

→ EARTH OBSERVATION SUMMER SCHOOL

Earth System Monitoring & Modelling

30 July–10 August 2018 | ESA–ESRIN | Frascati (Rome) Italy

Ocean Colour theory

Bob Brewin^{1,2}

¹ Plymouth Marine Laboratory (PML), Prospect Place, The Hoe, Plymouth PL1 3DH, UK

² National Centre for Earth Observation, PML, Plymouth PL1 3DH, UK



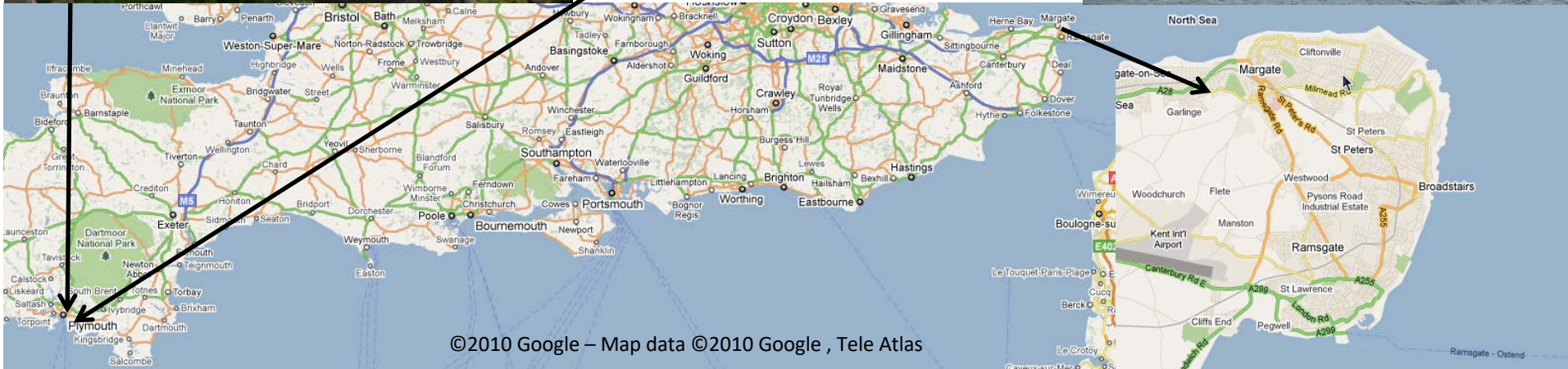
PML | Plymouth Marine Laboratory

A bit about myself



PML | Plymouth Marine Laboratory

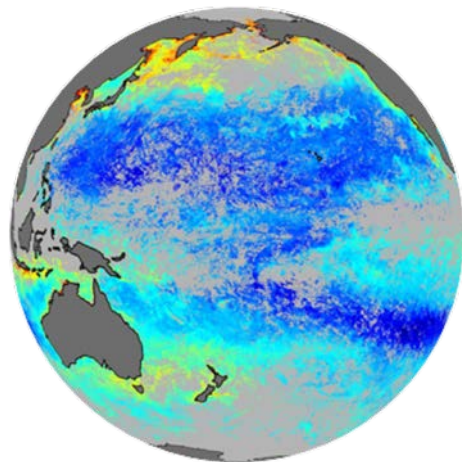
University of Plymouth
BSc Surf Science and Technology
MSc Applied Marine Science
PhD Marine Remote Sensing



A bit about myself



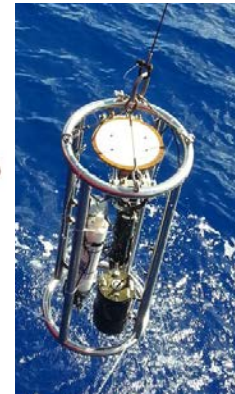
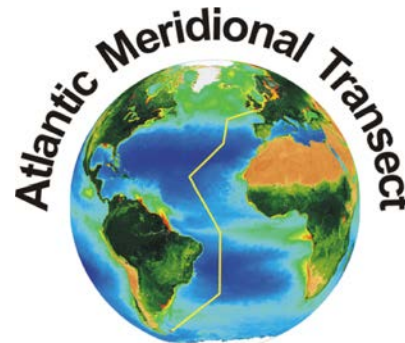
Remote sensing



**National Centre for
Earth Observation**

NATURAL ENVIRONMENT RESEARCH COUNCIL

Field work



Citizen Science

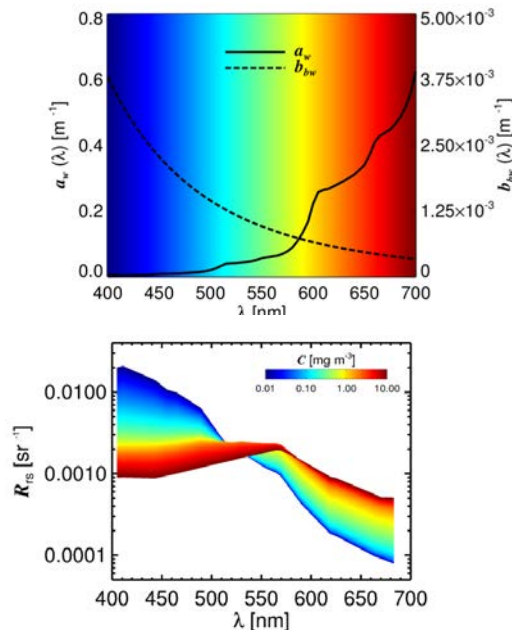


Overview of ocean colour lectures



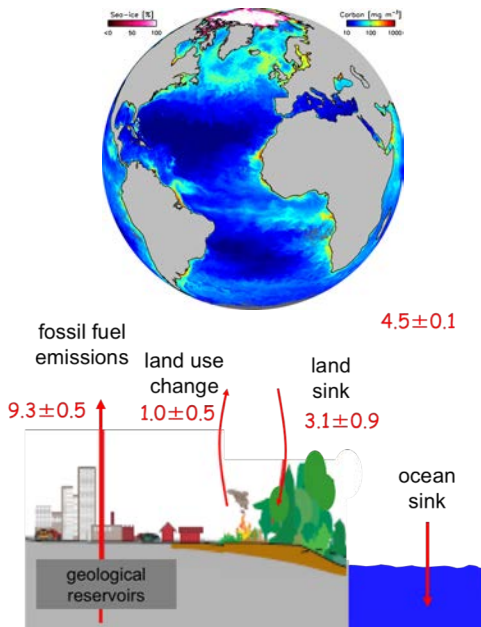
Ocean Colour theory

11:30 -12:30 1st August



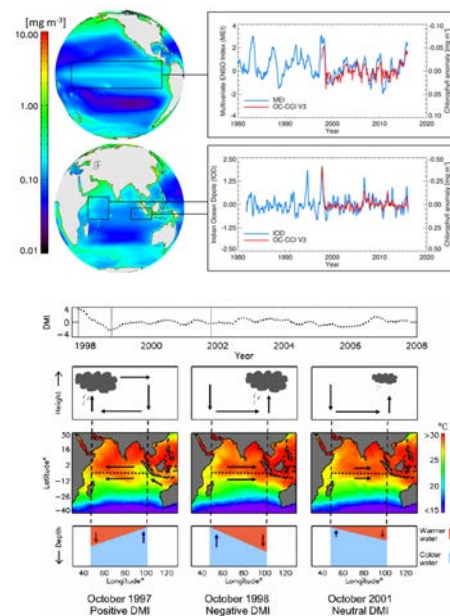
Ocean Colour and the marine carbon cycle

12:30 -13:30 2nd August



Ocean Colour and climate

11:30 -12:30 3rd August



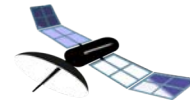
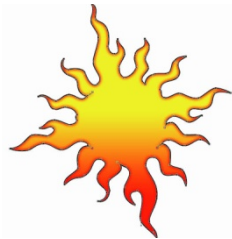
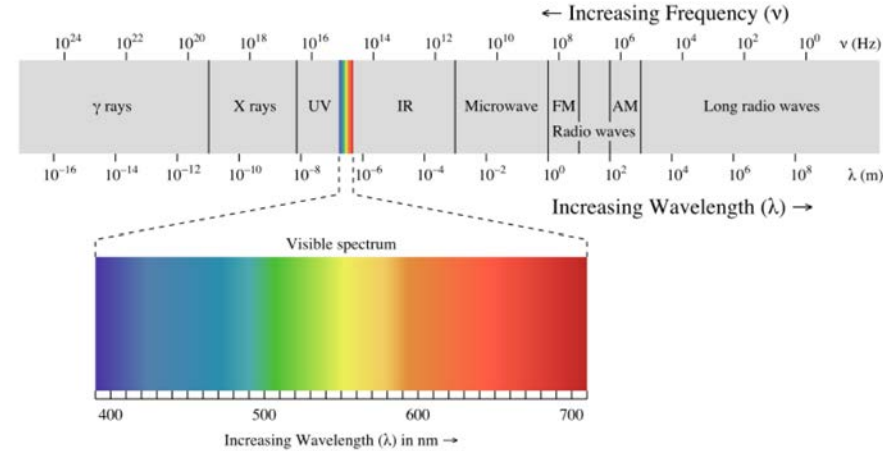
- 1) What is ocean colour
- 2) History of ocean colour
- 3) Optical properties of water and its constituents
- 4) In situ measurements of ocean colour
- 5) Satellite remote-sensing of ocean colour

What is ocean colour



The interaction of incident visible light with sea water.

Sunlight that enters the ocean is absorbed, scattered and reflected by seawater and the constituents that make up the seawater. These processes vary with wavelength of light. Spectral variations in the reflected light determine the colour of the ocean.



Ocean Colour

History of ocean colour



Albert
Bierstadt

Farrallon
Island

1887



Emil
Nolde

Sea with
Red Sun

Undated
(1867-1956)

Ivan
Aivazovsky

American
Shipping
off the
Rock of
Gibraltar

1873



Ivan
Aivazovsky

Bracing the
Waves

1890

The foureteenth, in the morning, was calme with fogge. At nine, the wind at east, a small gale with thicke fogge; wee steered south-east and by east, and running this course we found our greene sea againe, which by prooffe we found to be freest from ice, and our azure blue sea to be our ice sea. At this time we had more birds then we usually found.

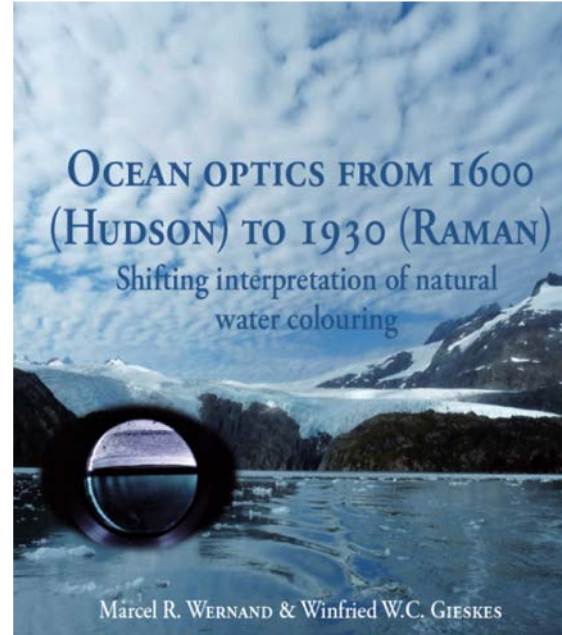
H. Hudson, First voyage, 1607

The colour of the Greenland Sea varies from ultramarine blue to olive green, and from the most pure transparency to striking opacity. These appearances are not transitory, but permanent; not depending on the state of the weather, but on the quality of the water.

W. Scoresby, 1820

Change in sea colour used in early navigation

- change in bottom topography
- presence of ice bergs
- river discharge
- occurrence of fish



POSEIDON'S PAINTBOX

HISTORICAL ARCHIVES OF OCEAN COLOUR IN GLOBAL-CHANGE
PERSPECTIVE

Marcel Robert Wernand

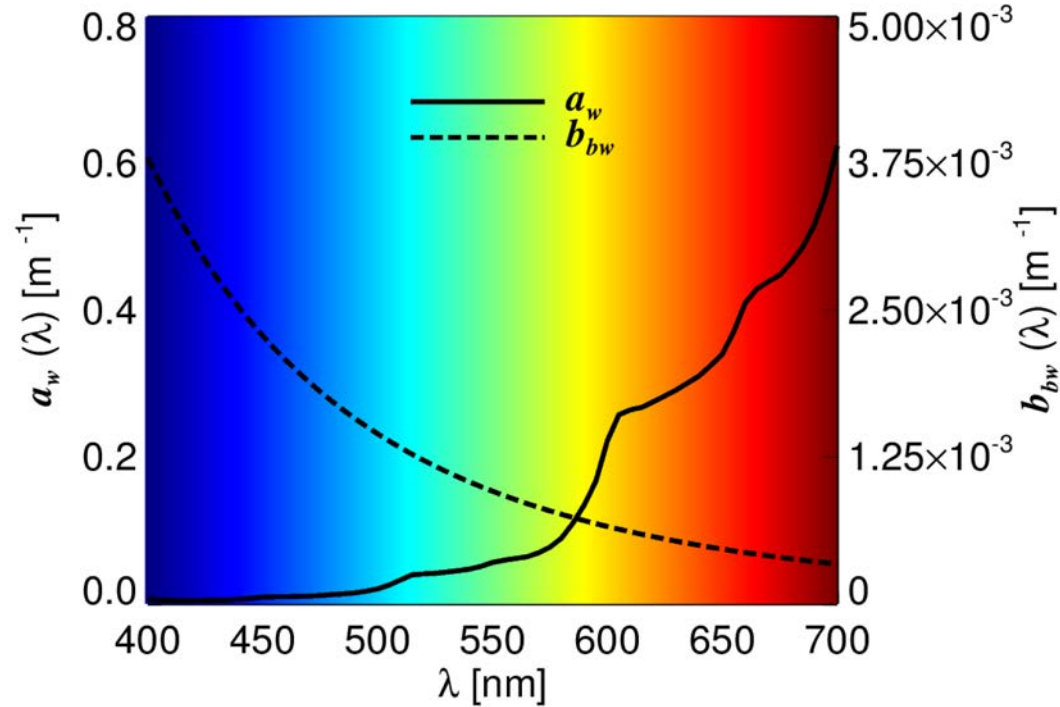
Optical properties of water and its constituents



A sufficient deep layer of pure water exhibits by molecular scattering a deep blue colour more saturated than sky-light and of comparable intensity. The colour is primarily due to diffraction, the absorption only making it of a fuller hue. The theories hitherto advanced that the dark blue of the deep sea is reflected sky-light or that it is due to suspended matter are discussed and shown to be erroneous

C. Raman, 1922

$$R(\lambda) \approx r \frac{b_b(\lambda)}{a(\lambda)}$$



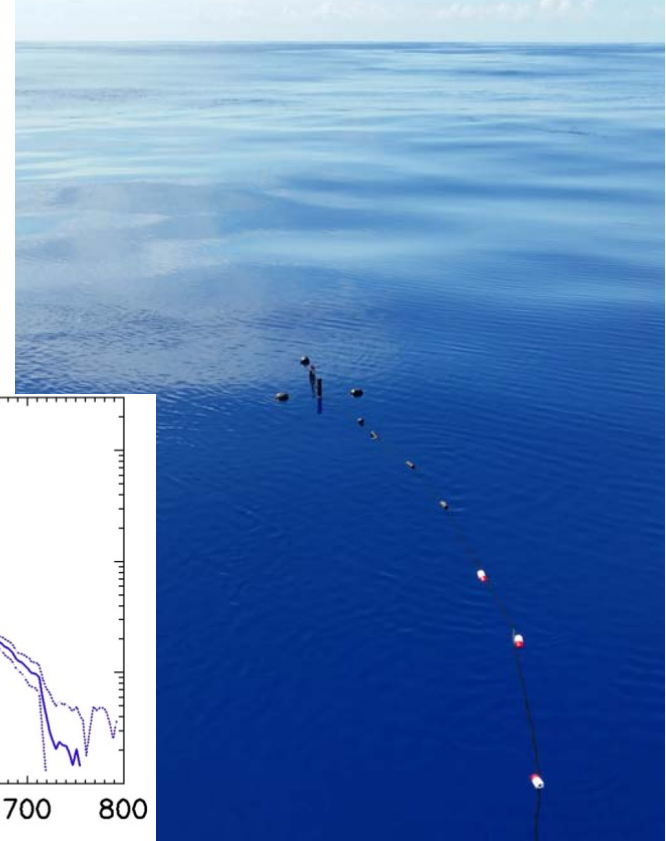
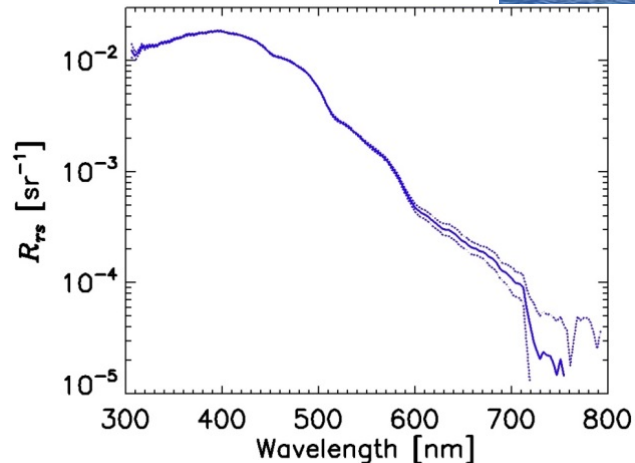
Evolution from human fascination to experimentation to rigorous science

Optical properties of water and its constituents



A sufficient deep layer of pure water exhibits by molecular scattering a deep blue colour more saturated than sky-light and of comparable intensity. The colour is primarily due to diffraction, the absorption only making it of a fuller hue. The theories hitherto advanced that the dark blue of the deep sea is reflected sky-light or that it is due to suspended matter are discussed and shown to be erroneous

C. Raman, 1922



Optical properties of water and its constituents



A sufficient deep layer of pure water exhibits by molecular scattering a deep blue colour more saturated than sky-light and of comparable intensity. The colour is primarily due to diffraction, the absorption only making it of a fuller hue. The theories hitherto advanced that the dark blue of the deep sea is reflected sky-light or that it is due to suspended matter are discussed and shown to be erroneous

C. Raman, 1922

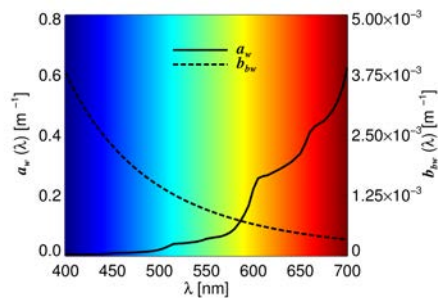


Taken from Wernand (2011)

Optical properties of water and its constituents

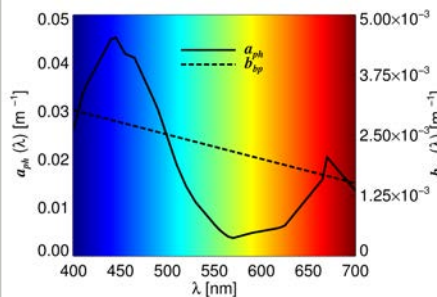
Sea water and its principle constituents

Pure seawater

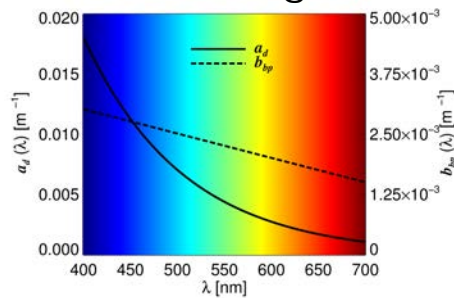


Particles

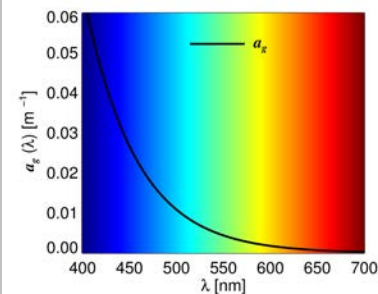
Phytoplankton



Non-algal



Dissolved matter



Apparent optical properties (AOPs)

While these vary depending on the inherent optical properties of the water, and the directional distribution of the light field in the sea (e.g. water leaving radiance, reflectance and diffuse attenuation coefficient of seawater)

Inherent optical properties (IOPs)

The optical properties of the water and its constituents independent of the directional distribution of the light field in the sea (e.g. absorption, backscattering, beam attenuation).

Inherent Optical Properties

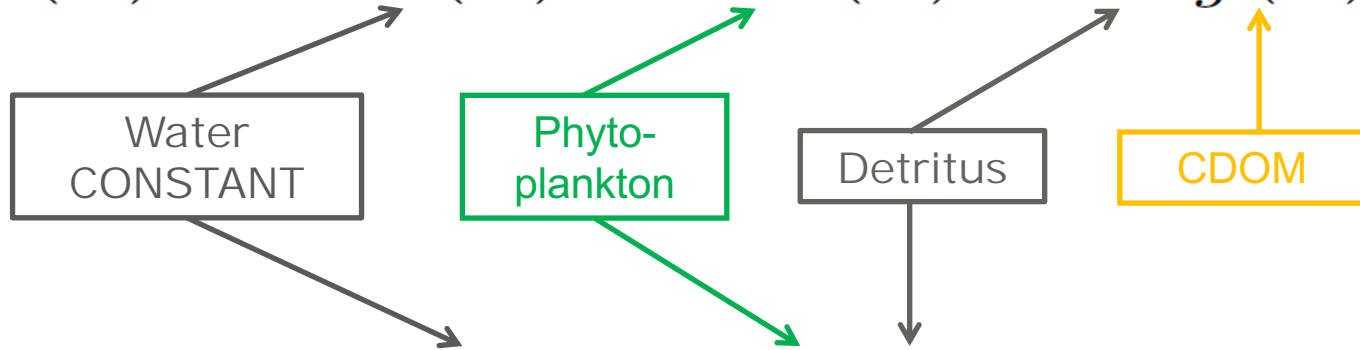
Specific inherent optical properties: the individual scattering and absorption components per unit concentration ($a_p^*(\lambda) = a_p(\lambda)/P$)

Bulk inherent optical properties: the individual scattering and absorption components per unit concentration multiplied by concentration ($a_p(\lambda) = a_p^*(\lambda)P$). Will vary with variations in specific IOPs and concentration.

$$a = a_w + P \cdot a_p^* + CDOM \cdot a_{CDOM}^*$$

$$b = b_w + P \cdot b_p^*$$

$$a(\lambda) = a_w(\lambda) + a_B(\lambda) + a_{dg}(\lambda)$$



$$b_b(\lambda) = b_{bw}(\lambda) + b_{bp}(\lambda)$$

$$R(\lambda) \approx r \frac{b_b(\lambda)}{a(\lambda)}$$

Case-2: Phytoplankton biomass does not covary with detritus and CDOM

Case-1: Phytoplankton biomass covaries with detritus and CDOM IOPs
can be tied to the chlorophyll concentration (C)

$$a(\lambda) = a_w(\lambda) + a_B(\lambda) + a_{dg}(\lambda)$$

Water
CONSTANT

\propto Chlorophyll (C)

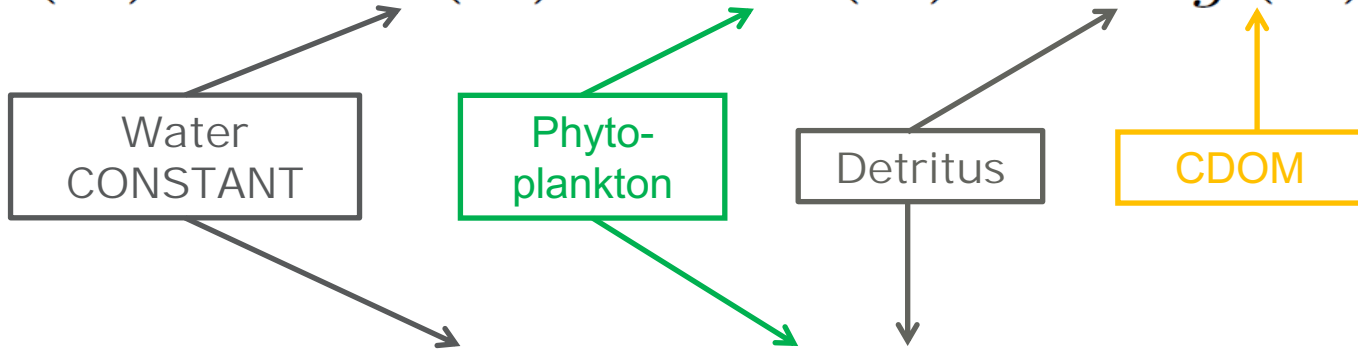
$$b_b(\lambda) = b_{bw}(\lambda) + b_{bp}(\lambda)$$

$$R(\lambda) \approx r \frac{b_b(\lambda)}{a(\lambda)}$$

Case-2: Phytoplankton biomass does not covary with detritus and CDOM

Case-1: Phytoplankton biomass covaries with detritus and CDOM. IOPs can be tied with reasonable confidence to the chlorophyll concentration (C)

$$a(\lambda) = a_w(\lambda) + a_B(\lambda) + a_{dg}(\lambda)$$



$$b_b(\lambda) = b_{bw}(\lambda) + b_{bp}(\lambda)$$

$$R(\lambda) \approx r \frac{b_b(\lambda)}{a(\lambda)}$$

Case-2: Phytoplankton biomass does not covary with detritus and CDOM

Case-1: Phytoplankton biomass covaries with detritus and CDOM. IOPs can be tied with reasonable confidence to the chlorophyll concentration (C)

$$a(\lambda) = a_w(\lambda) + a_B(\lambda) + a_{dg}(\lambda)$$

Phytoplankton

- Total Chlorophyll-a
- Phytoplankton pigment composition
- Phytoplankton size structure
- Phytoplankton Chl for different groups
- Phytoplankton Carbon for different groups
- Light attenuation (heating of ocean and primary production)

Detritus

- Sinking of material
- Coastal erosion of terrigenous sediments
- River deposition
- Dust / Volcanic / Cosmogenic deposition
- Recycling
- Light attenuation

CDOM

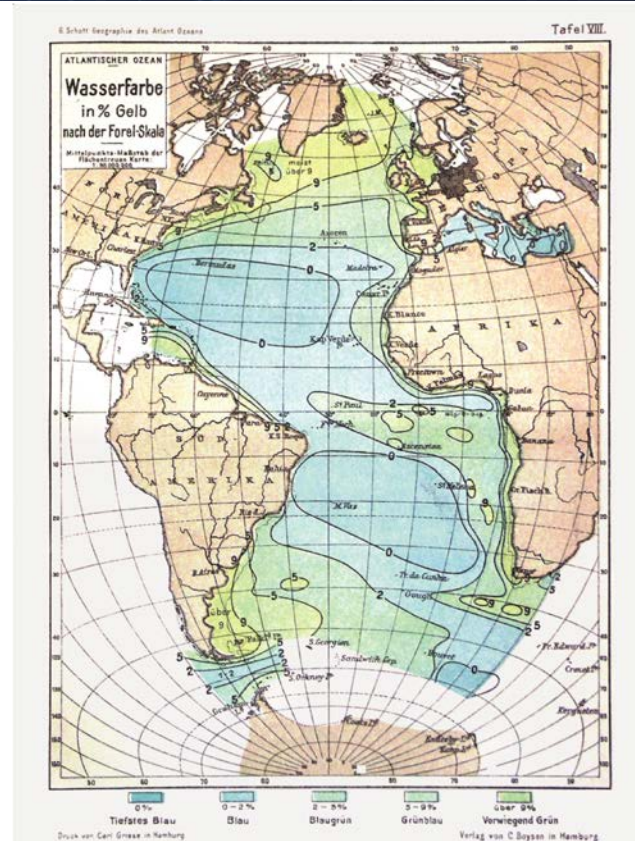
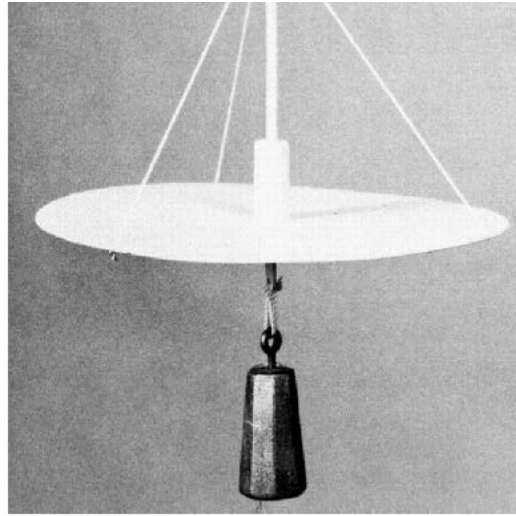
- Dissolved organic carbon cycle
- Proportions of humic and fulvic acids
- Semi-labile and refractory fractions
- Photodegradation status
- Water mass change
- Light attenuation

$$b_b(\lambda) = b_{bw}(\lambda) + b_{bp}(\lambda)$$

Particles

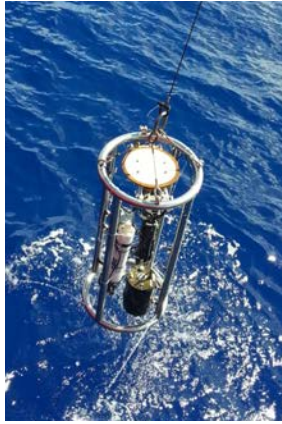
- Suspended particulate material
- Light attenuation
- Particle size structure
- Phytoplankton Carbon
- Phytoplankton Carbon for different groups
- Particulate Organic Carbon
- Particulate Inorganic Carbon

Traditional measurements of ocean colour



Wernand et al. (2011) PhD Thesis

Traditional measurements of ocean colour



Courtesy of
Marcel Wernand



Modern measurements of ocean colour

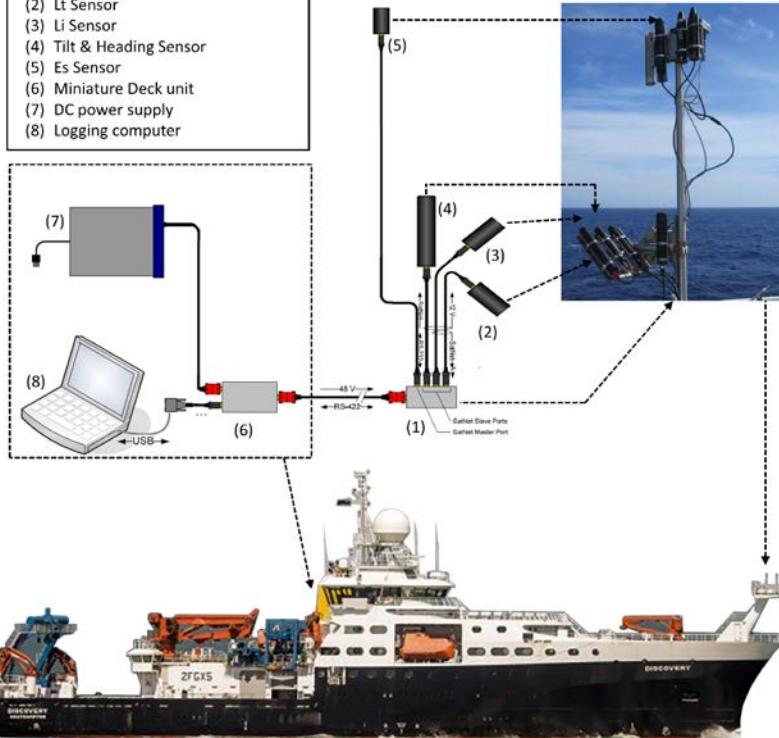


amt4sentinelfrm



HYPERSAS AMT SET-UP

- (1) HYPERSAS Junction Box
- (2) Lt Sensor
- (3) Li Sensor
- (4) Tilt & Heading Sensor
- (5) Es Sensor
- (6) Miniature Deck unit
- (7) DC power supply
- (8) Logging computer



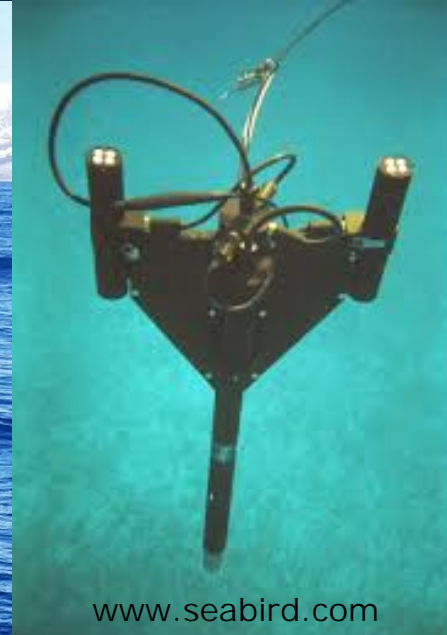
Above-water
radiometry

Measurements of apparent optical properties

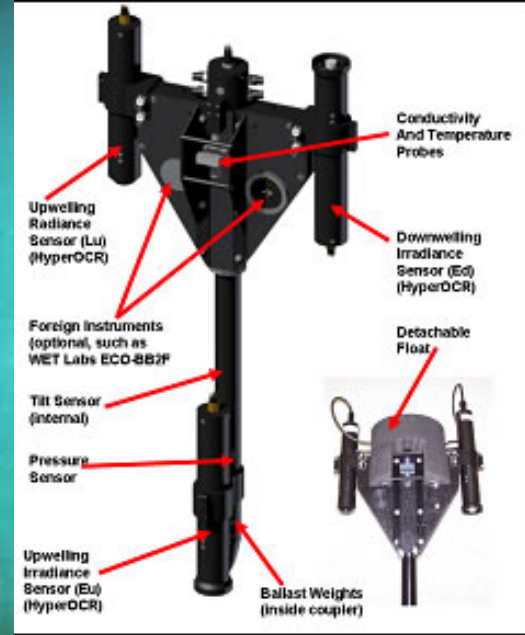
Modern measurements of ocean colour



amt4sentinelfrm

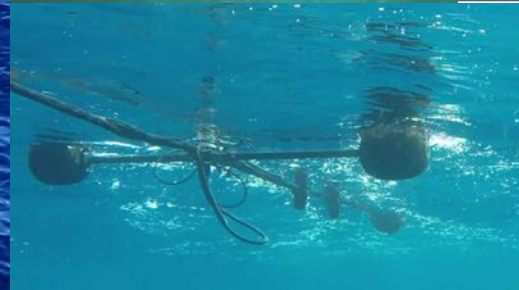


www.seabird.com

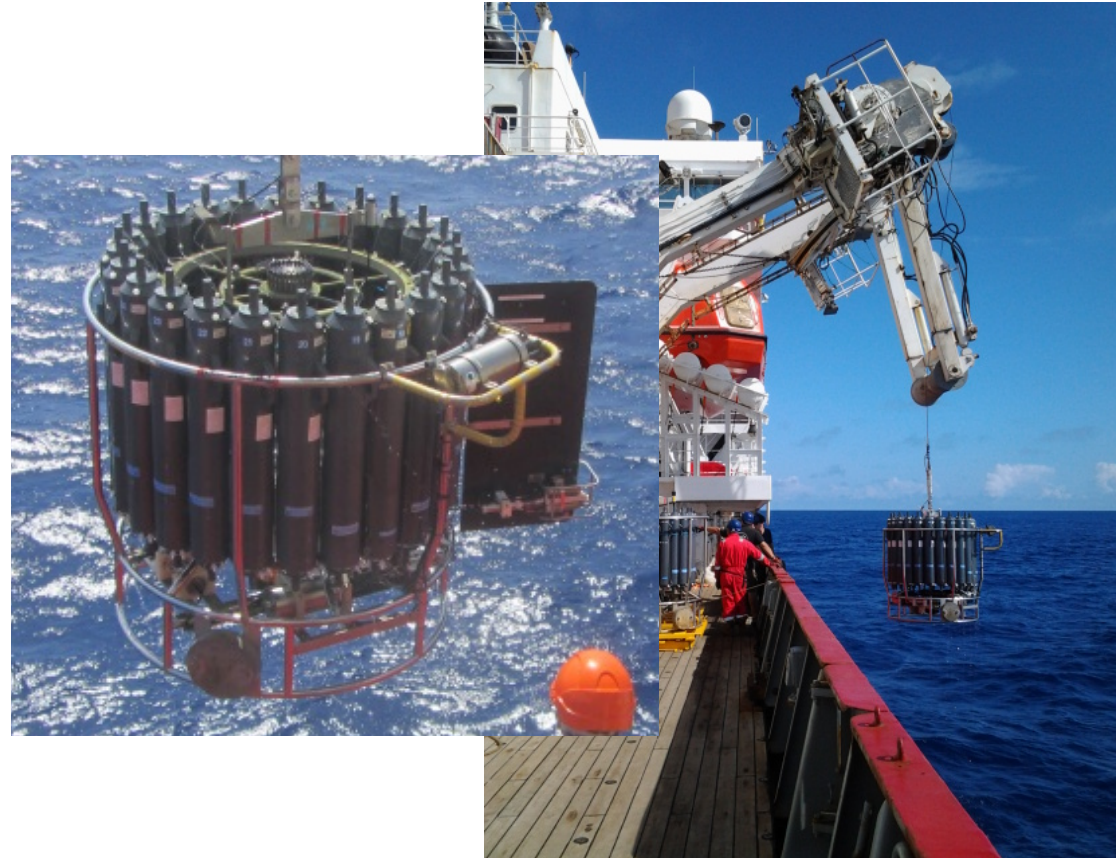
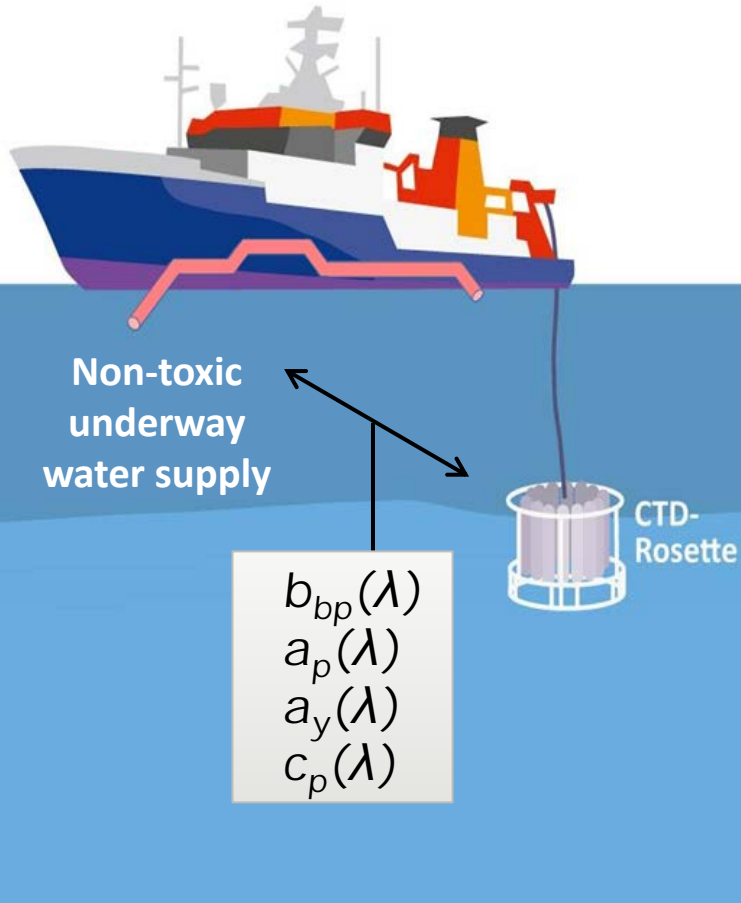


In water
radiometry

Measurements of
apparent optical
properties

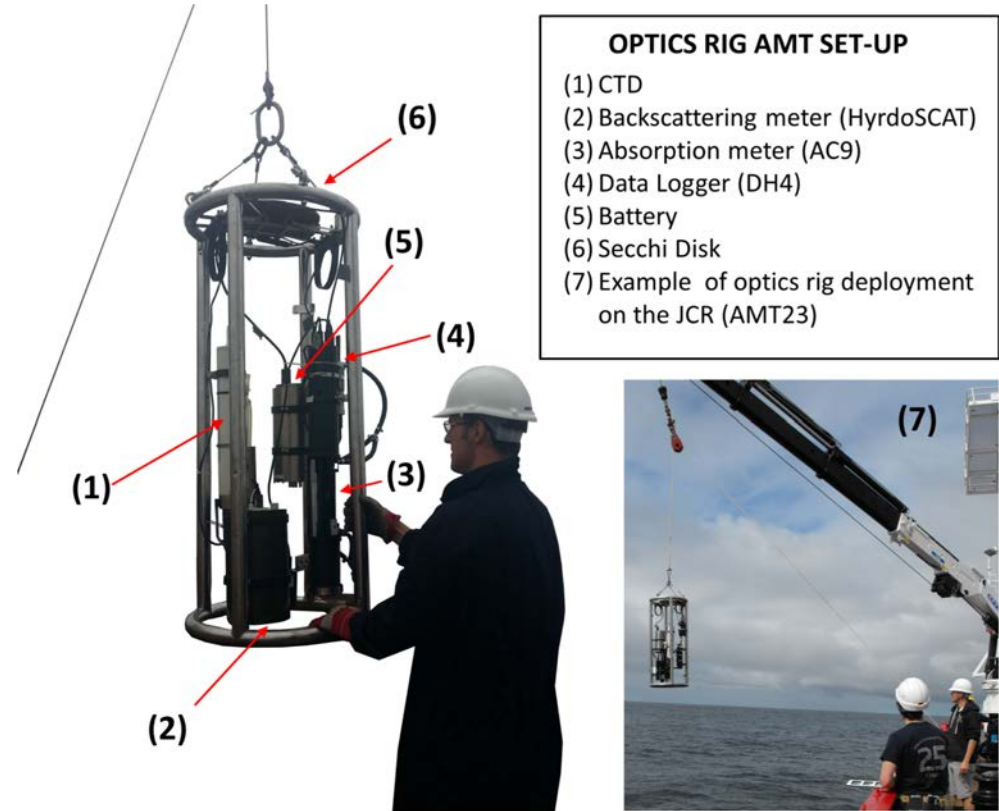
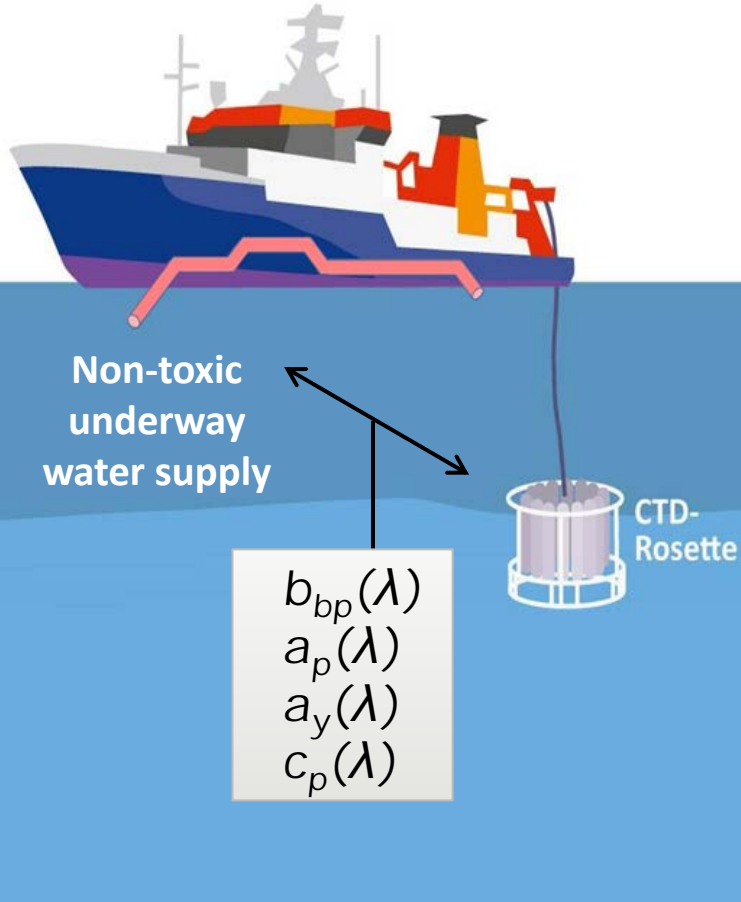


Modern measurements of ocean colour



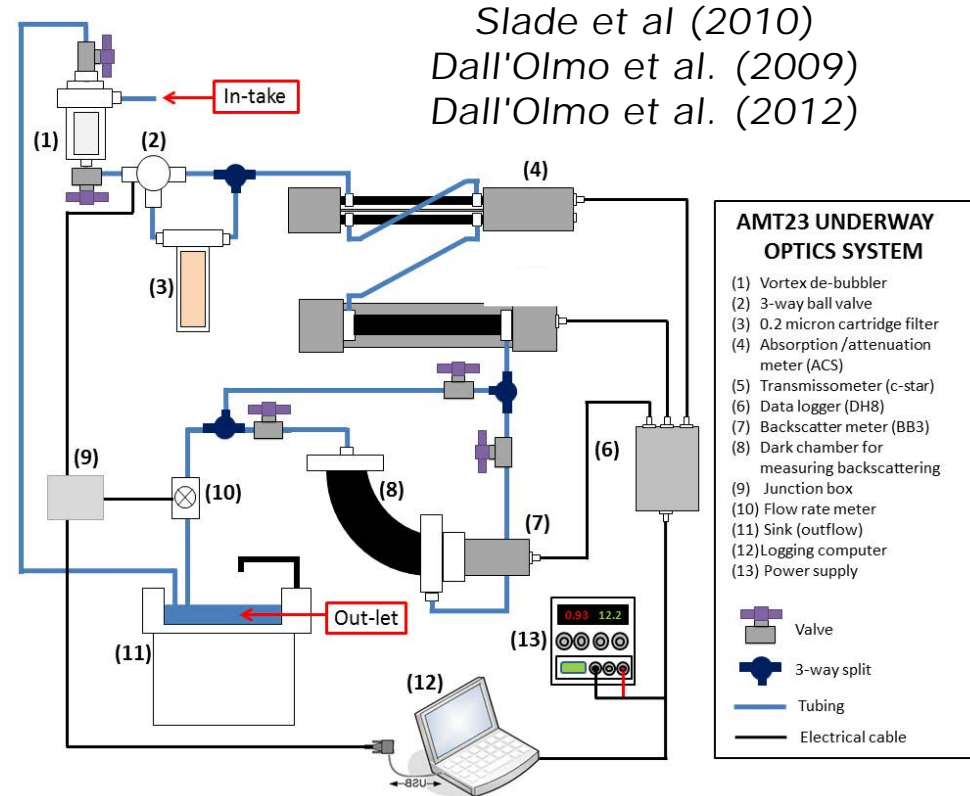
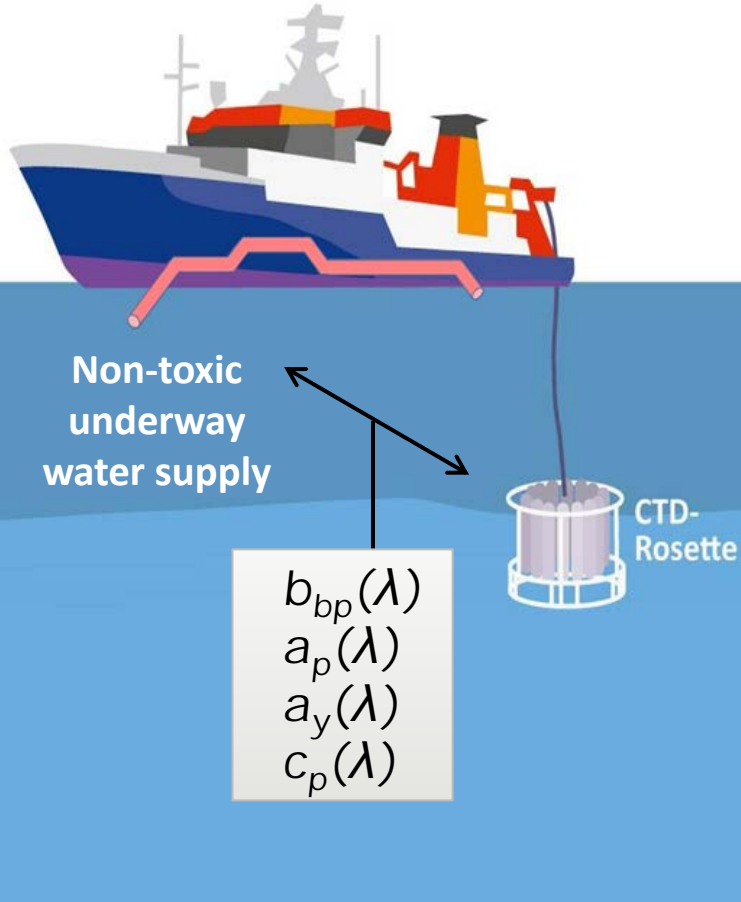
In water measurements of inherent optical properties

Modern measurements of ocean colour



In water measurements of inherent optical properties

Modern measurements of ocean colour



In water measurements of inherent optical properties

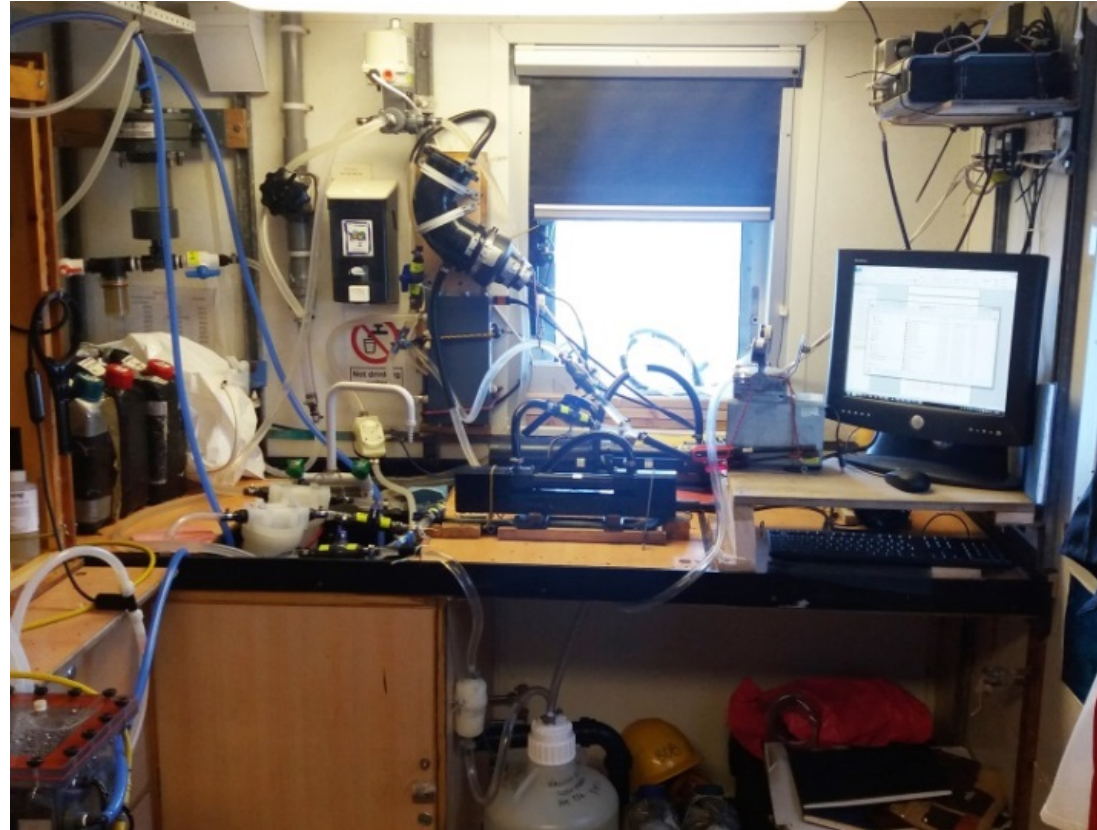
Modern measurements of ocean colour



Non-toxic
underway
water supply

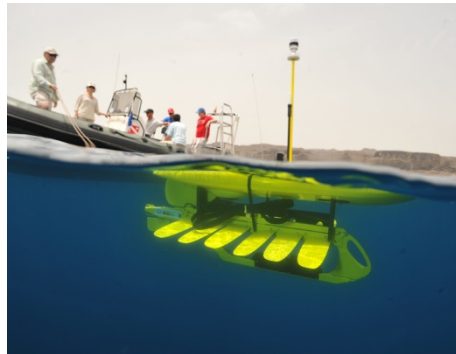
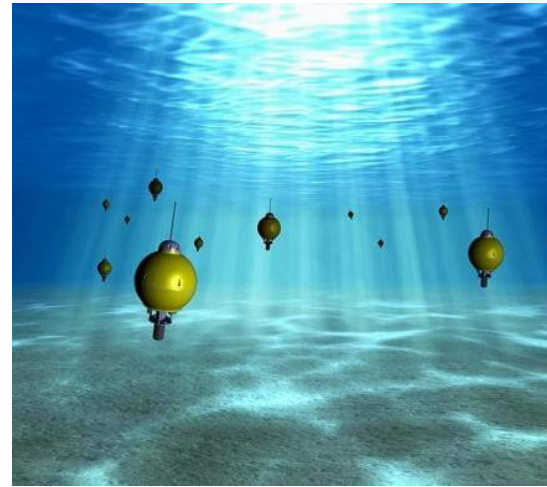
$b_{bp}(\lambda)$
 $a_p(\lambda)$
 $a_y(\lambda)$
 $c_p(\lambda)$

CTD-
Rosette

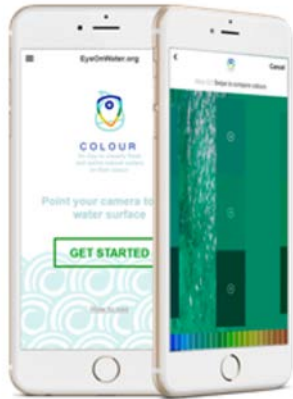


In water measurements of inherent optical properties

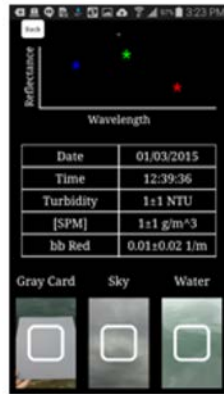
The future of ocean colour measurements



The future of ocean colour measurements



www.eyeonwater.org
Busch et al. (2016a,b)



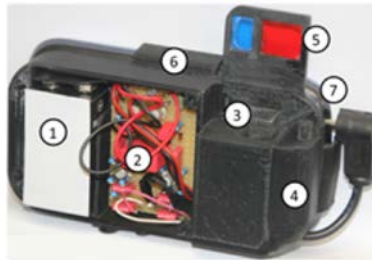
HydroColor app
Leeuw & Boss (2018)



www.secchidisk.org
Seafarers et al. (2017)



Courtesy of Marcel Wernand



SmartFluo
Friedrichs et al. (2017)



KdUINO DIY Buoy
Bardaji et al. (2016)

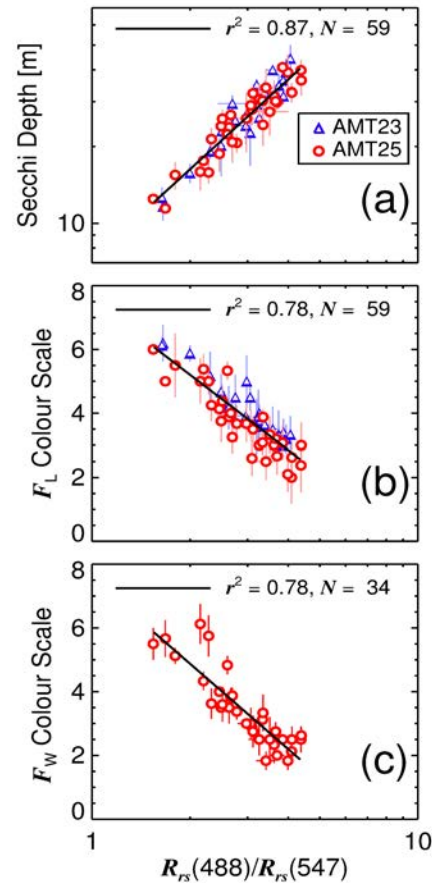
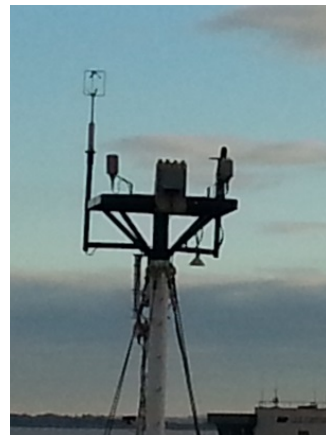
Plastic bottle with electronics inside.

Light sensors.

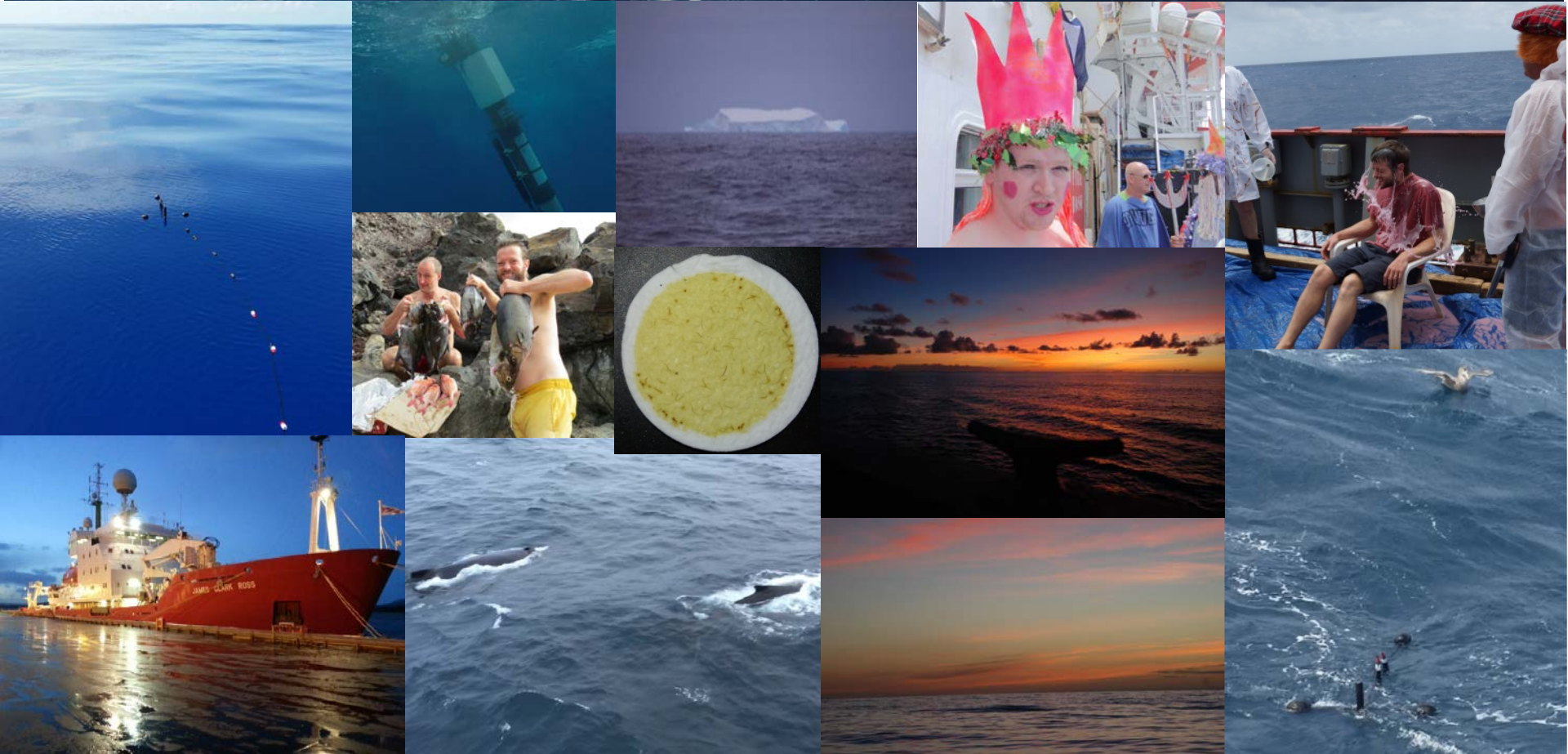


Brewin & Brewin (In prep)
NERC REVIVAL

Traditional and modern measurements of ocean colour



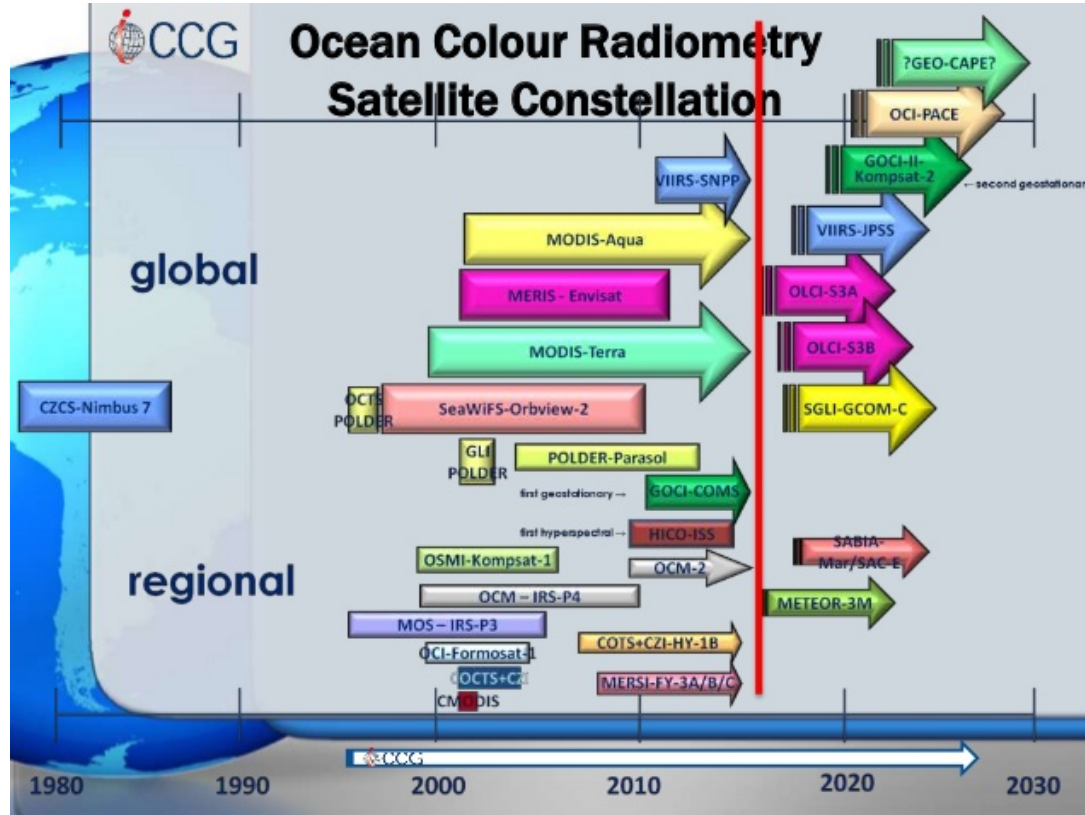
If you get the chance go to sea ☺



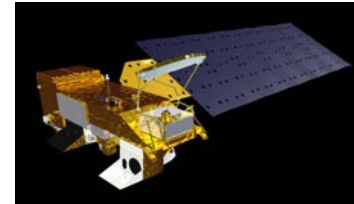
Satellite measurements of ocean colour



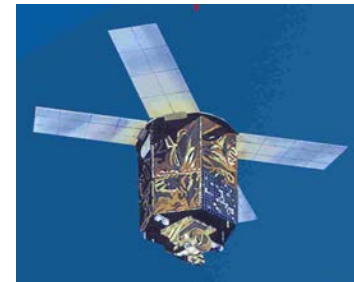
Satellite measurements of ocean colour



MERIS
2002-
2012

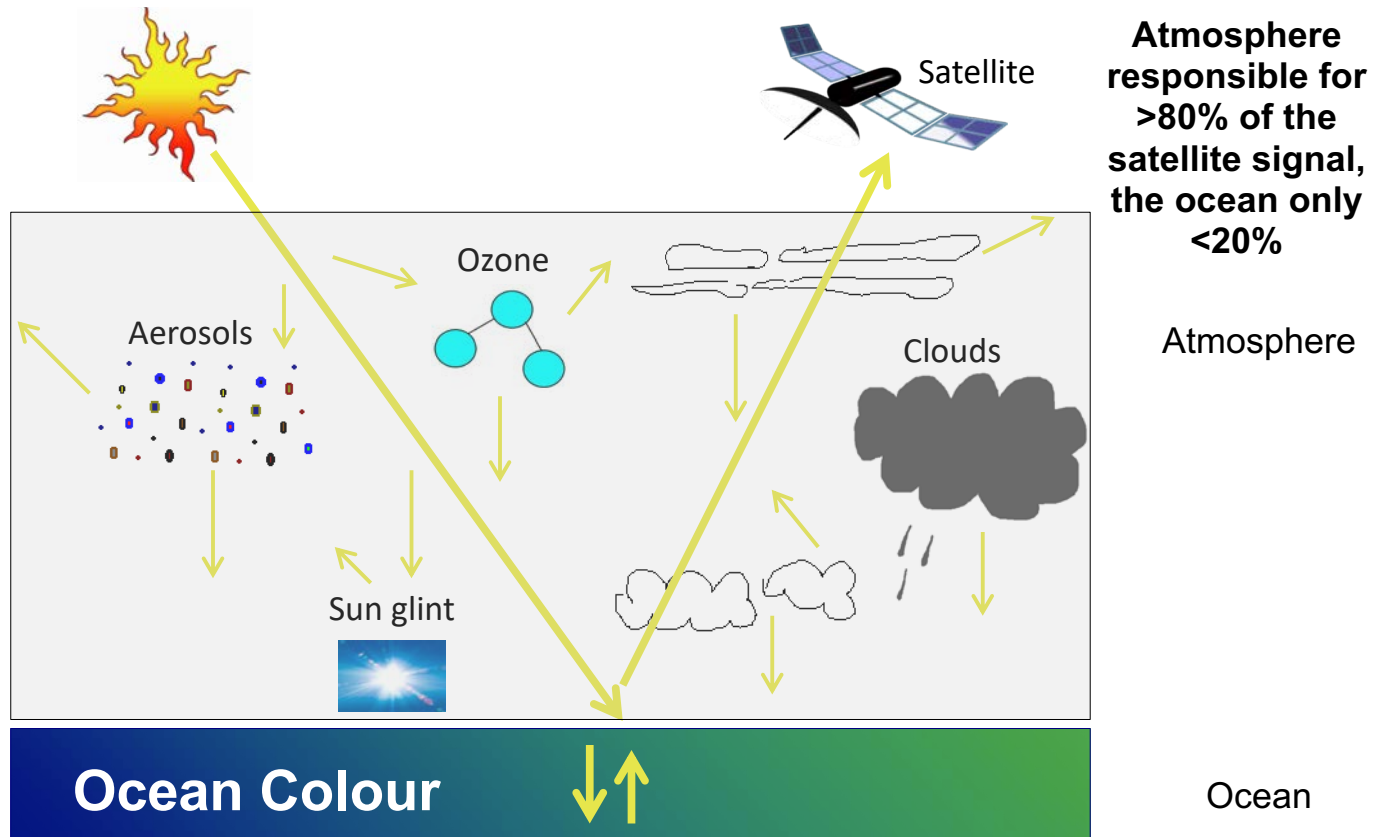


MODIS
2002-
present



SeaWiFS
1997-
2010

Satellite measurements of ocean colour



Satellite measurements of ocean colour



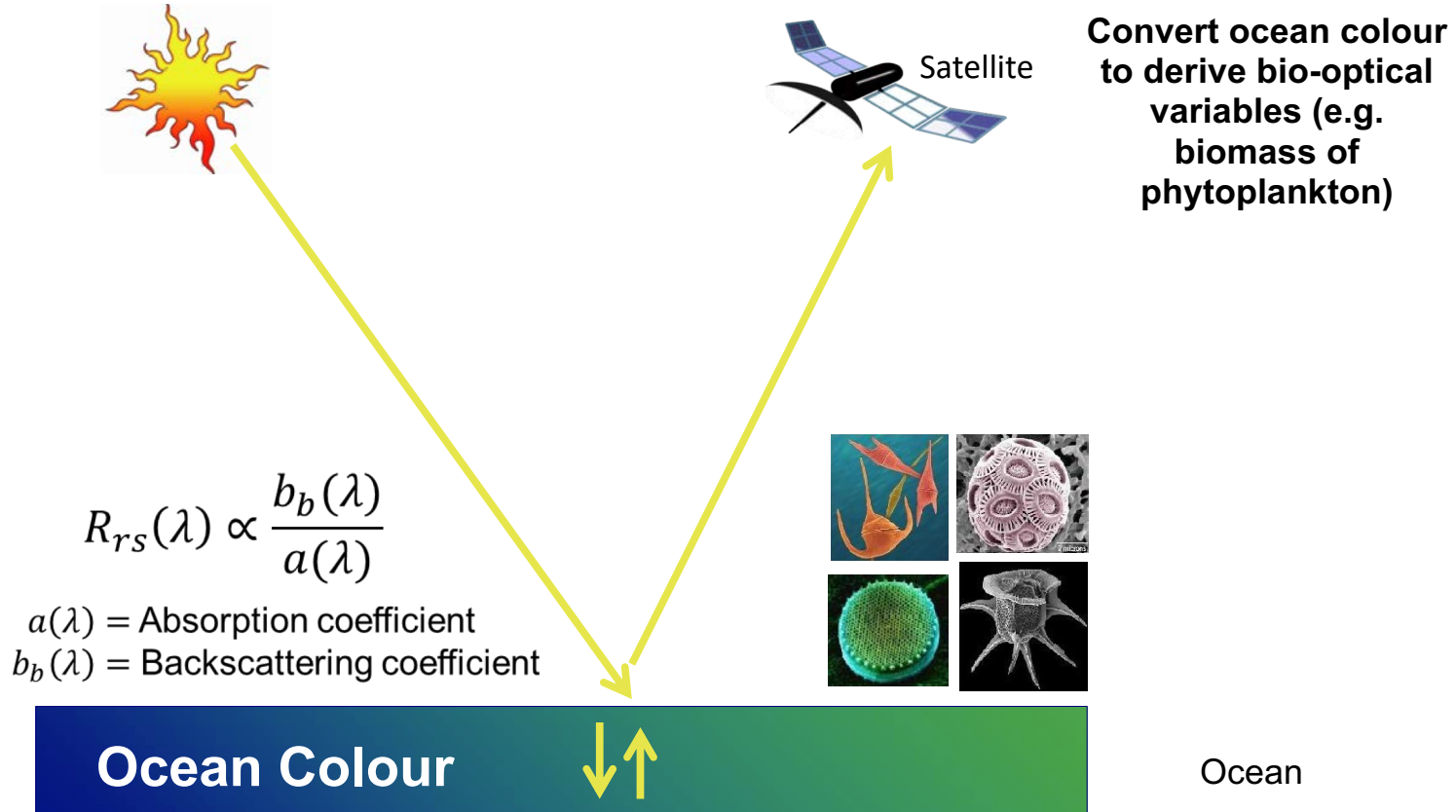
Satellite

**Remove
atmosphere to
capture the
<20% ocean
signal (water
leaving radiance)**

Ocean Colour



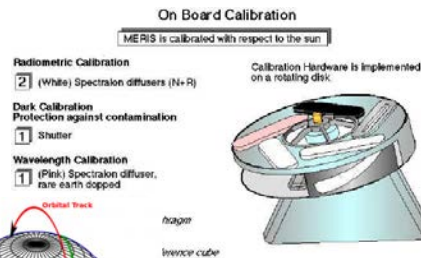
Ocean



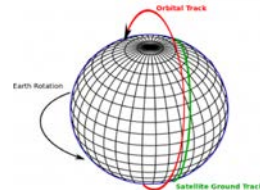
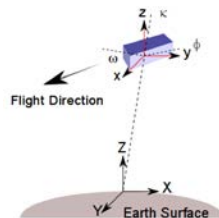
Basic steps in satellite ocean colour data processing



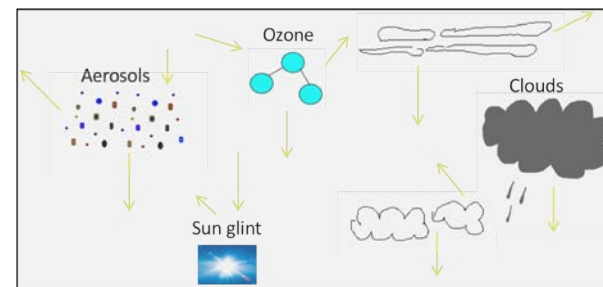
1) Radiometric and spectral calibration



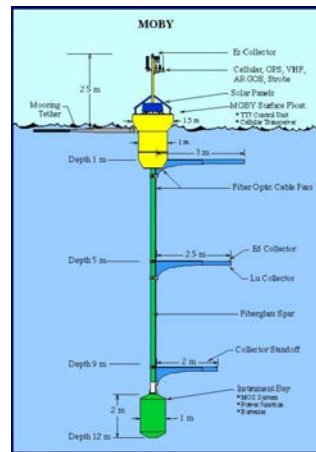
2) Geometric correction



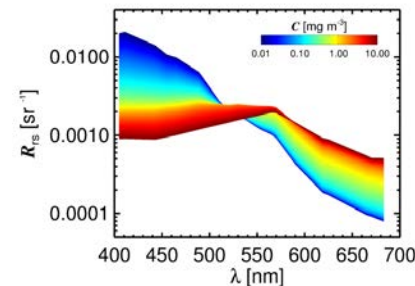
3) Atmospheric Correction



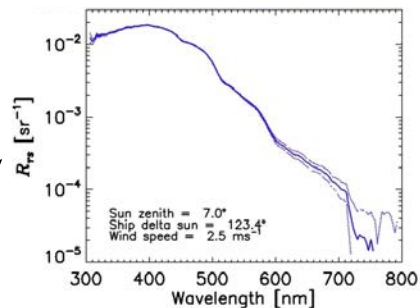
4) Vicarious calibration



5) In-water algorithm application



Algebraic

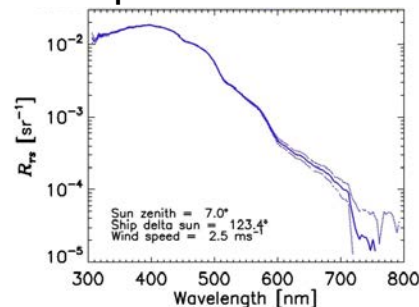


$$\begin{array}{r}
 25 \times 43 \\
 = (20+5) \times (40+3) \\
 = 20 \times 40 = 800 \\
 20 \times 3 = 60 \\
 5 \times 40 = 200 \\
 5 \times 3 = 15 \\
 \hline
 1075
 \end{array}$$

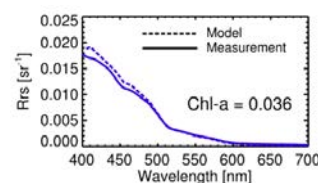
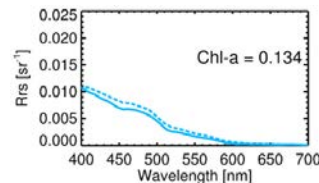
$$b_{bp}(\lambda) \ a_B(\lambda) \ a_{dg}(\lambda)$$

Lee et al. (2002) Applied optics
Smyth et al. (2006) Applied optics

Optimization



$$R_{rs}(\lambda) = \left\{ \sum_{i=1}^2 g_i \left[\frac{b_{bp} + b_{bp}(\lambda_0) \left(\frac{\lambda}{\lambda_0} \right)^{-\gamma}}{b_{bp} + b_{bp}(\lambda_0) \left(\frac{\lambda}{\lambda_0} \right)^{-\gamma} + a_w(\lambda) + C a_{ph}(\lambda) + a_{dg}(\lambda_0) \exp[-S_{dg}(\lambda - \lambda_0)]} \right]^i \right\} 0.5238,$$



$$b_{bp}(\lambda) \ a_B(\lambda) \ a_{dg}(\lambda)$$

Lee et al. (1998,1999) Applied optics
Maritorena et al. (2002) Applied optics
Werdell et al. (2011) Applied Optics

In-water ocean-colour algorithms



IOCCG Report Number 3, 2000

Remote Sensing of Ocean Colour in Coastal, and Other Optically-Complex, Waters

Edited by:
Shubha Sathyendranath (Bedford Institute of Oceanography, Canada)

IOCCG Report Number 5, 2006

Remote Sensing of Inherent Optical Properties: Fundamentals, Tests of Algorithms, and Applications

Editor:
ZhongPing Lee (Naval Research Laboratory, Stennis Space Center, USA)

Generalized ocean color inversion model for retrieving marine inherent optical properties

P. Jeremy Werdell,^{1,2,*} Bryan A. Franz,¹ Sean W. Bailey,^{1,3} Gene C. Feldman,¹
Emmanuel Boss,² Vittorio E. Brando,⁴ Mark Dowell,⁵ Takafumi Hirata,⁶
Samantha J. Lavender,⁷ ZhongPing Lee,⁸ Hubert Loisel,⁹
Stéphane Maritorena,¹⁰ Frédéric Mélin,⁵ Timothy S. Moore,¹¹
Timothy J. Smyth,¹² David Antoine,¹³ Emmanuel Devred,¹⁴
Odile Hembise Fanton d'Andon,¹⁵ and Antoine Mangin¹⁵

1559-128X/13/102019-19\$15.00/0
© 2013 Optical Society of America

1 April 2013 / Vol. 52, No. 10 / APPLIED OPTICS 2019



Contents lists available at ScienceDirect

Remote Sensing of Environment

journal homepage: www.elsevier.com/locate/rse



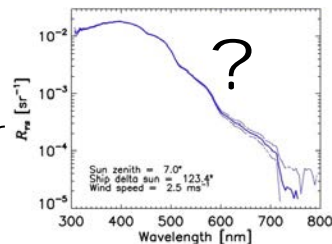
The Ocean Colour Climate Change Initiative: III. A round-robin comparison on in-water bio-optical algorithms



Robert J.W. Brewin^{a,b,*}, Shubha Sathyendranath^{a,b}, Dagmar Müller^c, Carsten Brockmann^d,
Pierre-Yves Deschamps^e, Emmanuel Devred^f, Roland Doerffer^c, Norman Fomferra^d, Bryan Franz^g,
Mike Grant^a, Steve Groom^a, Andrew Horseman^a, Chuanmin Hu^h, Hajo Krasemann^c, ZhongPing Leeⁱ,
Stéphane Maritorena^j, Frédéric Mélin^k, Marco Peters^d, Trevor Platt^a, Peter Regner^l, Tim Smyth^a,
Francois Steinmetz^c, John Swinton^m, Jeremy Werdell^g, George N. White IIIⁿ

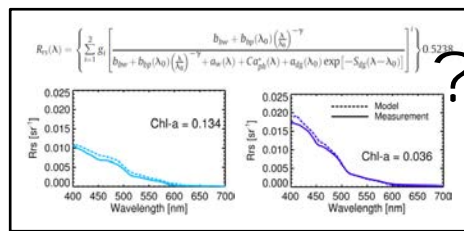
Uncertainties in satellite ocean colour products

Model-based error (error propagation)



$$\begin{array}{r}
 25 \times 43 \\
 = (20 + 5) \times (40 + 3) \\
 = 20 \times 40 = 800 \\
 20 \times 3 = 60 \\
 5 \times 40 = 200 \\
 5 \times 3 = 15 \\
 \hline
 1075
 \end{array}$$

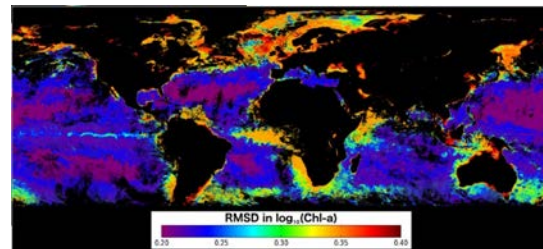
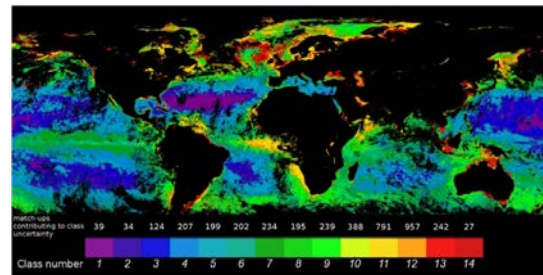
?



$$b_{bp}(\lambda) \quad a_B(\lambda) \quad a_{dg}(\lambda)$$

GlobColour

Errors based on validation



$$b_{bp}(\lambda) \quad a_B(\lambda) \quad a_{dg}(\lambda)$$

Ocean-Colour Climate Change Initiative

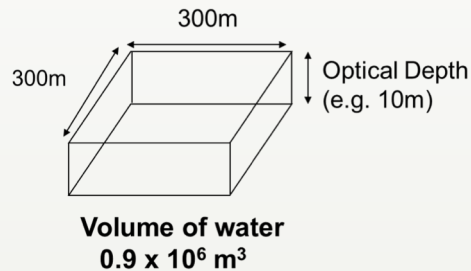
Oceanographic samples are typically poorly matched in scale compared with satellite-derived measurements.

Nominal resolution for Sentinel-3a is 300 m.
Suppose penetration depth is 10 m. One pixel represents $0.9 \times 10^6 \text{ m}^3$

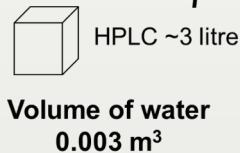
Suppose a three litre sample is taken for pigment analysis. This equates to a volume of 0.003 m^3

Pigment sample volume is only 3×10^{-9} of volume represented by pixel.

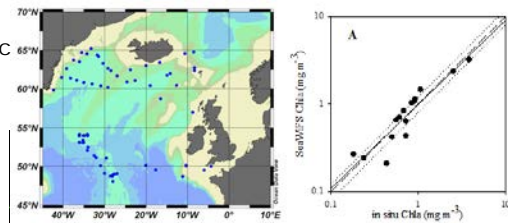
Satellite Pixel



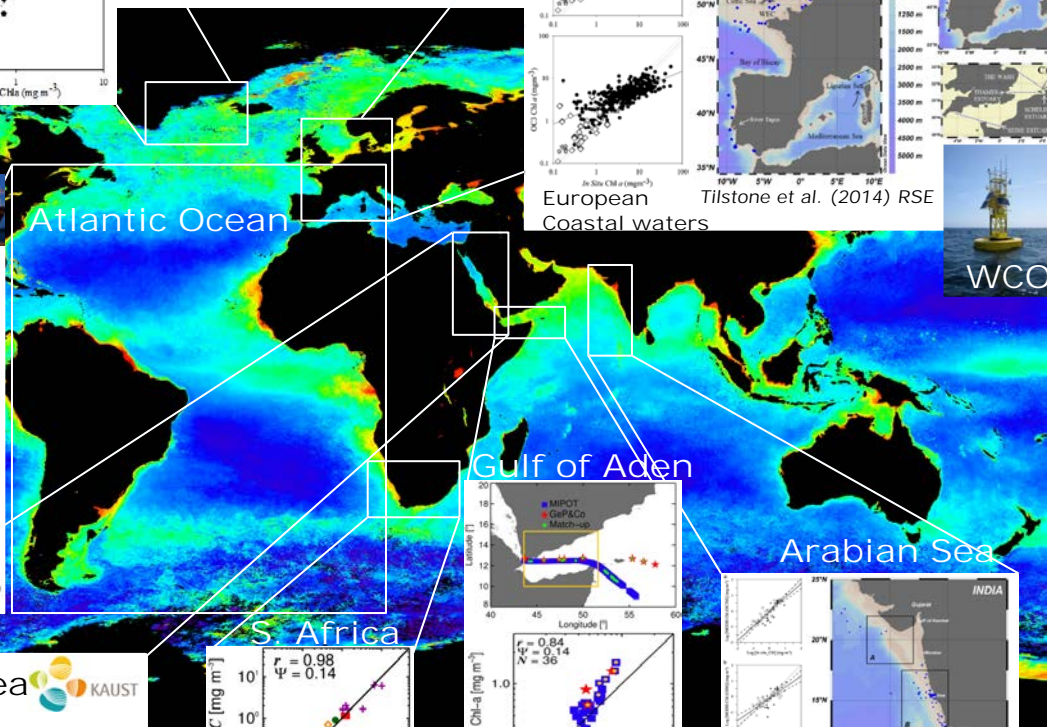
In situ water sample



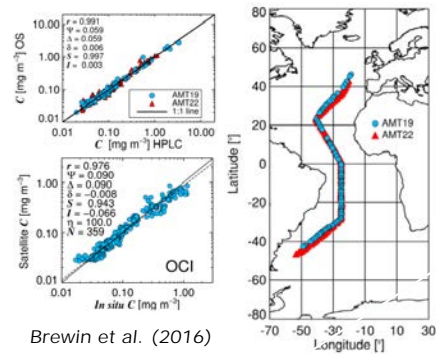
North Atlantic



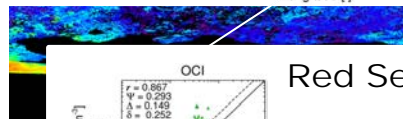
Tilstone et al. (2014) RSE
Tilstone et al. (2015) RSE
Raitso et al. (2014) GCB



European Coastal waters
Tilstone et al. (2014) RSE



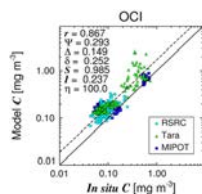
Brewin et al. (2016)



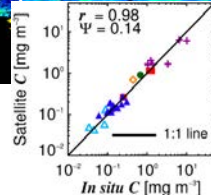
Red Sea



Raitso et al. (2013) Plos One
Brewin et al. (2013) RSE
Brewin et al. (2015) RSE
Racault et al. (2015) RSE
Raitso et al. (2015) GRL
Papadopoulos et al. (2015) JGR

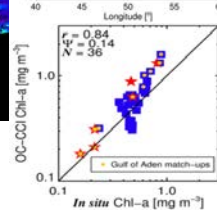
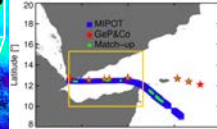


S. Africa



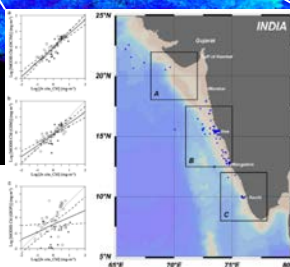
Lamont et al. (In revision) RSE

Gulf of Aden



Gittings et al. (2017) RSE

Arabian Sea



Tilstone et al. (2013) CSR
Chakraborty et al. (2016) ECS

- 1) What is ocean colour
- 2) History of ocean colour
- 3) Optical properties of water and its constituents
- 4) In situ measurements of ocean colour
- 5) Satellite remote-sensing of ocean colour



Ocean Colour Bibliography

[Home](#) » [Resources](#) » [Ocean Colour Bibliography](#)

The IOCCG bibliography is updated periodically with new references submitted by readers. Another useful ocean colour bibliography is the searchable [Historic Ocean Colour Archive](#) assembled by Marcel Wernand, with articles and books written between the 17th and early 20th century.

<http://ioccg.org/what-we-do/ioccg-publications/>

<http://ioccg.org/resources/ocean-colour-bibliography/>

<http://ioccg.org/what-we-do/ioccg-publications/ioccg-reports/>