoms bloom). Open circles represent stations with intense diatoms bloom (Region B). Numbers refer to stations. Lines represent linear regressions with parameters reported in figure and statistics in Table 1.

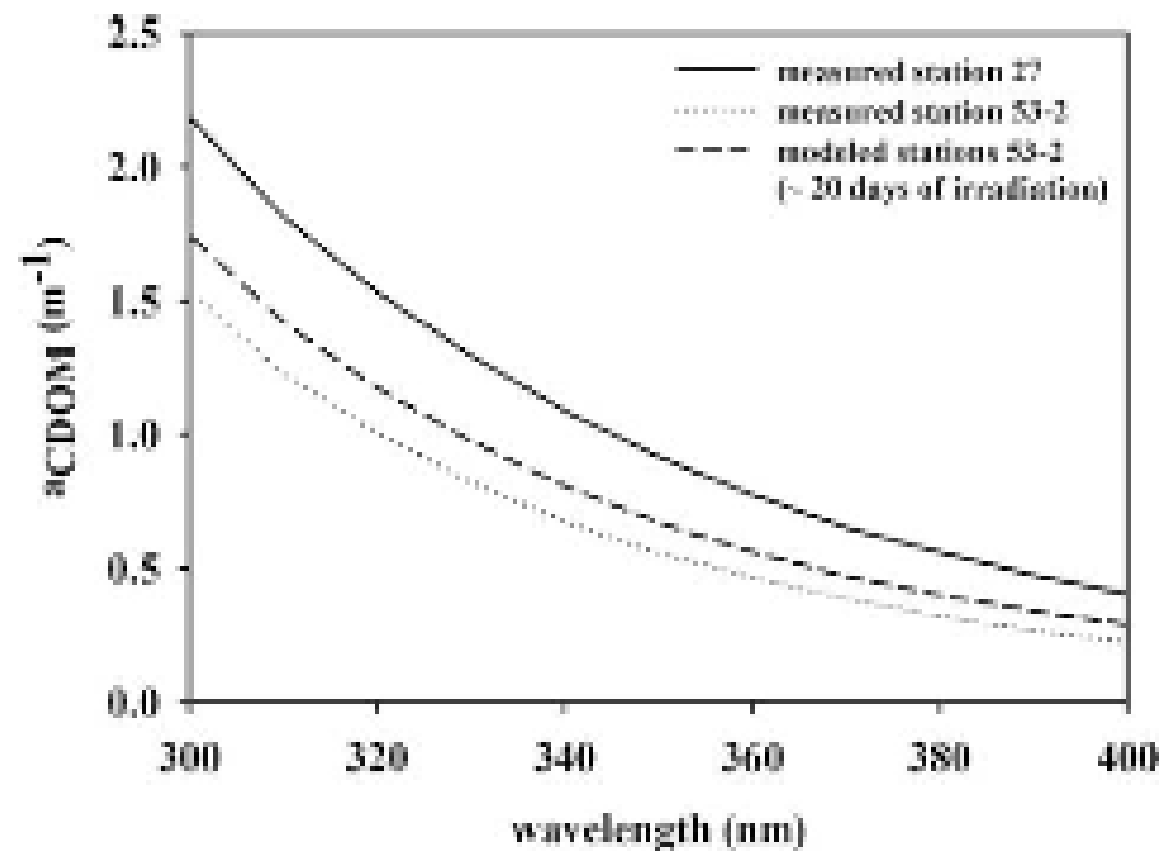
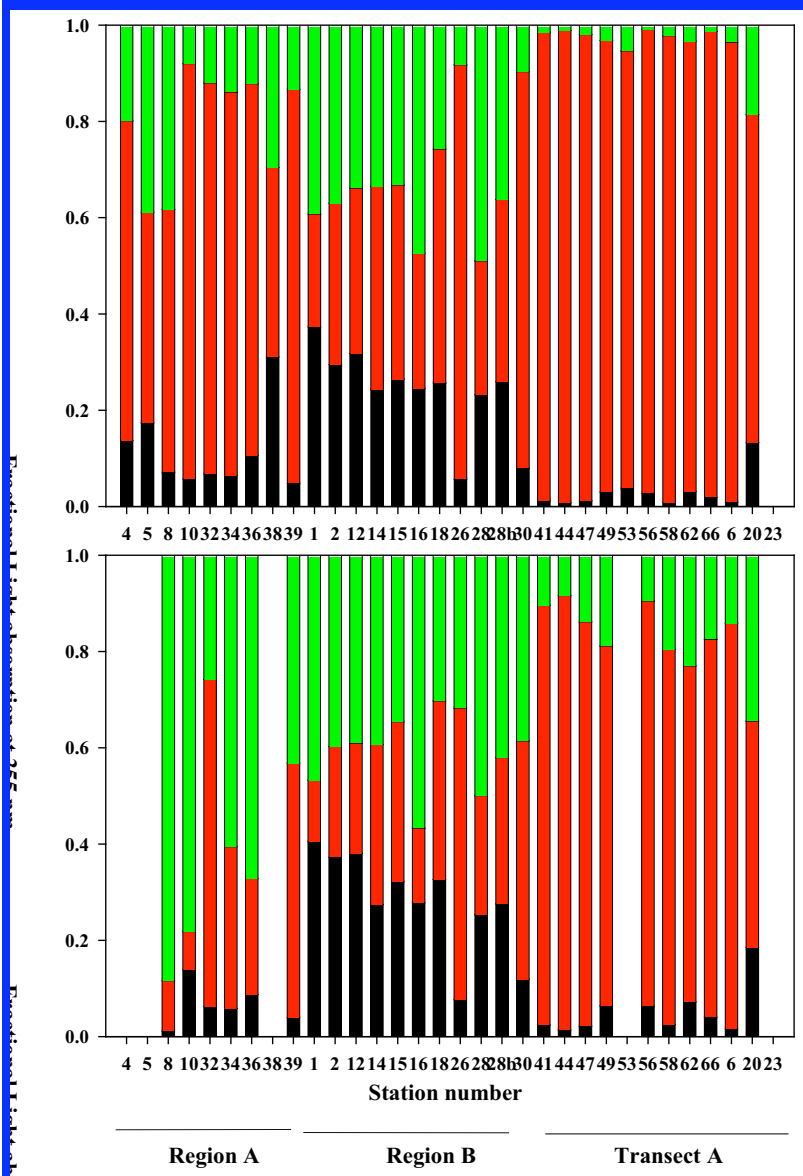


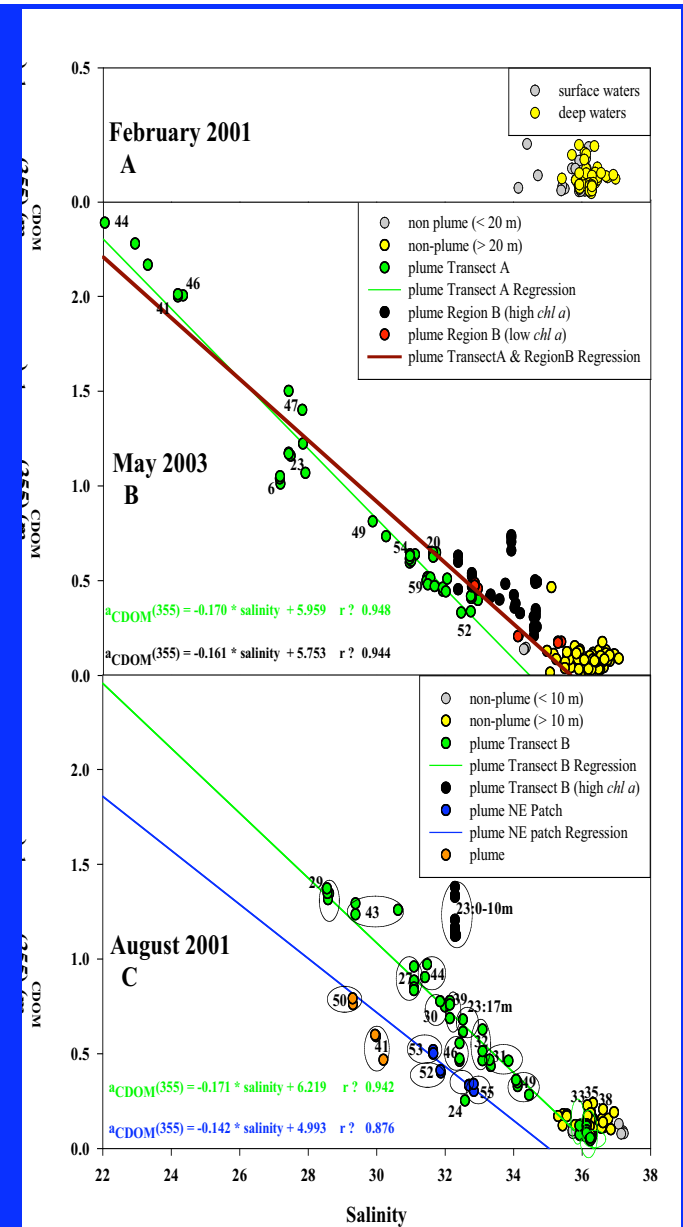
Figure 10. Measured (stations 27 and 53-2) and modeled (after 20 days of light exposure) a_{CDOM} during August 2001 in the WTNA.

Del Vecchio, R. and A. Subramaniam (2004) Influence of the Amazon River on the surface optical properties of the Western Tropical North Atlantic Ocean. *Journal of Geophysical Research*. 109, C11001, doi:10.1029/2004JC002503

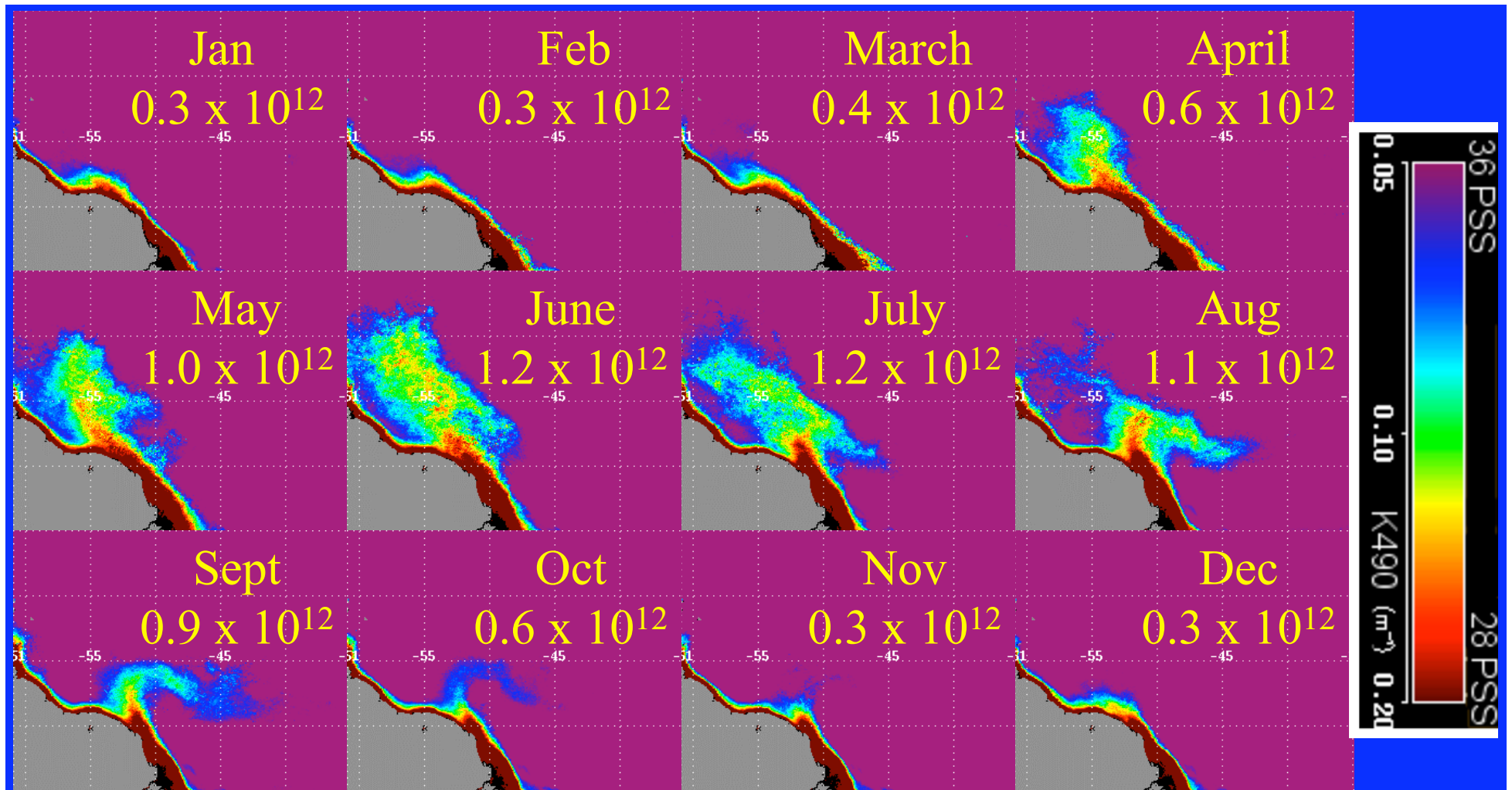


offshore out-of-plume offshore in-plume closer to shore in-plume

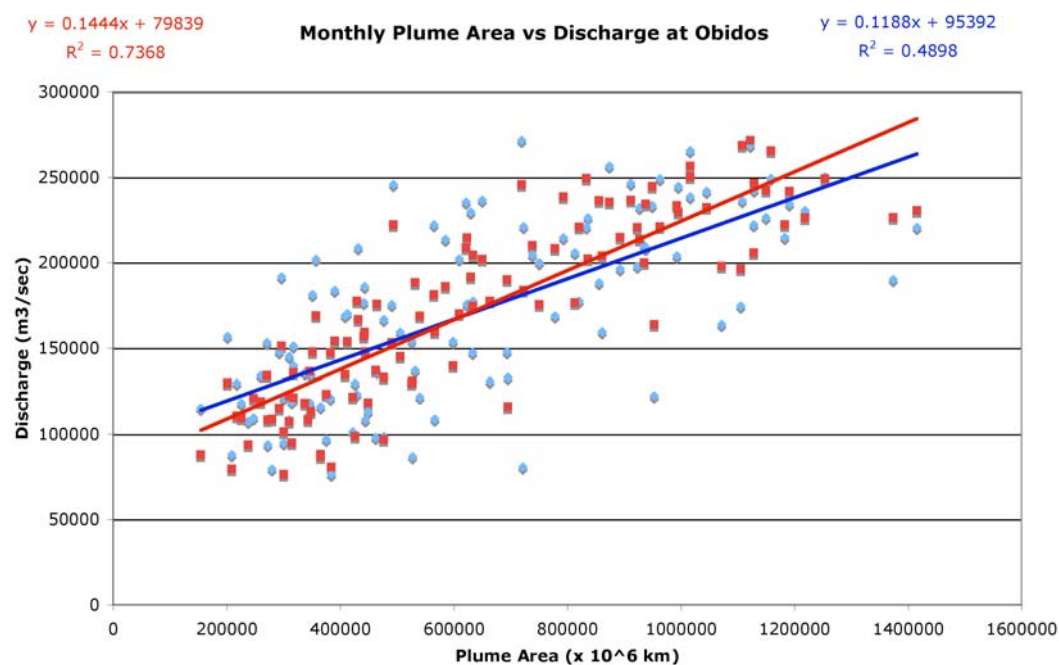
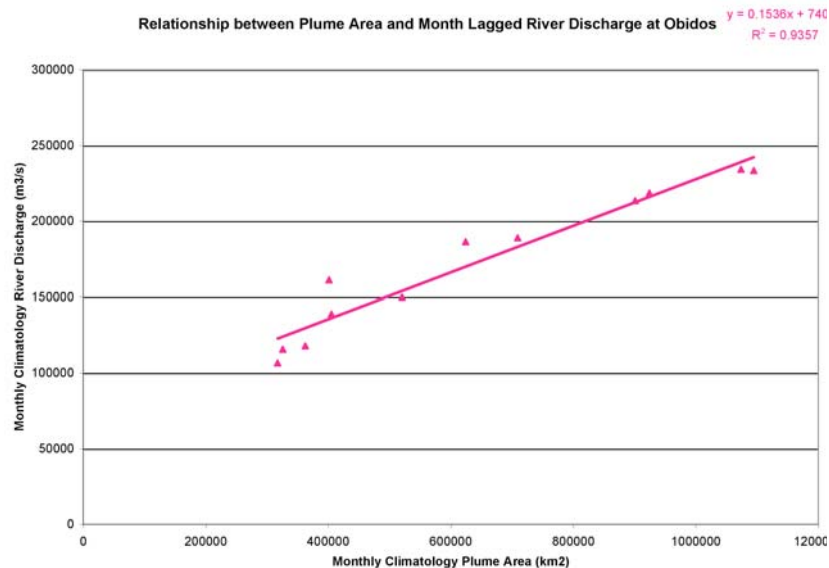
CDOM absorption coefficient at 355 nm [$a_{CDOM}(355)] (m^{-1})$ to salinity dependence for waters from the WTNA. Numbers refer to stations.



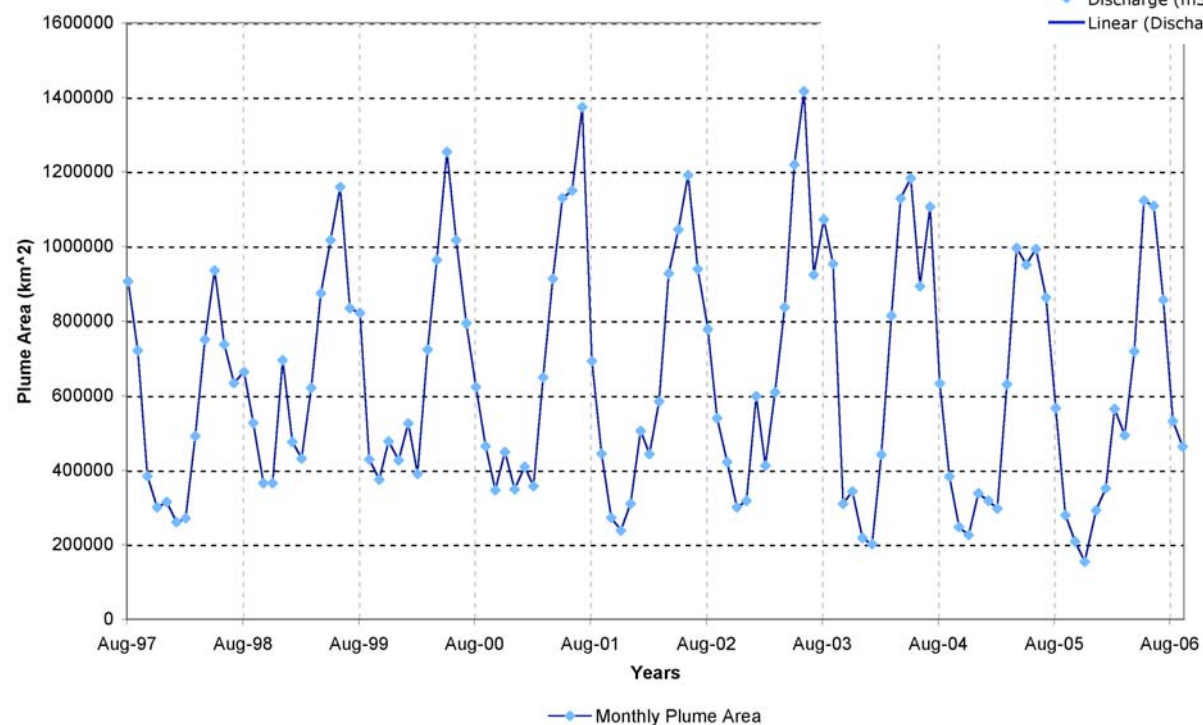
Del Vecchio, R. and A. Subramaniam (2004) Influence of the Amazon River on the surface optical properties of the Western Tropical North Atlantic Ocean. Journal of Geophysical Research. 109, C11001, doi:10.1029/2004JC002503



f_{river} for the Amazon calculated using the technique of Muller-Karger et al 1989 was 0.03 for the plume implying that N had to be recycled 39 times to meet the measured primary production demand.



Amazon River Plume Area
Sept. 1997- Oct. 2006



Amazon River Discharge and Climate Variability: 1903 to 1985

JEFFREY E. RICHEY, CARLOS NOBRE, CLARA DESER

Reconstruction of an 83-year record (1903 to 1985) of the discharge of the Amazon River shows that there has been no statistically significant change in discharge over the period of record and that the predominant interannual variability occurs on the 2- to 3-year time scale. Oscillations of river discharge predate significant human influences in the Amazon basin and reflect both extrabasinal and local factors. Cross-spectrum

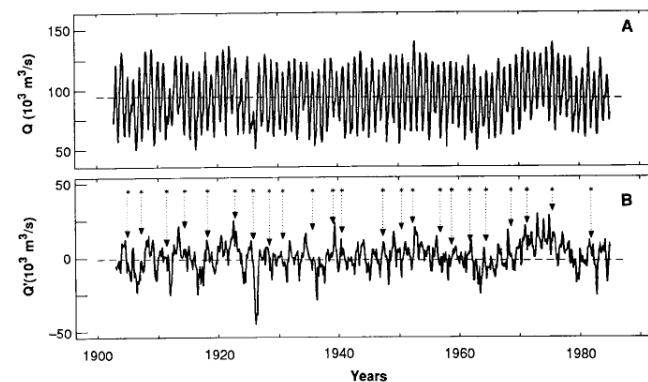


Fig. 2. Discharge of the Amazon River at Manacapuru; (A) discharge time series, 1903 to 1985; (B) deseasonalized Q' hydrograph, 1903 to 1985. Arrows indicate occurrence of ENSO events.

Amazon Annual Hydrological Cycle

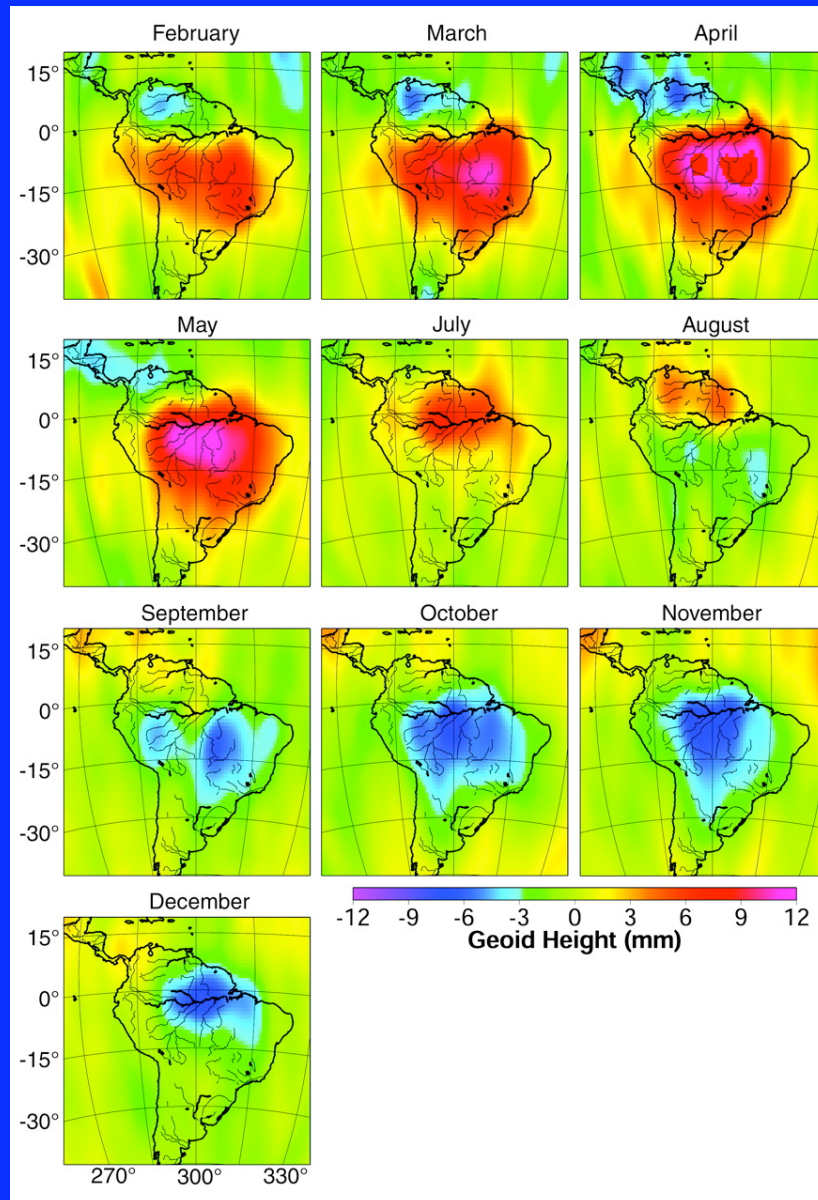
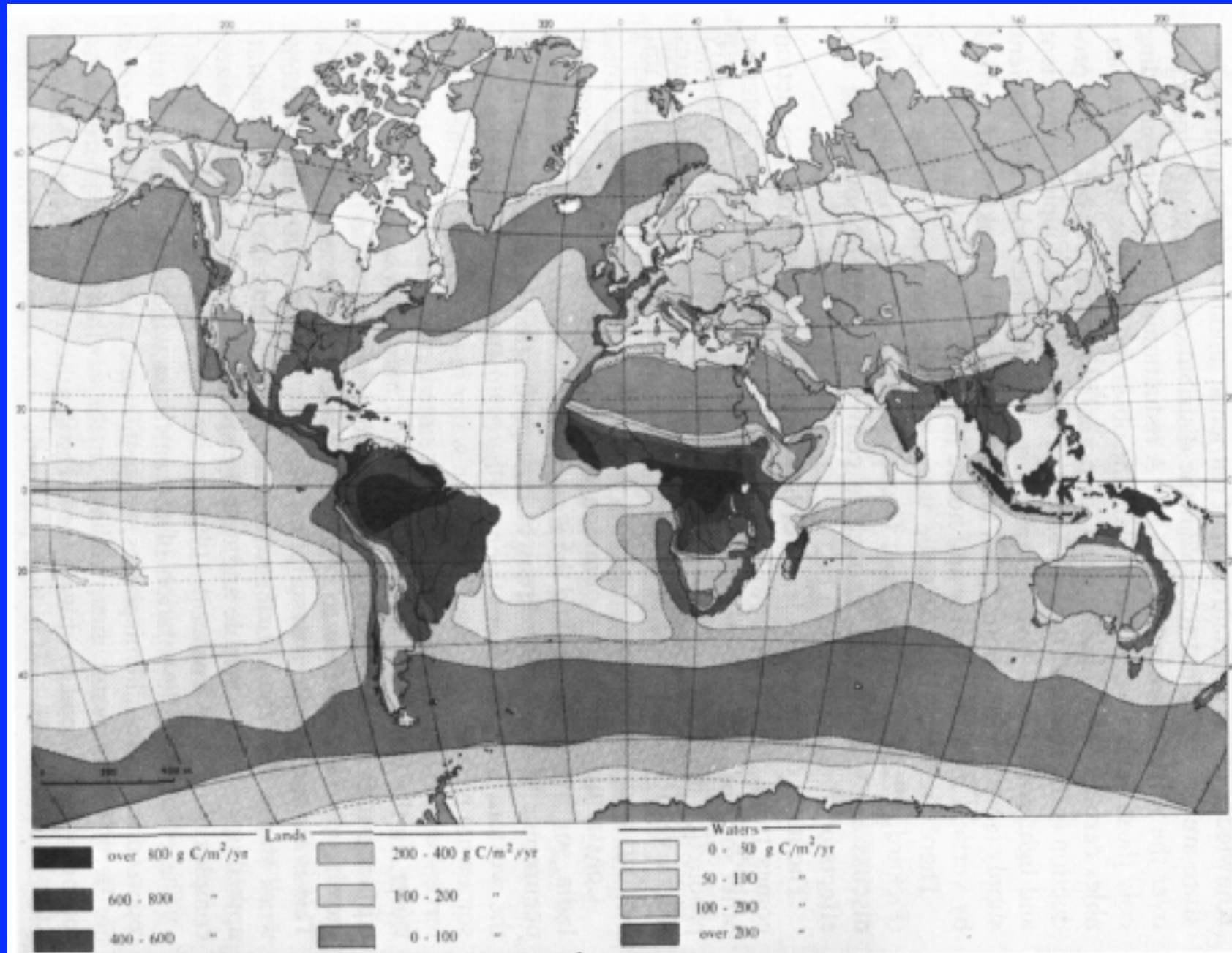


Fig. 2. From Tapley et al 2004 Science

Geoid height differences between each 2003 monthly gravity solution and the 14 month mean for equatorial South America (smoothing radius 400 km; degree-2 coefficients not included). This level of smoothing admits more error from the GRACE estimates, but the large signal in this region allows a higher resolution. Spacecraft events resulted in insufficient ground coverage to resolve the gravity field for the months of January and June.



From Lieth (1975)

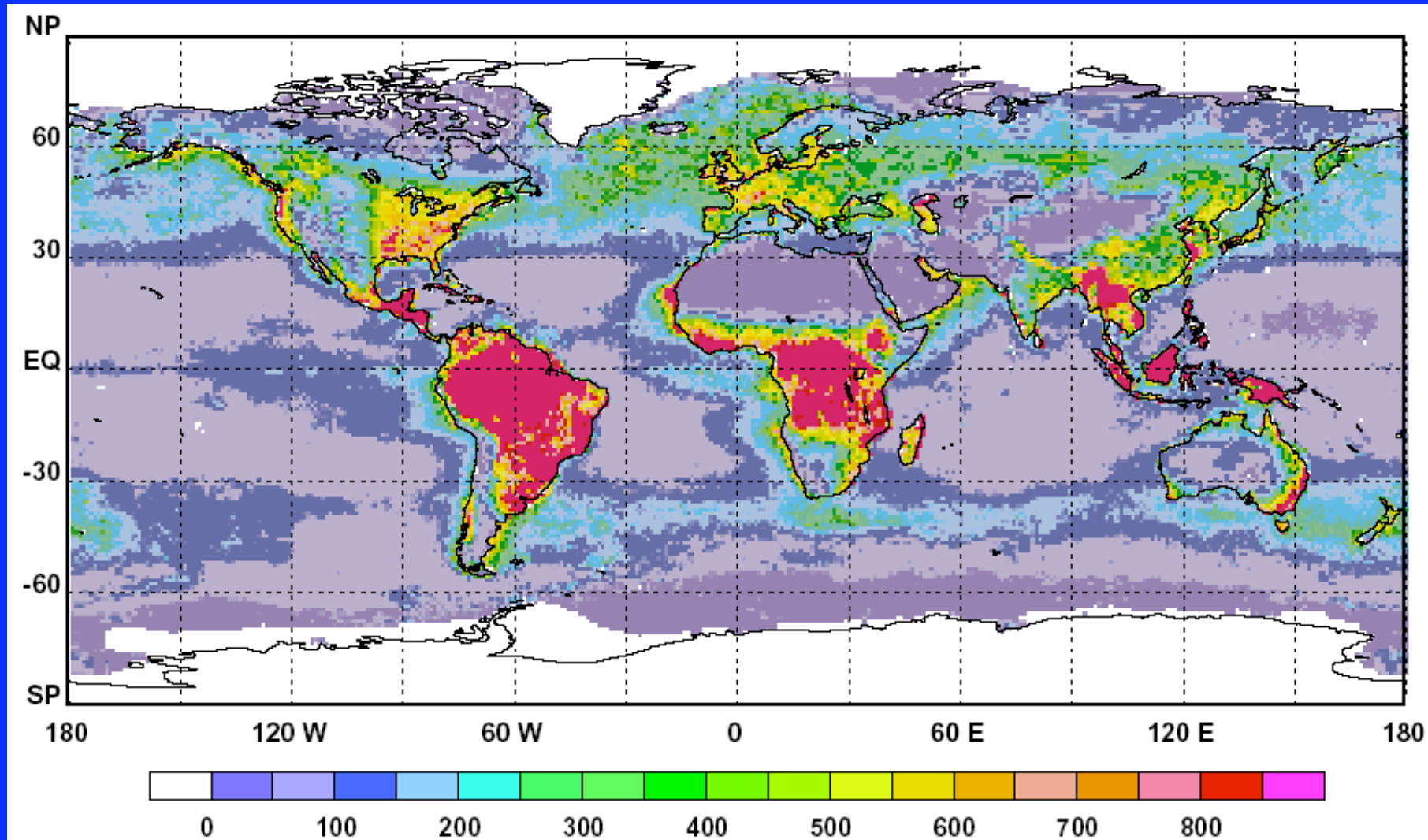
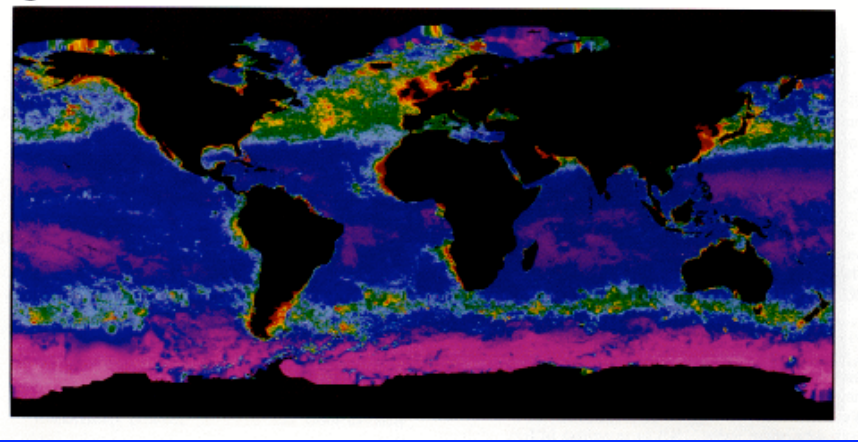
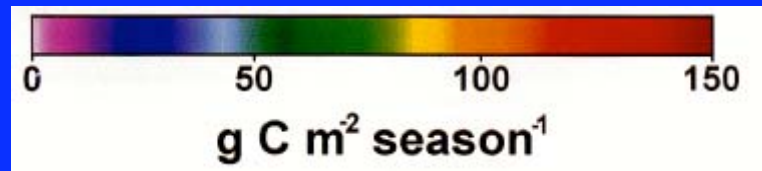
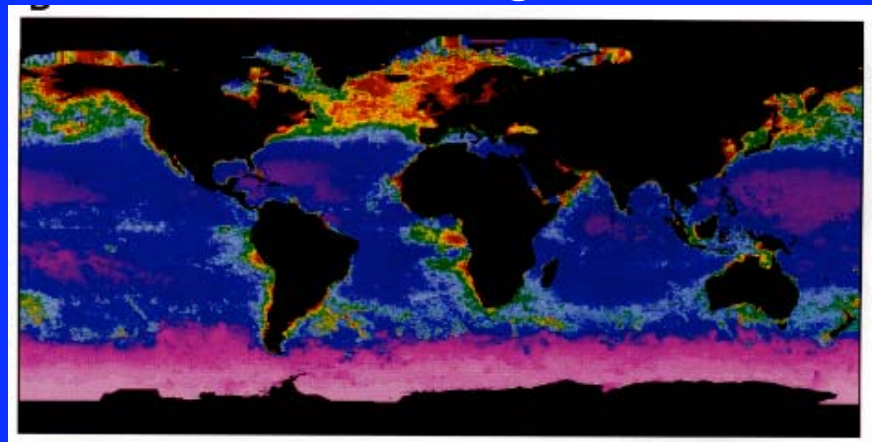


Fig. 1. Global annual NPP (in grams of C per square meter per year) for the biosphere, calculated from the integrated CASA-VGPM model. The spatial resolution of the calculations is $1^\circ \times 1^\circ$ for land and $1/6^\circ \times 1/6^\circ$ for the oceans. Input data for ocean color from the CZCS sensor are averages from 1978 to 1983. The land vegetation index from the AVHRR sensors is the average from 1982 to 1990. Global NPP is $104.9 \text{ Pg of C year}^{-1}$ ($104.9 \times 10^{15} \text{ g of C year}^{-1}$), with 46.2% contributed by the oceans and 53.8% contributed by the land.

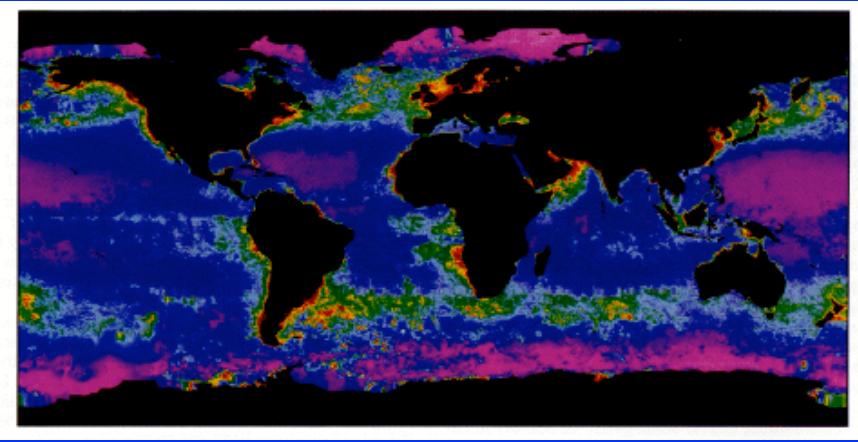
Mar-May



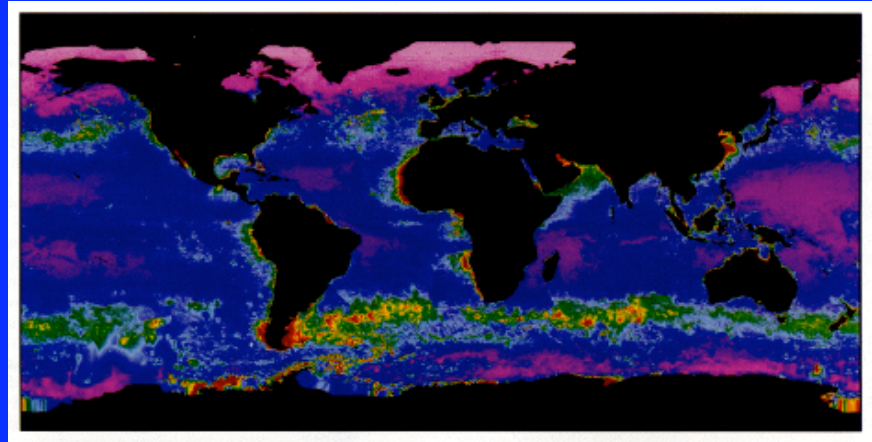
Jun-Aug



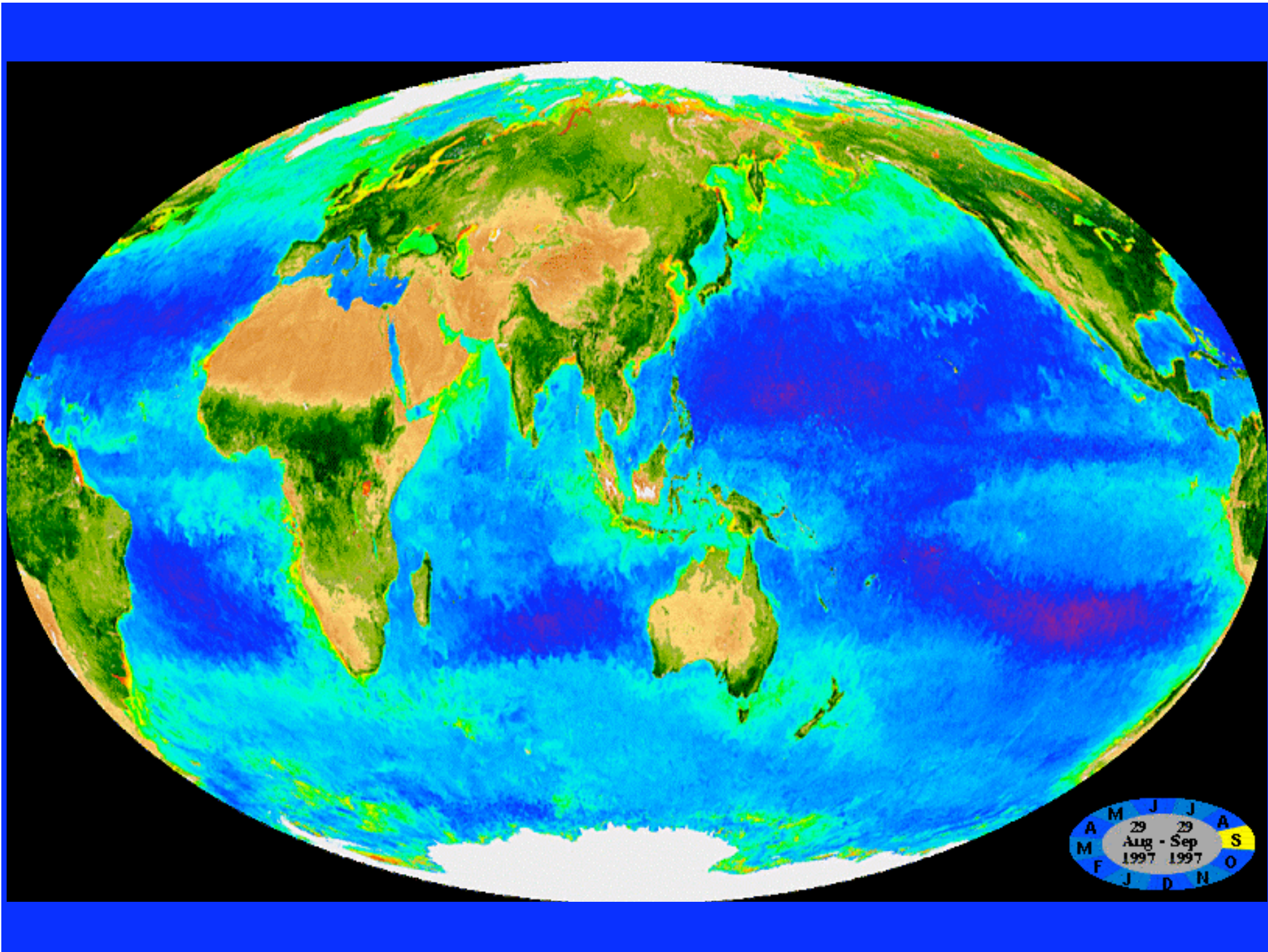
From Behrenfeld and Falkowski 1997, L&O



Sep-Nov



Dec-Feb



Some useful website sites for more information on ocean color remote sensing:

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

<http://oceancolor.gsfc.nasa.gov/gallery.html>

<http://visibleearth.nasa.gov/cgi-bin/results?st=1&page=36&th=905&query=seawifs>

For the animations go to:

http://www.gsfc.nasa.gov/topstory/20010327colors_of_life.html

<http://svs.gsfc.nasa.gov/search/InstrumentsDatasets/SeaStar-SeaWiFS.html>