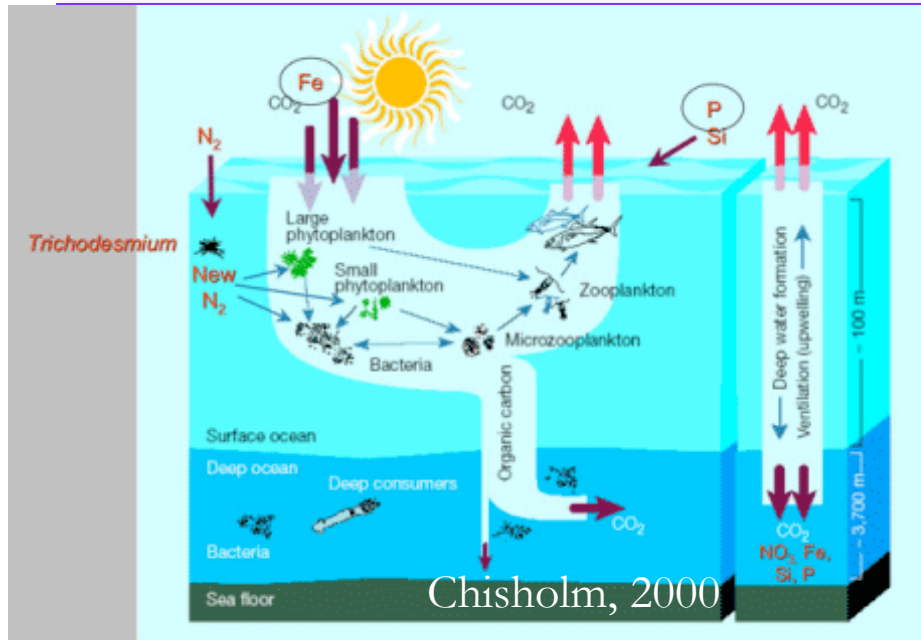

Phytoplankton cell size from ocean color imagery: connection to variability in the ocean carbon sink

Colleen Mouw and Galen McKinley
University of Wisconsin-Madison

Photo David Doubilet



Ecological Importance of Cell Size

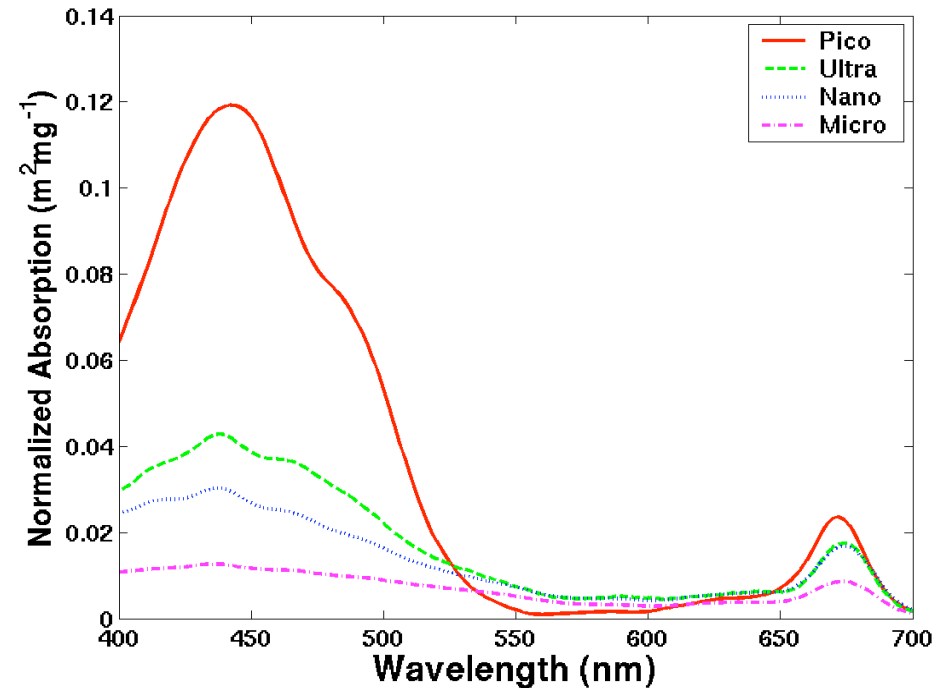


- Small cells:
 - recycled within euphotic zone
 - utilizing regenerated nutrients
 - Prefer stratified high light conditions
- Large cells:
 - sink out of the euphotic zone
 - utilize new nutrients efficiently
 - Prefer turbulent, low light conditions

- Unifying principals that mechanistically explain global, annual mean patterns and seasonal to interannual variations in particulate flux to depth remain elusive.
- Links between variation in export and air-sea CO_2 flux and its temporal variation have only begun to be explored.
- Previous studies suggest [Chl] and PP are not enough to accurately predict flux.
- Phytoplankton cell size is a critical determinant of flux.

Optical Importance of Cell Size

- Despite the physiological and taxonomic variability, variation in spectral shape can be defined by changes in the dominant size class.



Ciotti et al. 2002

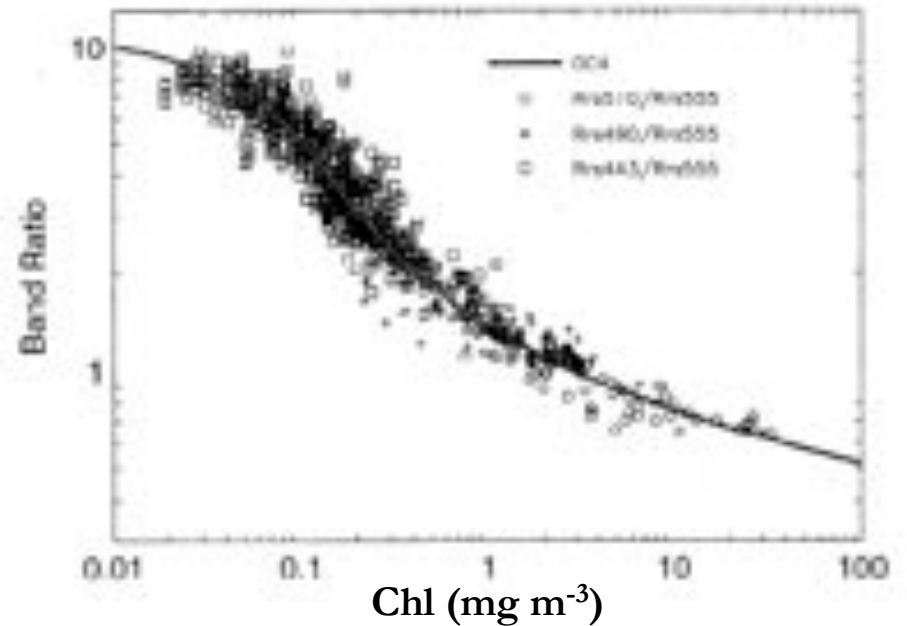
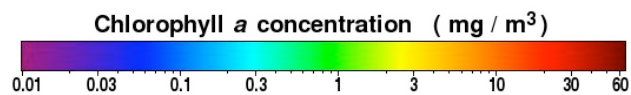
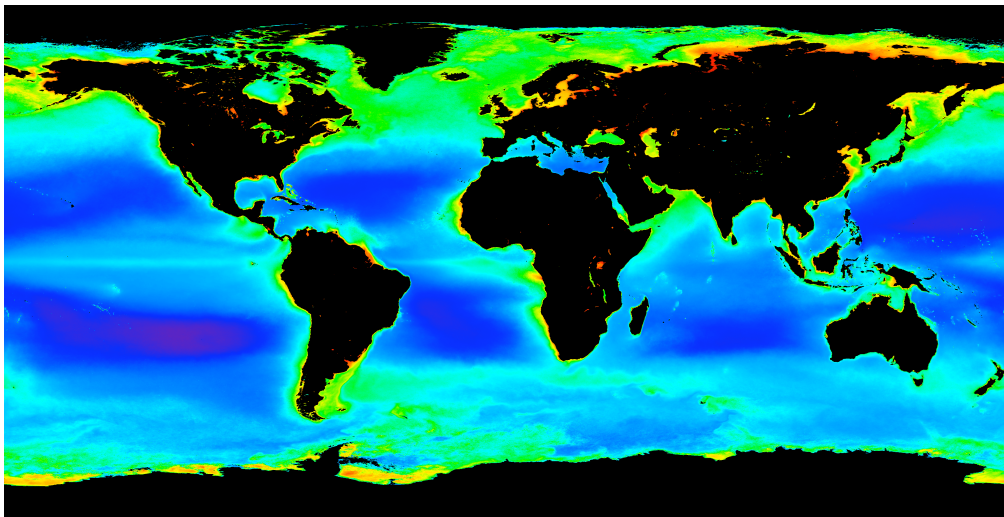
$$a_{ph}^*(\lambda) = [(1-S_f) \times a_{pico}^*(\lambda)] + [S_f \times a_{micro}^*(\lambda)]$$

Package effect

Motivation

- $R_{rs}(\lambda)$ data contains more information than just concentration.

$$R = \log\{(R_{rs\ 443} > R_{rs\ 490} > R_{rs\ 510}) / R_{rs\ 555}\}$$

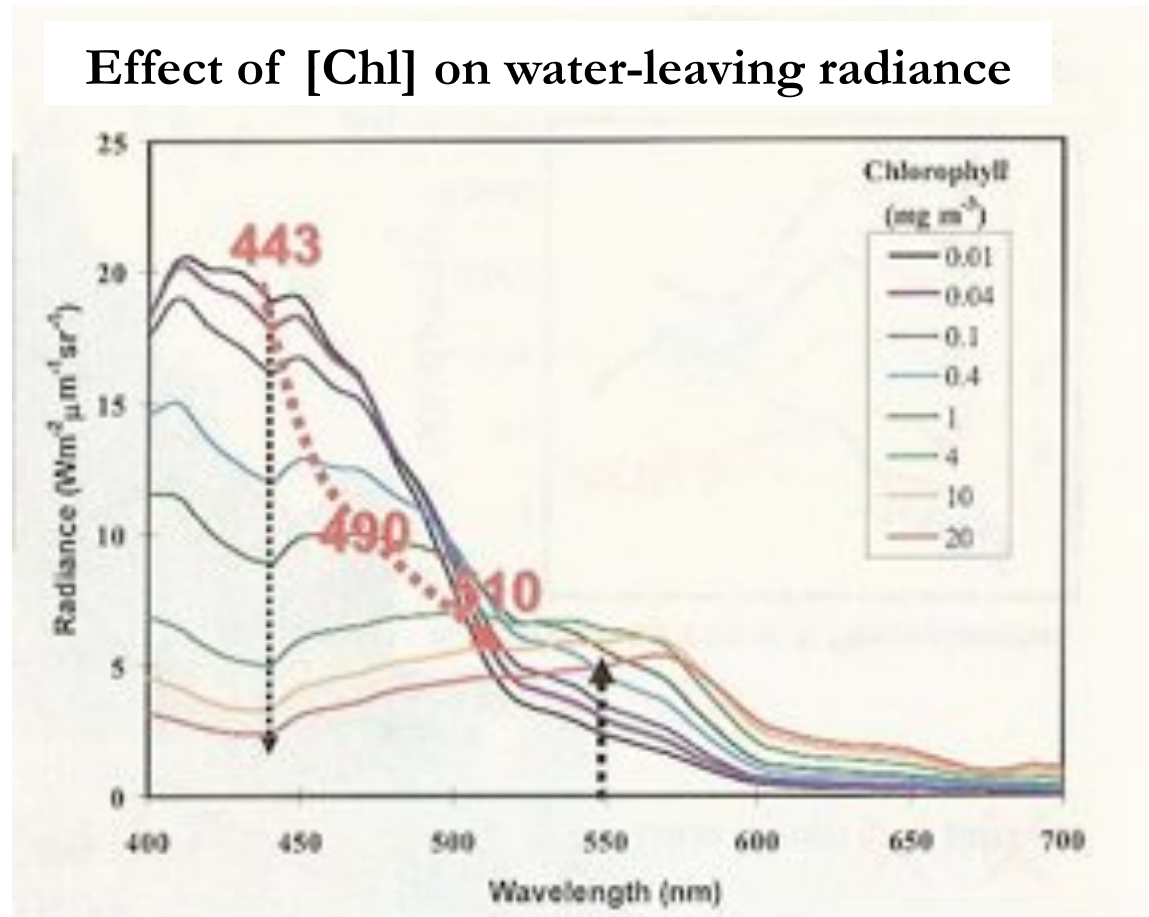


- SeaWiFS standard chlorophyll algorithm (OC4).

Effect of [Chl] on $R_{rs}(\lambda)$

Maximum band shifts from 443 to 490 to 510 nm with increasing chlorophyll concentration

Spectral shift



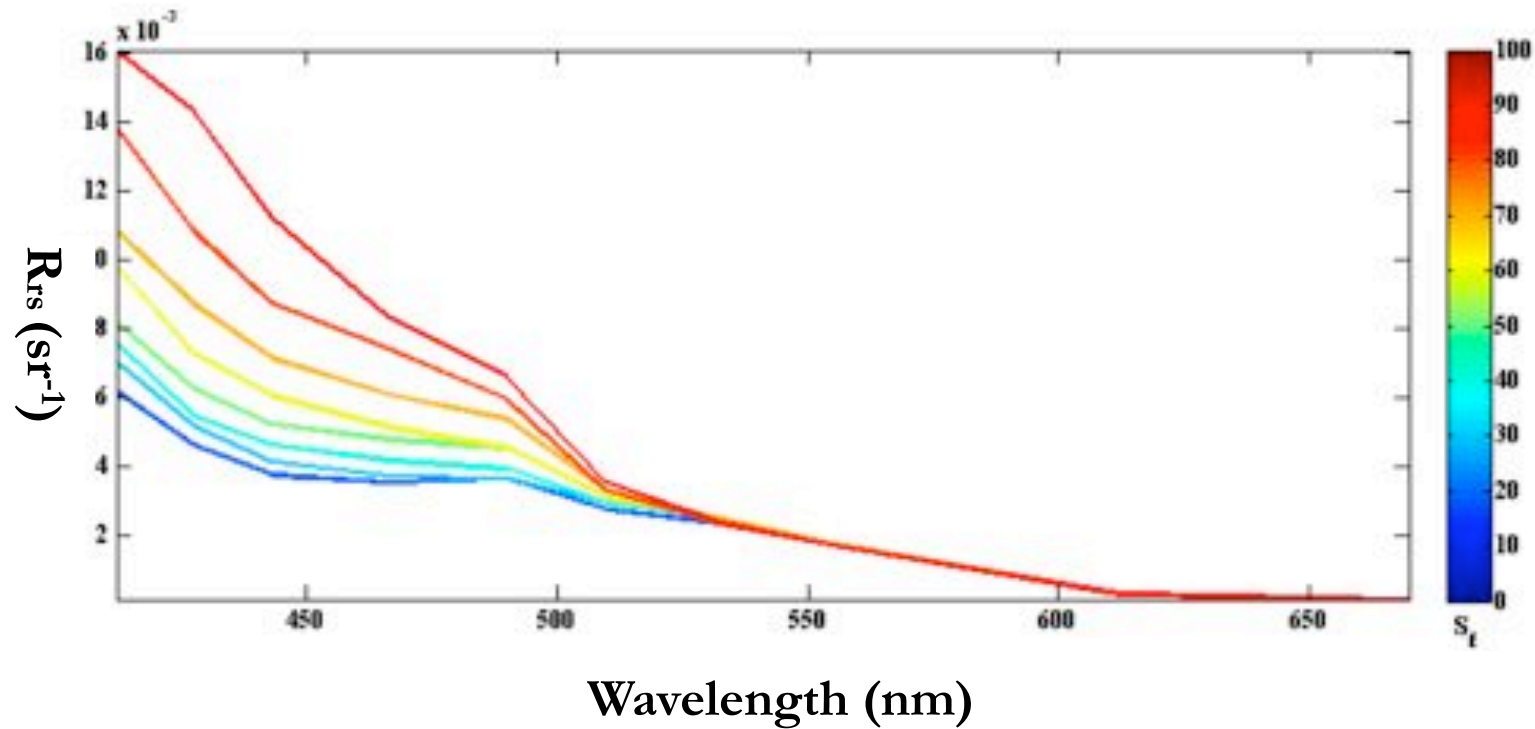
Effect of Cell Size on $R_{rs}(\lambda)$

S_{fm} varying

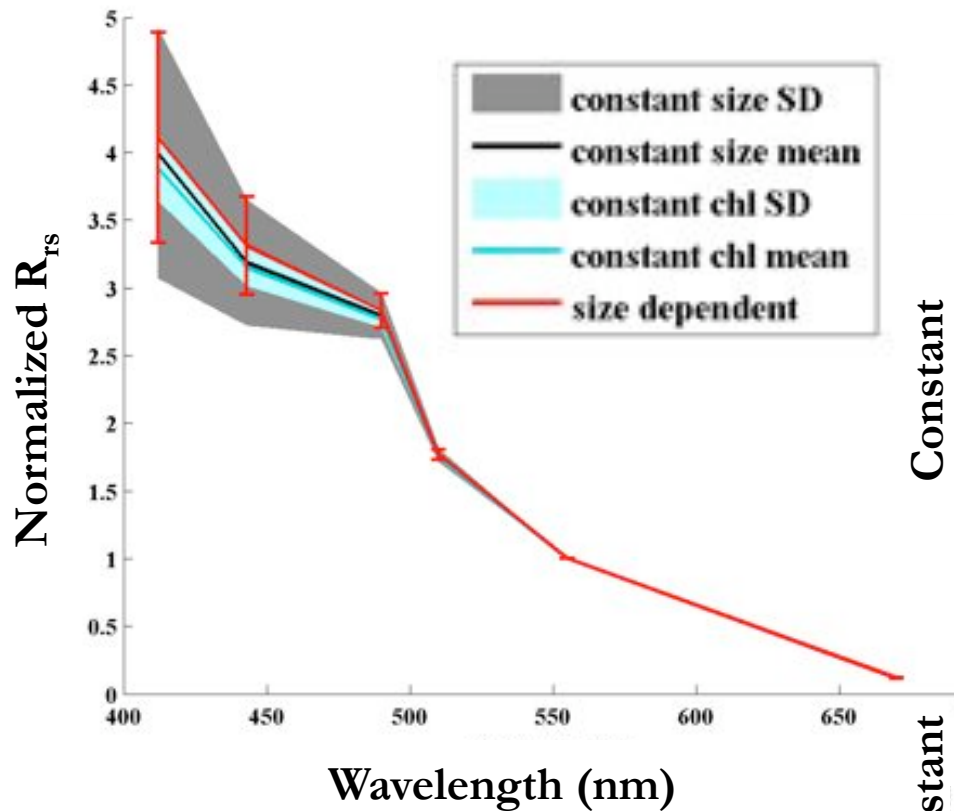
Constant $[Chl] = 0.5 \text{ mg m}^{-3}$

Constant $a_{CDM}(443) = 0.002 \text{ m}^{-1}$

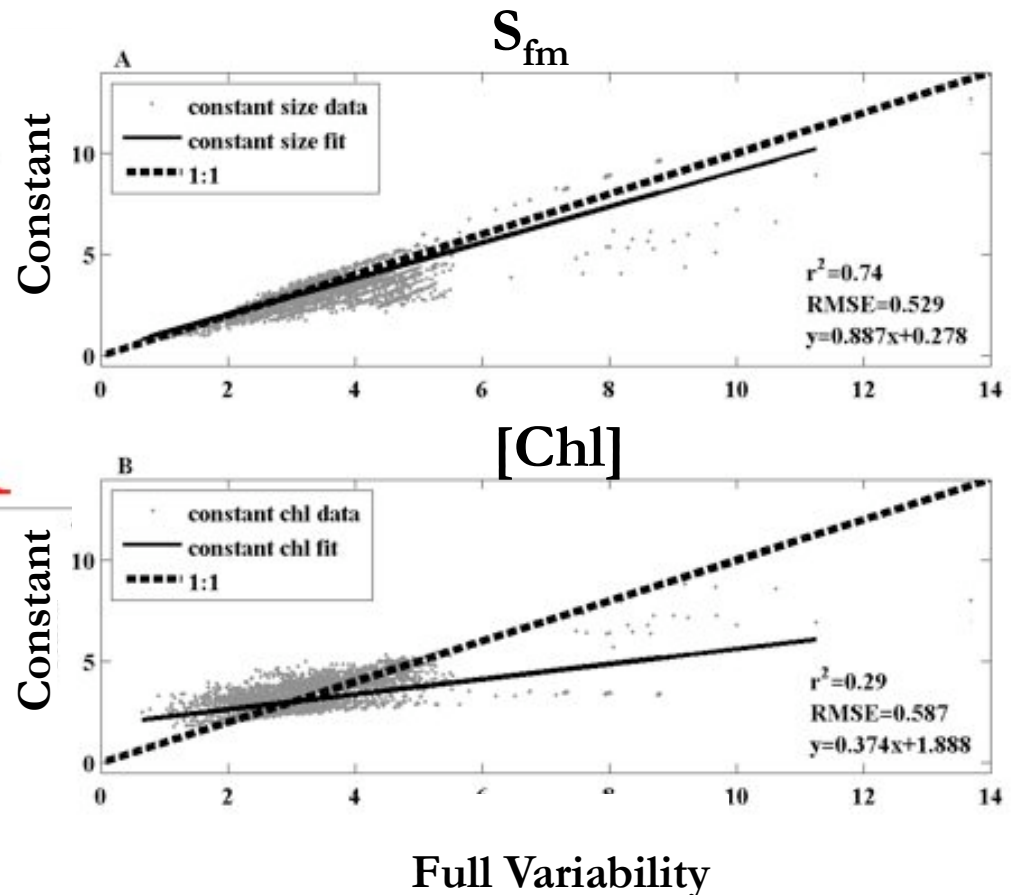
Magnitude shift!



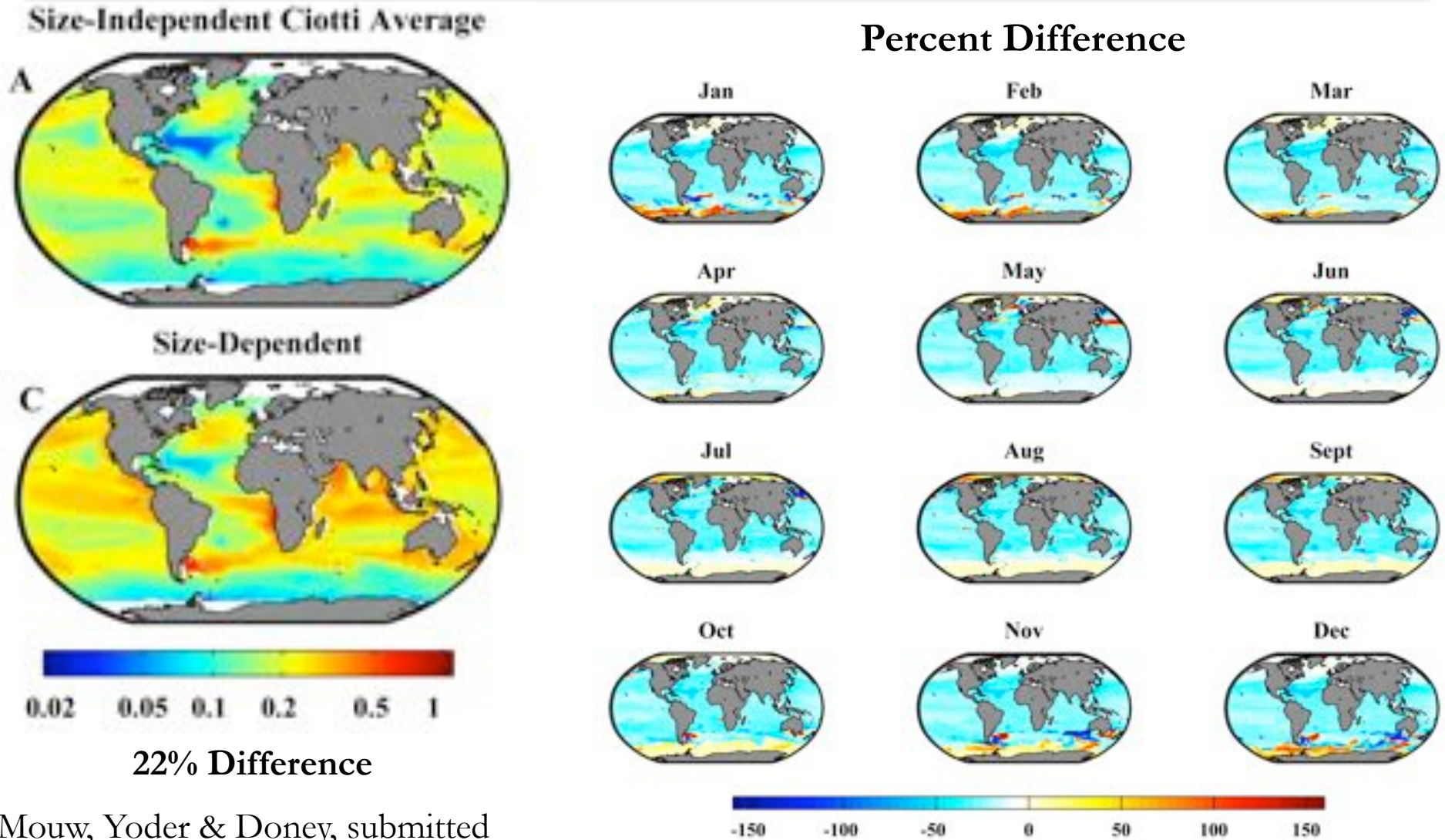
Contribution of S_{fm} & [Chl] to $R_{rs}(\lambda)$



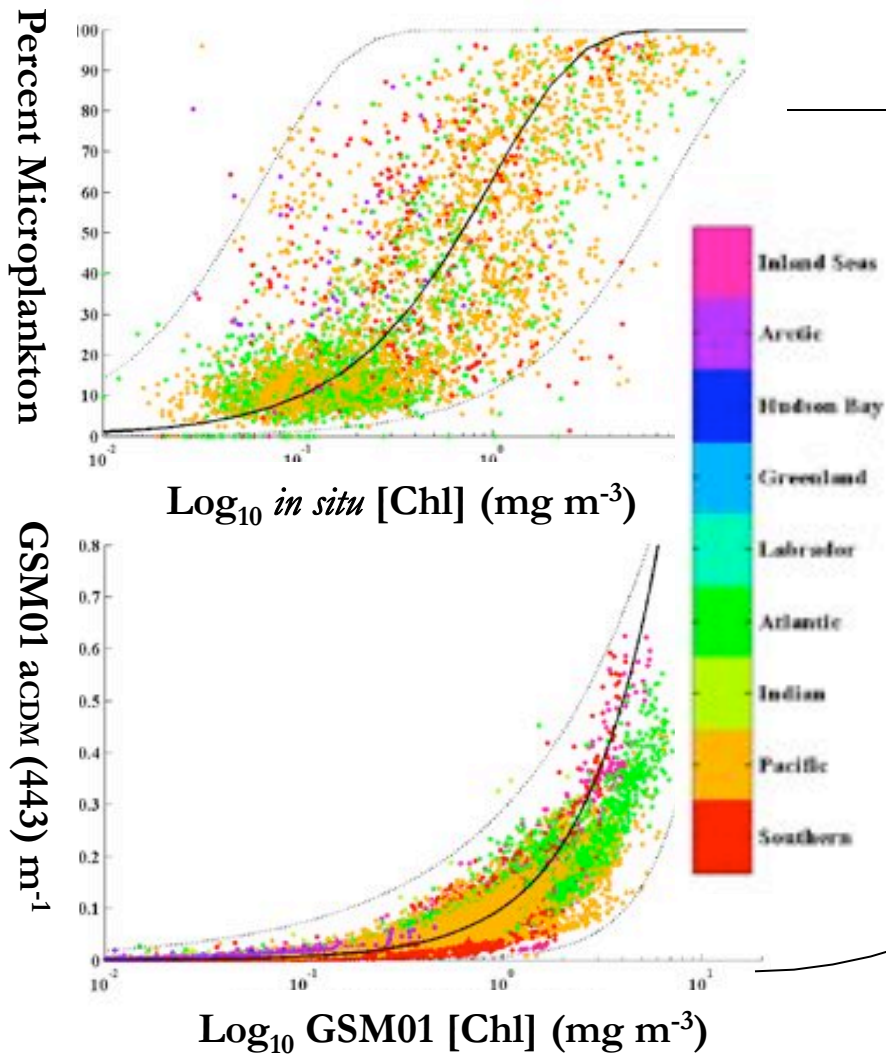
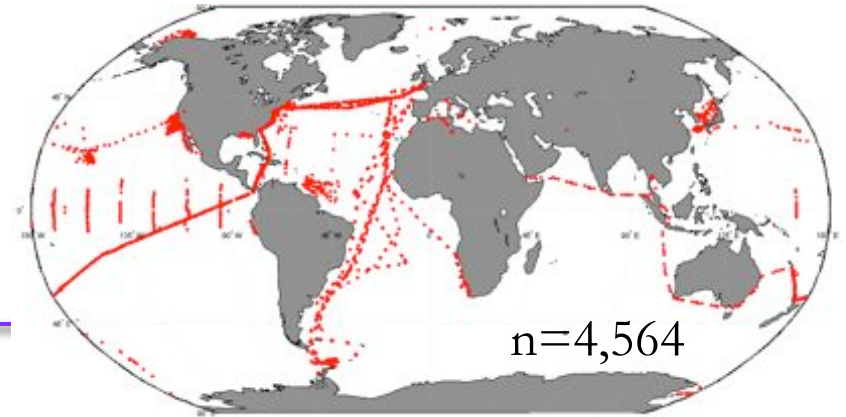
Variations in [Chl] impact $R_{rs}(443)$ more significantly than S_{fm} variations.



Size Impact on OC4 [Chl]

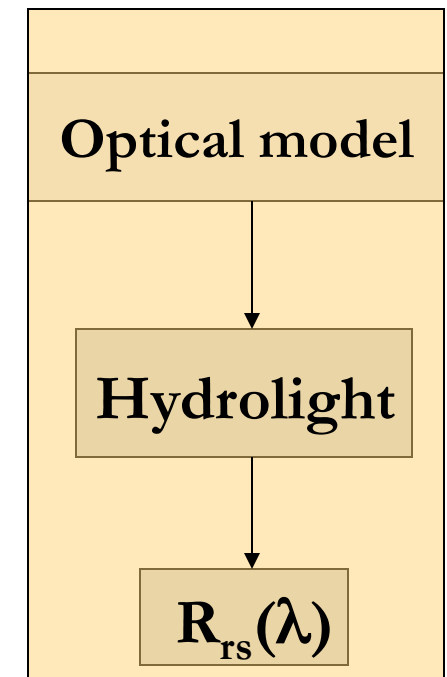


LUT Construction



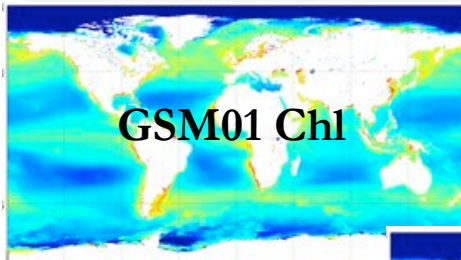
Full Factorial Design:
Chl, S_{fm} ,
 $a_{\text{CDM}}(443)$

n = 44,343



Mouw & Yoder, 2010

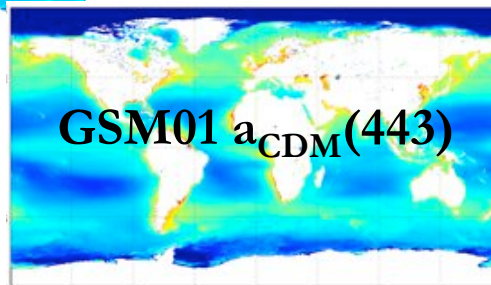
LUT Retrieval



If [Chl] above/below threshold \Rightarrow Mask

If [Chl] within threshold \Rightarrow Continue

$0.05 - 1.75 \text{ mg m}^{-3}$



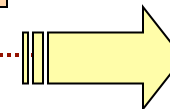
If $a_{\text{CDM}}(443) > \text{threshold} \Rightarrow$ Mask

If $a_{\text{CDM}}(443) < \text{threshold} \Rightarrow$ Continue

$< 0.17 \text{ m}^{-1}$

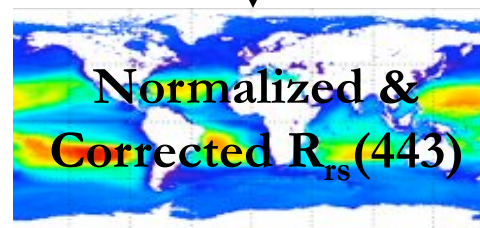


Hydrolight
Normalized $R_{\text{rs}}(443)$
(S_{fm} range)



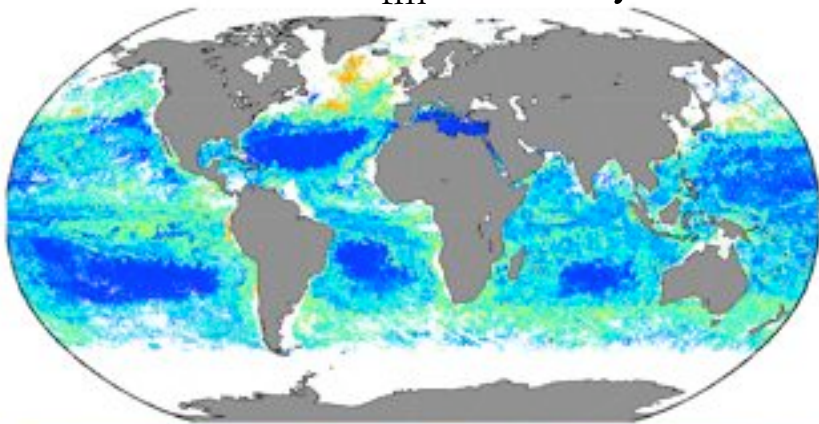
S_{fm}

$R_{\text{rs}}(\lambda)$ imagery

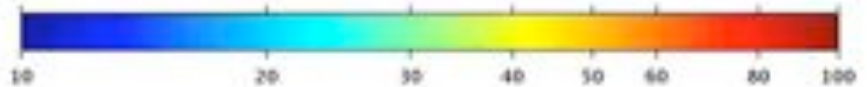
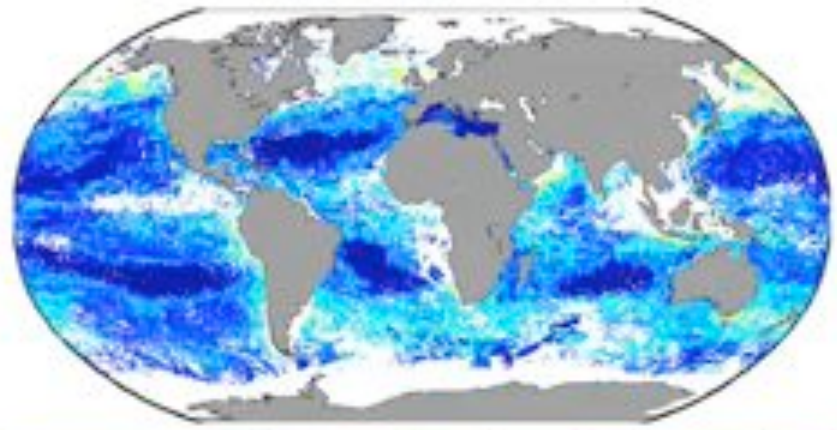


Phytoplankton Size Retrieval

Estimated S_{fm} for May 2006



9/1997



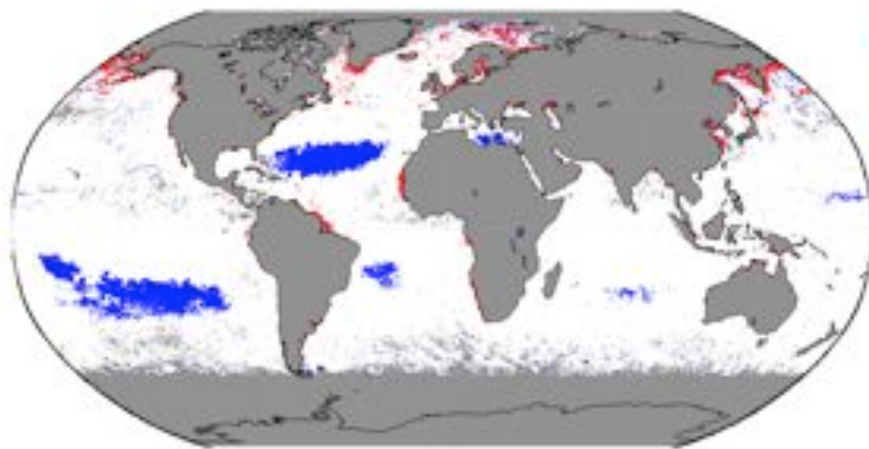
High CDM/Chl

Low Chl

Land/Cloud

No flag

- Process the remainder of the SeaWiFS mission
- Process MODIS-Aqua for the whole mission



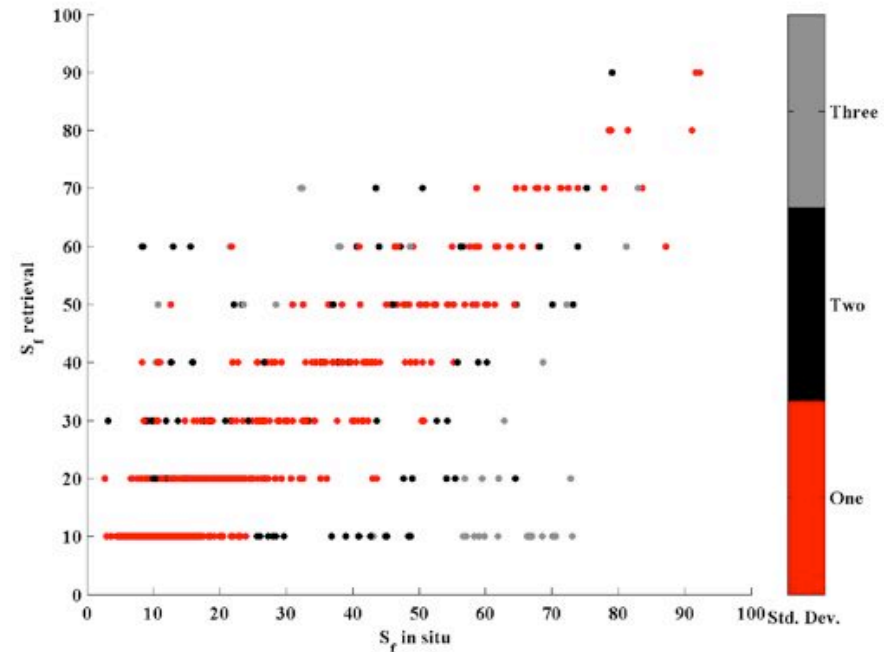
Beyond $NE\Delta R_{rs}$ thresholds

Mouw & Yoder, 2010

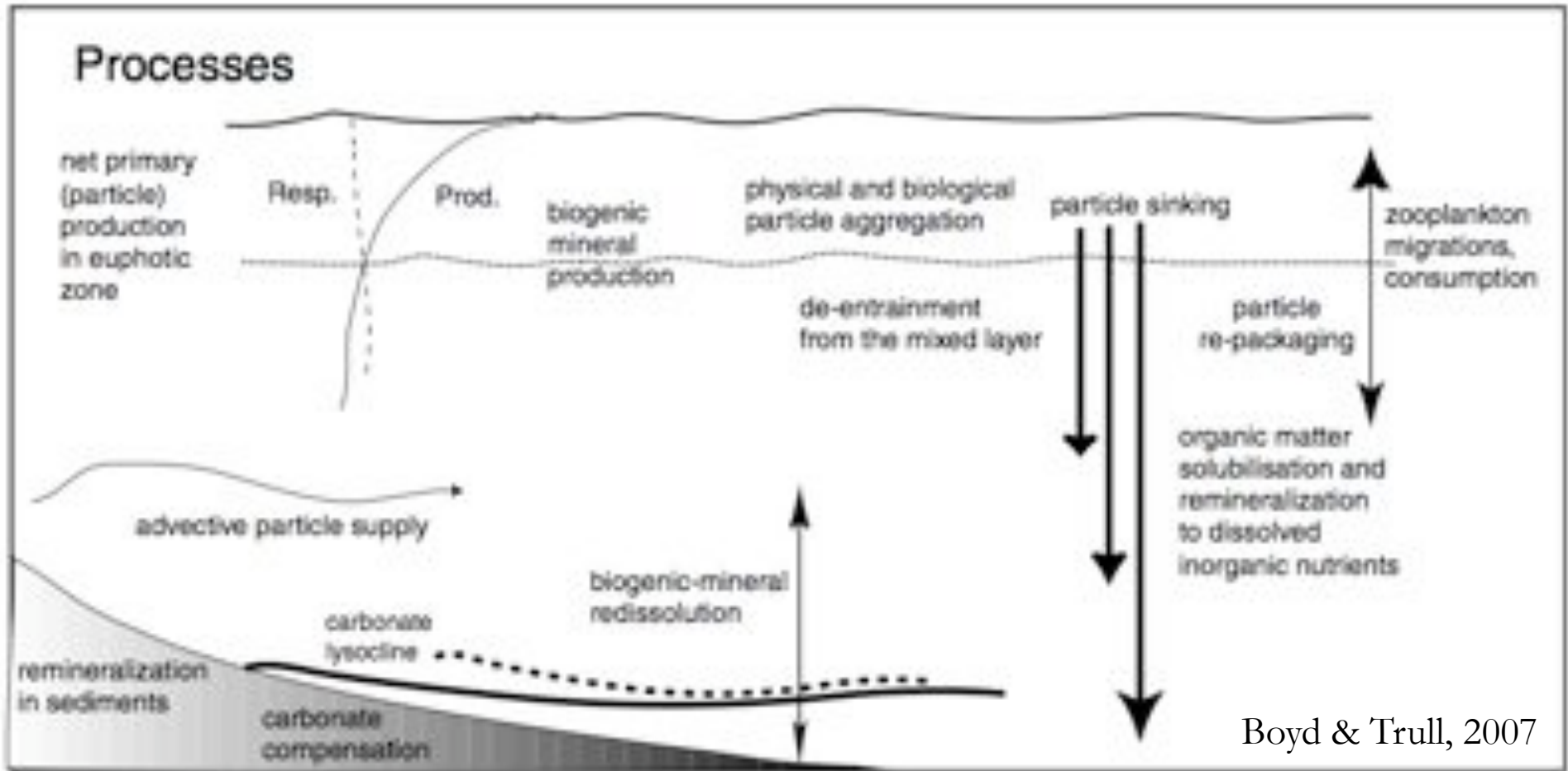
Validation

- 85% within 1 standard deviation
- 11%, 2 std. dev.
- 4%, 3 std. dev.

Publication	Validation Measure	Mouw & Yoder, 2010
Kostadinov et al., 2009	$r^2 = 0.21$ for PSD slope	$r^2 = 0.60$ for all data
Kostadinov et al. 2010	$r^2=0.415$, RMS=17.1	$r^2 = 0.60$, RMS=12.6
Uitz et al., 2006	$\log_{10}(\text{predicted}/\text{measured})$ median=0.02 mean= -0.012 std. dev.=0.883	$\log_{10}(\text{predicted}/\text{measured})$ median=0.0058 mean=0.0054 std. dev.=0.2315
Hirata et al., 2008	classification success all data from AMT-07=73%	classification success within first std. dev. = 84%
Alvain et al., 2008	classification success all data=57%	classification success within first std. dev. = 84%



Export Processes

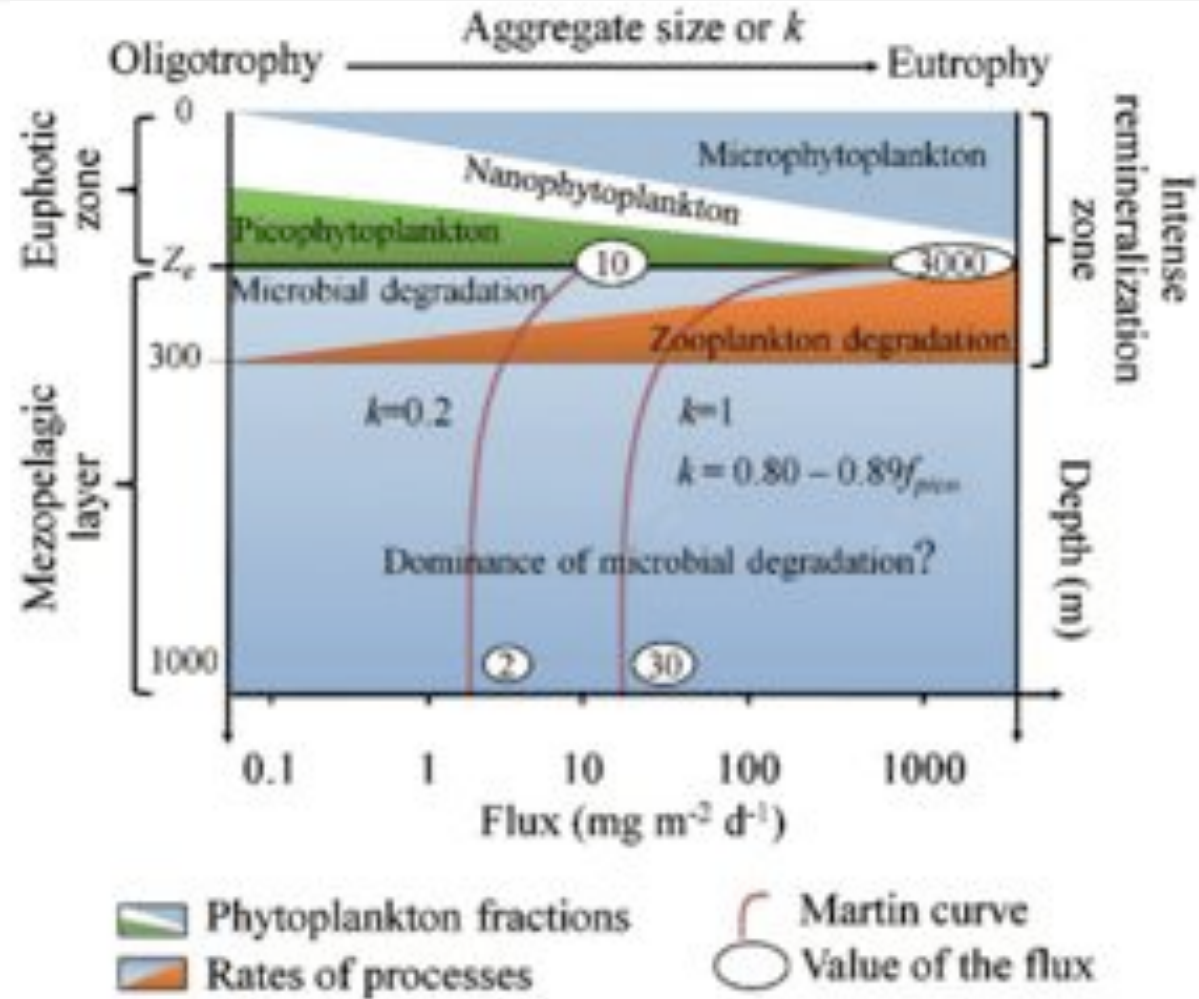


Biological pump efficiency – biologically mediated export of carbon from the surface ocean and its remineralization with depth.

Flux Variation with Depth

Martin Curve

$$F_z = F(z_0) \left(\frac{z}{z_0} \right)^{-k}$$



Flux Variation with Depth

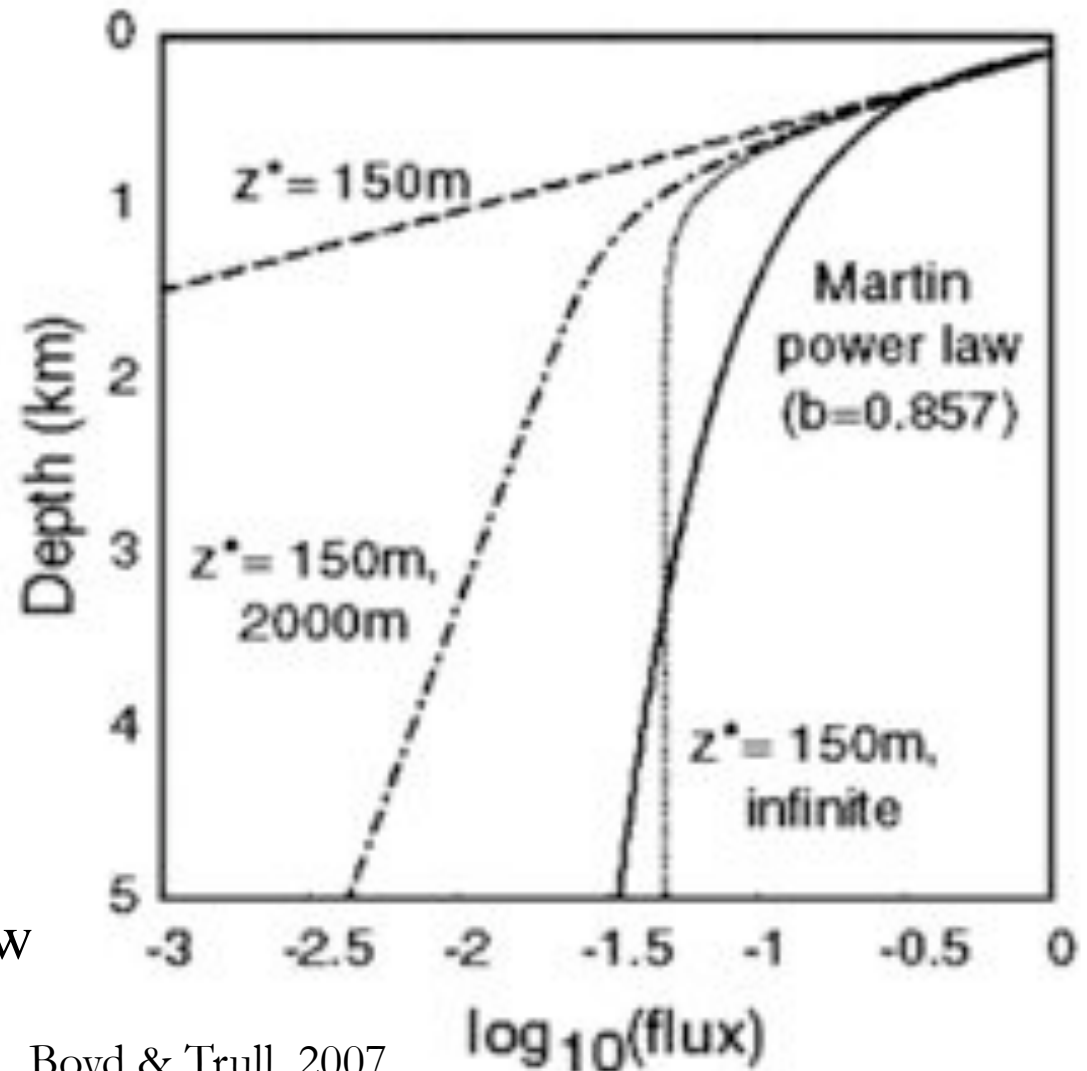
Martin Curve

$$F_z = F(z_0) \left(\frac{z}{z_0} \right)^{-k}$$

Lutz et al. 2002

$$F(t) = F(t_0) e^{\left(\frac{t-t_0}{t^*} \right)}$$

Martine curve -
Underestimation of shallow
remineralization.



Boyd & Trull, 2007

Previous Satellite Retrieval of Export

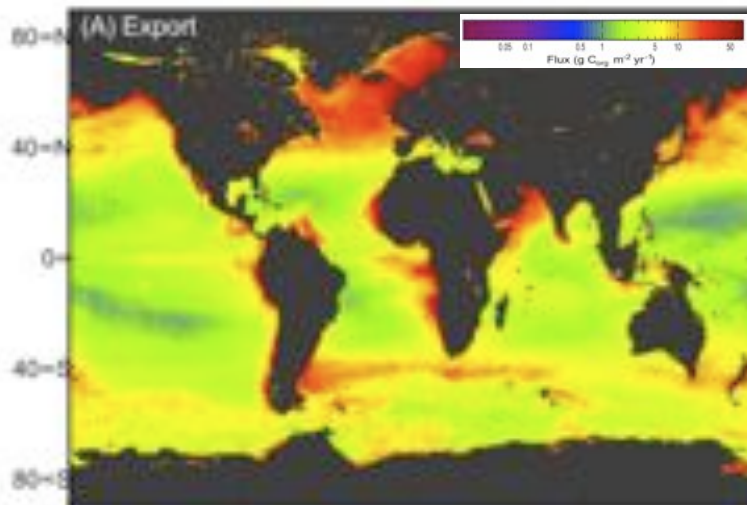
$$p(\Delta z) = pr_d \exp\left(\frac{-\Delta z}{rl_d}\right) + pr_r$$

$p(\Delta z)$: particulate flux : total production

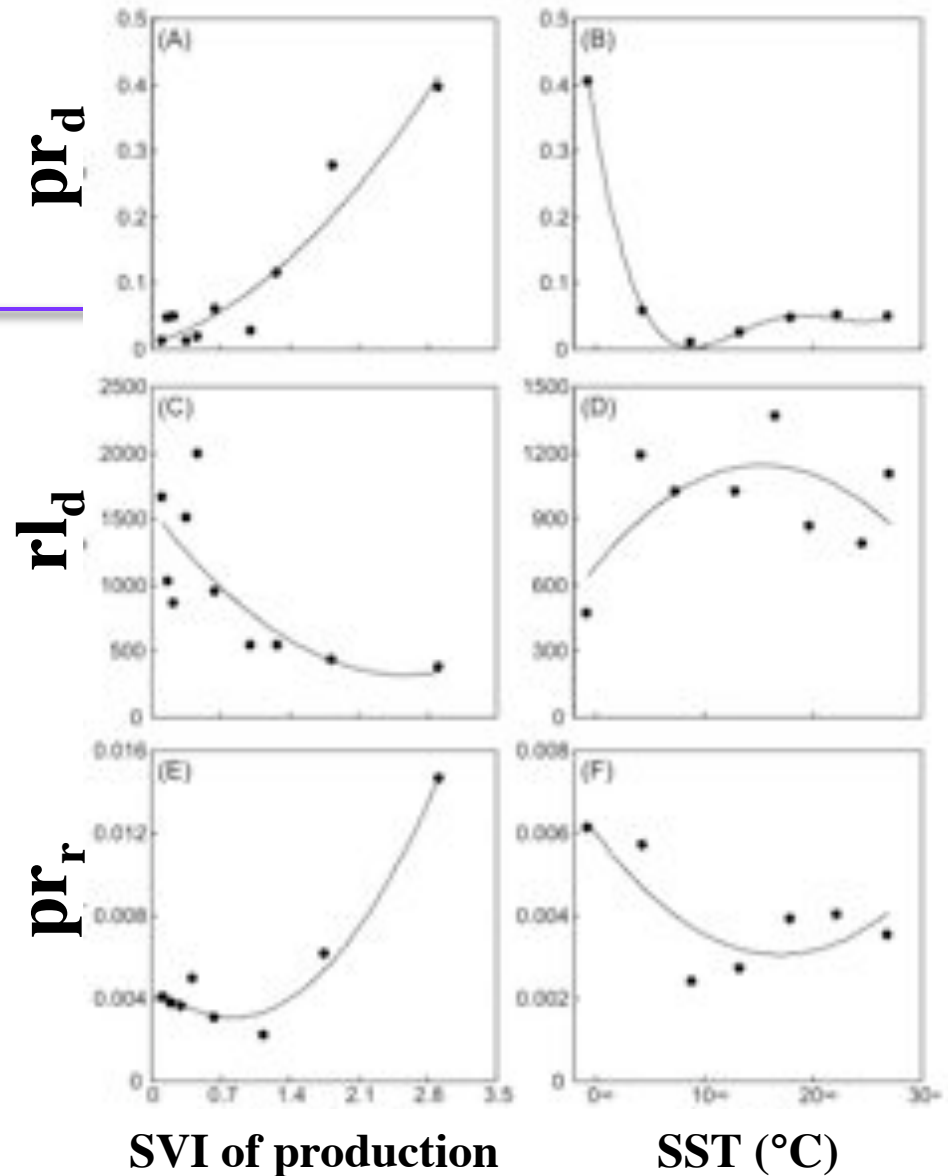
pr_d : liable export fraction

rl_d : remineralization scale

pr_r : refractory export fraction

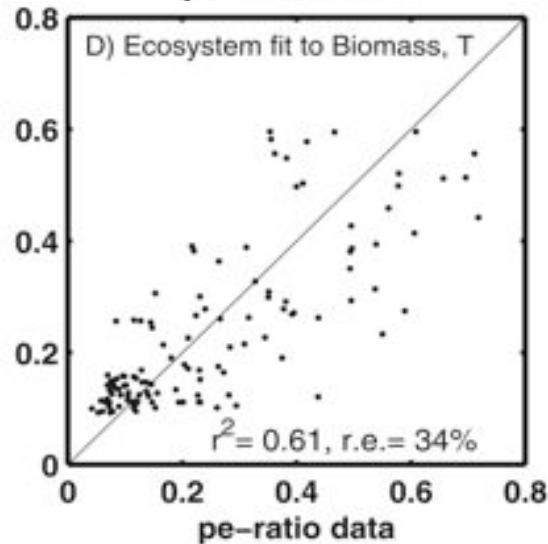
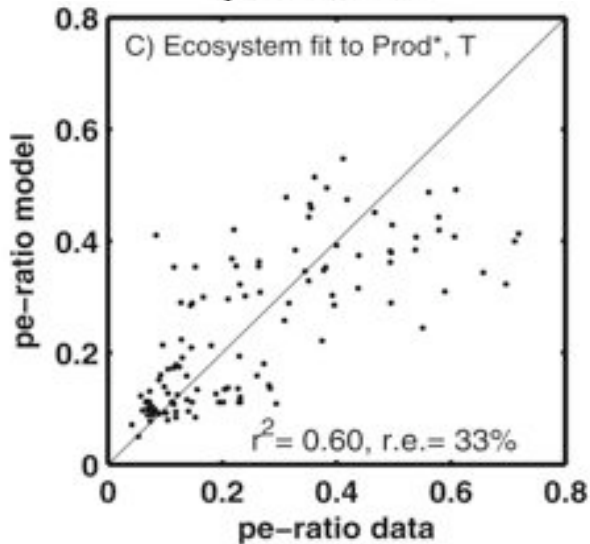
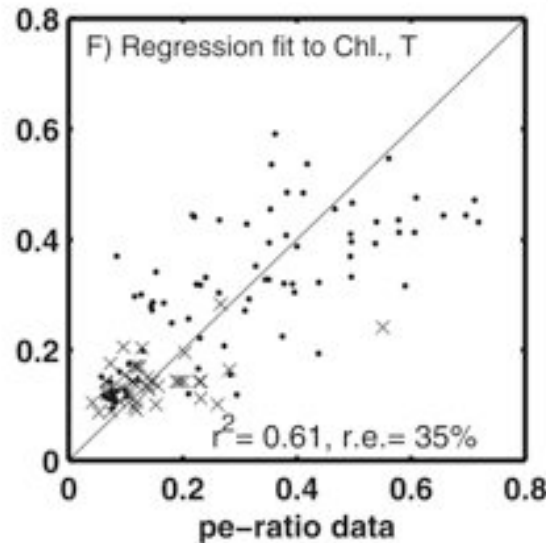
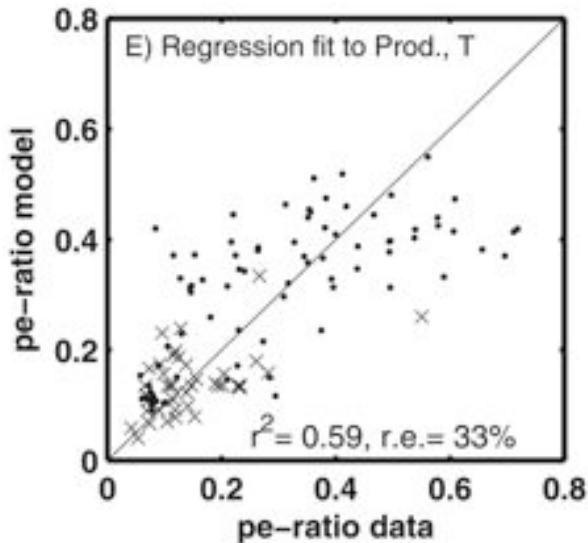


Lutz et al. 2007



Relationships developed with selection of only data points that yielded a statistically significant fit
 – Does not add mechanistic understanding

Previous Modeling of Export



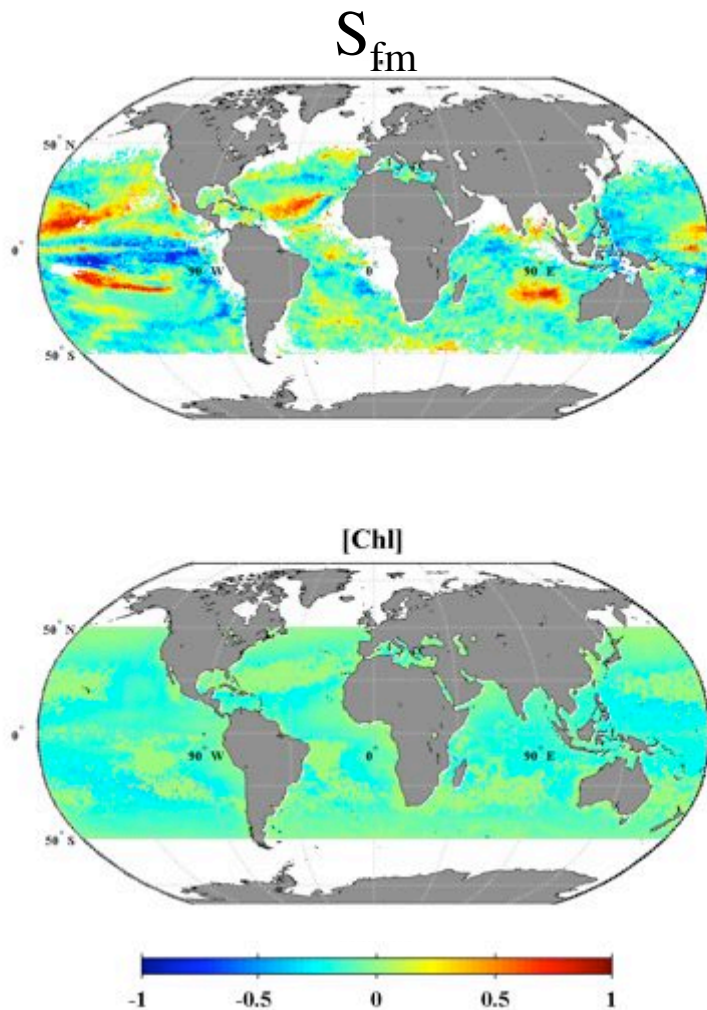
Empirical

- Captures site-to-site variations, but not variability at specific sites.

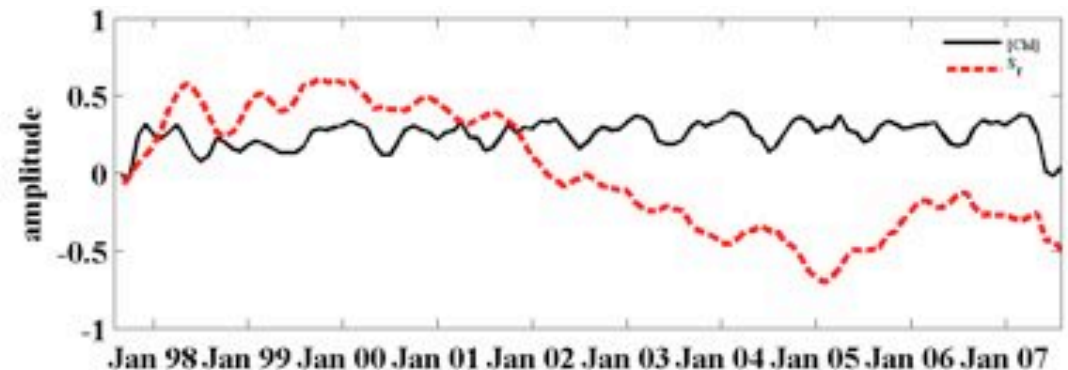
Mechanistic

- Full model (87%)
- Primary control – PP (59%)
- Proximate control – size (28%)

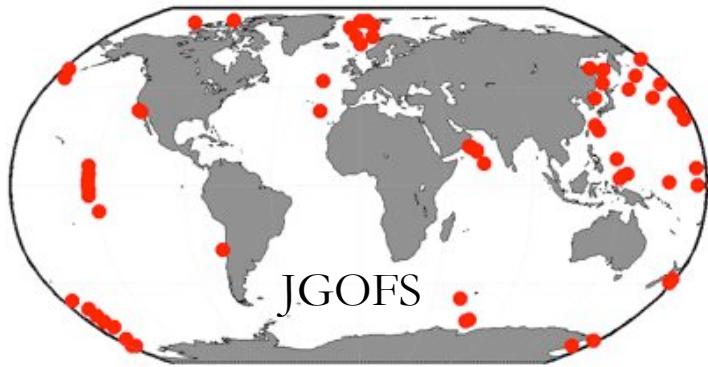
Individual EOF – Mode 1



- Global syntheses for particle export & remineralization have done a good job capturing differences between regions, but a poor job capturing seasonal & interannual variations at individual locations.
- Phytoplankton cell size displays greater interannual variability than chlorophyll

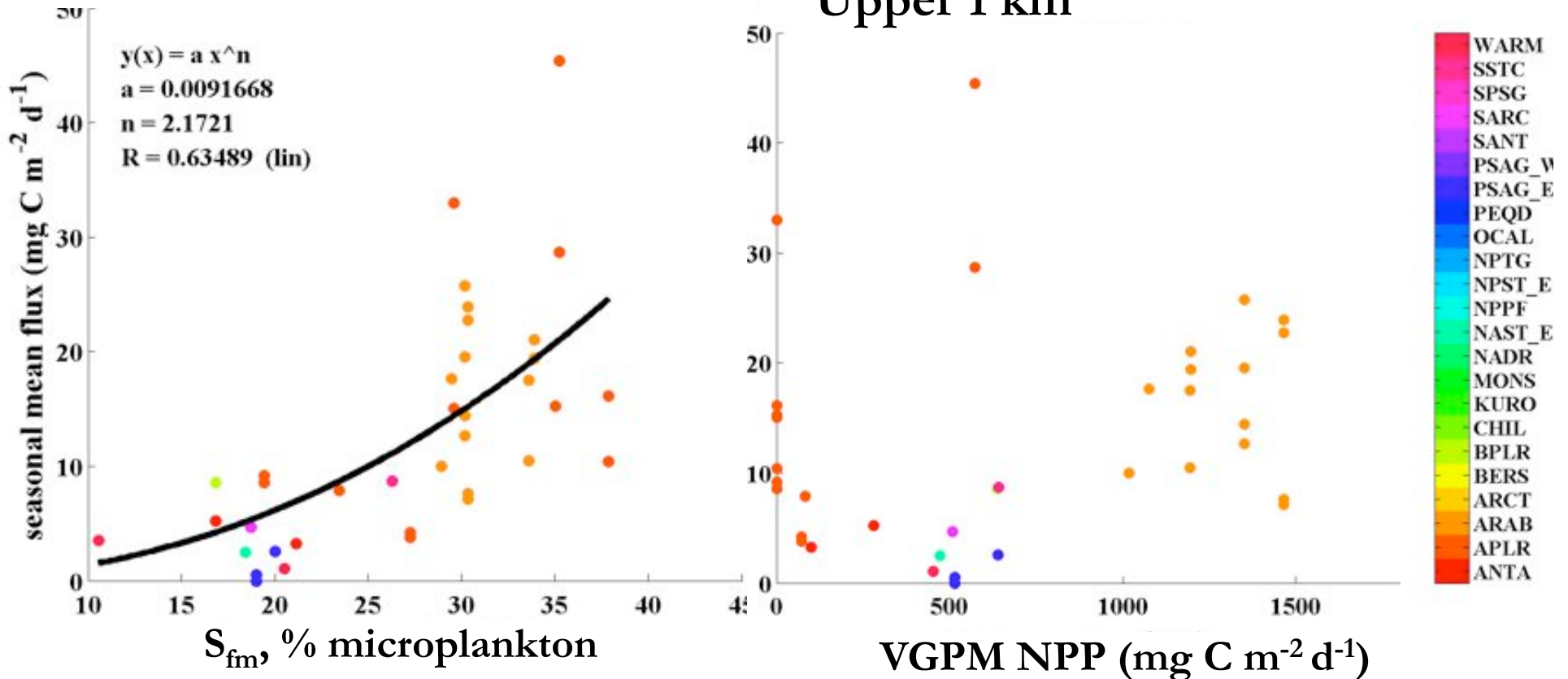


- $[Chl]$ - adjustments to seasonal cycle
- S_{fm} - ENSO relations



Cell Size, NPP & Flux

Upper 1 km



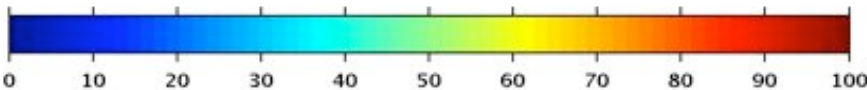
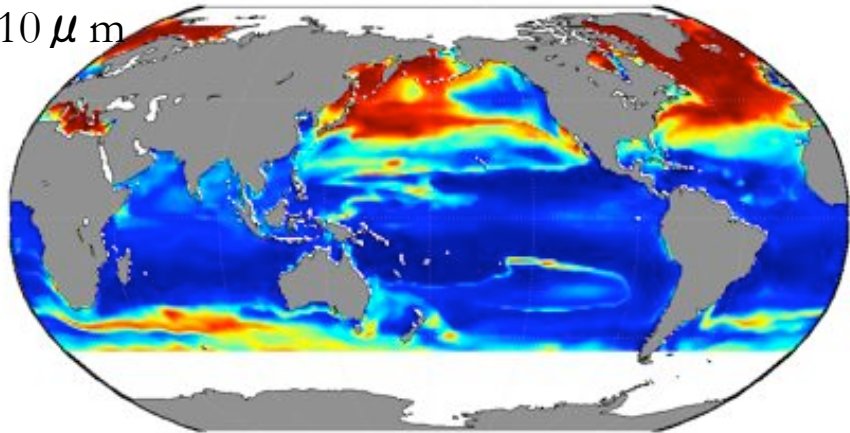
Refine Dunne et al. (2005) & Lutz et al. (2007) using phytoplankton size as a key predictor.



<http://darwinproject.mit.edu>

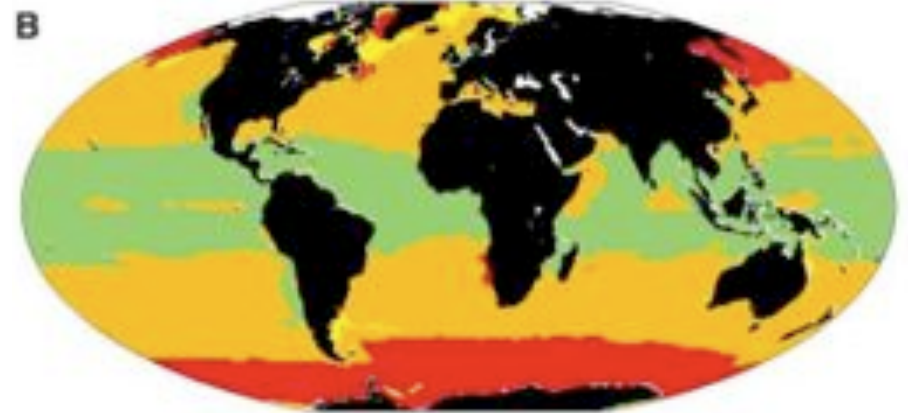
Percentage of “r” Strategists

$>10 \mu m$



Figure, Dutkiewicz

Emergent Functional Groups



Green: *Prochlorococcus* Follows et al. 2007

Orange: small photo-autotrophs

Red: diatoms

Yellow: large phytoplankton

- 1) Update export parameterization to include lithogenic & other mineral ballasting.
- 2) Incorporate improved understanding of how phytoplankton size structure controls particle export & remineralization.

Objectives & Questions

Objectives -

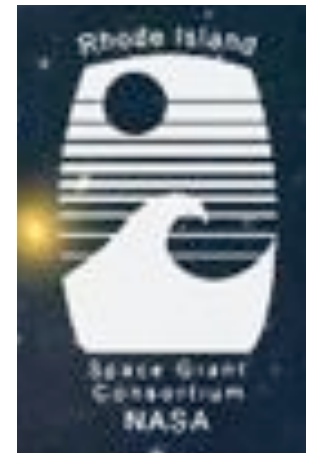
- 1) Use newly available satellite retrievals of phytoplankton community size structure to refine algorithms for sinking biogenic particles and their remineralization at depth.
- 2) Integrate into the Darwin model to improve export parameterization.
- 3) Use the improved Darwin model to understand connections to ocean carbon uptake and storage.

Questions –

- 1) Do satellite retrievals of phytoplankton size structure improve empirical algorithms for the export of biogenic particles from the surface ocean and their remineralization at depth?
- 2) How does the variability in the surface ocean phytoplankton size structure impact the biological pump of carbon to the deep ocean?

Acknowledgements

- Jim Yoder (WHOI)
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- Scott Doney and Ivan Lima (WHOI)
- NASA OBPG & SeaBASS



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