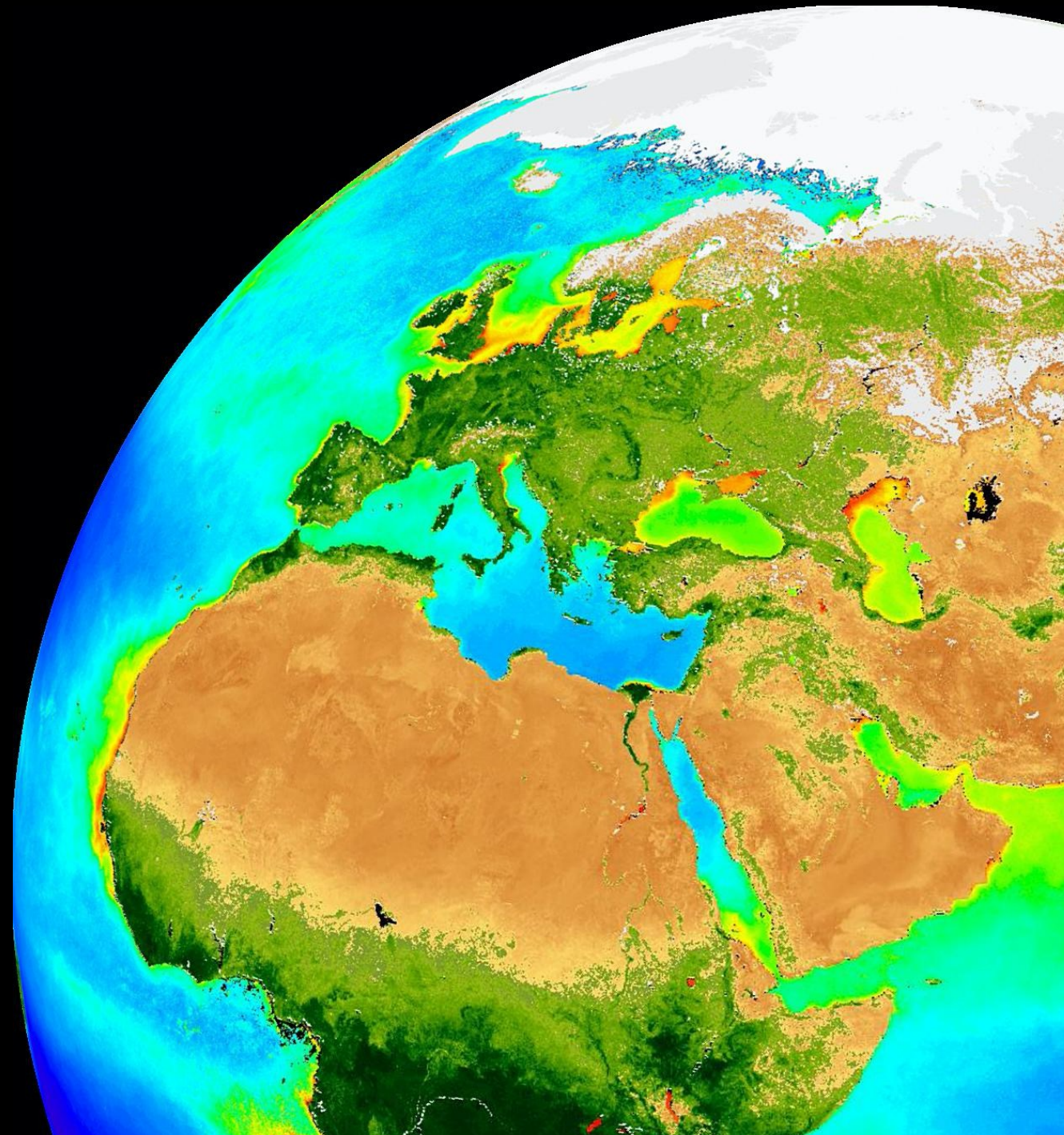


# A *very* brief history of ocean color from space

Jeremy Werdell

PACE class @ UMBC  
1-5 Aug 2022



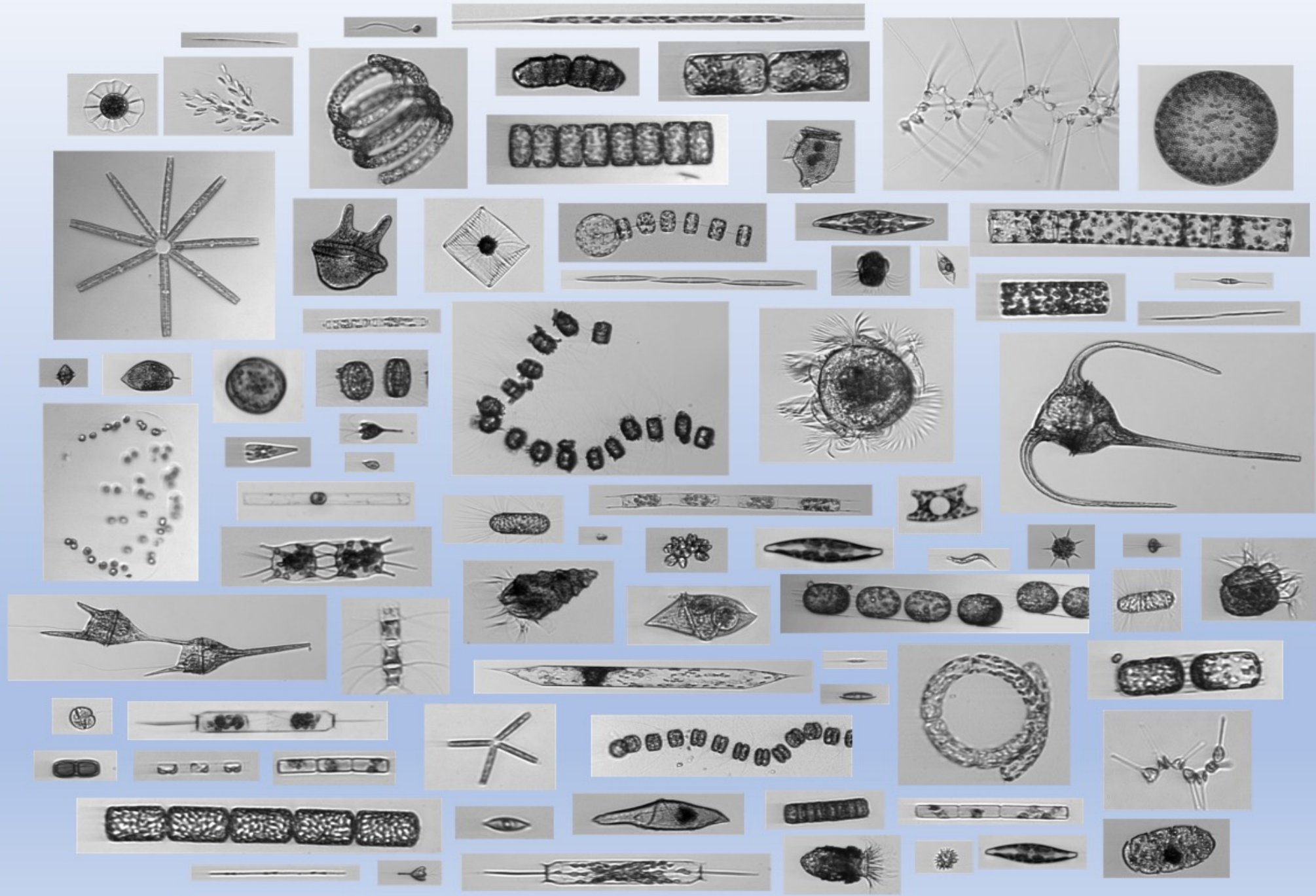


Theme for the next 25 min:

A brief history of the  
genesis and evolution of  
satellite “ocean color”



Credit: Heidi Sosik (WHOI)



## Part 1 (of 3)

Why phytoplankton?

Why satellites?



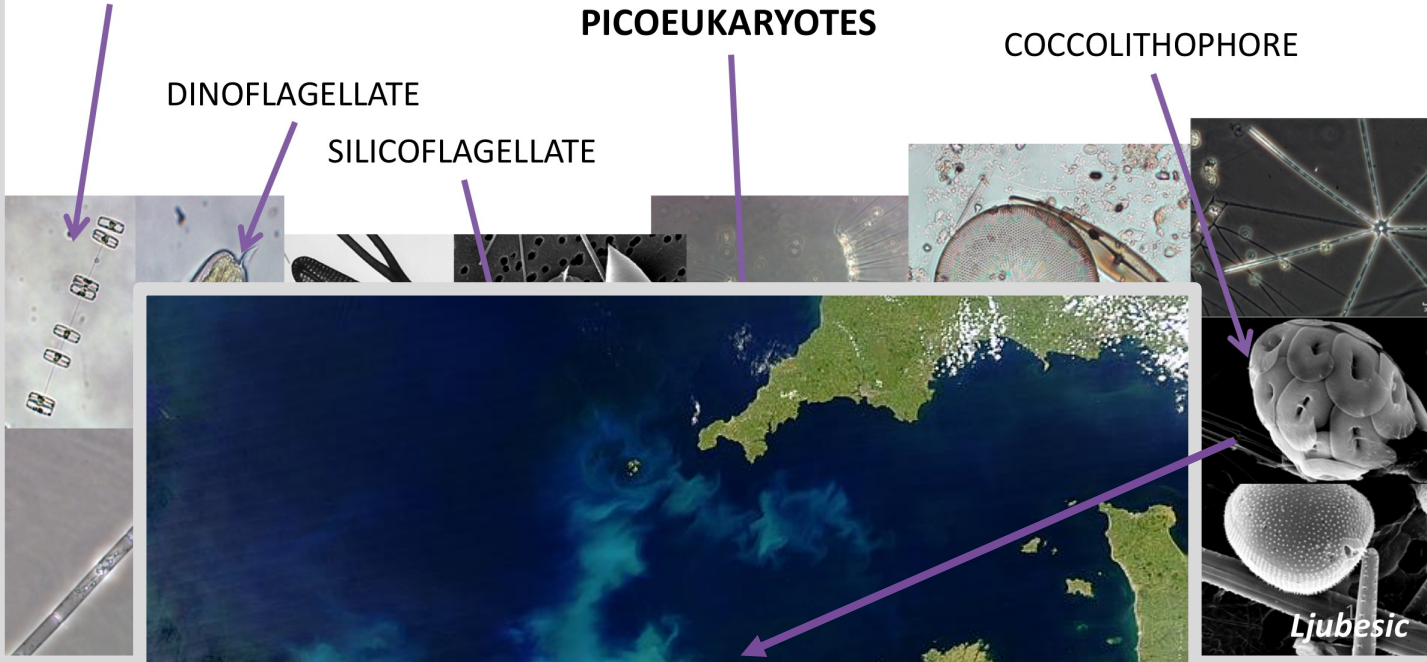
DIATOM

PICOEUKARYOTES

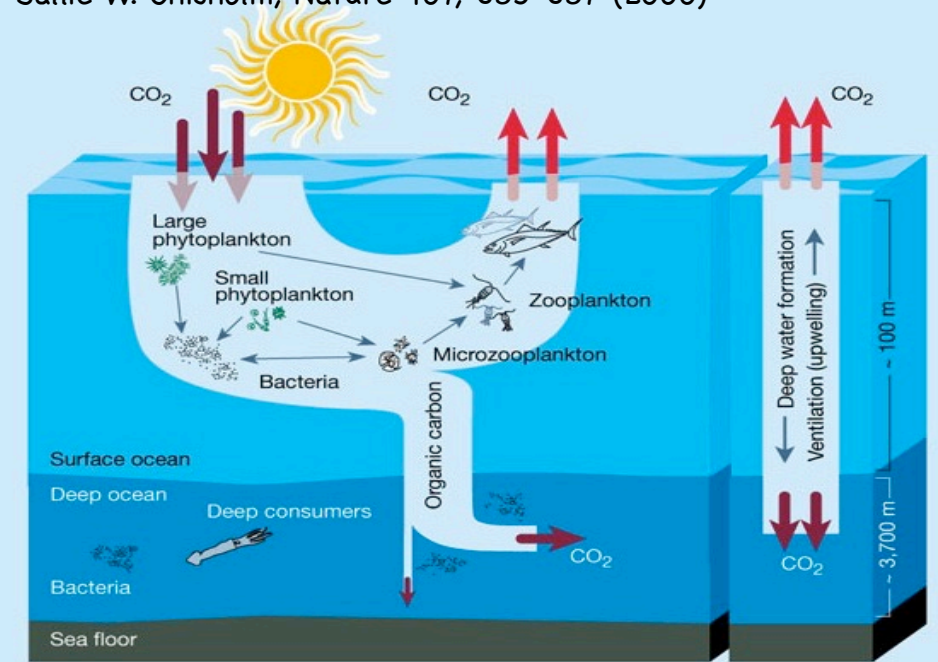
COCCOLITHOPHORE

DINOFLAGELLATE

SILICOFLAGELLATE



Sallie W. Chisholm, Nature 407, 685-687 (2000)



one coccolithophore

0.01 mm

1,000 cells/mL





A satellite image from NOAA shows an aerial view of Lake Erie's massive 2011 algae bloom.

PHOTOGRAPH BY NASA/EARTH OBSERVATORY



## Algae outbreak suffocates thousands of sardines in Oman

Residents of Sidab village teamed up to clean the area before the smell of dead fish spread



Image Credit: Twitter

The sardines had choked to death due to the lack of oxygen in the seawater.

Published: 12:27 May 6, 2017  
Gulf News

GULF NEWS 











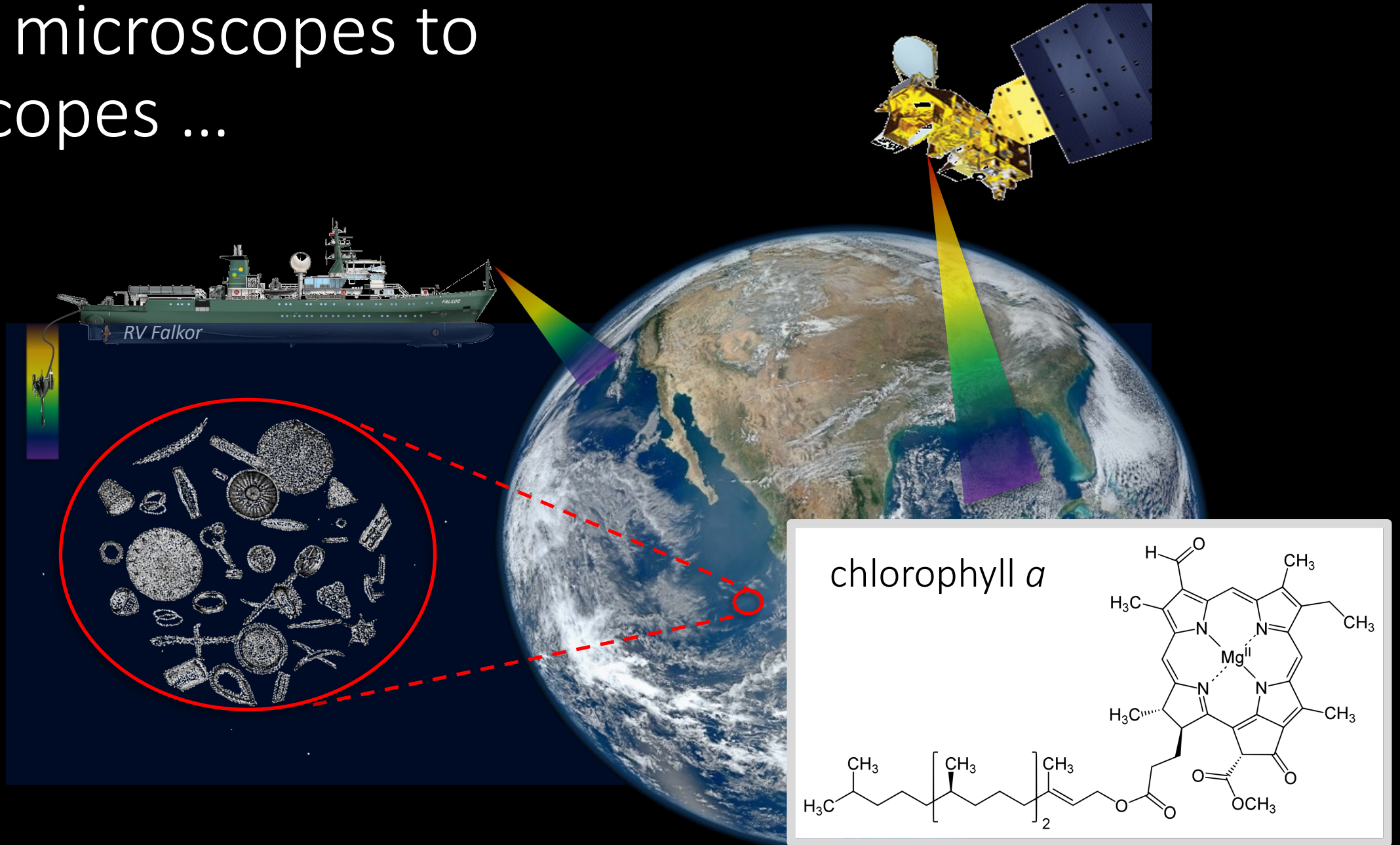
Woods Hole  
Oceanographic  
INSTITUTION







# From microscopes to telescopes ...





Ocean Chlorophyll (mg/m<sup>3</sup>)

low

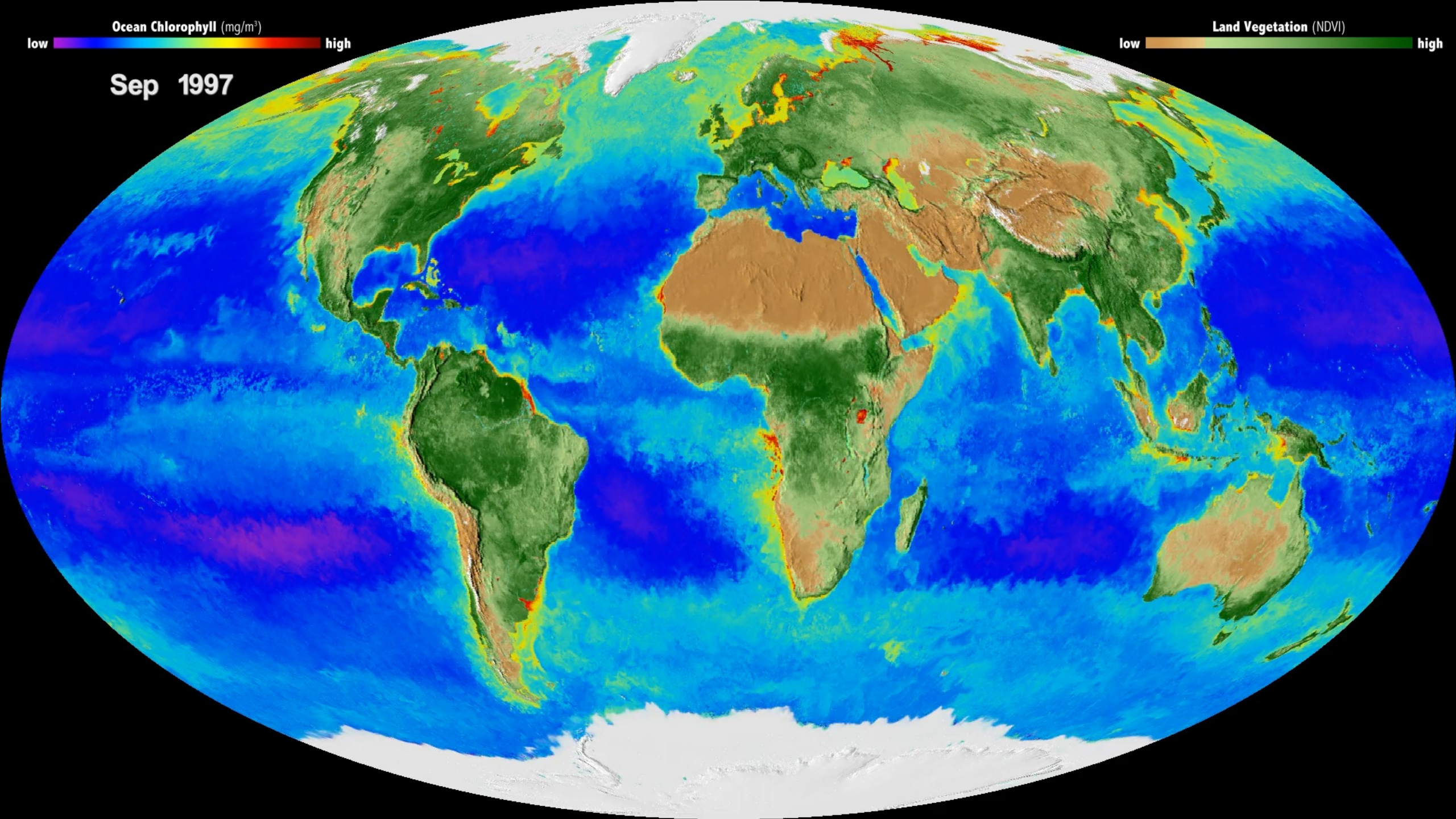
high

Land Vegetation (NDVI)

low

high

Sep 1997





## Part 2

How'd we get here?  
How does it work?

# SCIENCE

20 February 1970

Vol. 167, No. 3921

AMERICAN ASSOCIATION FOR THE ADVANCEMENT OF SCIENCE

## Spectra of Backscattered Light from the Sea Obtained from Aircraft as a Measure of Chlorophyll Concentration

GEORGE L. CLARKE  
GIFFORD C. EWING  
CARL J. LORENZEN

*Woods Hole Oceanographic  
Institution, Woods Hole,  
Massachusetts 20543*

“ocean color”

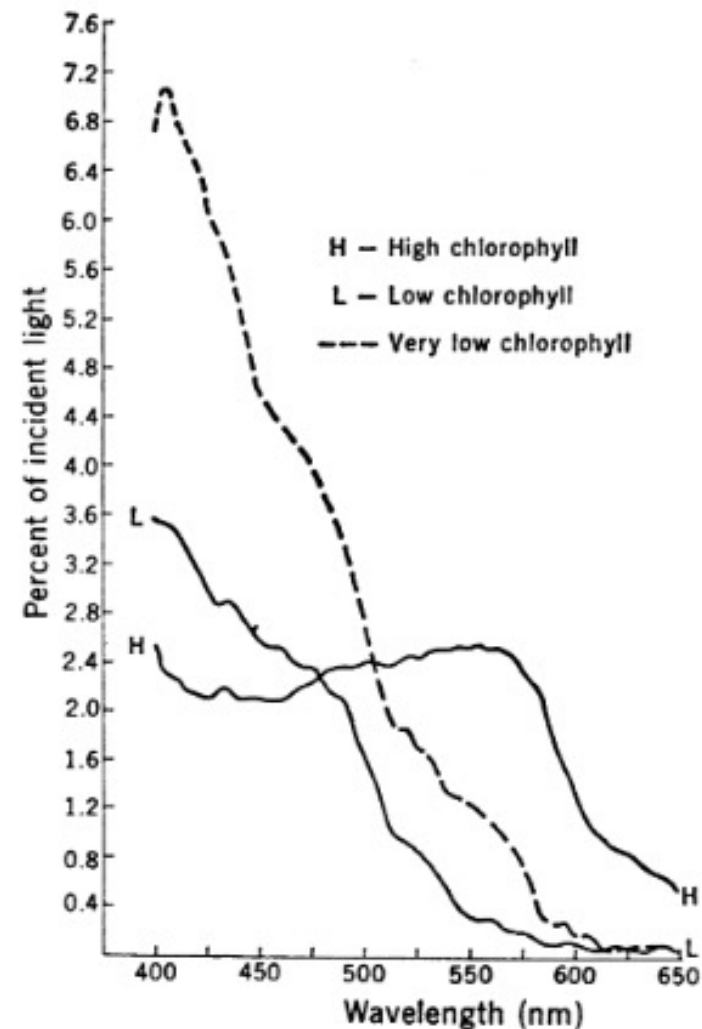


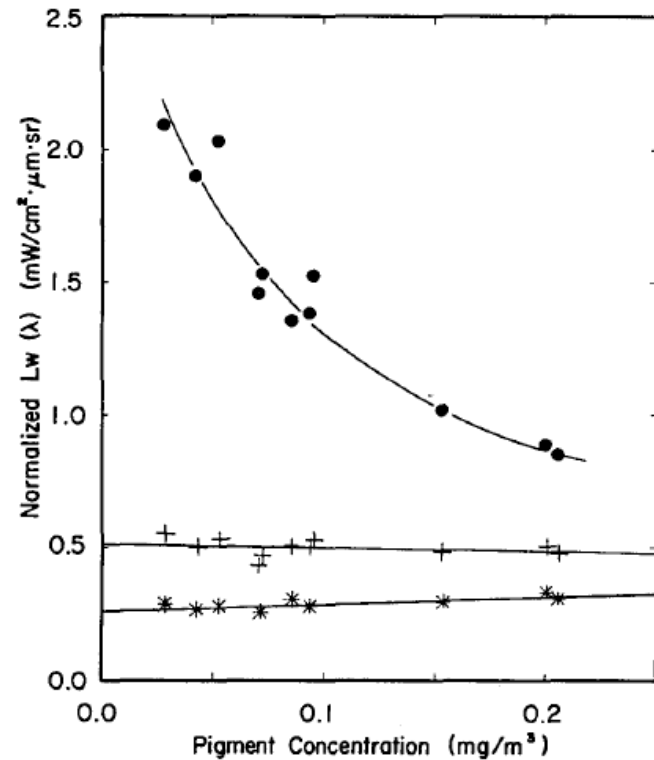
Fig. 3. Data from the high and low chlorophyll curves plotted as percentage of the incident light and compared with data taken on the same day from an area with very low chlorophyll concentration south of the Gulf Stream.



## Clear water radiances for atmospheric correction of coastal zone color scanner imagery

Howard R. Gordon and Dennis K. Clark

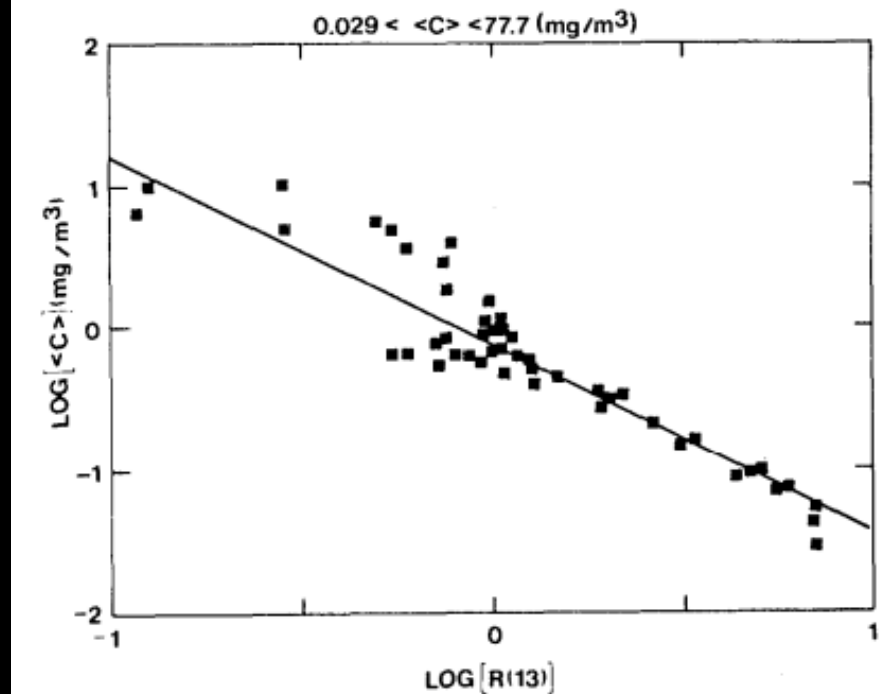
15 December 1981 / Vol. 20, No. 24 / APPLIED OPTICS 4175



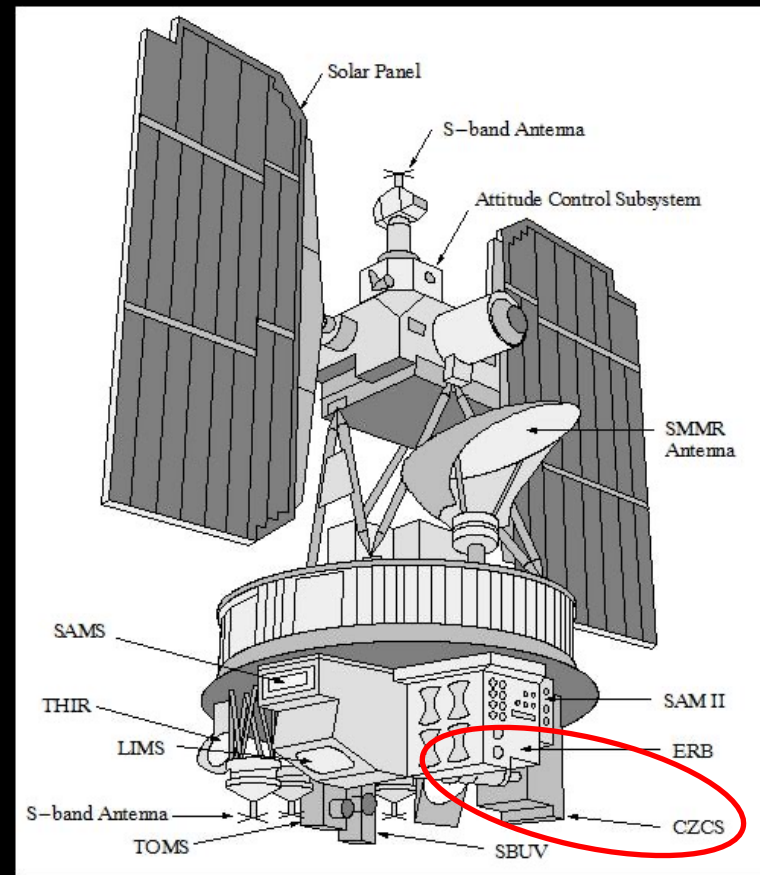
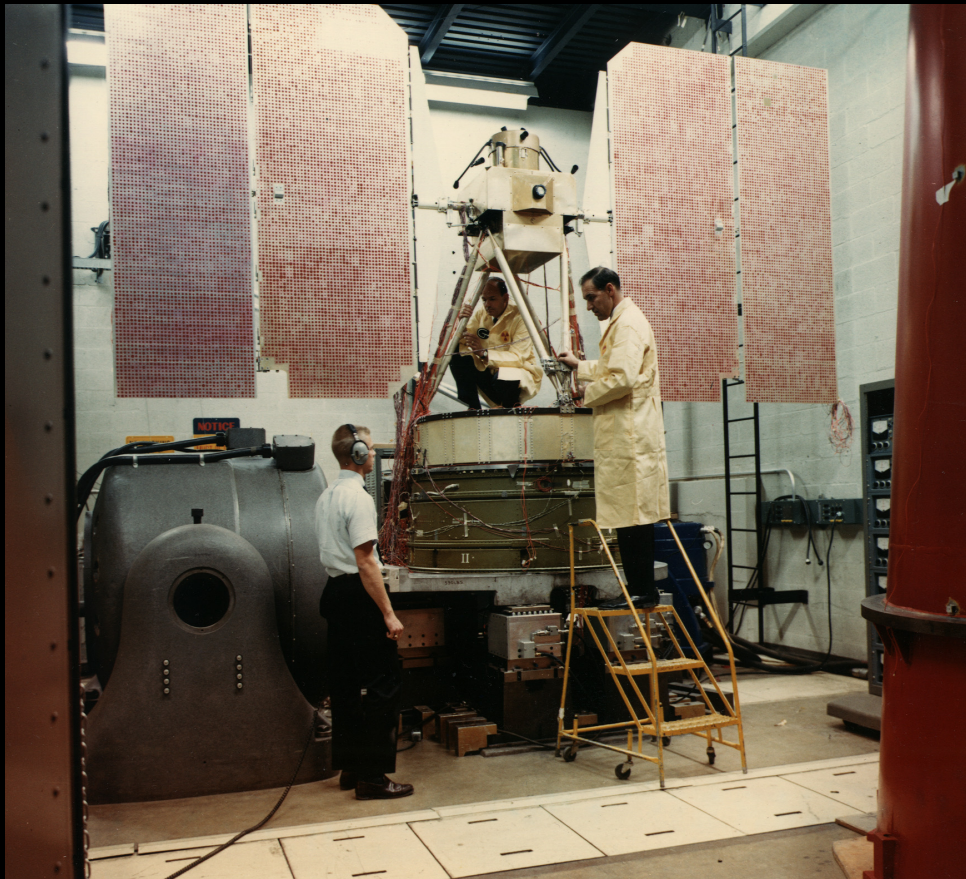
## Phytoplankton pigment concentrations in the Middle Atlantic Bight: comparison of ship determinations and CZCS estimates

Howard R. Gordon, Dennis K. Clark, James W. Brown, Otis B. Brown, Robert H. Evans, and William W. Broenkow

20 APPLIED OPTICS / Vol. 22, No. 1 / 1 January 1983



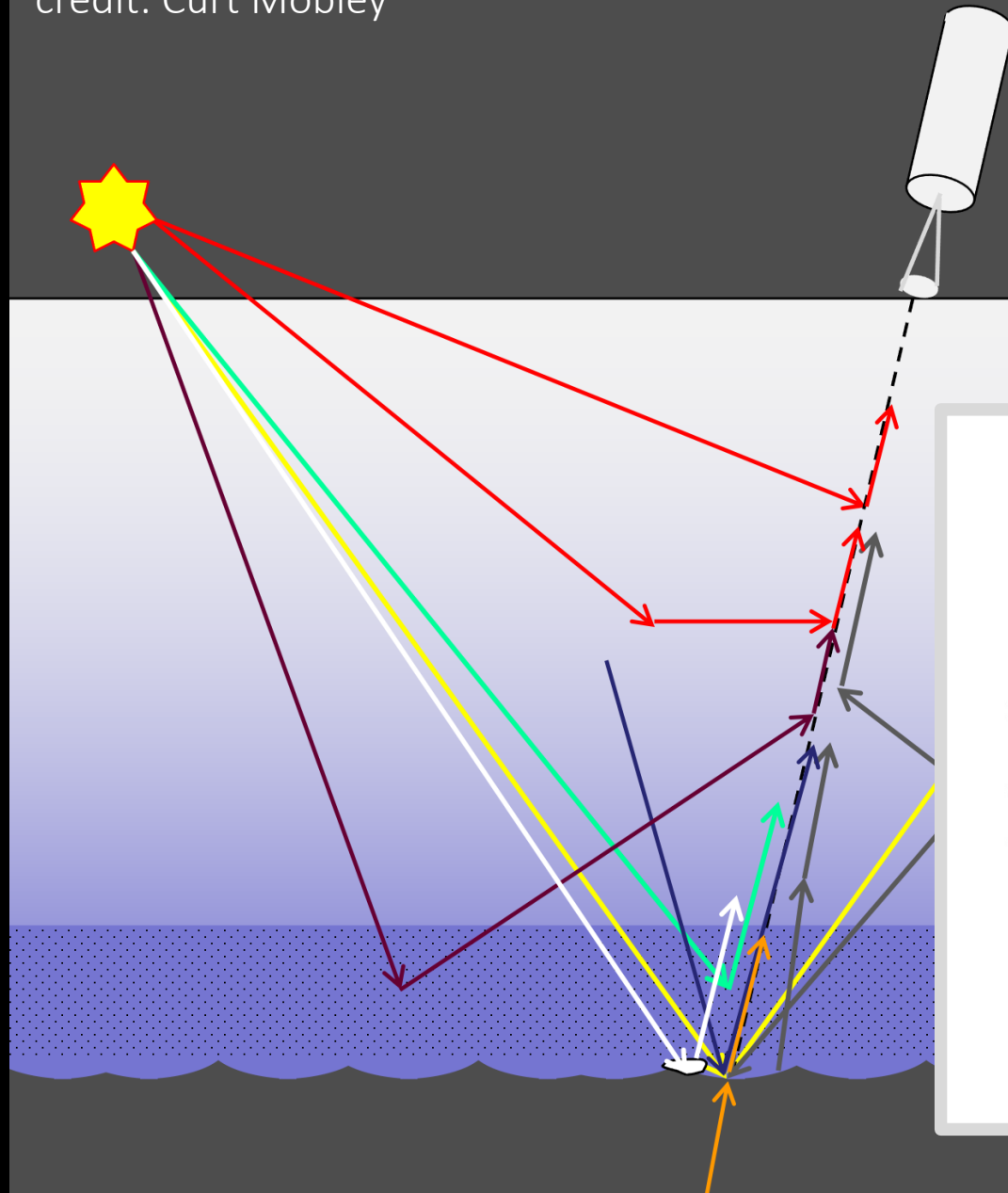
# Coastal Zone Color Scanner 1978-1986



metric	CZCS
primary ocean bands (nm)	443, 520, 550, 670
	<ul style="list-style-type: none"> <li>chl-a + phaeopigments</li> <li>diffuse attenuation at 490 nm</li> </ul>
nadir res.	825 m
nadir swath	1636 km discontinuous operation
tilt	$\pm 20^\circ$ in $2^\circ$ increments
det. per band	1
digitization	8 bits



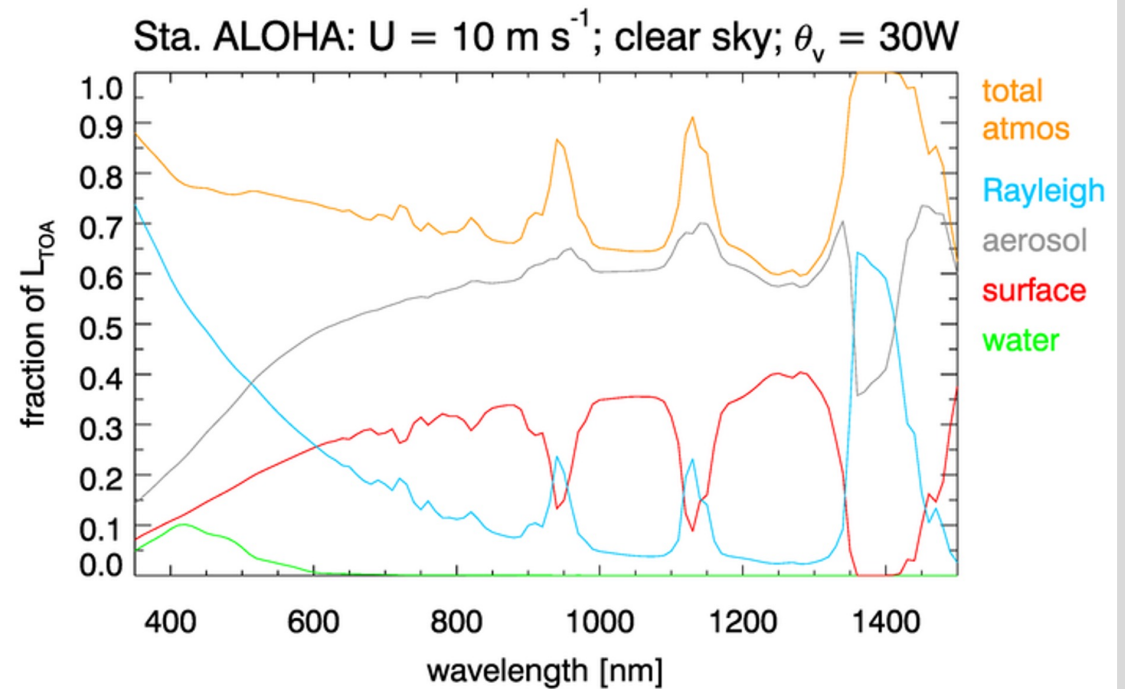
credit: Curt Mobley



contributions to at-sensor radiance

specular reflectance

Rayleigh  
(atmospheric  
gases)



water-leaving  $L_w$

credit: Curt Mobley

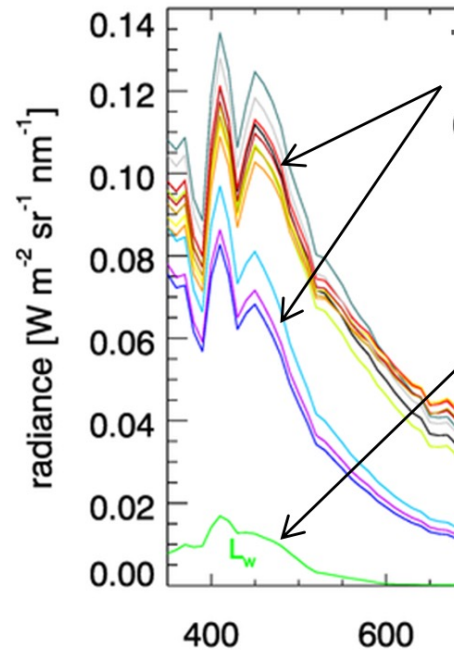
# How can you estimate or extract $L_w$ surface from the measured $L_u$ at the

## 3 approaches:

1) the “black pixel” assumption + extrapolation (Case 1, deep waters only)

2) empirical line fit

3) radiative transfer modeling



### A PRELIMINARY ASSESSMENT OF THE NIMBUS-7 CZCS ATMOSPHERIC CORRECTION ALGORITHM IN A HORIZONTALLY INHOMOGENEOUS ATMOSPHERE

Howard R. Gordon

Department of Physics  
University of Miami  
Coral Gables, Florida 33124

Gordon 2021 recounts the development & validation of the methodologies

#### 1. THE CORRECTION ALGORITHM

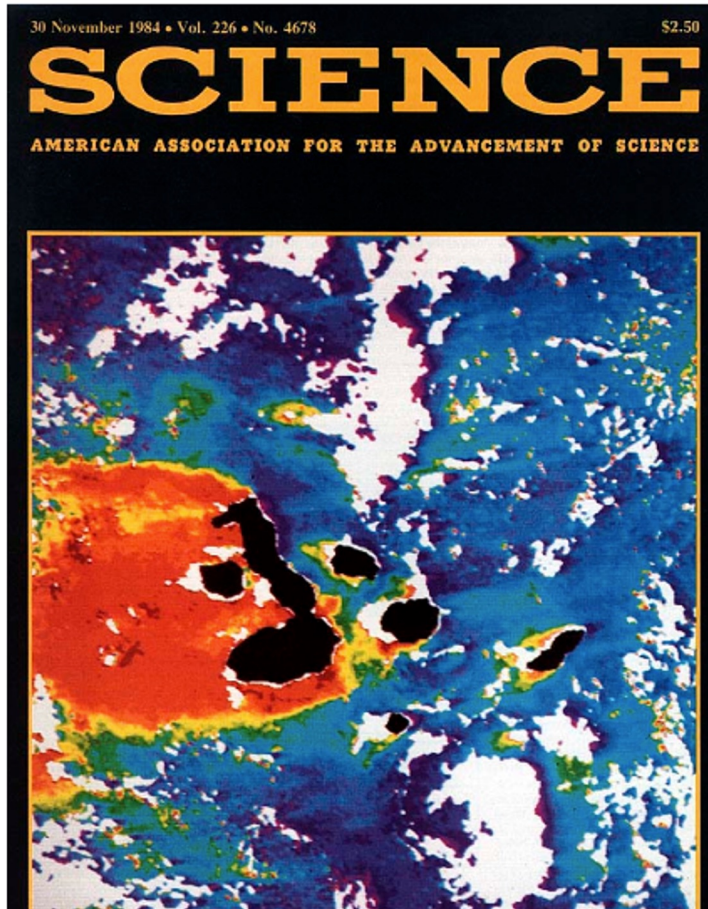
In order to employ the Nimbus-7/CZCS to estimate the concentration of phytoplankton pigments in the oceans, it is necessary to remove the effects of the intervening atmosphere from the satellite imagery. The principal effect of the atmosphere is a loss in contrast caused by the addition of a substantial amount of radiance (path radiance) to that scattered out of the water. Although image enhancement techniques can be used to regain some of the contrast for pattern recognition purposes, the extraction of pigment concentrations requires that the radiance originating from beneath the sea surface be accurately extracted from the imagery (Gordon and Clark, 1980). A technique has been developed (Gordon, 1978) which shows considerable promise (Gordon et al, 1980) for removal of these atmospheric effects and is presently being implemented into the NASA processing system. The basic idea of this atmospheric correction algorithm is two-fold. First, it is noted that to an excellent approximation the total radiance  $L_T^\lambda$  at the sensor at a wavelength  $\lambda$  can be partitioned into a Rayleigh scattering component  $L_R^\lambda$ , an aerosol scattering component  $L_A^\lambda$ , and a component  $t^\lambda L_w^\lambda$  backscattered out of the ocean and transmitted through the atmosphere, i.e.

$$L_T^\lambda = L_R^\lambda + L_A^\lambda + t^\lambda L_w^\lambda \quad (1)$$

where  $L_w^\lambda$  is the radiance backscattered out of the ocean and  $t^\lambda$  is the diffuse transmittance of the atmosphere.  $t^\lambda$  is used rather than the direct transmittance to take into account the fact that when the sensor is viewing a given pixel some of the radiance it receives originated from neighboring pixels.  $t^\lambda$  is given by

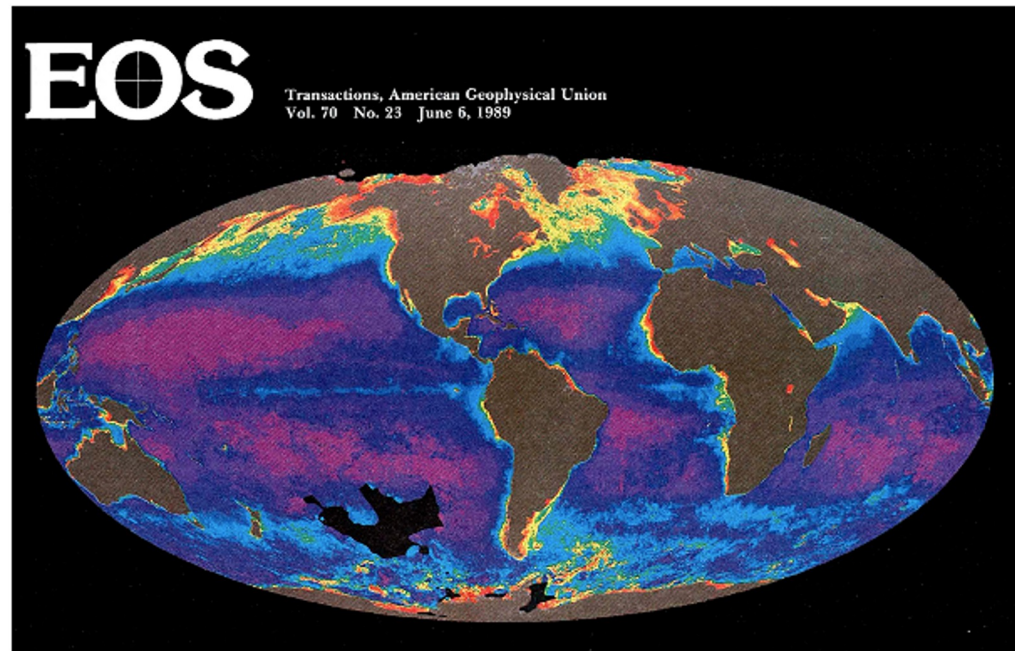


## revolutionized perceptions of the ocean



Satellite Color Observations of the Phytoplankton Distribution in the Eastern Equatorial Pacific During the 1982–1983 El Niño

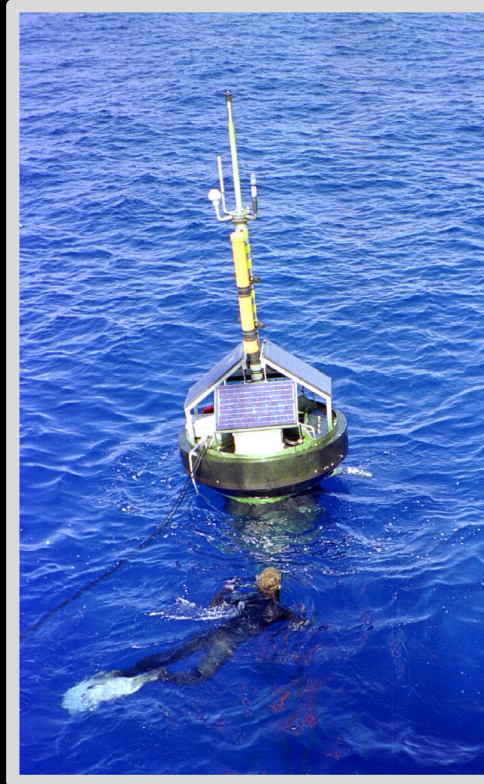
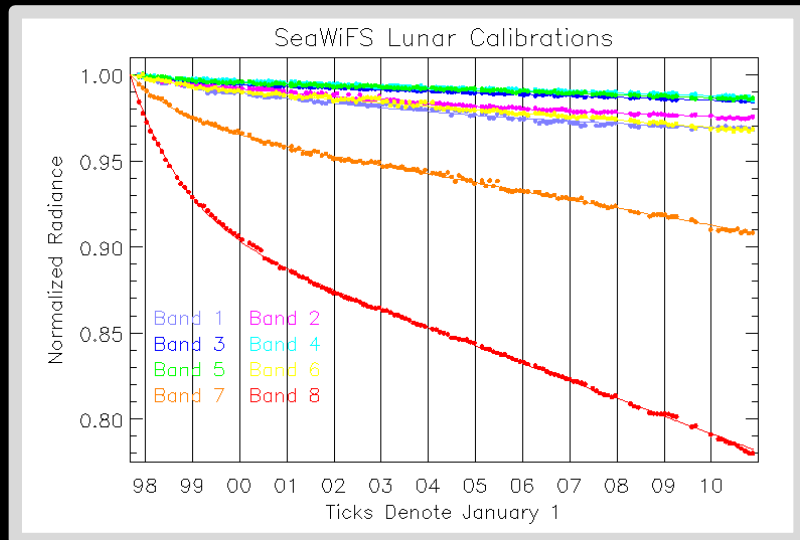
first ever look at global distribution of marine phytoplankton, ocean productivity



Feldman et al. 1984 and 1989

# SeaWiFS 1997-2010

- lunar calibration
- system vicarious calibration



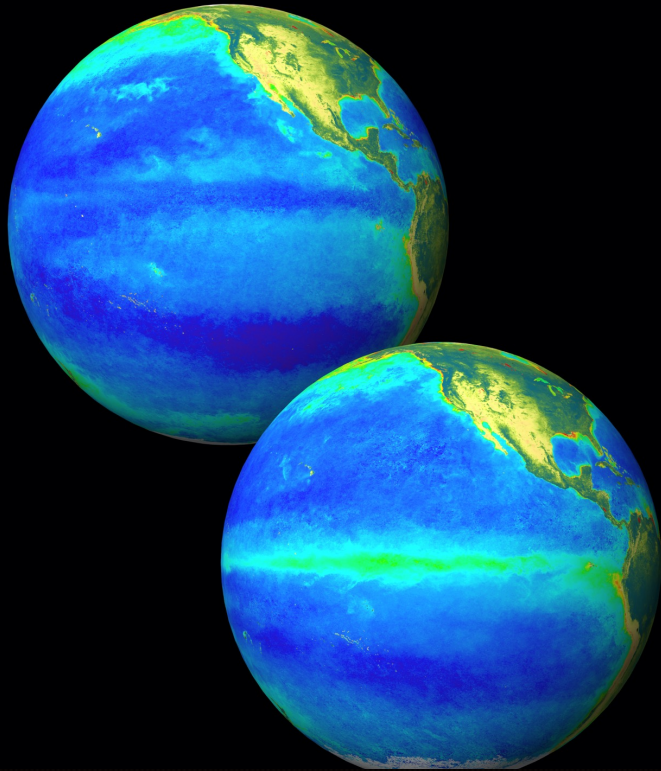
- black pixel assumption revisited
- spectral inversion modeling
- coupled atmosphere-ocean retrievals
- wind speed dependent Sun glint mask
- ocean bidirectional reflectance

metric	CZCS	SeaWiFS
primary ocean bands (nm)	443, 520, 550, 670	412, 443, 490, 510, 555, 670, 765, 865
+ aquatic inherent optical properties + carbon: POC, PIC + photosynthetically available radiation		
nadir res.	825 m	1100 m
nadir swath	1636 km discontinuous operation	1500 km GAC (2-day global) 2875 km LAC
tilt	$\pm 20^\circ$ in $2^\circ$ increments	$\pm 20^\circ$
det. per band	1	4 (TDI) = 1
digitization	8 bits	10 bits GAC 12 bits LAC



# Biospheric Primary Production During an ENSO Transition

Michael J. Behrenfeld,<sup>1\*</sup> James T. Randerson,<sup>2</sup>  
Charles R. McClain,<sup>1</sup> Gene C. Feldman,<sup>1</sup> Sietse O. Los,<sup>3</sup>  
Compton J. Tucker,<sup>1</sup> Paul G. Falkowski,<sup>4</sup> Christopher B. Field,<sup>5</sup>  
Robert Frouin,<sup>6</sup> Wayne E. Esaias,<sup>1</sup> Dorota D. Kolber,<sup>4</sup>  
Nathan H. Pollack<sup>7</sup>

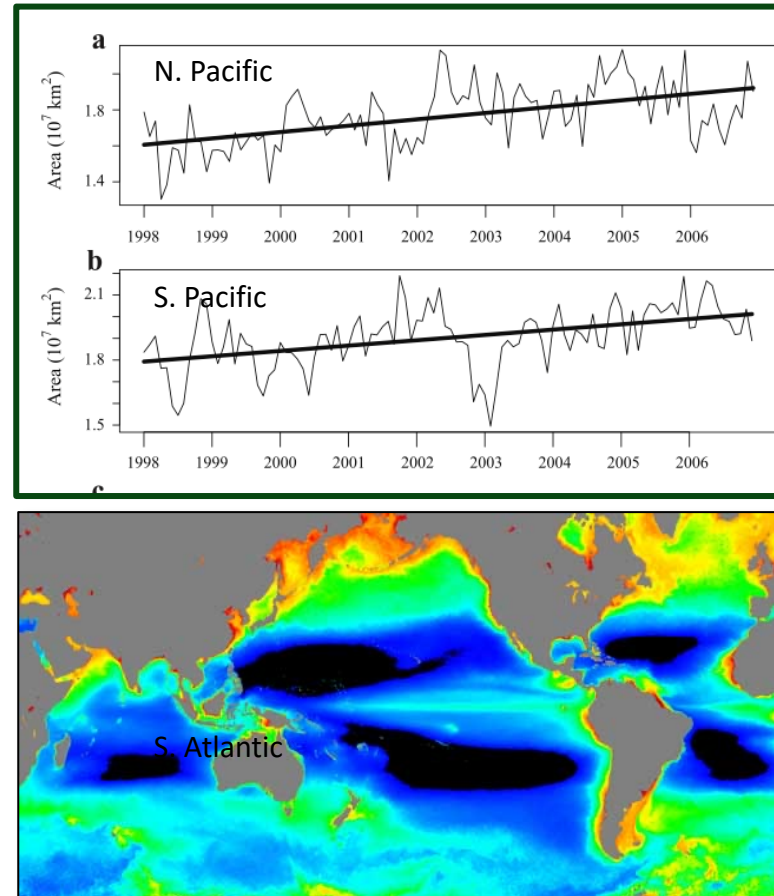


30 March 2001  
**Science**  
Vol. 291 No. 5518  
Pages 2503-2658 59

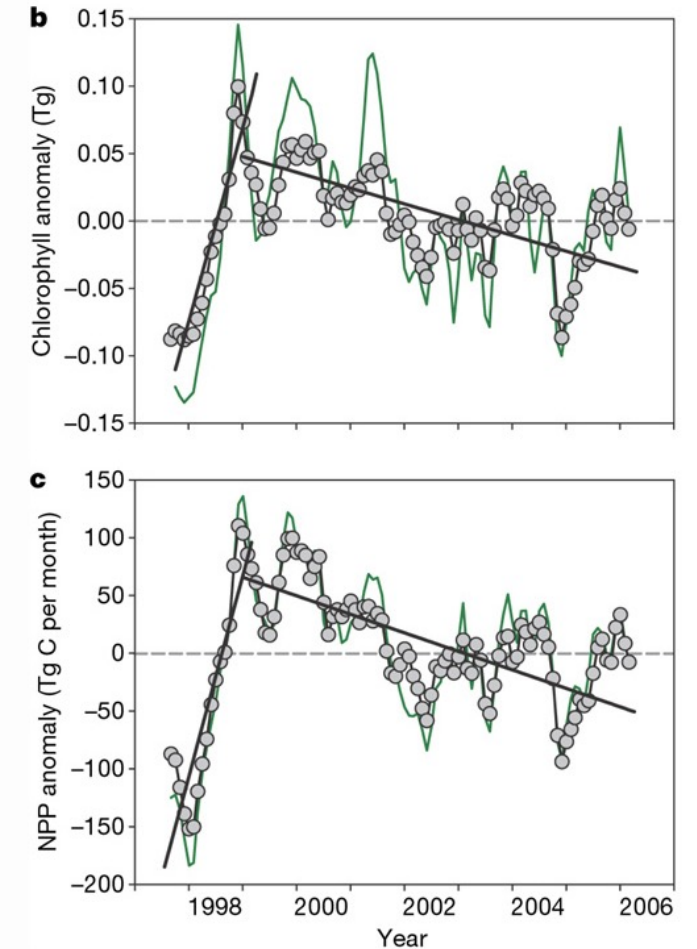
# Climate-driven trends in contemporary ocean productivity

**nature**

Michael J. Behrenfeld<sup>1</sup>, Robert T. O'Malley<sup>1</sup>, David A. Siegel<sup>3</sup>, Charles R. McClain<sup>4</sup>, Jorge L. Sarmiento<sup>5</sup>,  
Gene C. Feldman<sup>4</sup>, Allen J. Milligan<sup>1</sup>, Paul G. Falkowski<sup>6</sup>, Ricardo M. Letelier<sup>2</sup> & Emmanuel S. Boss<sup>7</sup>



Polivina et al. 2008, Geophy. Res. Letters

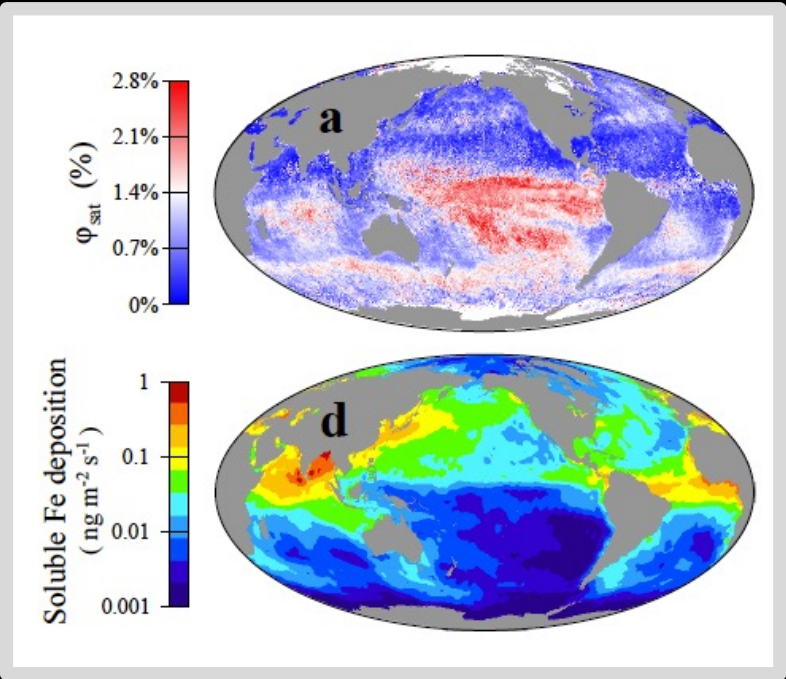


# MODIS

## 1999-present

- Fluorescence band
- SWIR for turbid water
- 250 & 500 m atmosphere & land bands

Behrenfeld et al. 2009, BGS



metric	CZCS	SeaWiFS	MODIS
primary ocean bands (nm)	443, 520, 550, 670	412, 443, 490, 510, 555, 670, 765, 865	412, 443, 488, 531, 547, 667, 678, 748, 869, plus SWIR
	+ fluorescence line height + photosynthetic quantum yield + turbidity index		
nadir res.	825 m	1100 m	1000 m
nadir swath	1636 km discontinuous operation	1500 km GAC (2-day global) 2875 km LAC	2230 km (2-day global)
tilt	±20° in 2° increments	±20°	none
det. per band	1	4 (TDI) = 1	10
digitization	8 bits	10 bits GAC 12 bits LAC	12 bits



SGLI  
2017-  
present

OLCI  
2016-  
present

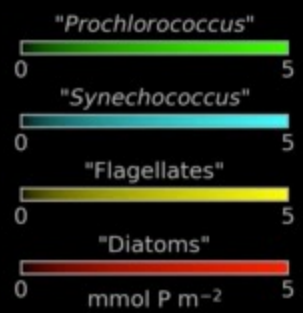
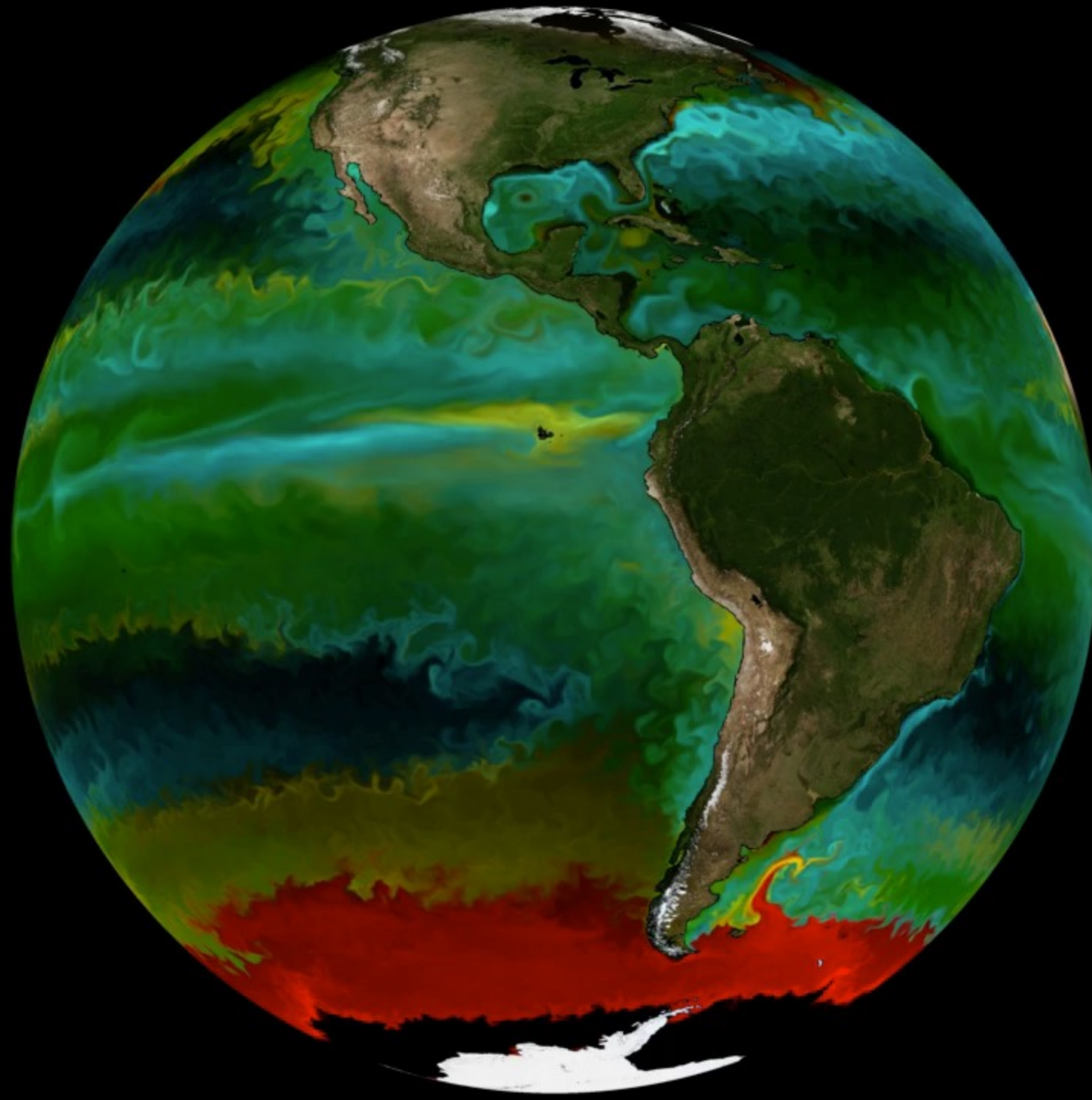
+ GOCI, HICO,  
MERIS, MOS, OCM,  
OSMI, SeaHaWK,  
VIIRS, others ...

metric	CZCS	SeaWiFS	MODIS	SGLI	OLCI
primary ocean bands (nm)	443, 520, 550, 670	412, 443, 490, 510, 555, 670, 765, 865	412, 443, 488, 531, 547, 667, 678, 748, 869, plus SWIR	380, 412, 443, 490, 529, 566, 672(P), 763, 867(P), 1055, SWIR (IRS)	400, 412, 443, 490, 510, 560, 620, 665, 674, 682, 709, ..., 765, ..., 866, 1013
nadir res.	825 m	1100 m	1000 m	250 m full 1000 m red.	300 m full 1200 m red.
nadir swath	1636 km discontinuous operation	1500 km GAC (2-day global) 2875 km LAC	2230 km (2-day global)	1150 km (3+day global)	1270 km (3+day global)
tilt	$\pm 20^\circ$ in $2^\circ$ increments	$\pm 20^\circ$	none	none	none
det. per band	1	4 (TDI) = 1	10	pushbroom	pushbroom
digitization	8 bits	10 bits GAC 12 bits LAC	12 bits		

## Part 3

Where are we going?





# Welcome to the International Ocean Colour Coord

Promoting the application of remotely-sensed ocean-colour and inland water radiometry in coastal and aquatic environments, through coordination, training, liaising between providers and provision of expert advice.

Missions & Instruments >

Satellite and In Situ Data

Software

Tutorials/Books

Workshops and Conferences

Ocean Colour Bibliography

Ocean Colour Programs and  
Institutions

global *hyperspectral*

cubesats

LIDAR

polarimetry

geostationary

high spatial resolution

L8 tomorrow:

*“PACE in a  
consumer’s  
market”*



# NASA Plankton, Aerosol, Cloud, ocean Ecosystem (PACE) mission

## The PACE Ocean Color Instrument (OCI):

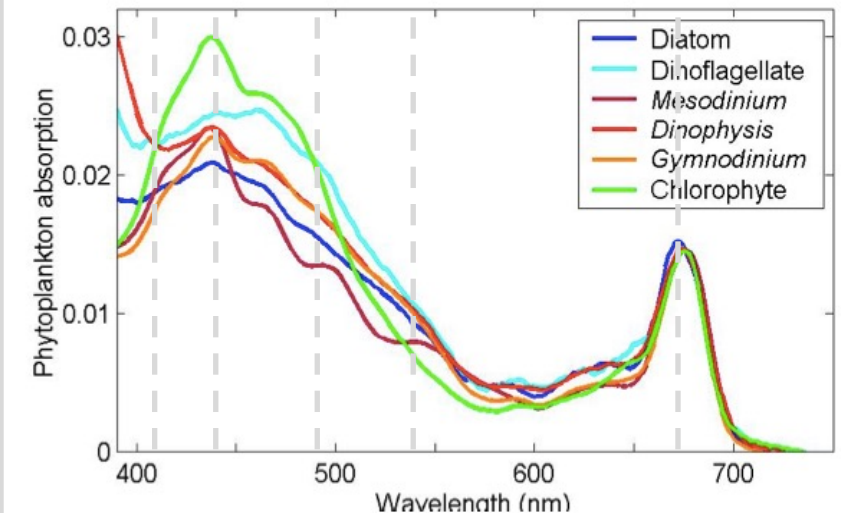
- (320) 340 – 890 nm, 5 nm resolution, 2.5 nm steps
- plus, 940, 1038, 1250, 1378, 1615, 2130, and 2250 nm
- *single science pixel to mitigate image striping*
- 1 – 2 day global coverage
- ground pixel size of 1 km<sup>2</sup> at nadir
- $\pm 20^\circ$  fore/aft tilt to avoid Sun glint
- twice monthly lunar calibration
- **January 2024 launch**

## 2 contributed multi-angle polarimeters:

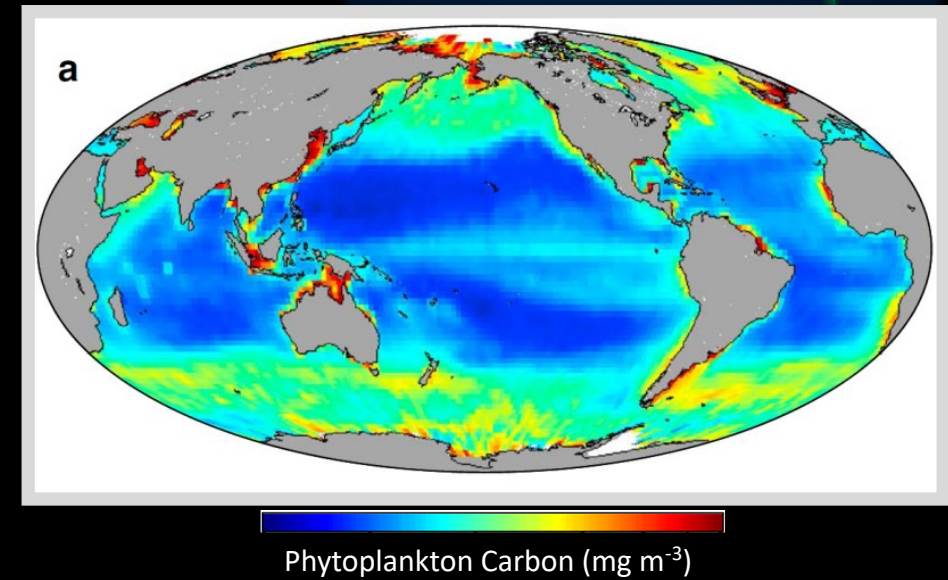
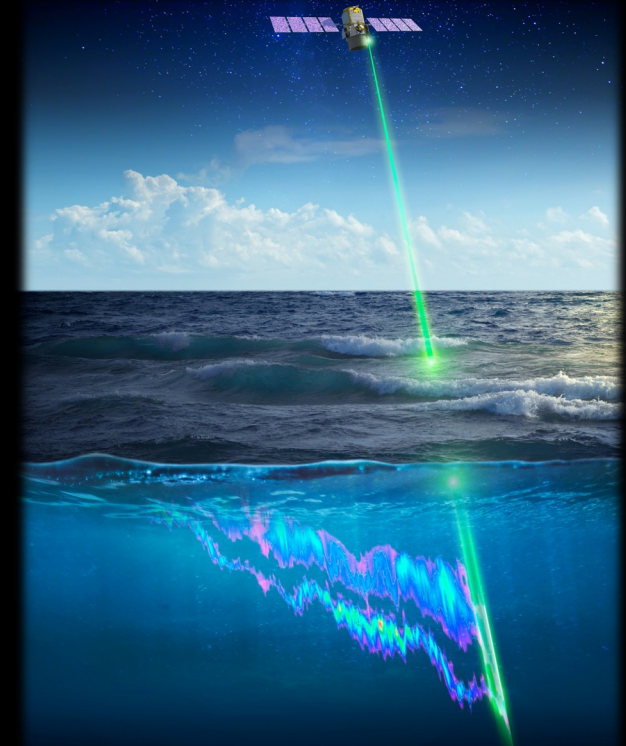
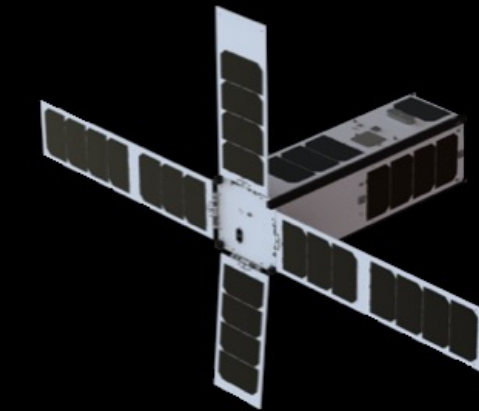
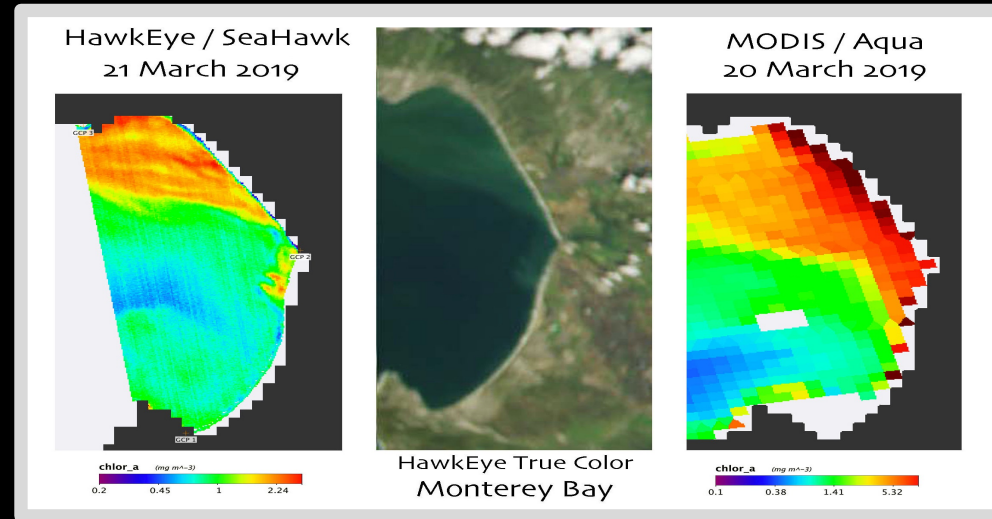
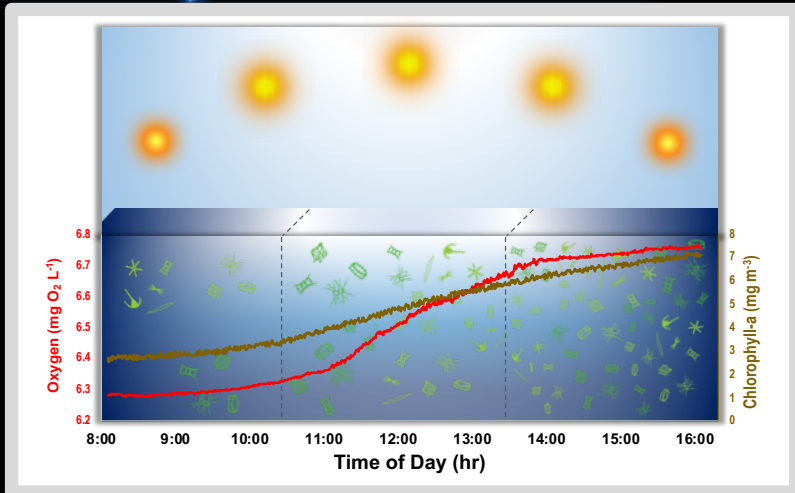
- **HARP-2 (UMBC)**  
4 visible-NIR bands  
**Wide swath and hyper-angular**  
2.5-km at nadir
- **SPEXone (SRON/Airbus)**  
**Hyperspectral UV-NIR and narrow swath**  
5 angles  
3 km at nadir



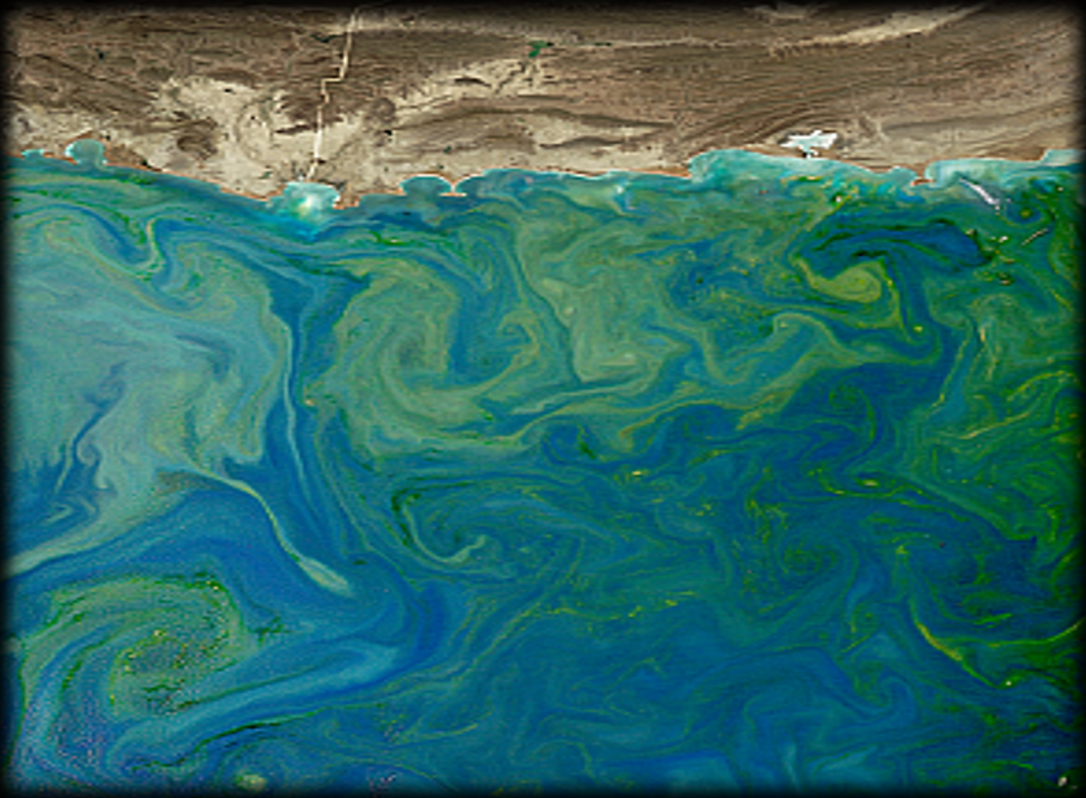
[@NASAOcean](https://pace.gsfc.nasa.gov)



# Looking forward







see also: McClain et al. 2022, Frontiers in Remote Sensing