

# Pre-Aerosol, Cloud, ocean Ecosystem (PACE) mission

- 2010 Report - *Responding to the Challenge of Climate and Environmental Change: NASA's Plan for a Climate-Centric Architecture for Earth Observations and Applications from Space* (<http://science.nasa.gov/earth-science/>)
- PACE will make new, global ocean color radiometry measurements essential for understanding ocean biology and ecology, and the carbon cycle and its relationship to climate change, along with *plans for polarimetry* measurements to provide extended data records on clouds and aerosols
- Here we present results from the PACE Science Definition Team which has **\*\*nearly\*\*** completed its report
- Next step will be for NASA HQ to decide how it will implement the PACE mission **\*\*but\*\*** launch date is planned for 2019
- PACE's name will likely change to reflect its marine focus – A SDT suggestion is “Pelagic And Coastal Ecosystem (PACE) mission”

# Today's Session

## **Session 2. Ocean biogeochemistry from satellite data**

**Chair: *David Siegel (Univ. of California, Santa Barbara)***

14:00 A tutorial on satellite ocean color remote sensing (*David Siegel, Univ. of California, Santa Barbara*)

14:45 Science goals and objectives from the NASA PACE (Pre-Aerosol, Clouds, and ocean Ecosystem) Science Definition Team report (*Michael Behrenfeld, Oregon State Univ.*)

15:30 Break

16:00 NASA PACE Science Definition Team report approach and recommendations (*Carlos Del Castillo, Johns Hopkins Univ.*)

16:45 Panel discussion and community input to PACE

# Satellite Ocean Color Overview & the PACE Science Definition Team

Dave Siegel – UC Santa Barbara

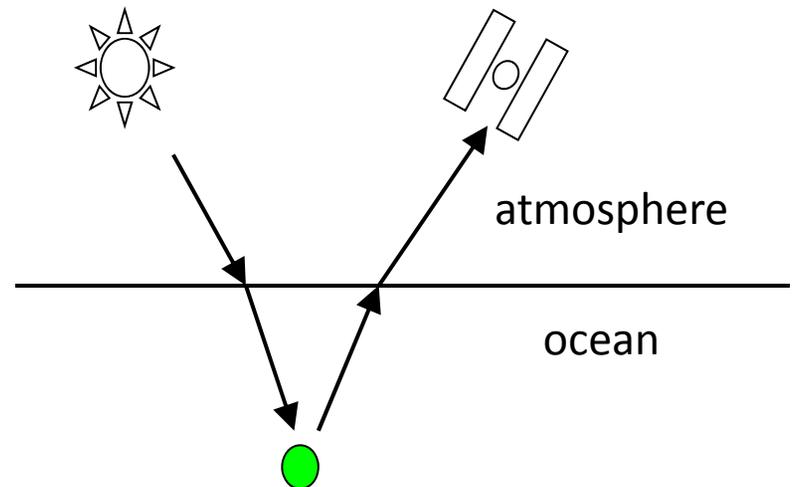
With help from Mike Behrenfeld, Stéphane Maritorena,  
Chuck McClain, Bryan Franz, Jim Yoder, David Antoine,  
Norm Nelson, Claudia Mengalt, Bob Evans, Carlos Del  
Castillo & many more

# Talk Objectives

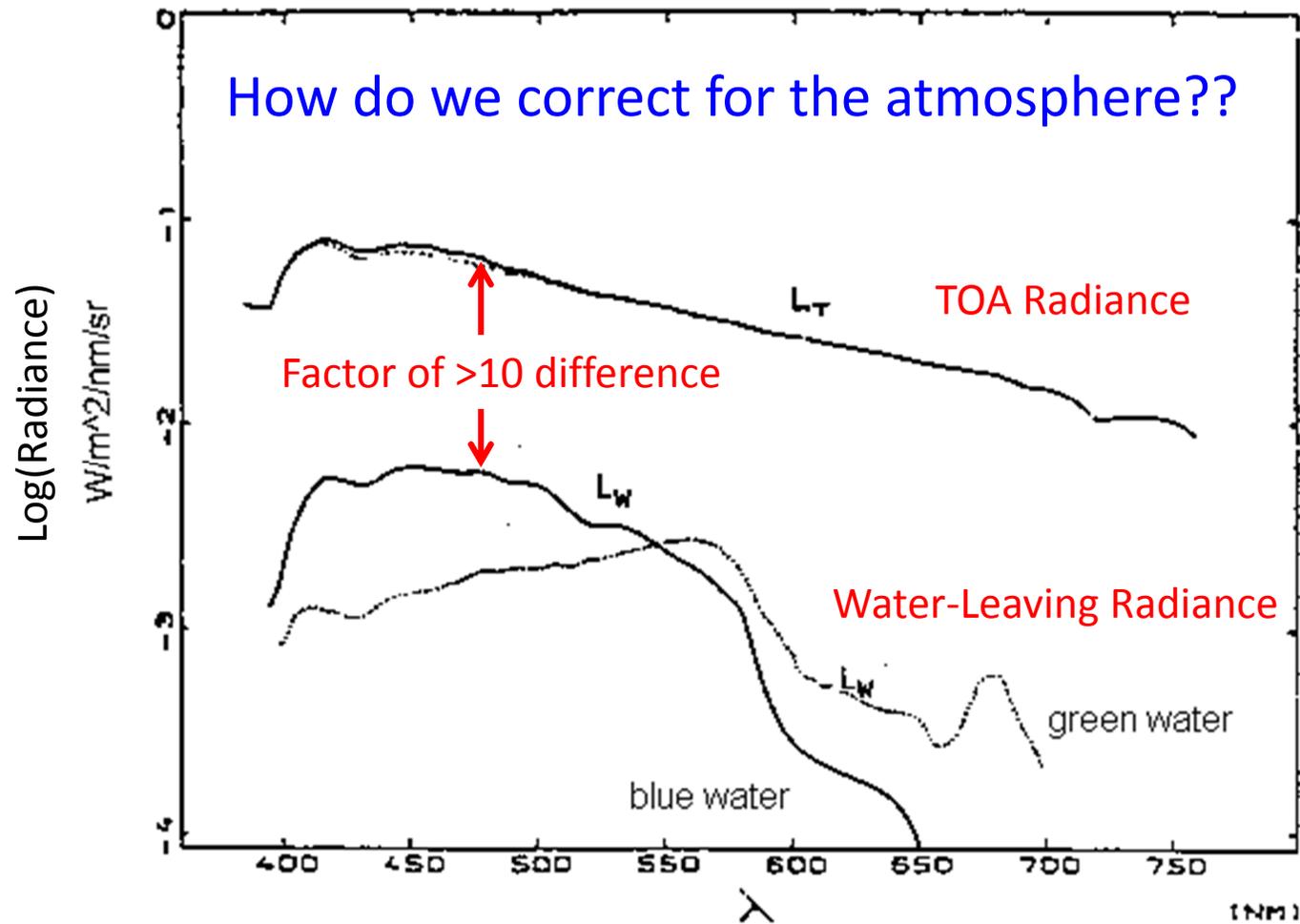
- Review satellite ocean color basics
- Highlight important findings from the SeaWiFS, MODIS & MERIS era
- Provide background for future missions such as PACE...

# What is Satellite Ocean Color?

- The spectrum of the light reflected from the sea
- Water-leaving photons are backscattered & not absorbed (*ocean optics & relationship to ecology*)
- To see the oceans from space, we must account for the atmosphere (*atmospheric correction*)
- Ocean color signals are small (*great measurements require great care...*)



# Bright Atmosphere – Dark Ocean



# Atmospheric Correction

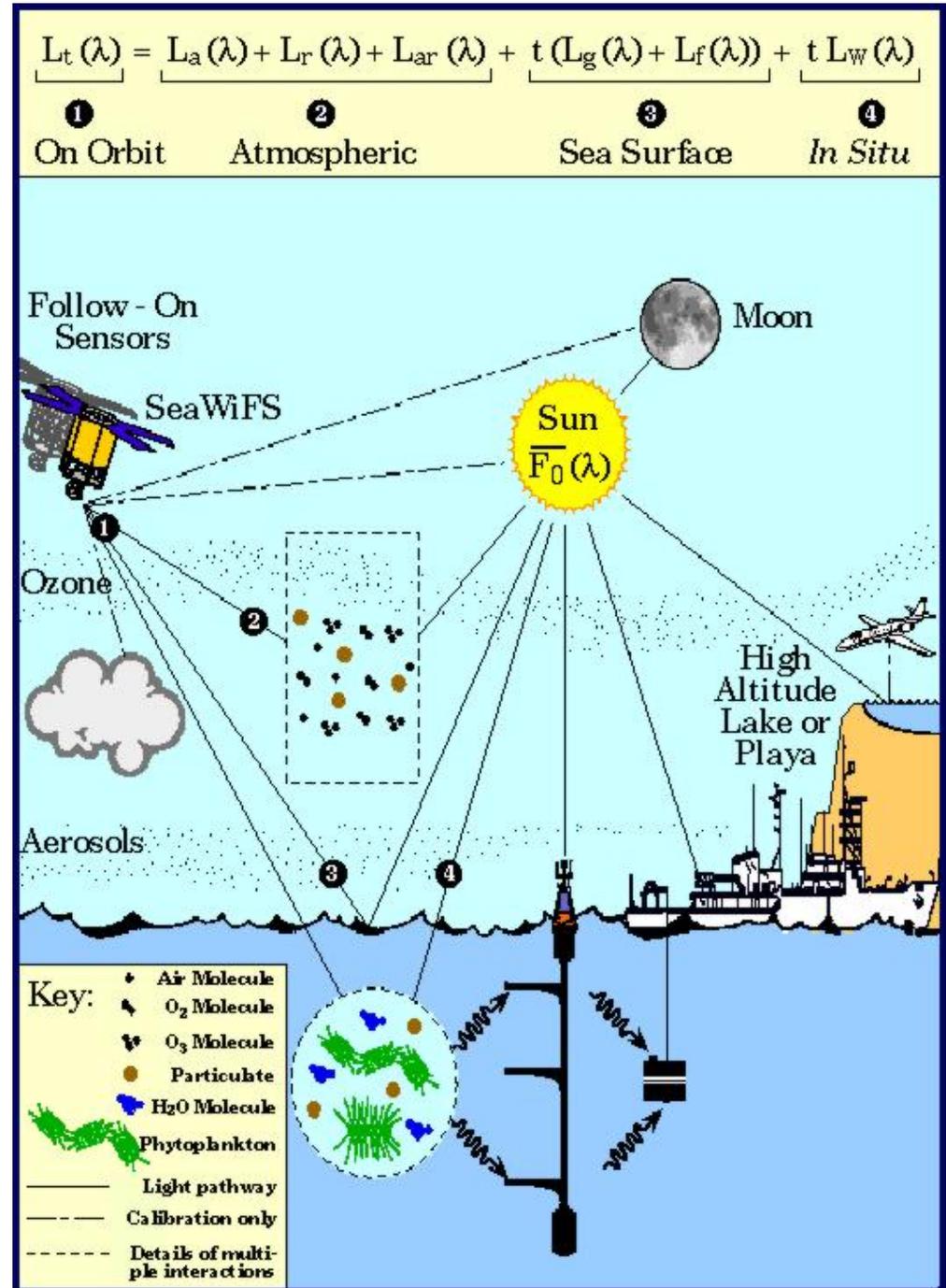
Radiance budget for satellite radiance

Measure  $L_t(\lambda)$

Model  $L_r(\lambda)$ ,  $L_f(\lambda)$  &  $L_g(\lambda)$

Unknowns are  $L_w(\lambda)$ ,  
 $L_a(\lambda)$  &  $L_{ar}(\lambda)$

It is  $L_w(\lambda)$  we need to know...



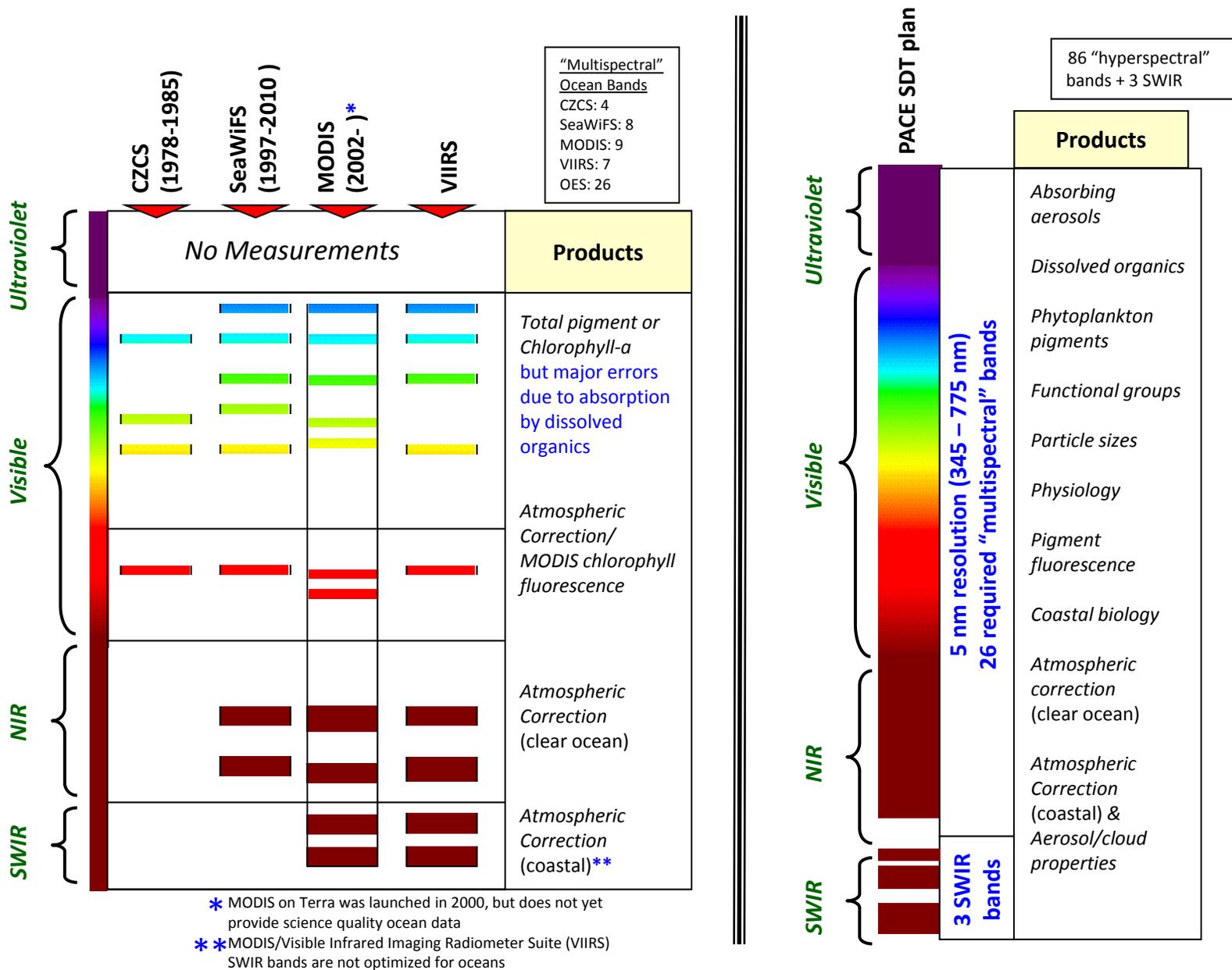
# Atmospheric Correction Basics

- **Goal:** *Subtract off the atmospheric path signals from the satellite measurement*
- Model Rayleigh scattering, molecular absorption & interface reflectance terms
- Hard part is aerosol radiances
  - Use near-infrared bands to model aerosol radiances in the visible (in the future UV bands too)
  - Requires detailed models of aerosol optical properties that can be diagnosed from NIR

# Ocean Color Sensor Requirements

- An ocean color sensor must...
  - Have *necessary* spectral resolution
  - Accurate (gains must be well known)
  - Stable (changes in gains must be known)
  - Well characterized (polarization, spectral, etc.)
- Devil is in the details...

# Comparison of Spectral Coverage

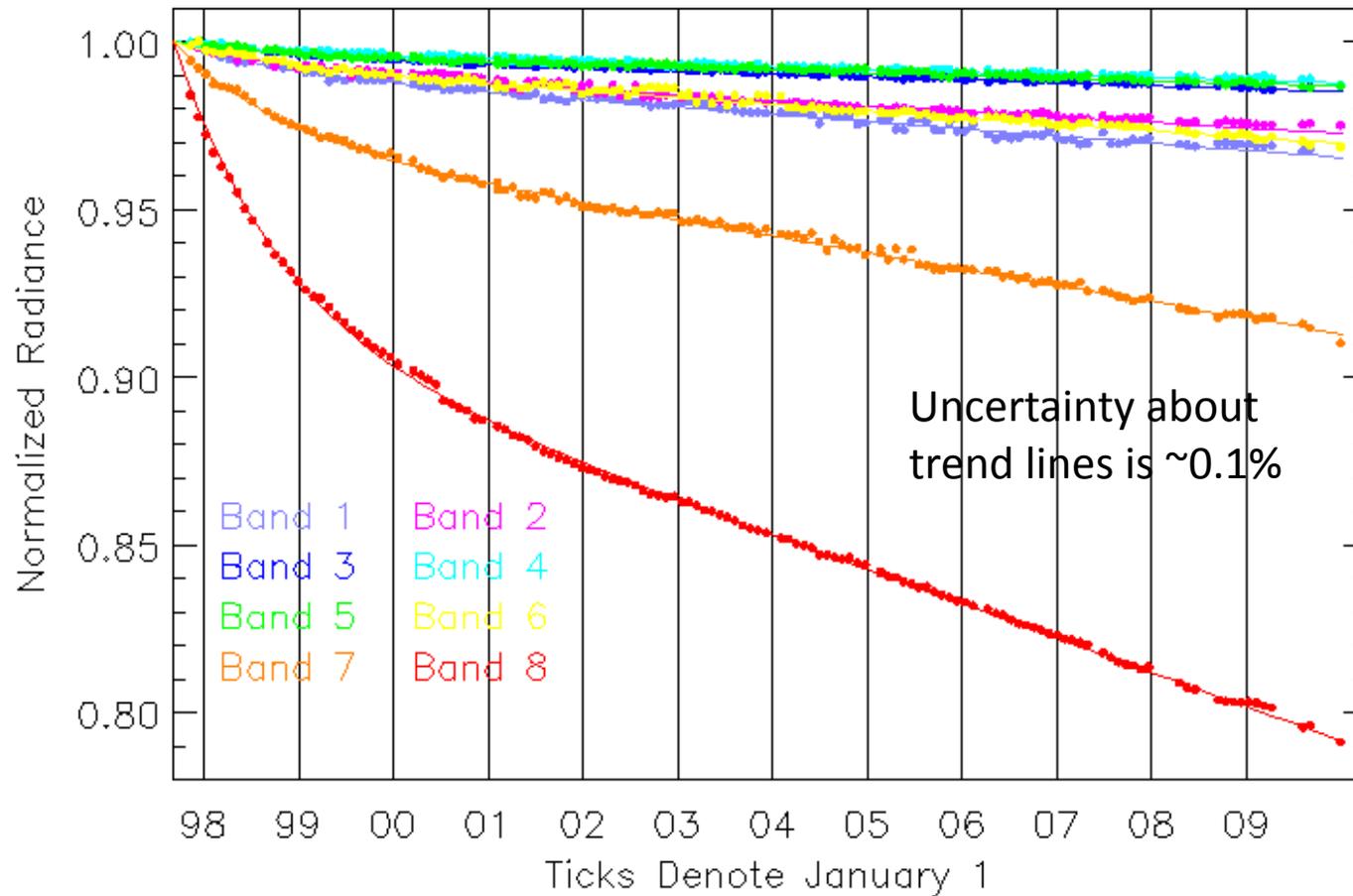


# Satellite Sensor Gains

- Accuracy requirements mean that satellite gains need to be known to better than 0.5%
- Accurate ground data are required
  - End-to-end test -> vicarious calibration
- Changes in these gains must be monitored
  - Lunar viewing or multiple on-board sources
- Other “issues” creep in (like changes in polarization sensitivity or spectral responses)

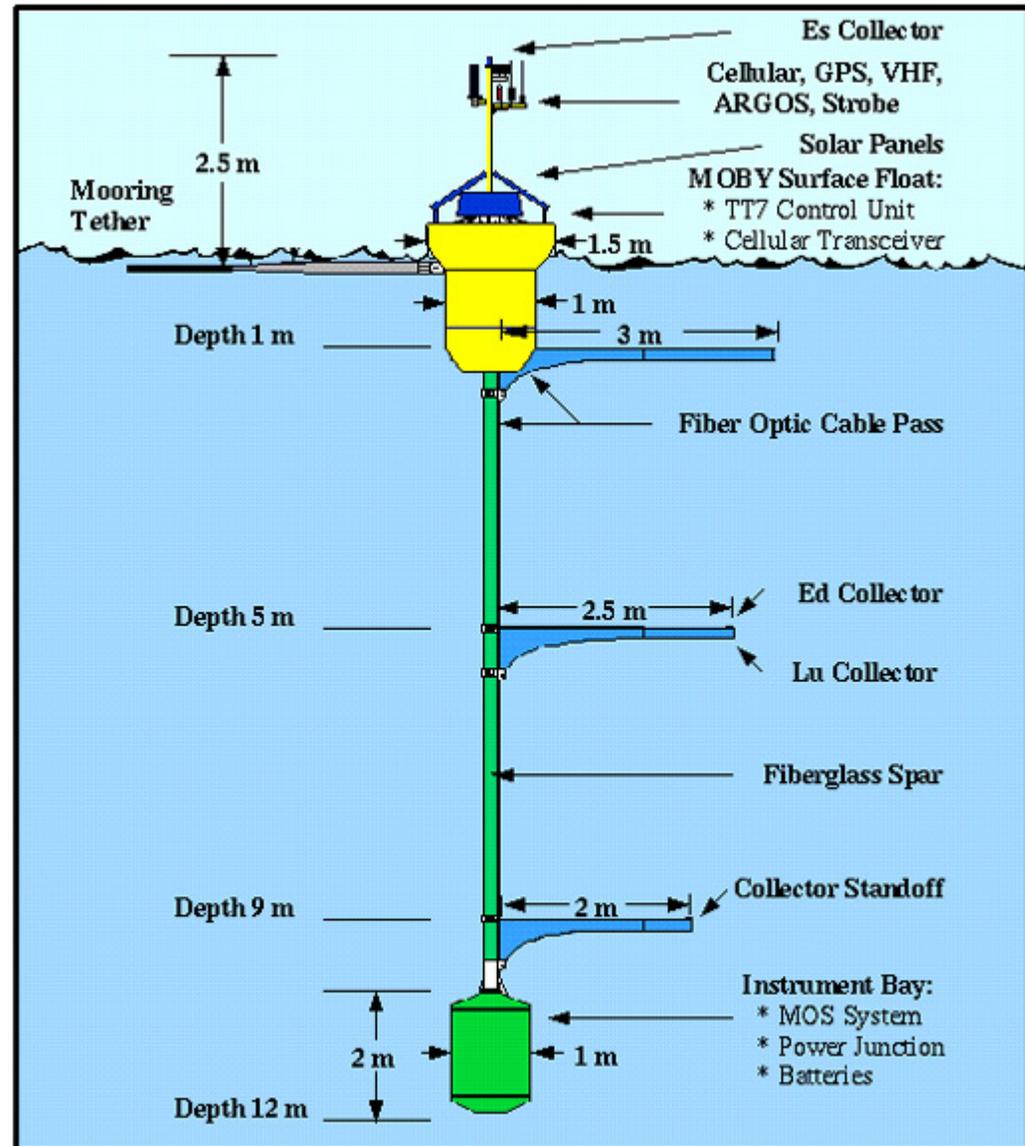
# SeaWiFS Lunar Calibration

Used to monitor sensor gain *changes* over time



# Marine Optical BouY

- Accurate source for vicarious calibration
- Used with models to set absolute gains
- Located off Hawaii and operational since 1996
- Difficulty with glint & nadir looking satellites (MODIS)
- Other ground obs are used as well



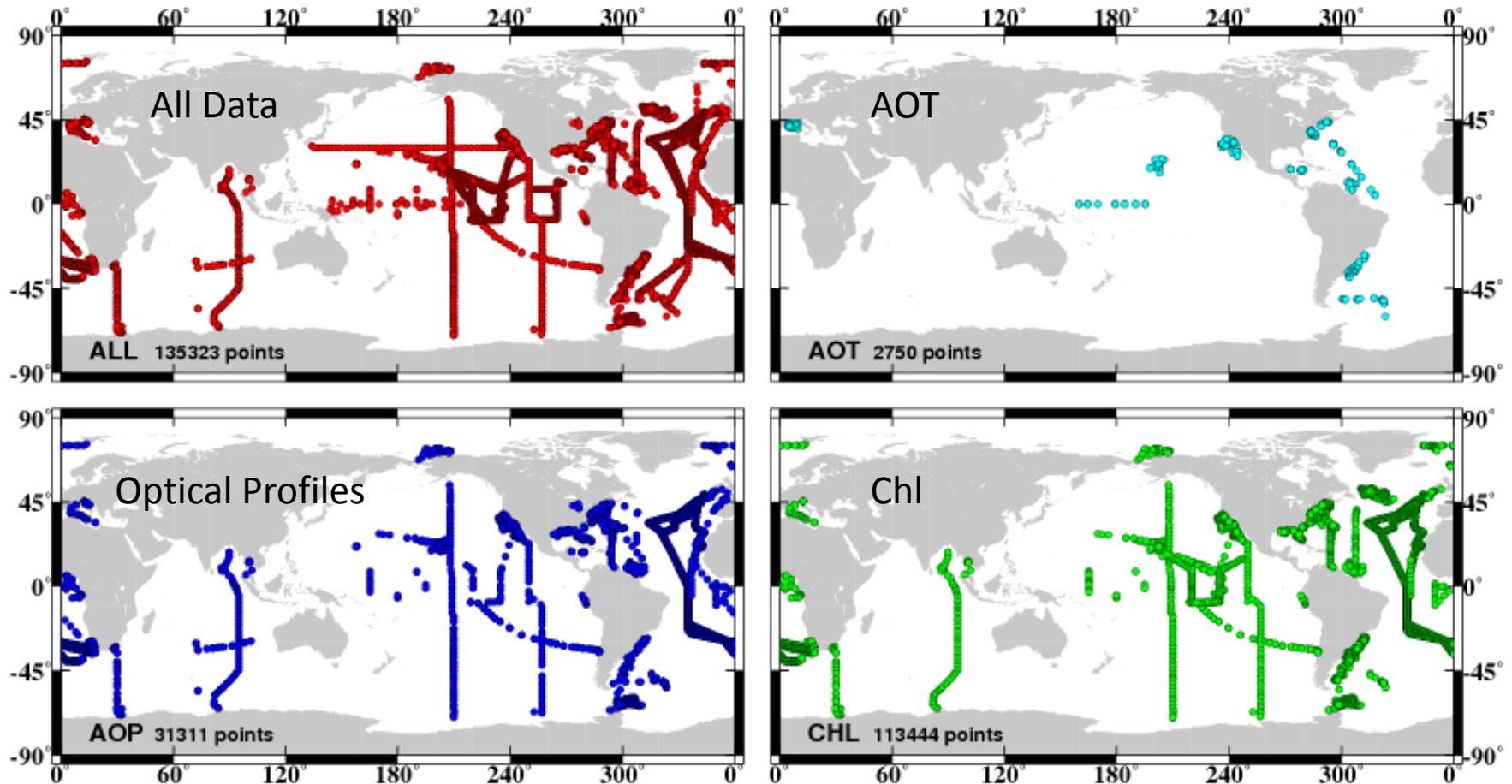
# Satellite Sensor Issues

- Accuracy requirements mean that satellite gains need to be known to better than 0.005
- Accurate ground data are required - MOBY+  
End-to-end test -> vicarious calibration
- Changes in these gains must be monitored  
Lunar viewing or multiple on-board sources
- Other “issues” can creep in (like changes in polarization sensitivity or spectral responses)
- *Reprocessing is key...*

# Bio-Optical Modeling

- **Goal:** *Relate water-leaving radiance spectra to useful in-water properties*
- Both empirical & semi-analytical approaches
- Need simultaneous measurements of water-leaving radiance & useful in-water properties

# Global In Situ Data - SeaBASS

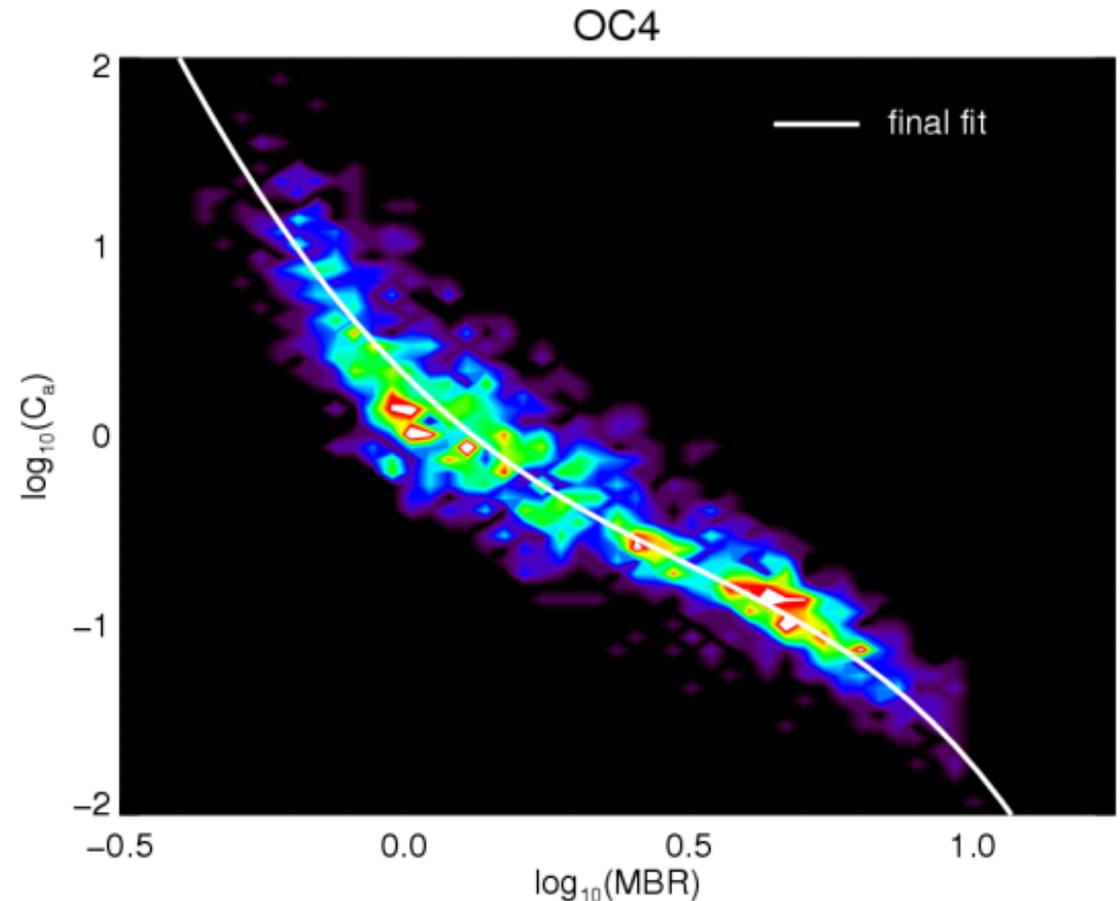


10 Jul 2009 ~ SeaBASS data points

# Bio-Optical Algorithm

OC4v6 used for  
SeaWiFS

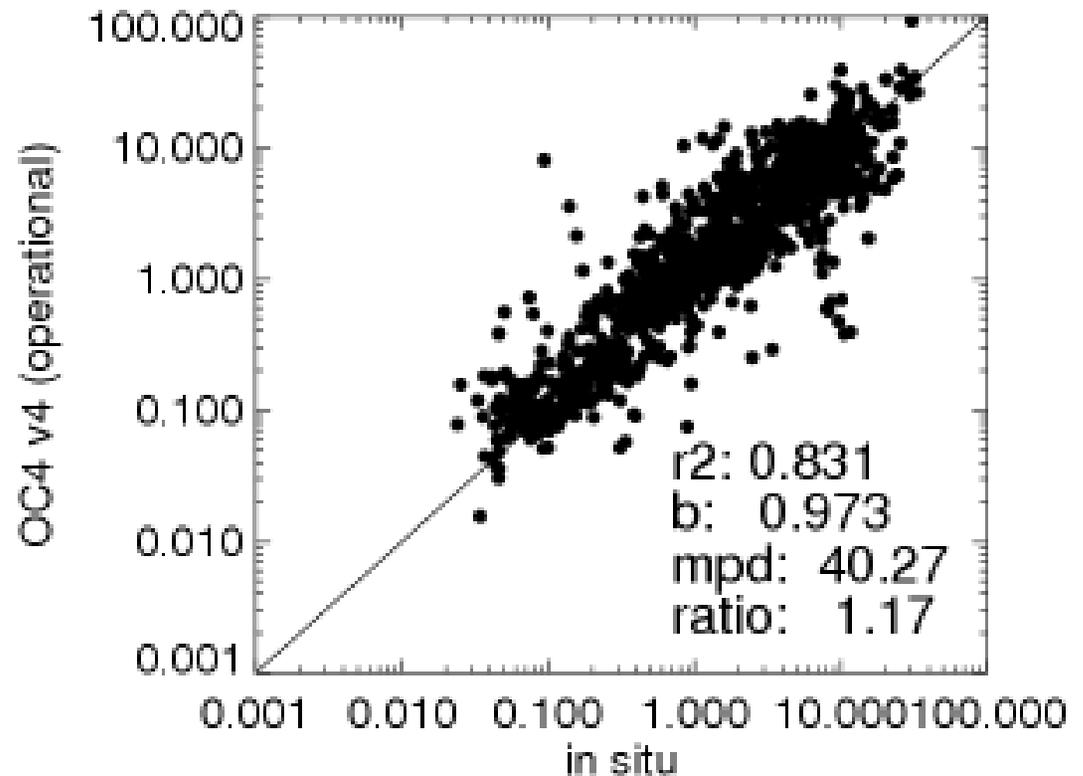
- Empirical
- Maximum Band  
Ratio of  $L_{WN}(\lambda)$ 's  
(443/555, 489/555 & 510/555)



From GSFC reprocessing page following O'Reilly et al. [1998] JGR

# End-to-End Validation

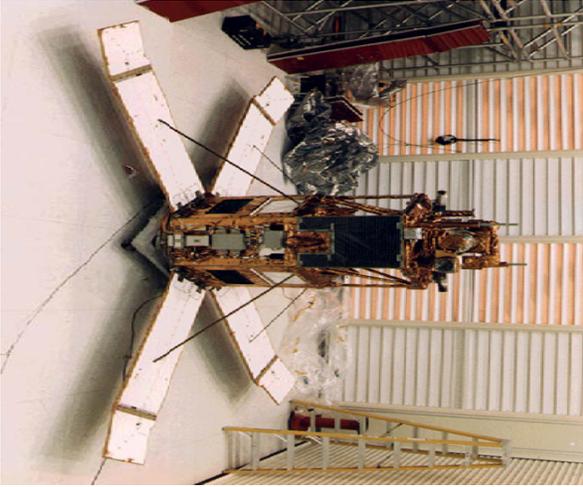
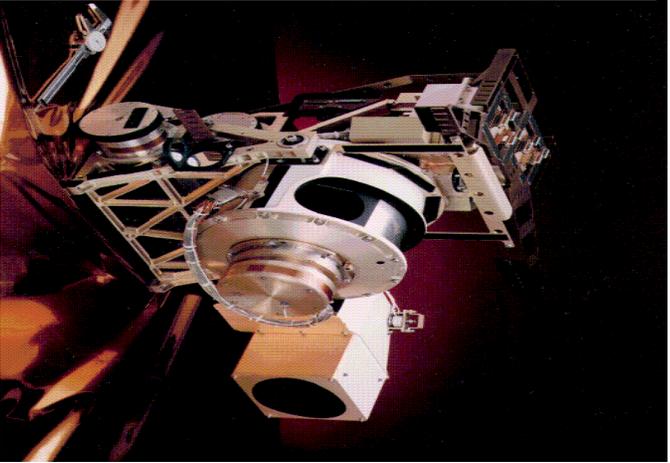
- OC4v6 w/ SeaWiFS
- Global match-up data set of SeaWiFS & in situ Chl's
- Regression & the fit slope are very good



# Ocean Color Components

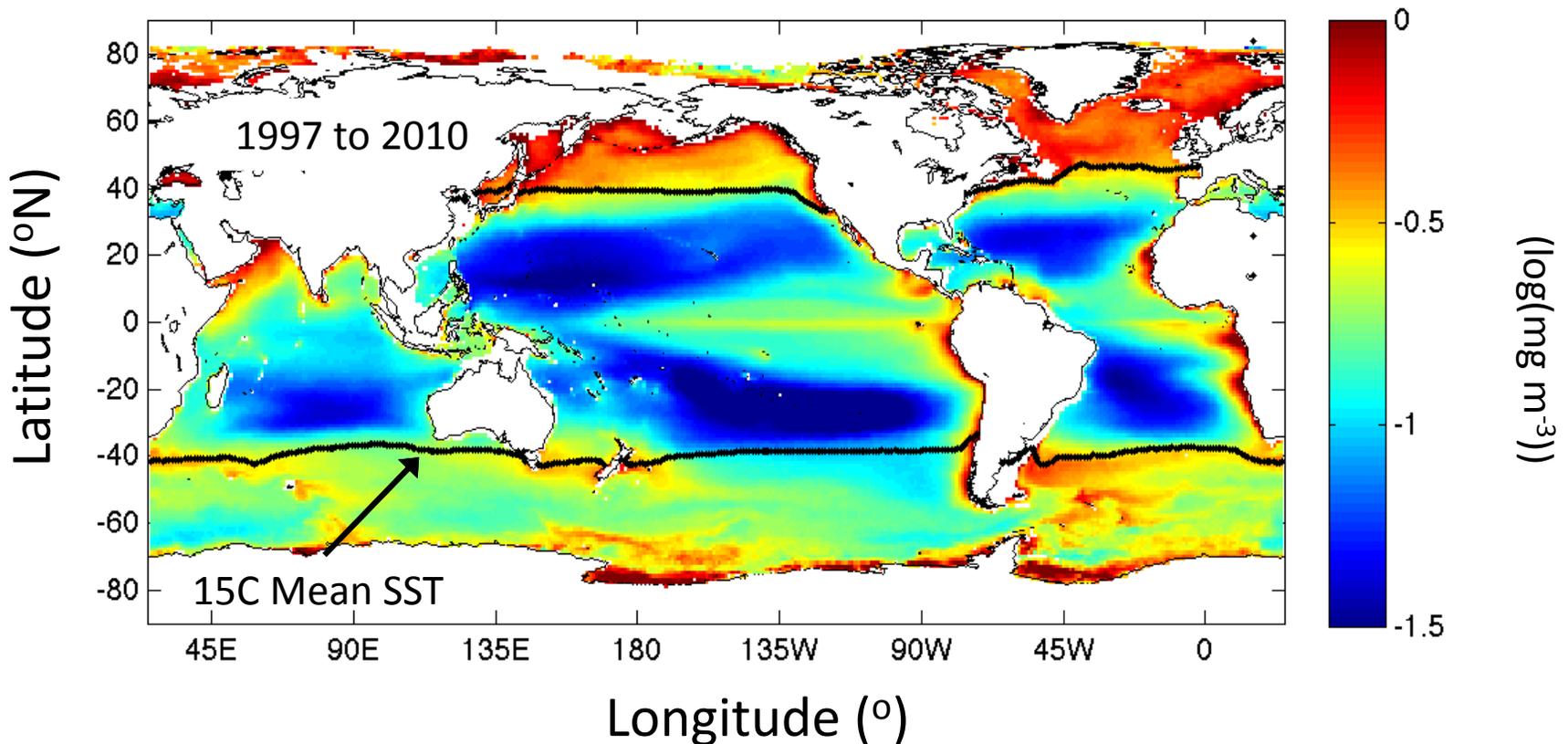
- Ocean color signals are small (*great measurements require great care...*)
- We must account for the atmosphere (*radiative transfer in the atmosphere*)
- Relate water-leaving radiance to bio-optical properties (*ocean optics & relationship to ecology*)
- Validate we can do this end-to-end through the entire system (*this requires periodic reprocessing*)

# SeaWiFS: 1997-2010



*Death of SeaWiFS: 1997-2011*

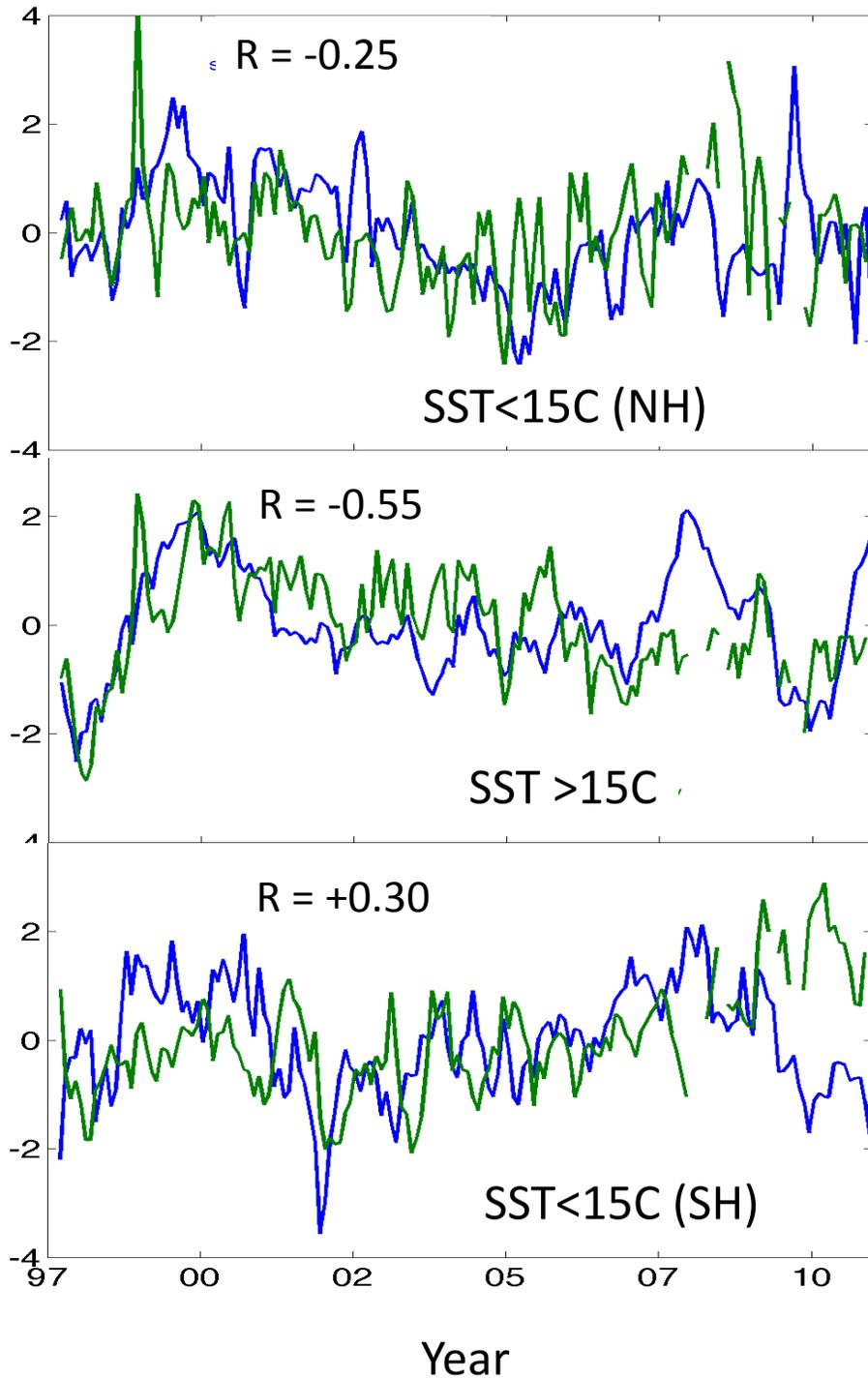
# SeaWiFS Mission Mean Chlorophyll



Basic patterns are well predicted by large scale wind driven circulation as suggested by Harald Sverdrup > 50 years ago!!

What does SeaWiFS tell us about change over its 13 years in space?

Standardized Monthly Anomalies for  $\log(\text{Chl}_{\text{OC4}})$  and  $-\text{SST}$



Decreasing SST  
↑  
Increasing  $\text{Chl}_{\text{OC4}}$

### Trends by Region

Not Significant  
 $+0.035 \text{ } ^\circ\text{C}/\text{y}$

$-0.18 \text{ } \%/y$   
 $+0.015 \text{ } ^\circ\text{C}/y$

Increasing SST  
↓  
Decreasing  $\text{Chl}_{\text{OC4}}$

$+0.83 \text{ } \%/y$   
 $+0.029 \text{ } ^\circ\text{C}/y$

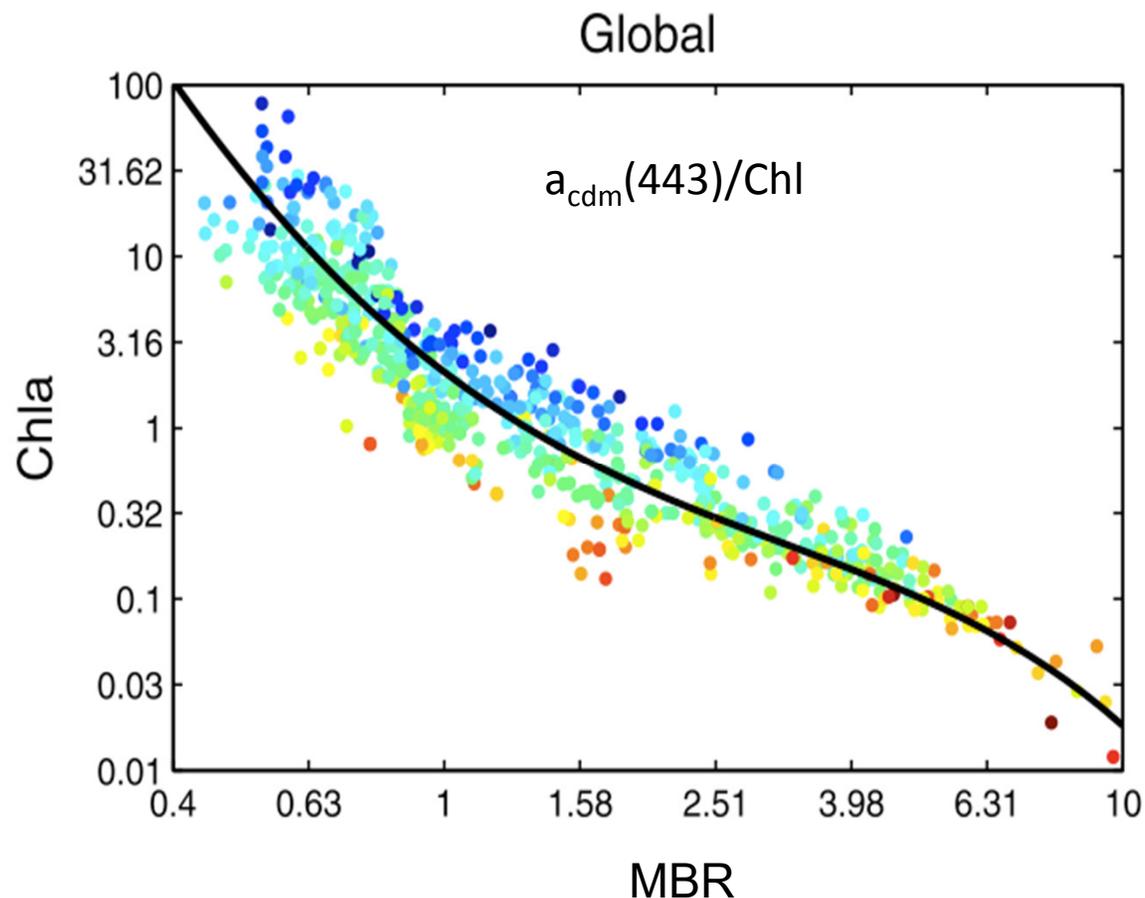
Is this the whole story?

# Operational Chlorophyll Algorithm

OC4v6 algorithm

- Empirical
- Maximum Band Ratio of  $L_{wN}(\lambda)$ 's  
(443/555, 489/555 & 510/555)

Need to remove  
the CDOM signal!

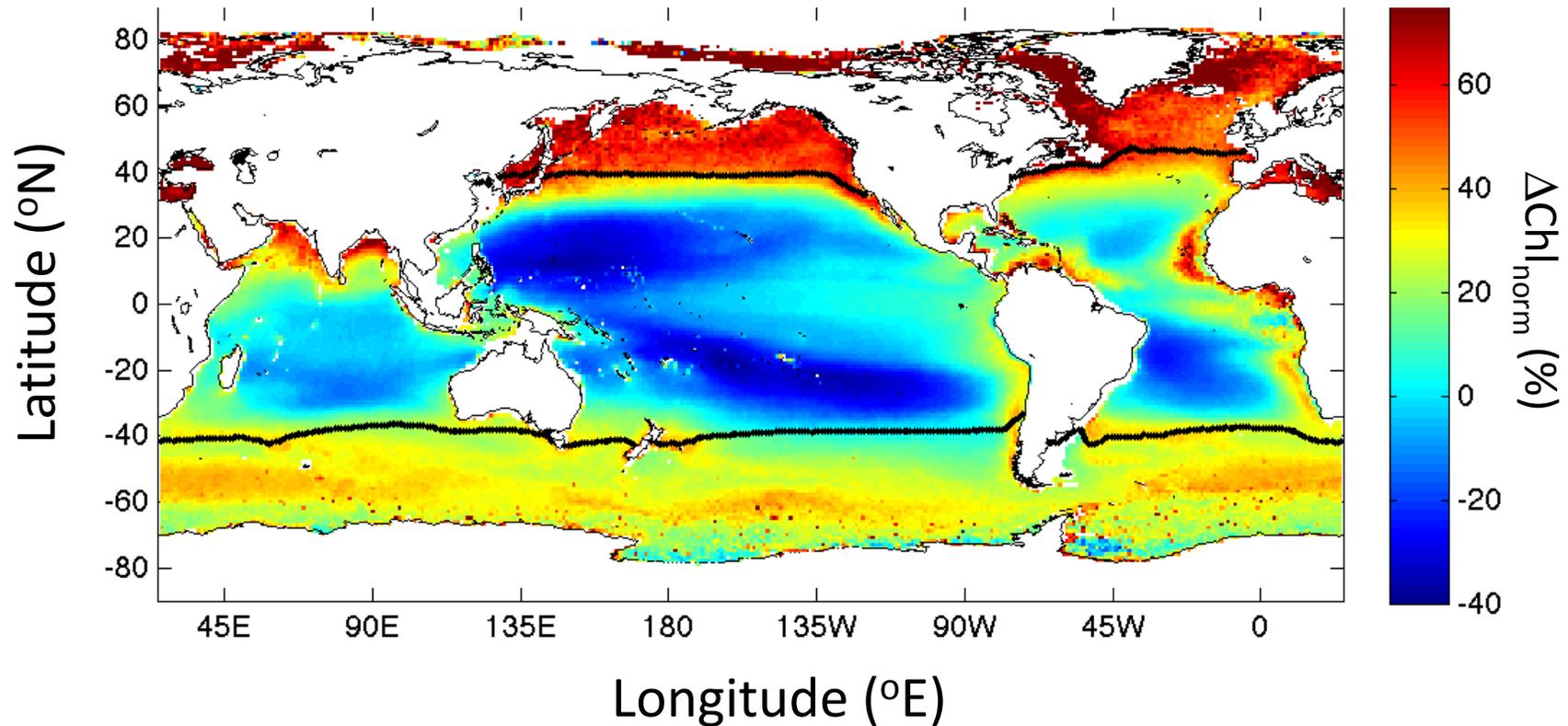


Szeto et al. JGR [2011] analysis of NOMAD data

# GSM Semi-Analytic Model

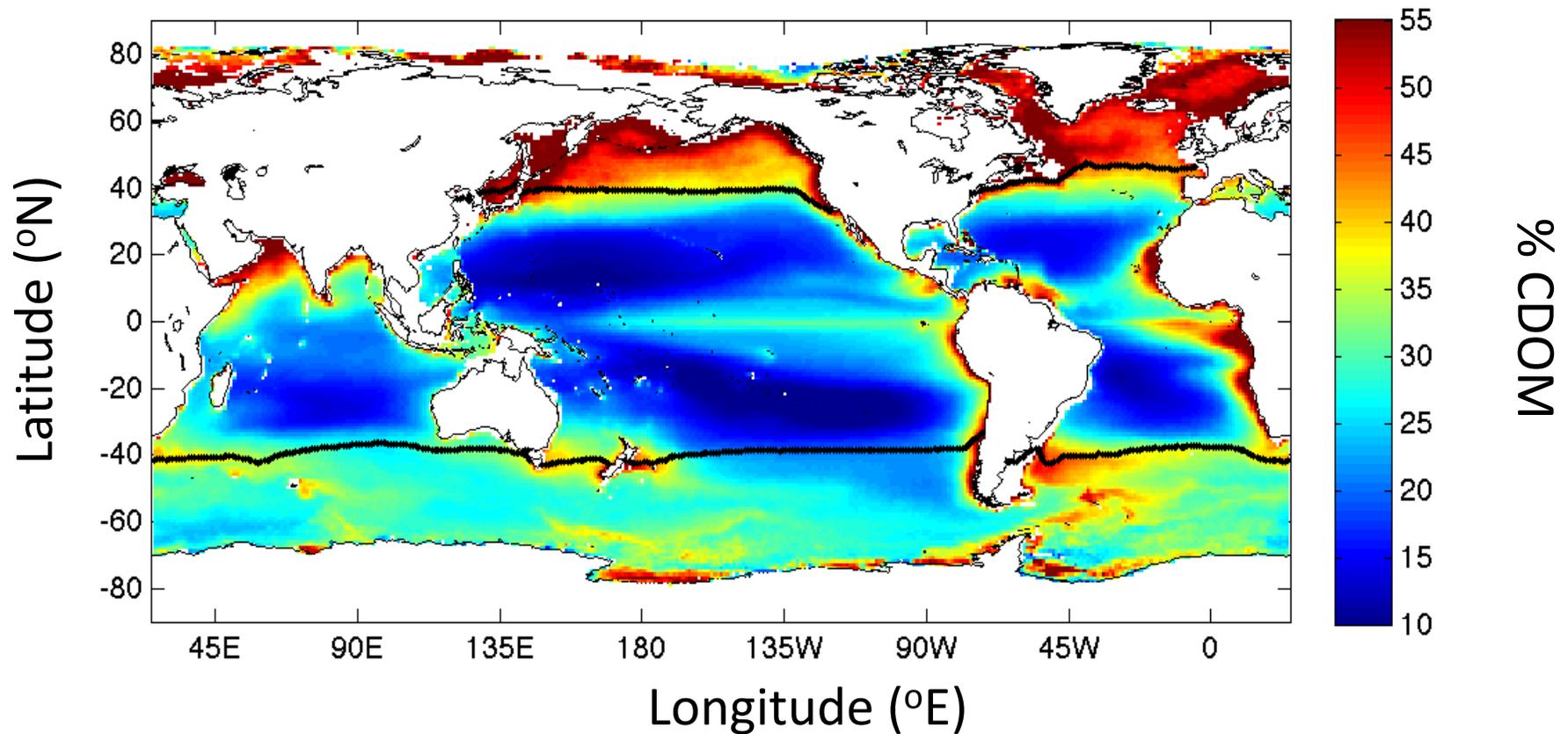
- Retrieves three relevant properties (CDM, BBP, Chl)
- Assumptions...
  - Relationship between  $L_{wN}(\lambda)$  & IOP's is known
  - Component spectral shapes are constant
  - Water properties are known
  - In open ocean, CDM is almost entirely CDOM
- Model coefficients determined using field obs
- Validation statistics for  $\text{Chl}_{\text{GSM}}$  with SeaWiFS observations are nearly as good as for  $\text{Chl}_{\text{OC4}}$

# Difference Between OC4v6 & GSM Chl's



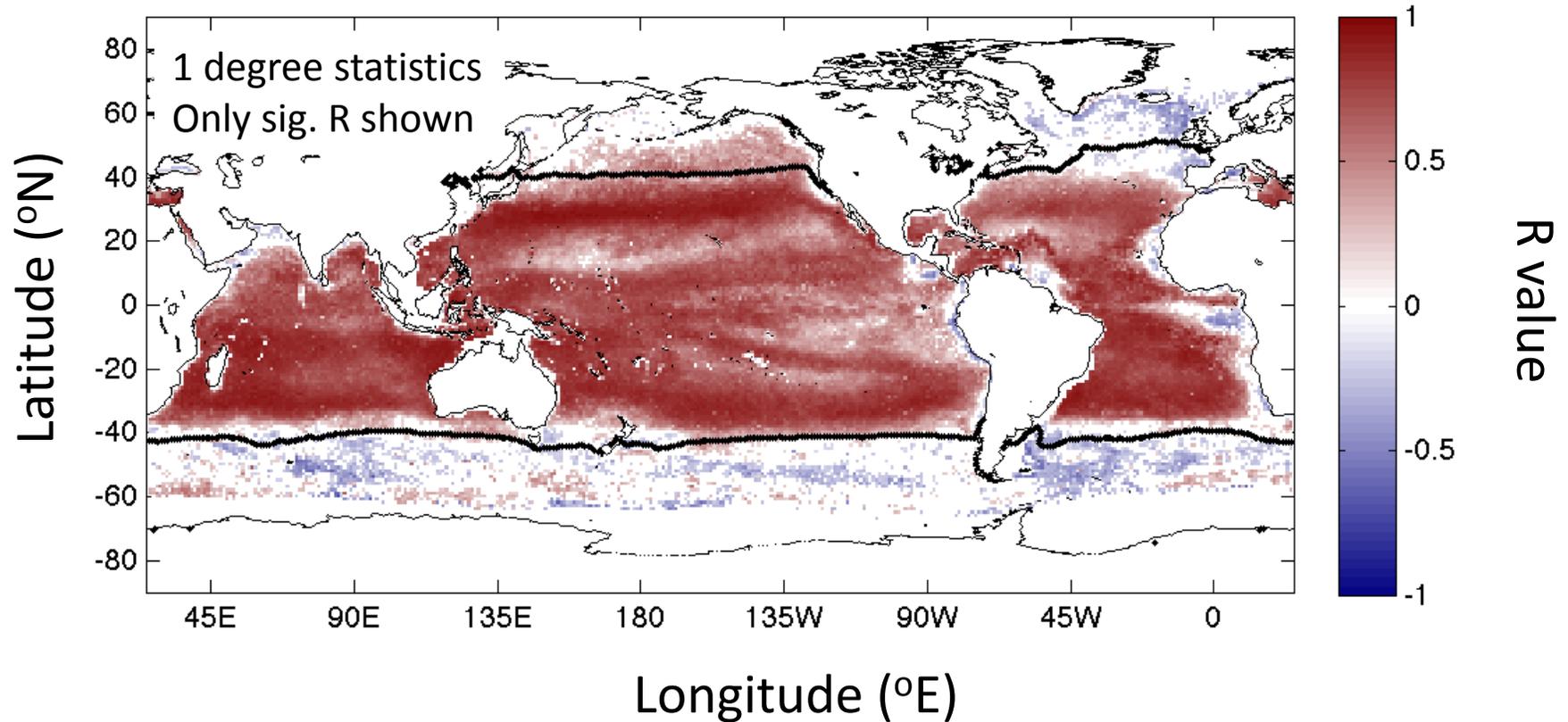
- $\Delta\text{Chl}_{\text{norm}} = 100 * (\text{Chl}_{\text{OC4}} - \text{Chl}_{\text{GSM}}) / \text{Chl}_{\text{GSM}}$
- $\text{Chl}_{\text{OC4}} > \text{Chl}_{\text{GSM}}$  by  $\sim 60\%$  in high NH, known riverine sources, etc.
- $\text{Chl}_{\text{OC4}} \sim 20\%$  lower in subtropical gyres
- $\text{Chl}_{\text{OC4}} \sim 30\%$  higher in the Southern Ocean

# Mean Contribution of CDOM to Absorption



- Defined as  $a_{\text{cdm}}(443) / (a_{\text{cdm}}(443) + a_{\text{ph}}(443))$  retrieved using GSM
- High in subpolar NH oceans & low in subtropical oceans
- Spatial patterns for %CDOM &  $\Delta\text{Chl}_{\text{norm}}$  are highly correlated ( $R=0.66$ )

# Temporal Correlation of $\Delta\text{Chl}_{\text{norm}}$ & %CDOM

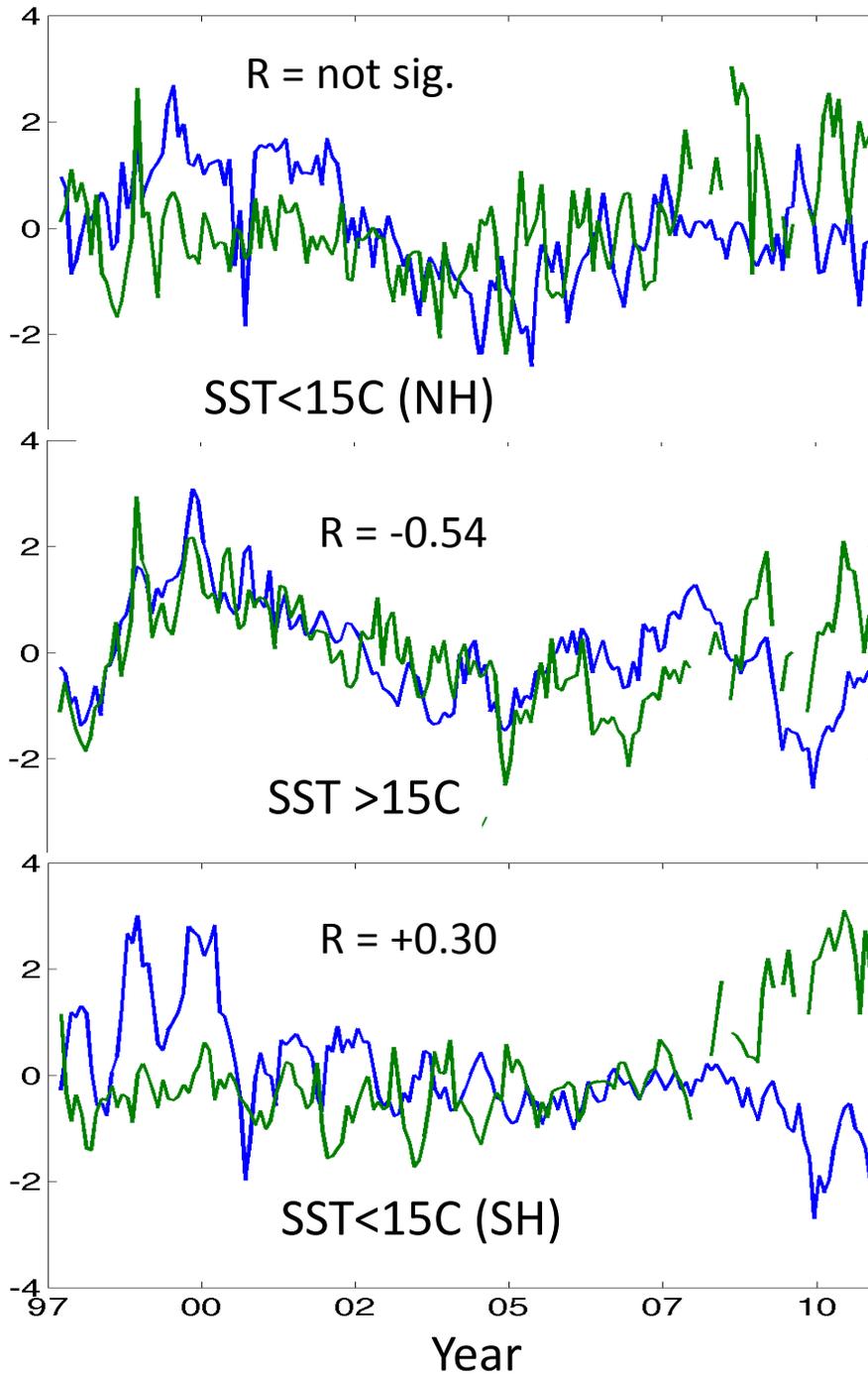


- High positive correlation between  $\Delta\text{Chl}_{\text{norm}}$  & %CDOM in warm ocean
- Correlations are mixed for regions where mean SST  $< 15^{\circ}\text{C}$

# Empirical Algorithms & CDOM

- Mean patterns in  $\Delta\text{Chl}_{\text{norm}}$  & %CDOM are well related especially for warm & NH cool oceans
- Changes in time of  $\Delta\text{Chl}_{\text{norm}}$  & %CDOM are well correlated for the warm ocean but not outside
- Both point to CDOM affecting  $\text{Chl}_{\text{OC4}}$  retrievals

Standardized Monthly Anomalies for  $\log(\text{Chl}_{\text{GSM}})$  and  $-\text{SST}$

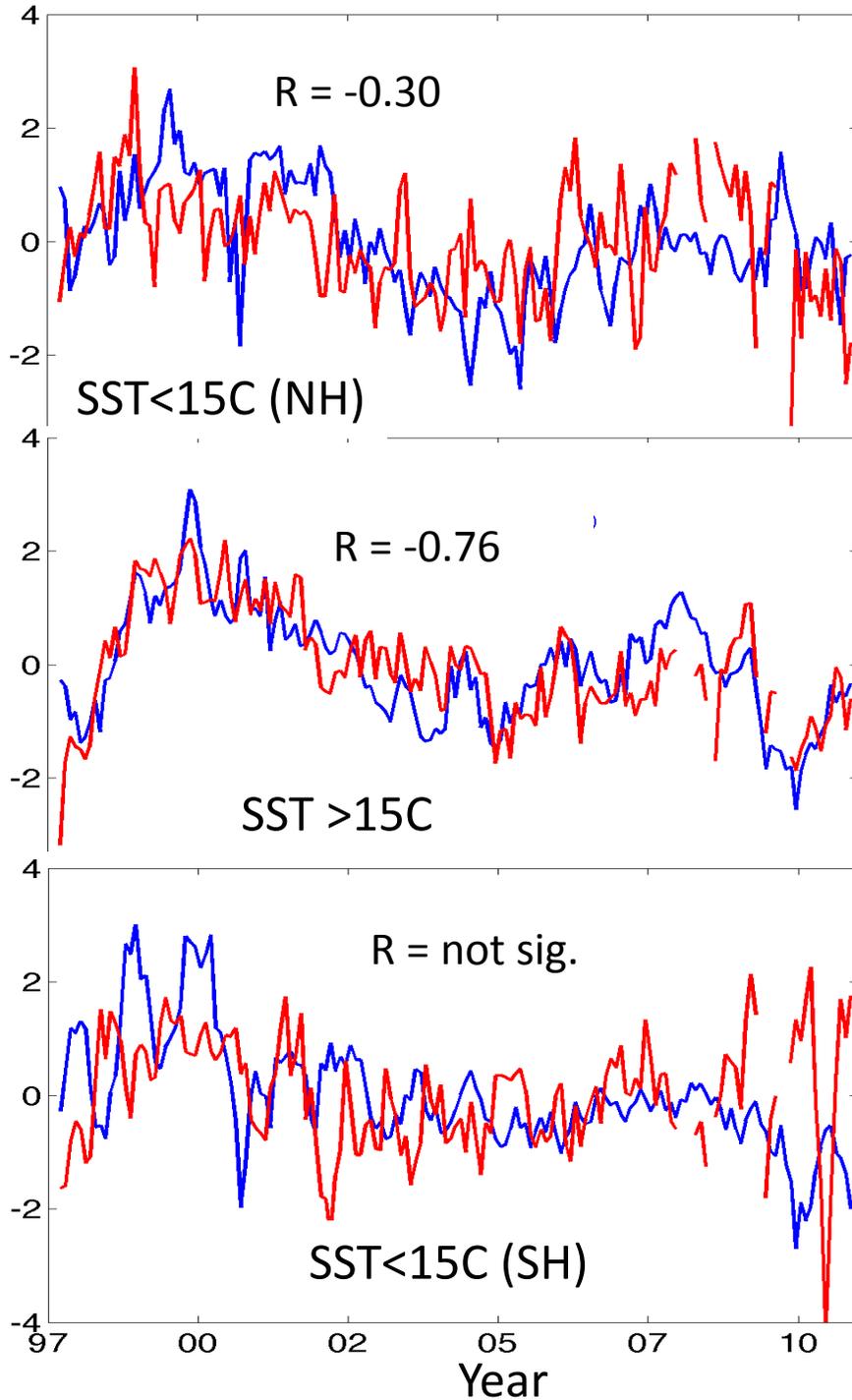


Decreasing SST  $\uparrow$  Increasing  $\text{Chl}_{\text{GSM}}$   
 Increasing SST  $\downarrow$  Decreasing  $\text{Chl}_{\text{GSM}}$

Trends by Region	
$+0.79 \%/y$	$+0.035 \text{ }^\circ\text{C}/y$
not significant	$+0.015 \text{ }^\circ\text{C}/y$
$+1.03 \%/y$	$+0.029 \text{ }^\circ\text{C}/y$

OC4 Chl showed decreases in warm ocean!!

Standardized Monthly Anomalies for  $\log(\text{CDOM})$  and  $-\text{SST}$



Decreasing SST



Increasing  $\log(\text{CDOM})$

Increasing SST



Decreasing  $\log(\text{CDOM})$

### Trends by Region

-0.56 %/y  
+0.035 °C/y

-0.31 %/y  
+0.015 °C/y

not sig  
+0.029 °C/y

OC4 Chl showed  
decreases in warm  
ocean!!

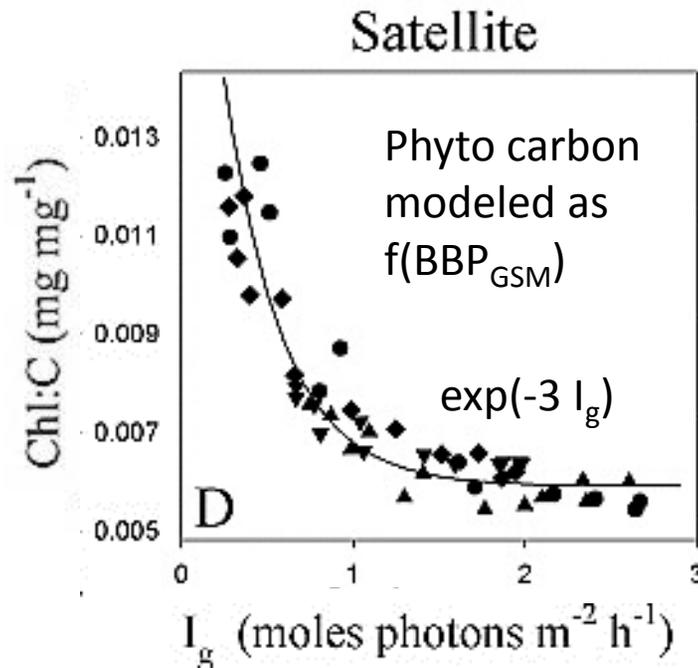
# What do we learn about global trends?

- SeaWiFS trends are negative for  $\text{Chl}_{\text{OC4}}$  in the warm ocean but they are insignificant for  $\text{Chl}_{\text{GSM}}$
- CDOM trends in the warm ocean are also negative (which may explain the  $\text{Chl}_{\text{OC4}}$  trends)
- Trends for  $\text{Chl}_{\text{GSM}}$  are increasing for cool oceans
- Correlations with SST are greatest with CDOM
- Don't see the 1%/y decrease of Boyce et al. [2010]

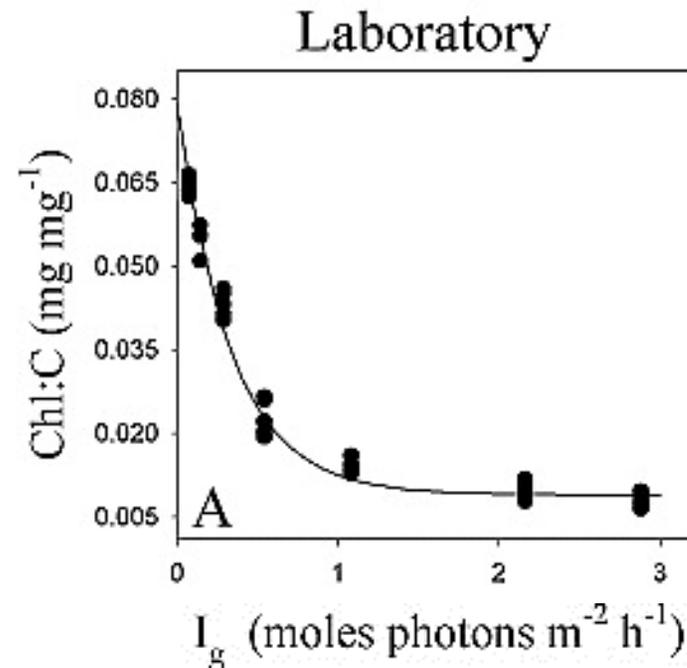
# So, What is Chlorophyll Really?

- Chlorophyll = f(phytoplankton abundance, physiological adaptations, community composition, ...)
- Global patterns reflect abundance changes due to regional nutrient inputs
- But Chl/C's can change more than five-fold
- Q: Are changes in  $\text{Chl}_{\text{GSM}}$  due to biomass or physiology?

# Chl:C from satellite??



Satellite Chl:C for several subtropical regions vs. light



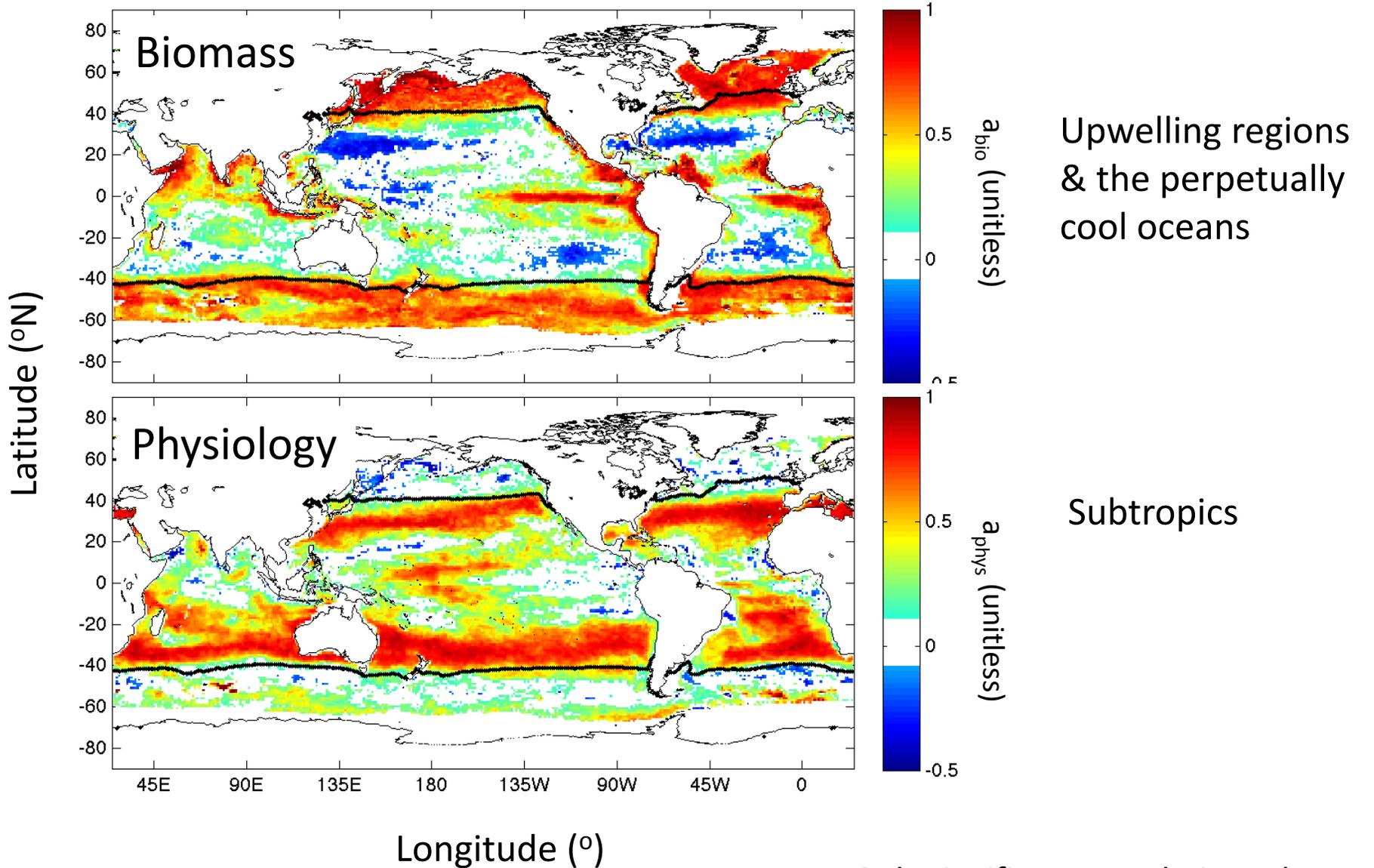
Chl:C vs. growth irradiance for *D. tertiolecta*

Opens the door to modeling phytoplankton growth rates & carbon-based NPP

Behrenfeld et al. (2005) GBC



# Chlorophyll is a Poor Metric for Biomass



Only significant correlations shown

# So, is it biomass or physiology?

- Biomass contributions dominate the high latitude oceans & regions of coastal & equatorial upwelling
- Physiology contributions dominate the subtropics
- Not much explained in the tropics (but not much variability in  $\text{Chl}_{\text{GSM}}$ )
- Points to chlorophyll being a poor index for phytoplankton biomass for all regions

# Need to Get Past Chlorophyll already!

- CDOM signals are huge – bias trends – mask phytoplankton signals
- Band ratio models are dangerous – especially with small signals due to climate variations
- For much of the oceans, chlorophyll is not useful as a metric for phytoplankton biomass
- Future missions (i.e., PACE) must be designed for this reality while enabling more extensive products (PFT's, PSD, physiology, etc.)

Thank You for  
Your Attention!!



Special Thanx to the NASA Goddard  
Ocean Biology Processing Group  
and the  
NRC Committee on Sustained Ocean Color Obs