

U.S. ECoS

U.S. Eastern Continental Shelf Carbon Budget: Modeling, Data Assimilation, and Analysis

A project of the NASA Earth System Enterprise
Interdisciplinary Science Program

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J. Druon, S. Seitzinger, S. Signorini, D. Pollard



U.S. ECoS

Science Team:

| | |
|-----------------------------|--|
| Eileen Hofmann (ODU): | project oversight, 1D modeling |
| Chuck McClain (GSFC): | project oversight, remote sensing data |
| Marjorie Friedrichs (VIMS): | 1D modeling and data assimilation |
| Sergio Signorini (GSFC): | satellite data analysis |
| Antonio Mannino (GSFC): | carbon cycling, DOC algorithms |
| Jean-Noel Druon (GSFC): | DOM modeling |
| Cindy Lee (SUNY-SB): | carbon cycling |
| Jay O'Reilly (NOAA): | satellite-derived data sets |
| Dale Haidvogel (RU): | ROMS circulation modeling |
| John Wilkin (RU): | ROMS circulation modeling |
| Sybil Seitzinger (RU): | food web and nutrient dynamics |
| Katja Fennel (Dal.U): | biogeochemical modeling |
| Ray Najjar (PSU): | oxygen data, climate modeling |
| David Pollard (PSU): | climate modeling |



U.S. ECoS

Goal: To develop carbon budgets for the U.S. east coast continental shelf (Mid-Atlantic Bight and South Atlantic Bight)

Research Questions:

1. What are the relative carbon inputs to the MAB and SAB from terrestrial run-off and *in situ* biological processes?
2. What is the fate of DOC input to the continental shelf from estuarine and riverine systems?
3. What are the dominant food web pathways that control carbon cycling and flux in this region?
4. Are there fundamental differences in the manner in which carbon is cycled on the continental shelves of the MAB and SAB?
5. Is the carbon cycle of the MAB and SAB sensitive to climate change?



Project Structure/Management

Personnel

Breadth of expertise: modelers and observationalists

Multiple subgroups working in parallel:

model-data comparison via Rutgers OpenDap server

Communication

Semi-annual group meetings

Monthly conference calls

Parallelism and frequent communication

⇒ builds diversity

Outline

1. Data Analysis

- Historical *in situ* measurements
- Satellite-derived data
- Limited field measurement effort

2. Development/Implementation of Models

- Circulation model
- Coupled biogeochemical-circulation model
- Coupled biogeochemical-circulation model with DOM

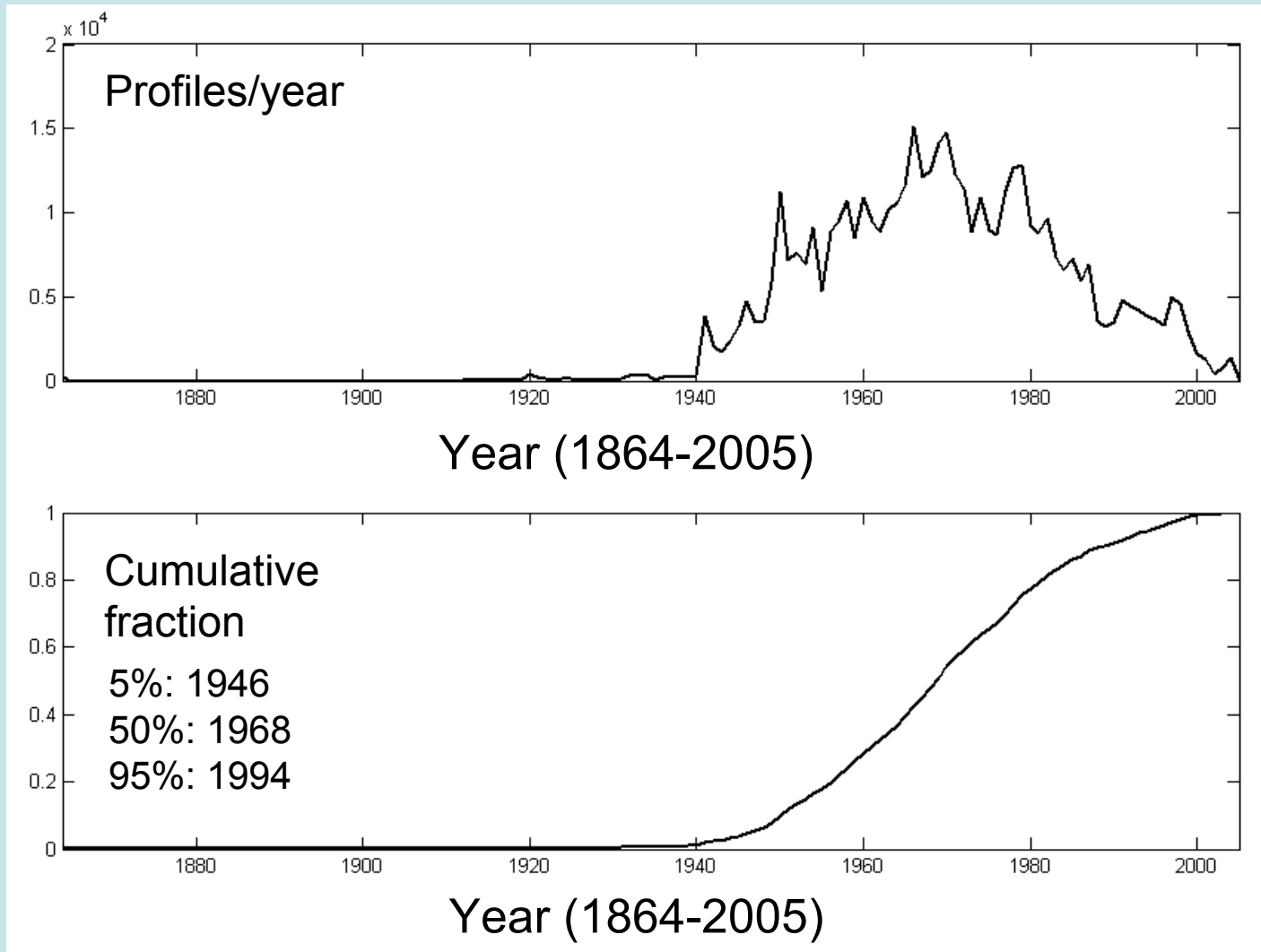
3. Models+Data

- Quantitative skill assessment
 - Scatter, Taylor, Target, Variational data assimilation

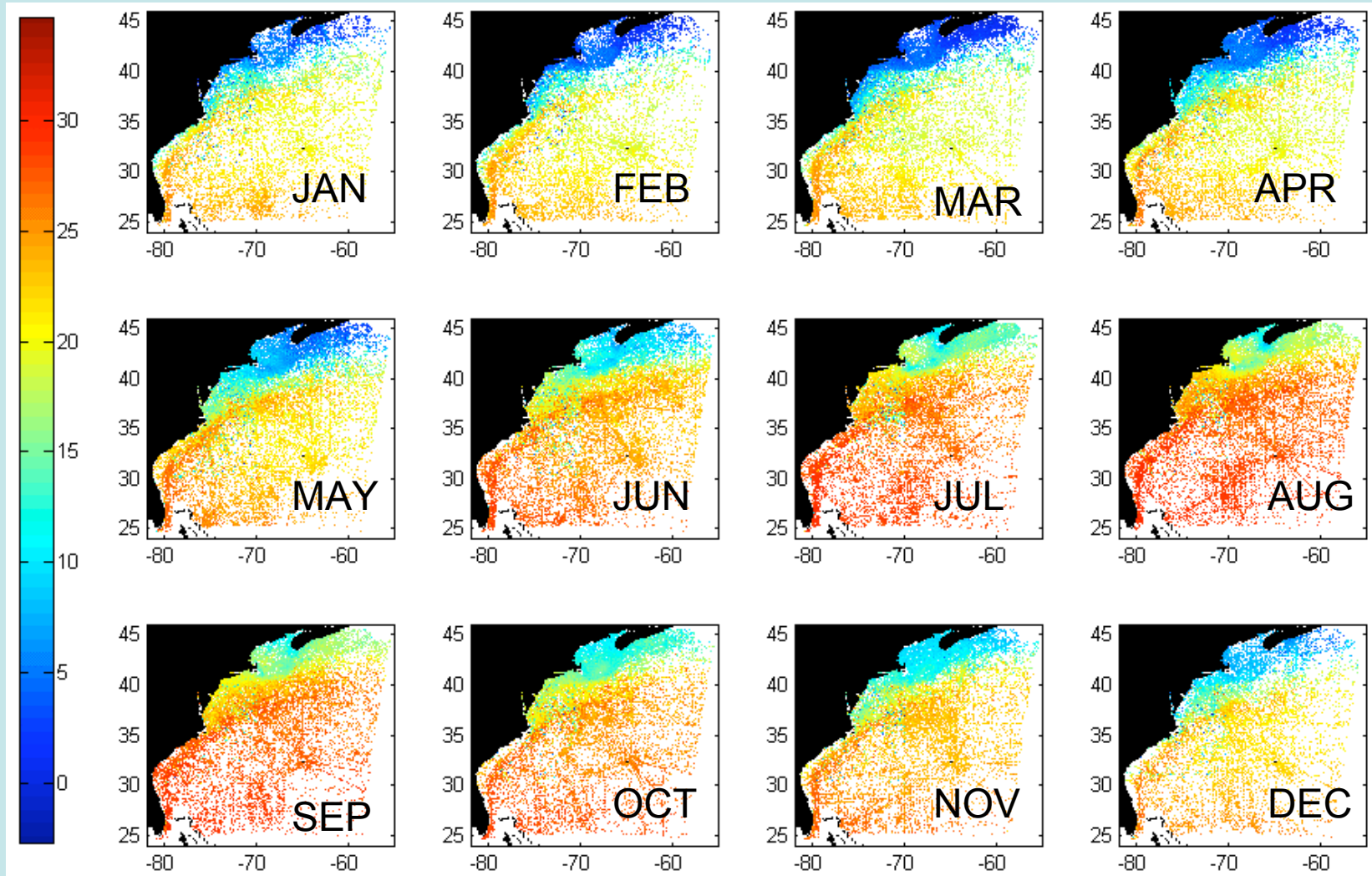
4. Process/Climate Studies

1a. Historical data

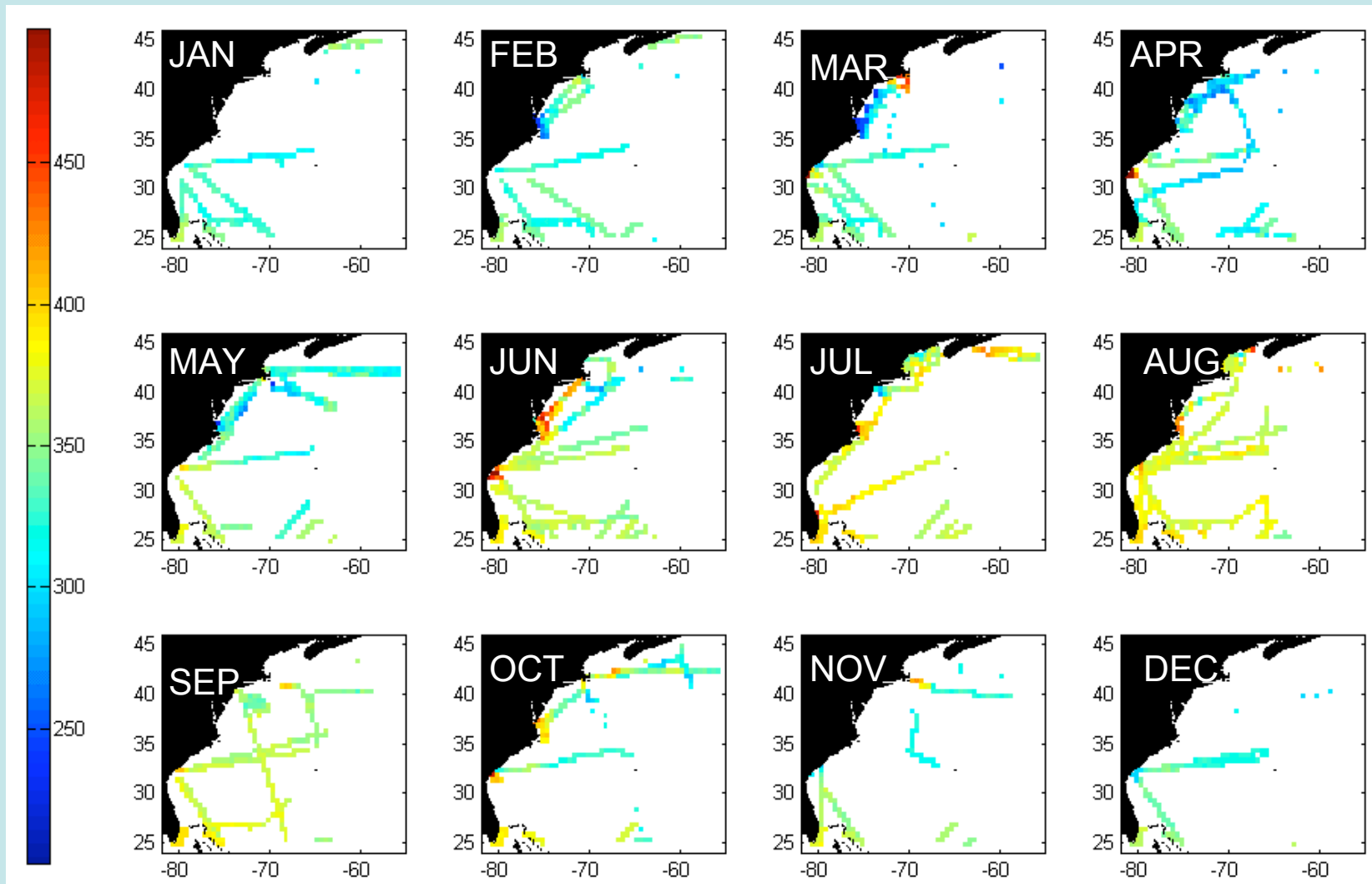
Total number of NODC Temperature profiles: 462,348



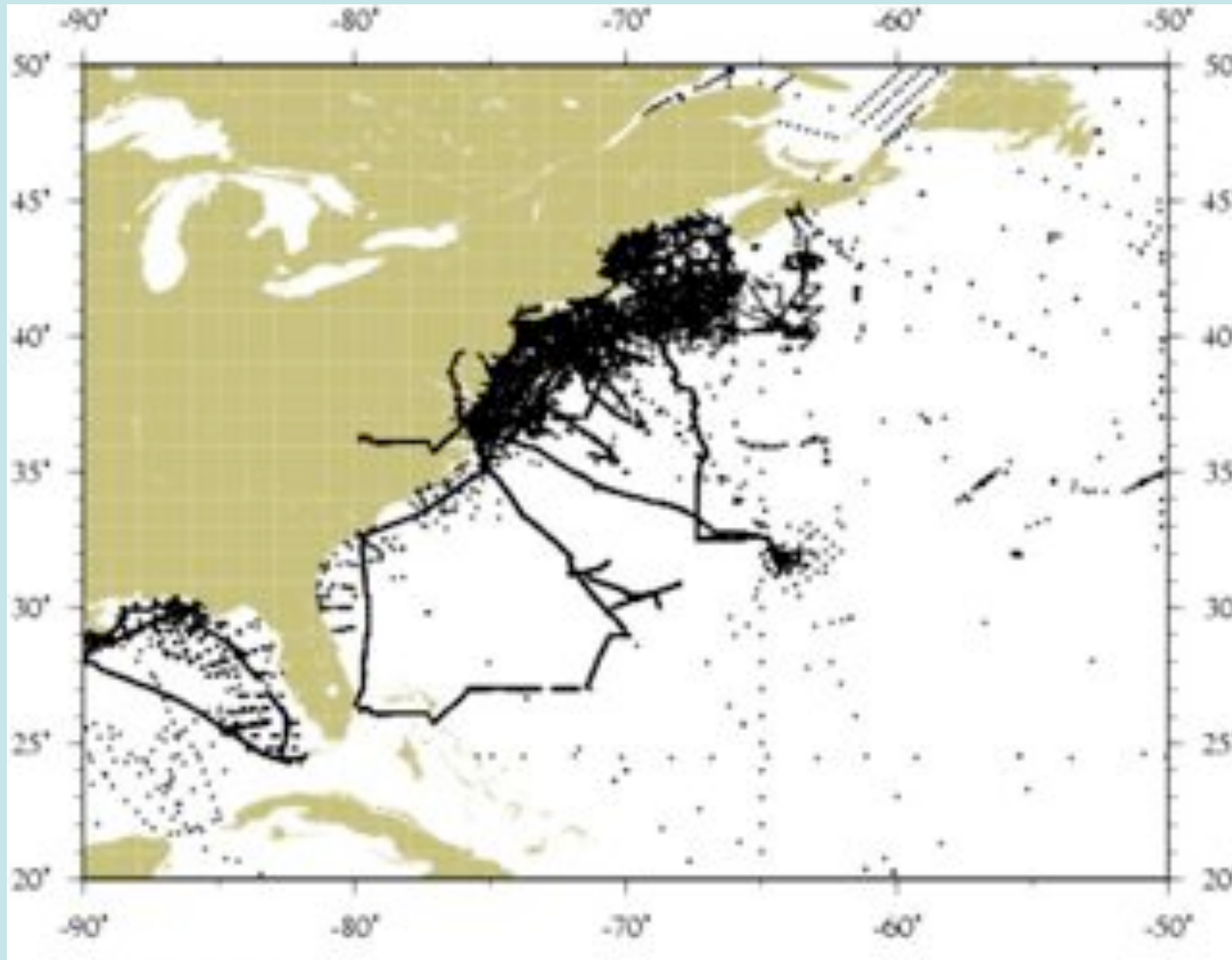
Temperature (°C)



$p\text{CO}_2$ (μatm)



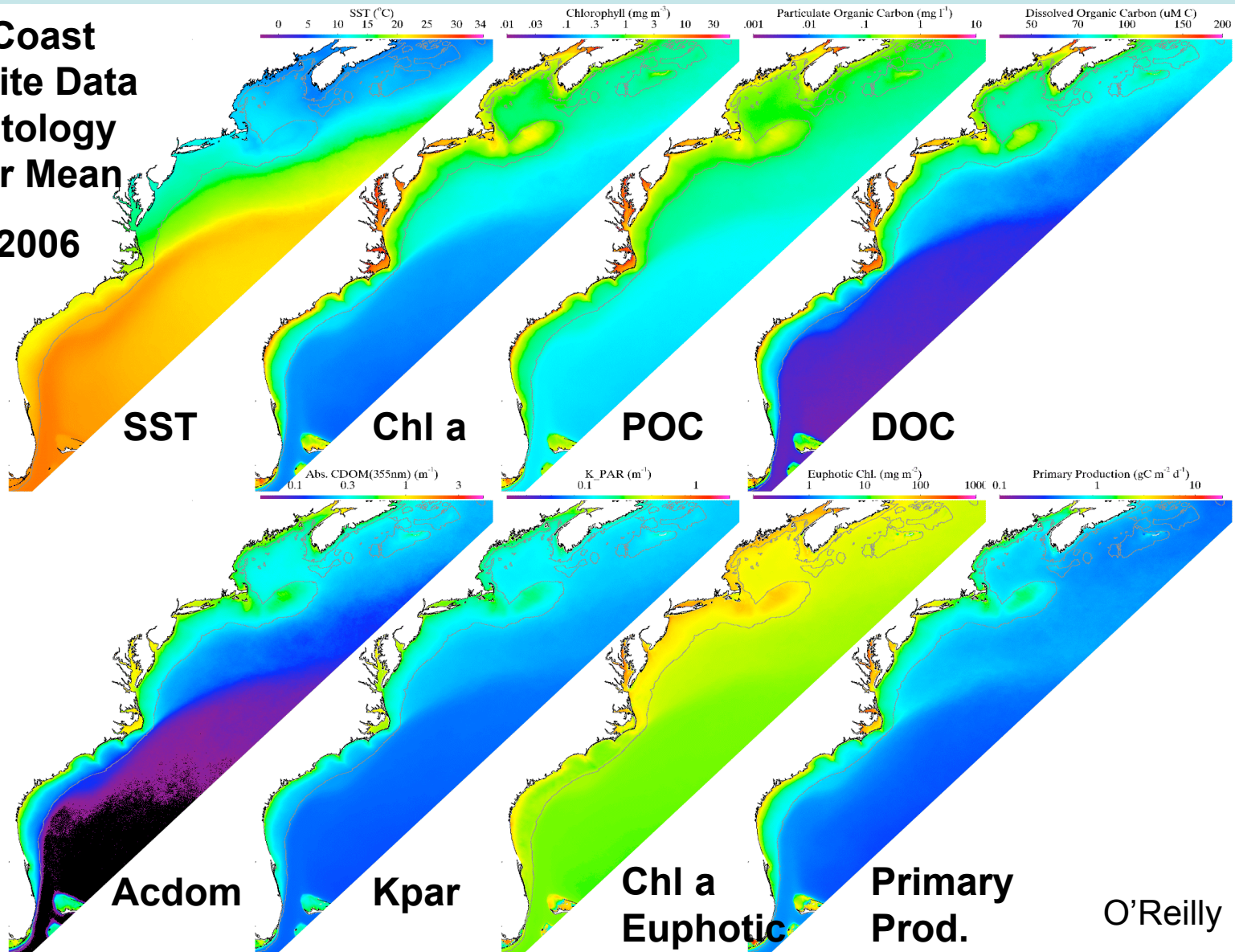
NODC chlorophyll-a profiles



- Disparity in data density between SAB and MAB
- More burden on satellite data in south

1b. Satellite data

**East Coast
Satellite Data
Climatology
9-Year Mean
1998-2006**

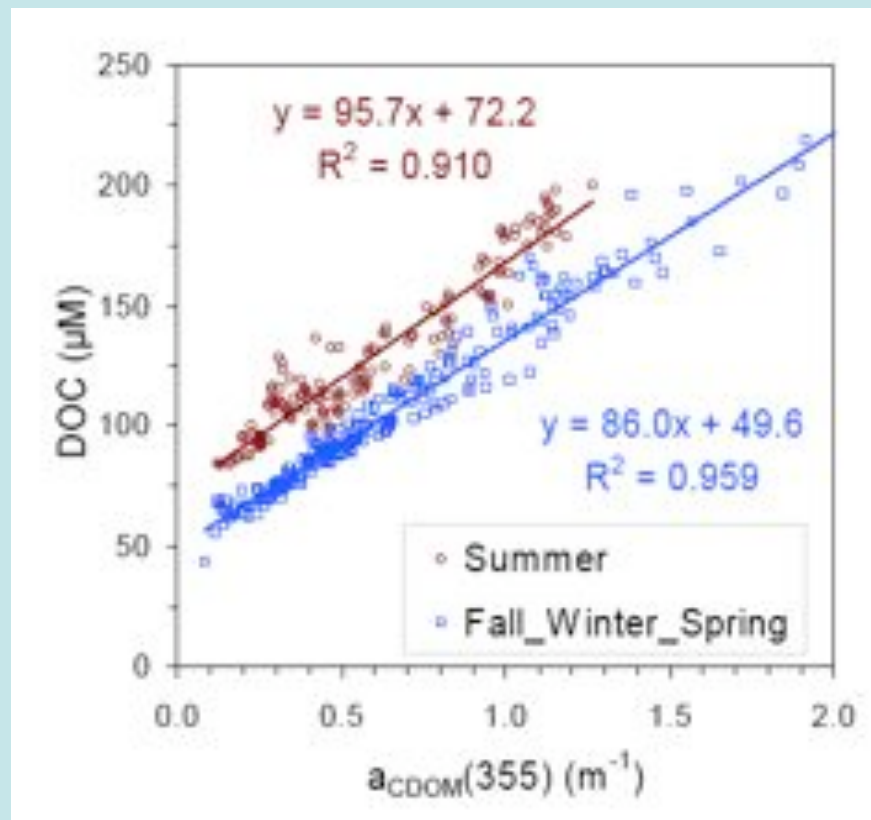


O'Reilly

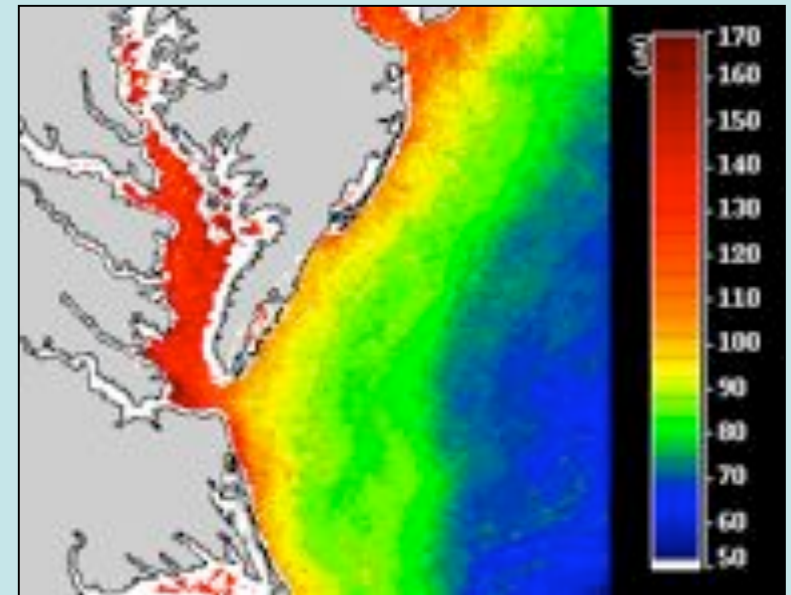
1c. Satellite+*in situ* data analyses

Chesapeake Bay Mouth and adjacent coastal waters

- in situ DOC, CDOM, POC, pigments, TSP
- satellite derived CDOM, DOC, POC algorithms



SeaWiFS Feb. 2005 - DOC (µM)



DOC Reservoir for
Winter 2004 & 2005
= 1.13 ± 0.036 Tg C

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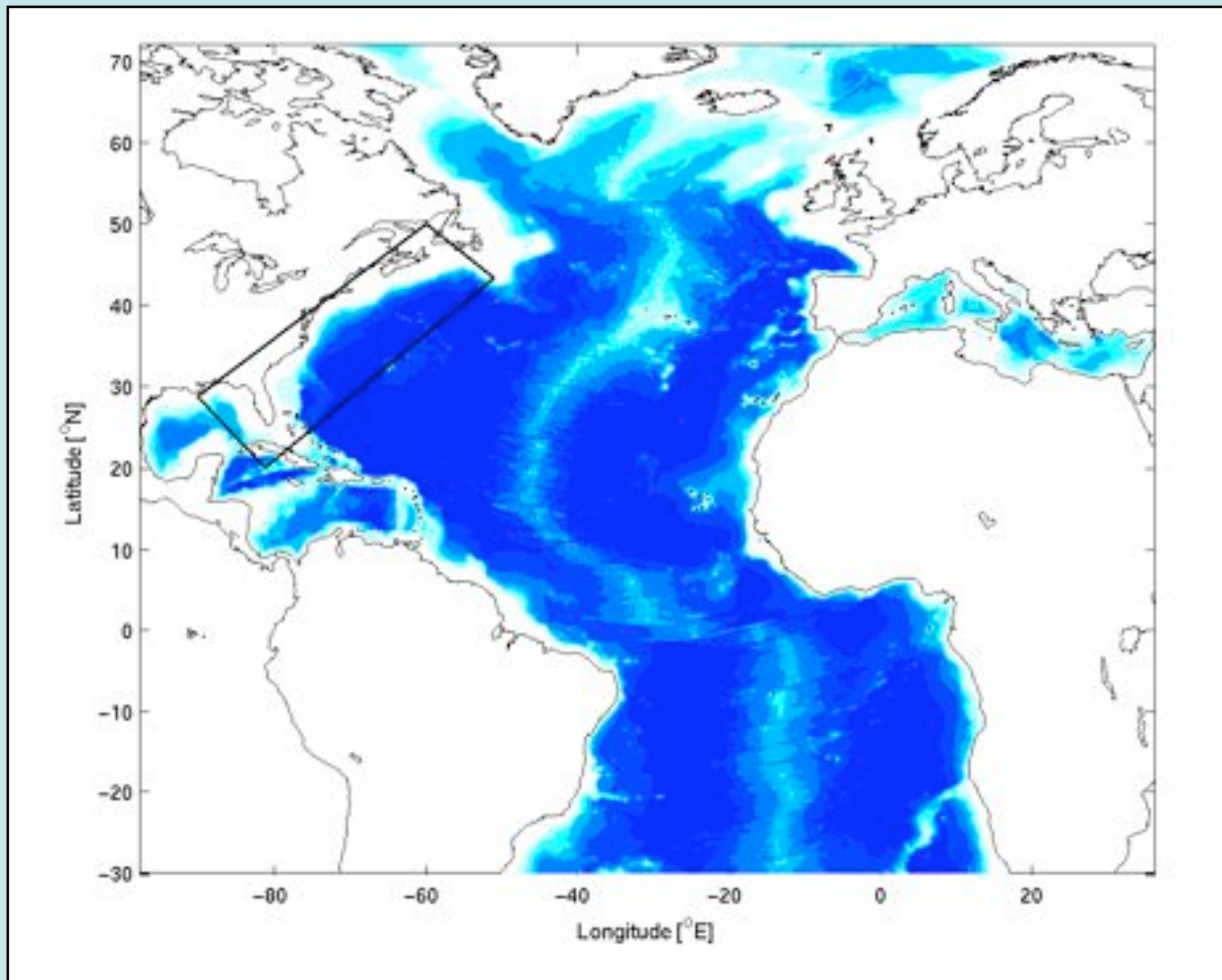
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2. Coupled circulation-biogeochemical-DOM model

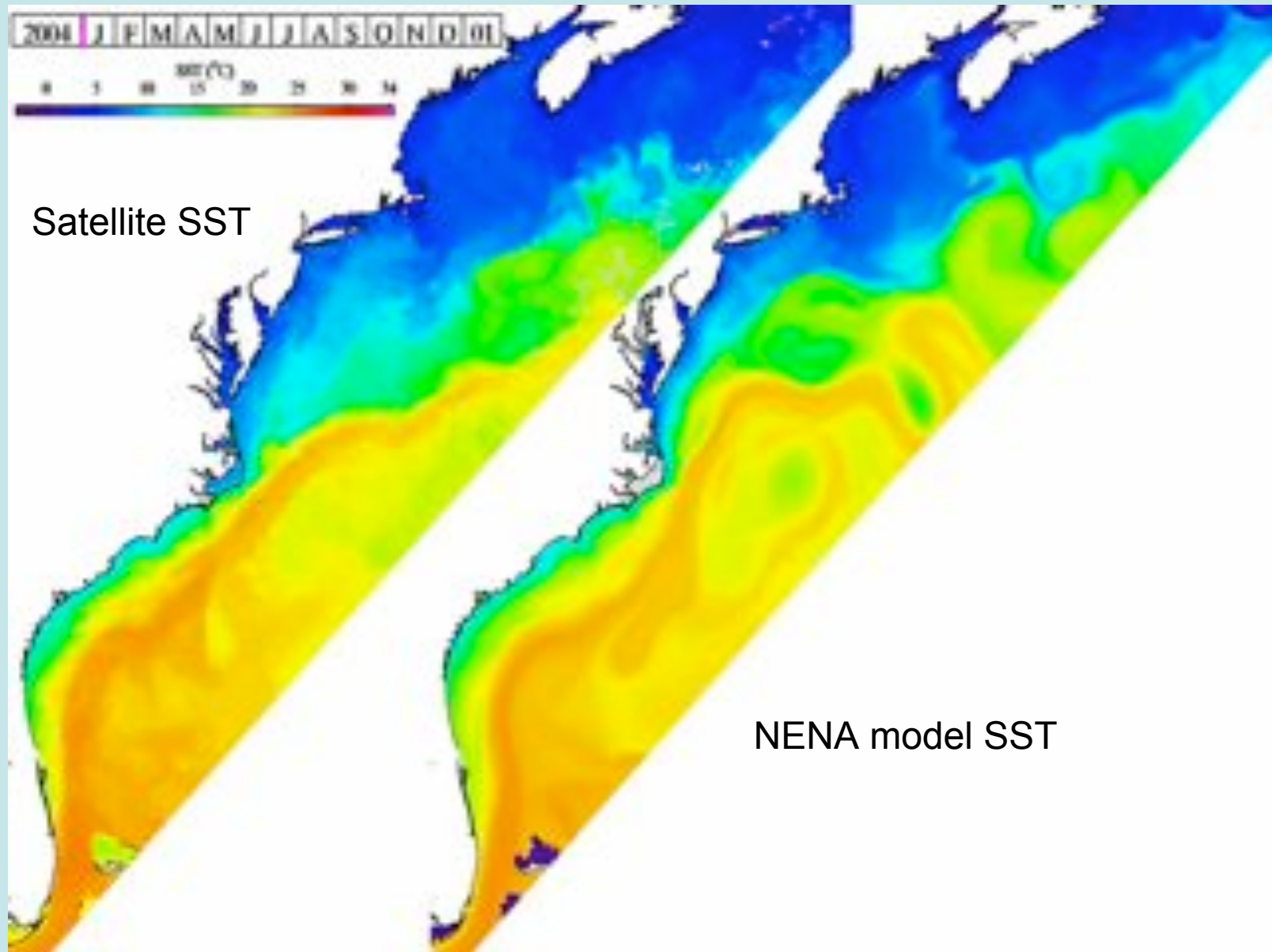
Northeast North American shelf model (NENA)



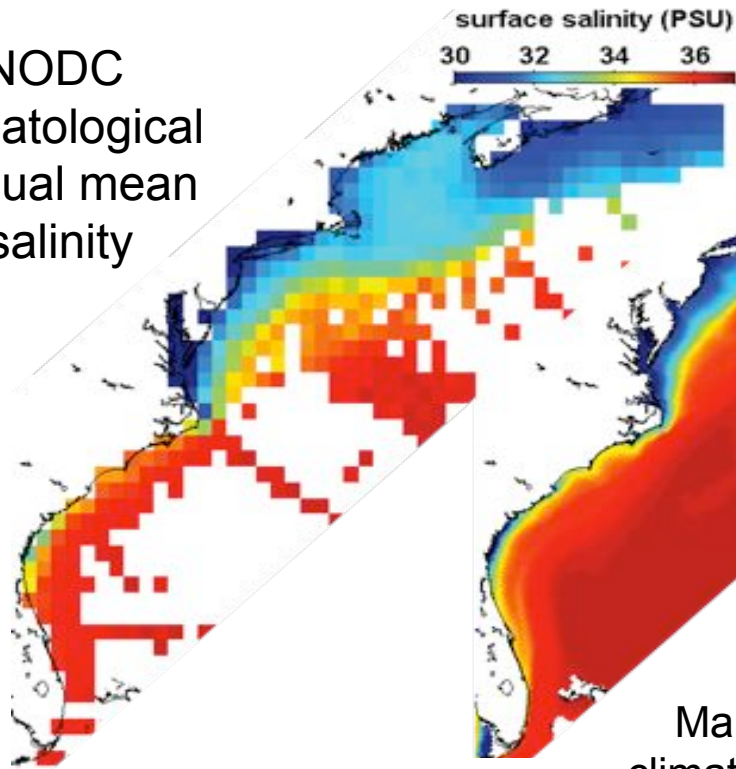
10 km horiz res
30 vertical levels
Nested in
HYCOM

Wilkin
Haidvogel
Fennel
Druon

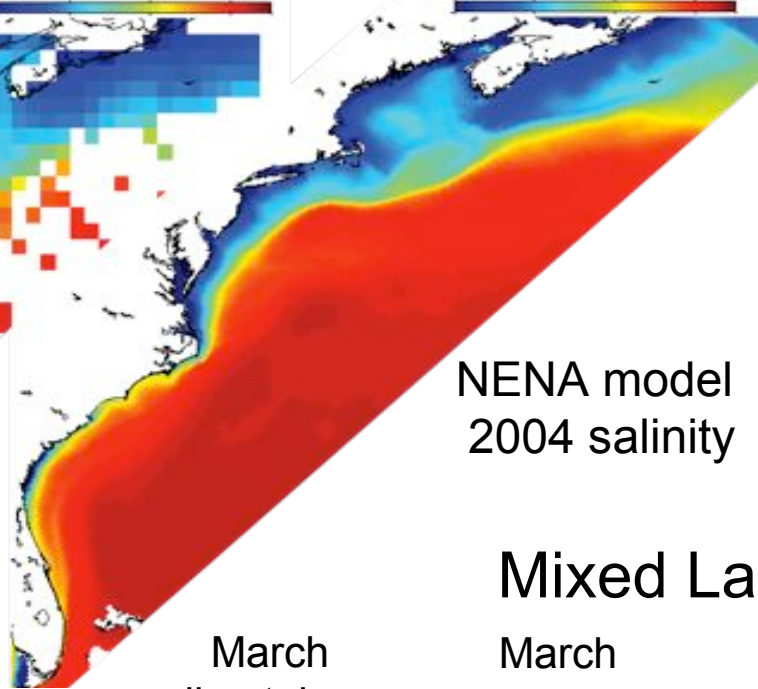
SST satellite-model comparison for 2004



NODC
climatological
annual mean
salinity



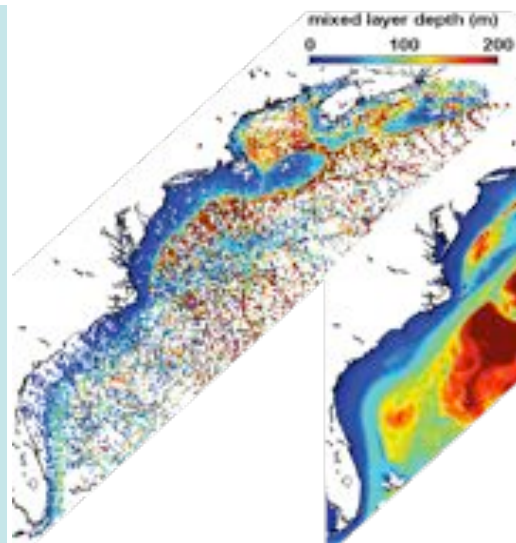
surface salinity (PSU)
30 32 34 36



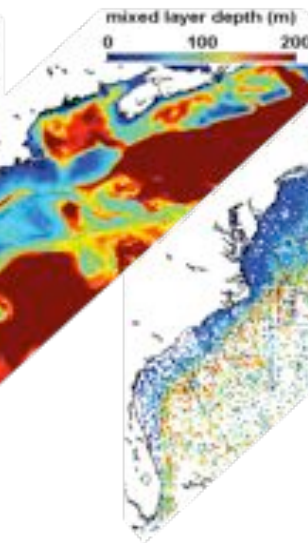
In situ
NODC
model-data
comparisons

Mixed Layer Depths

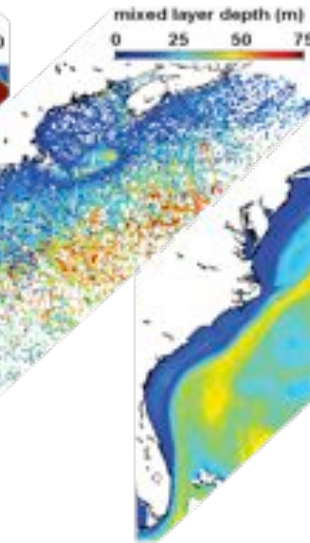
March
climatology
data



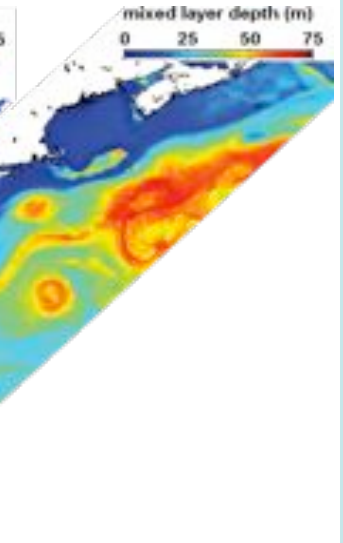
March
2004
model



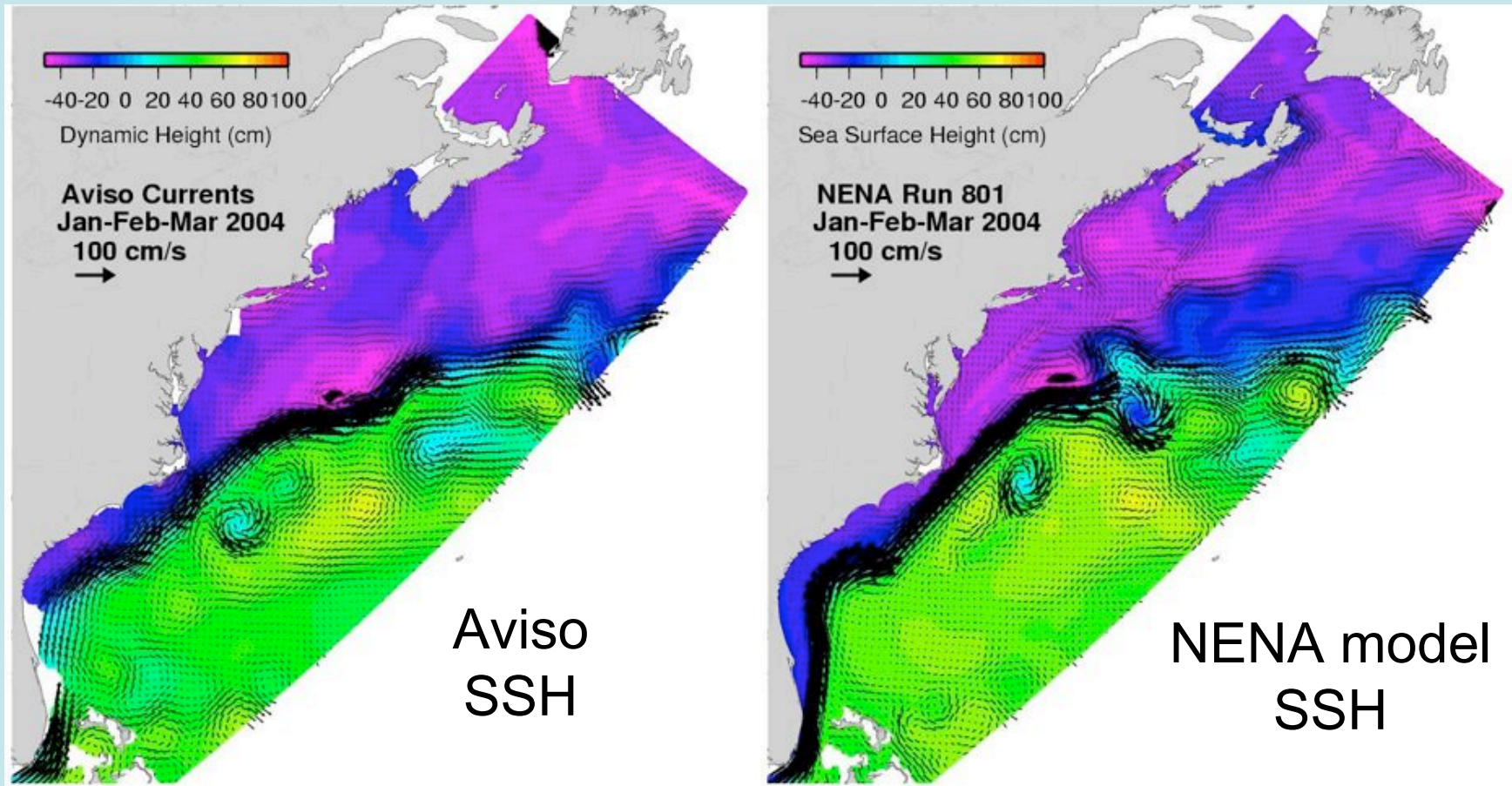
September
climatology
data



September
2004
model

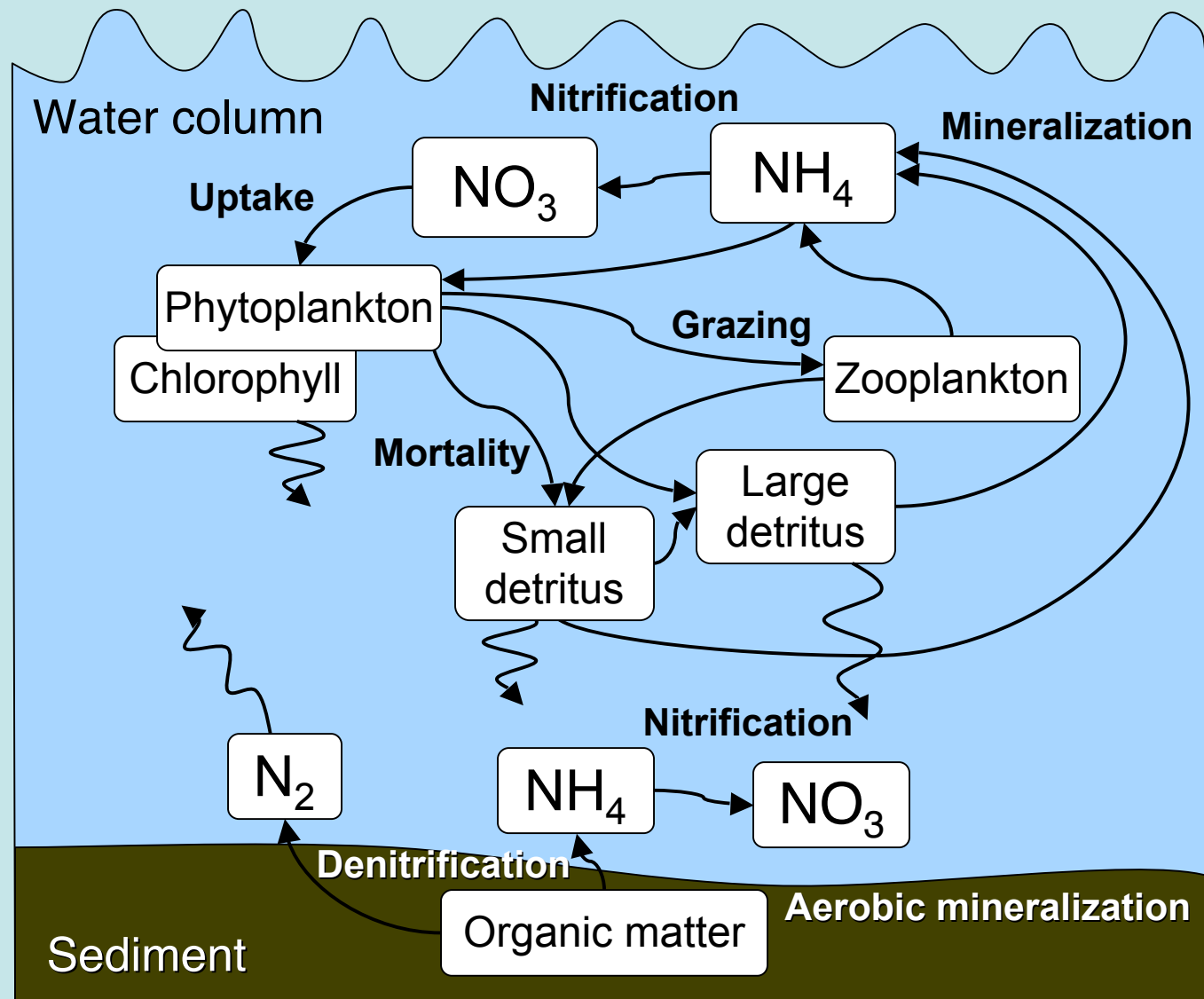


SSH & surface current comparison: NENA vs. Aviso*



*AVISO =Archiving, Validation and Interpretation of Satellite Oceanographic data
Absolute Dynamic Topography from all altimeter missions:
Jason-1,T/P, ENVISAT, GFO, ERS1/2, GEOSAT)

2b. Biogeochemical-circulation modeling

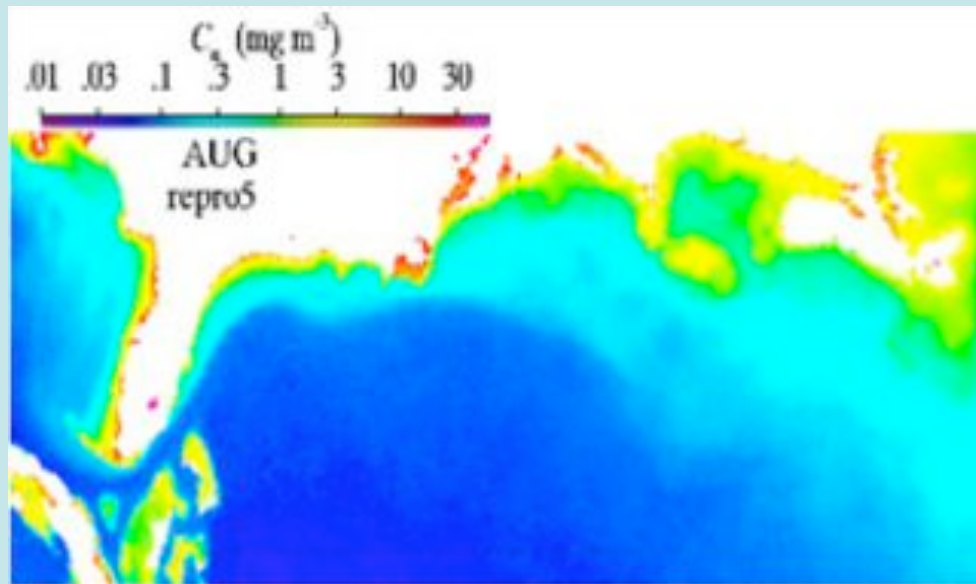


Fennel et al., 2006

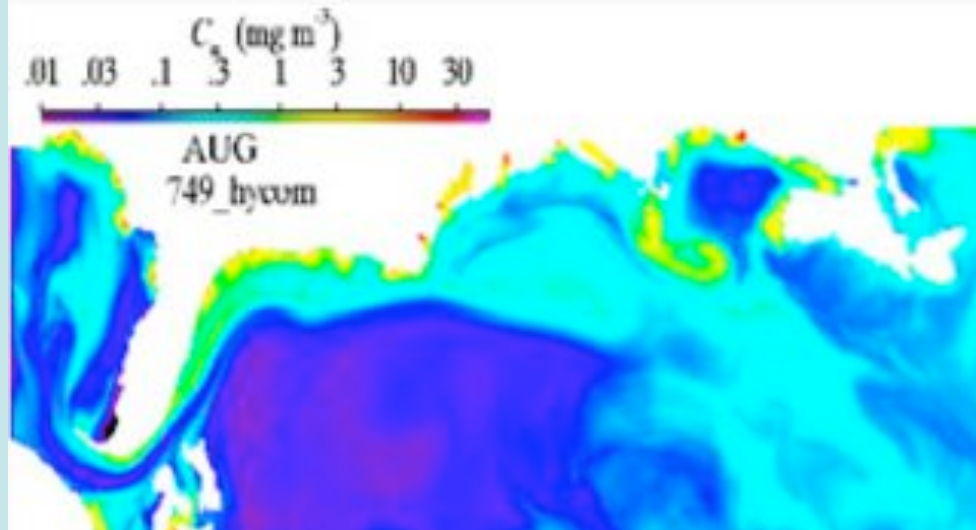
No DOM

Surface chlorophyll comparison: model vs. SeaWiFS

SeaWiFS



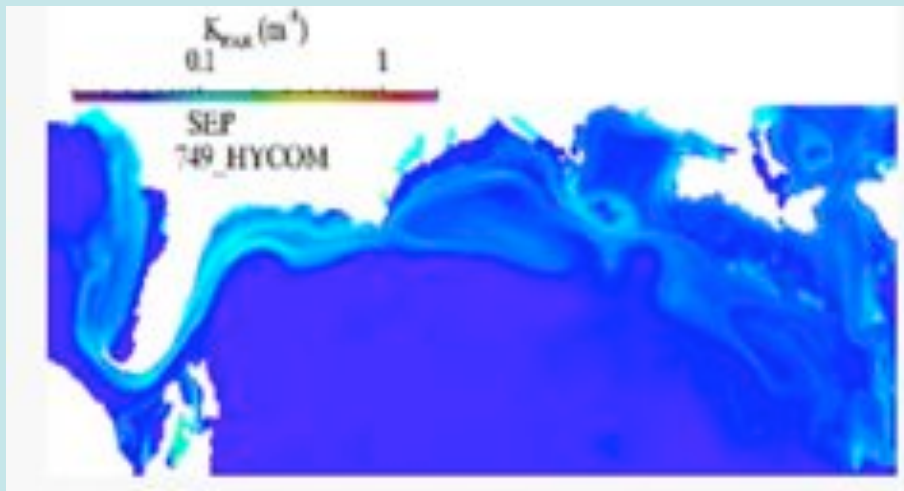
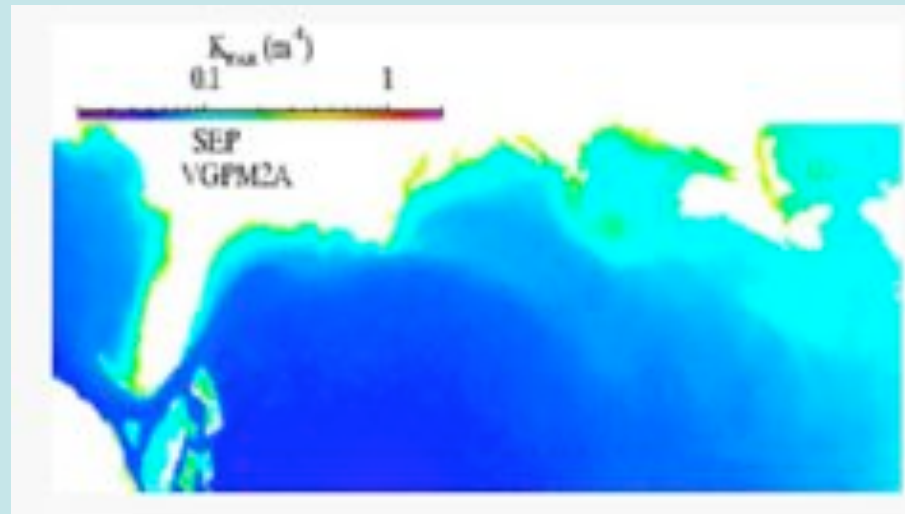
NENA
model



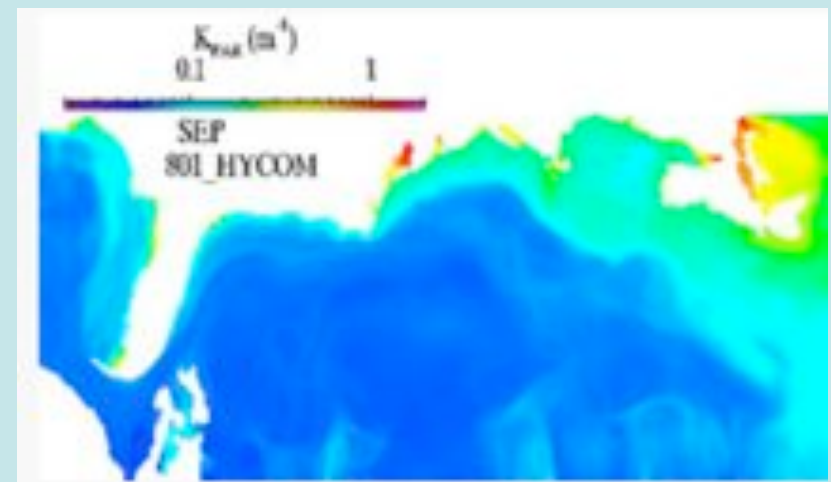
Fennel

k_PAR: derived from VGPM2A vs. NENA

k_PAR
derived from
VGPM2a



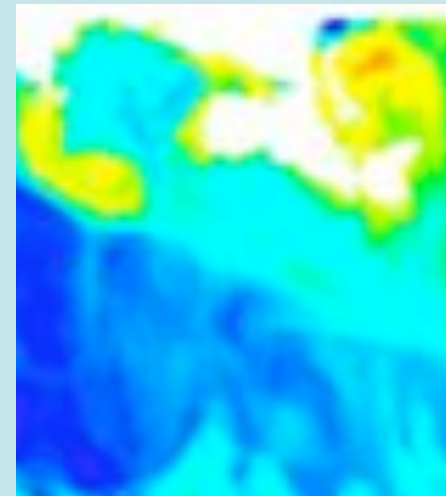
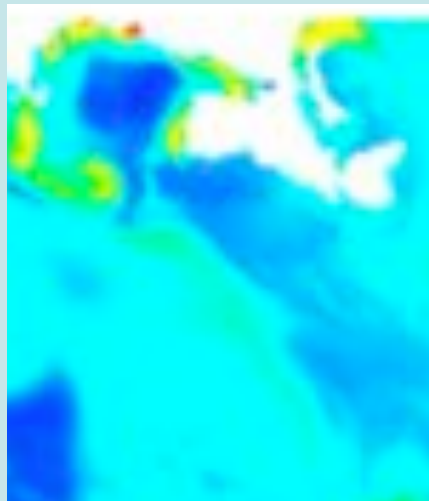
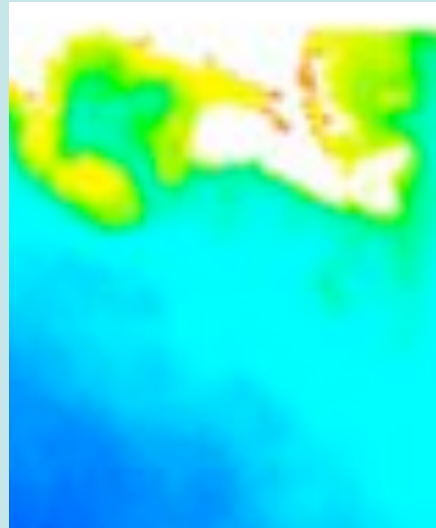
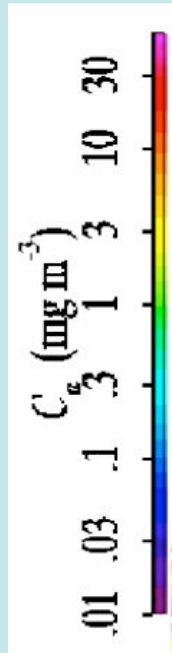
k_PAR: original simulation



k_PAR: after addition of k_{CDOM}

chlorophyll comparison: with/without k_CDOM

SeaWiFS
chlorophyll
September

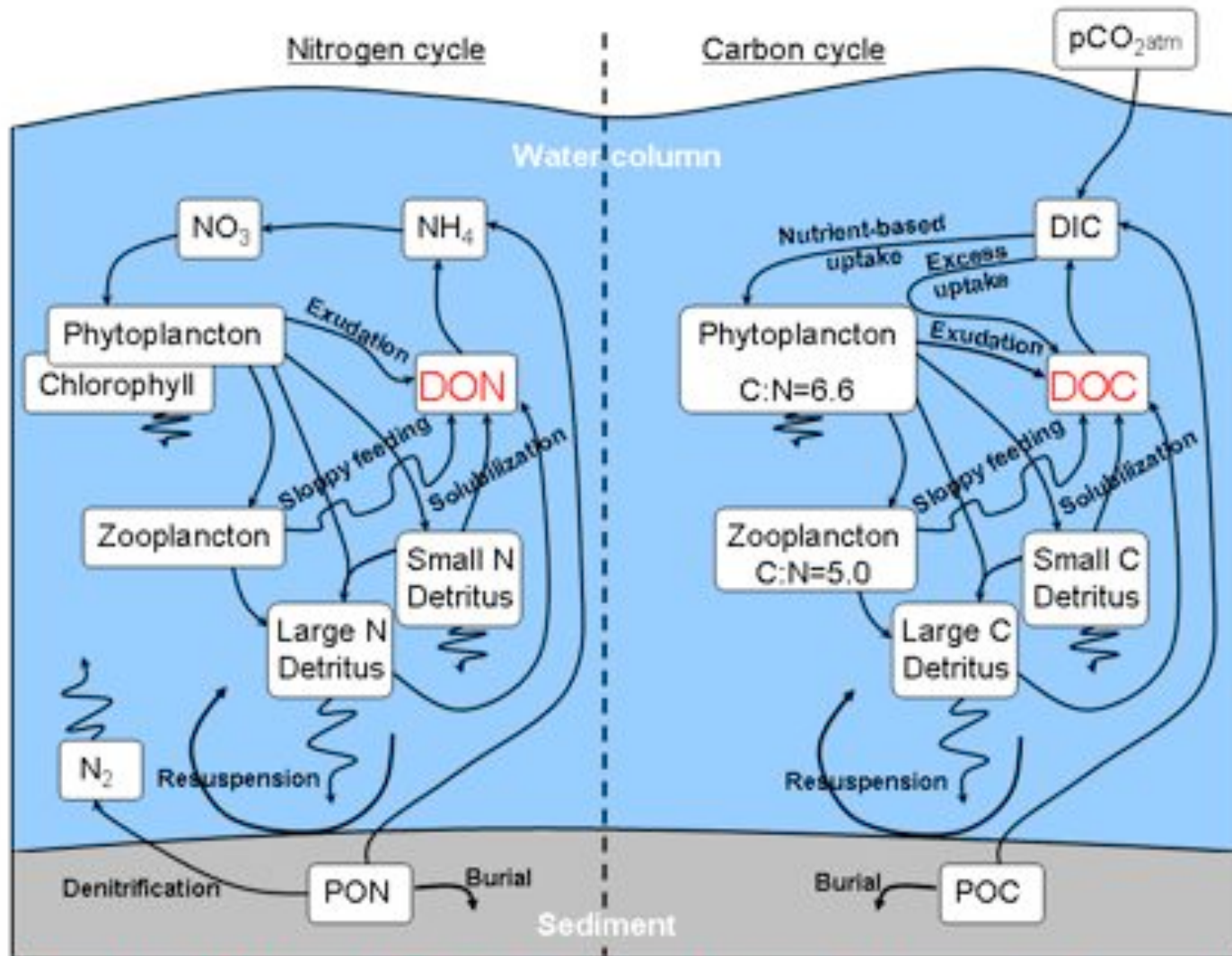


Fennel

original simulation (no_k_CDOM)

after addition of k_CDOM

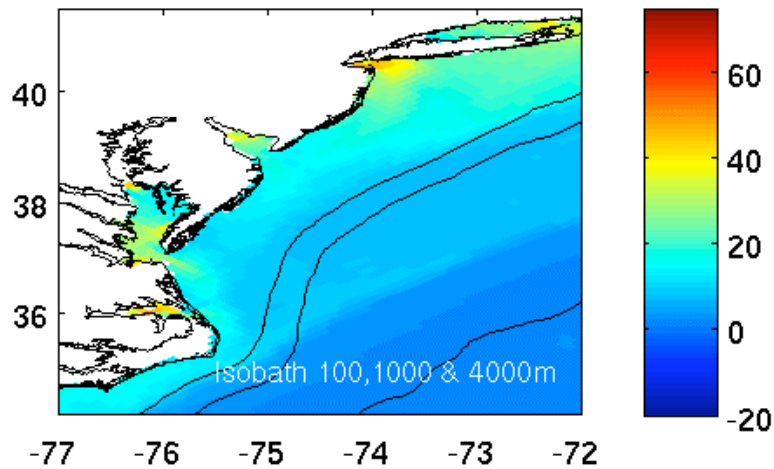
2c. DOM modeling



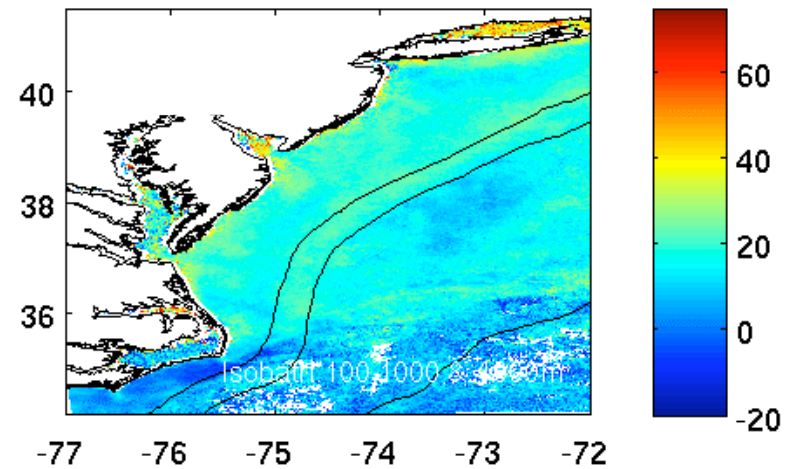
Semilabile DON and DOC with degradation rates from weeks to months

Semi-labile DOC July 2004

Model semi-labile DOC



SeaWiFS-derived semi-labile DOC



$$\Delta\text{DOC} = \text{TotalDOC}(\text{July}) - \text{TotalDOC}(\text{March})$$

[Refractory+semi-labile] *[Refractory]*

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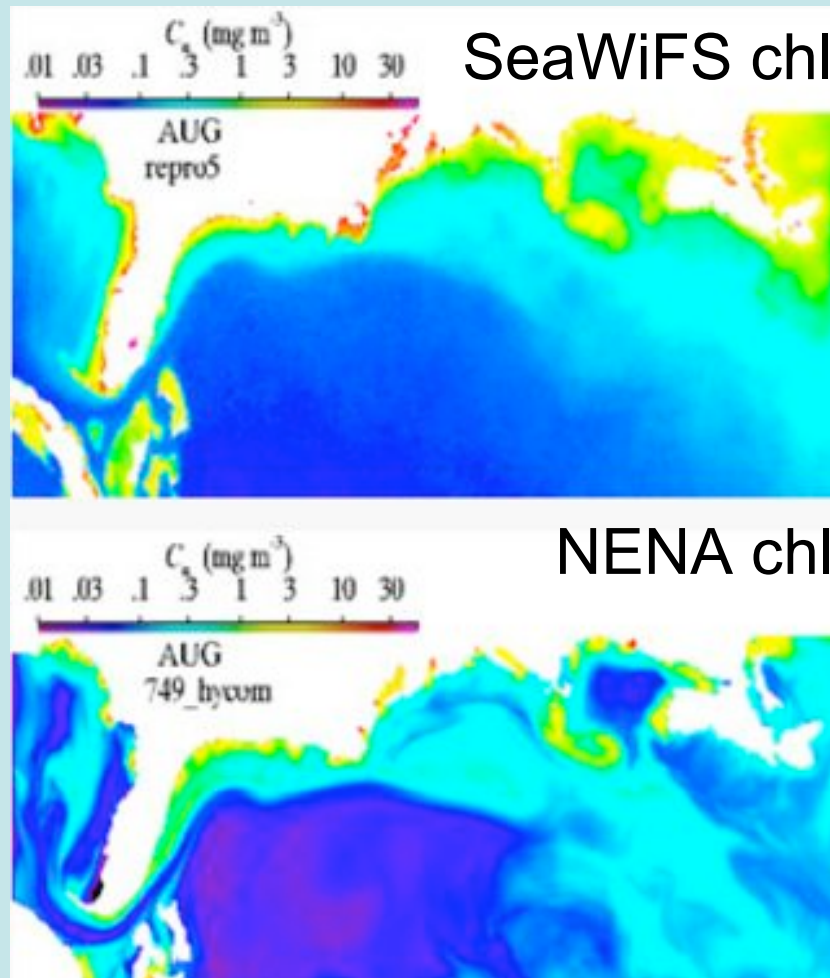
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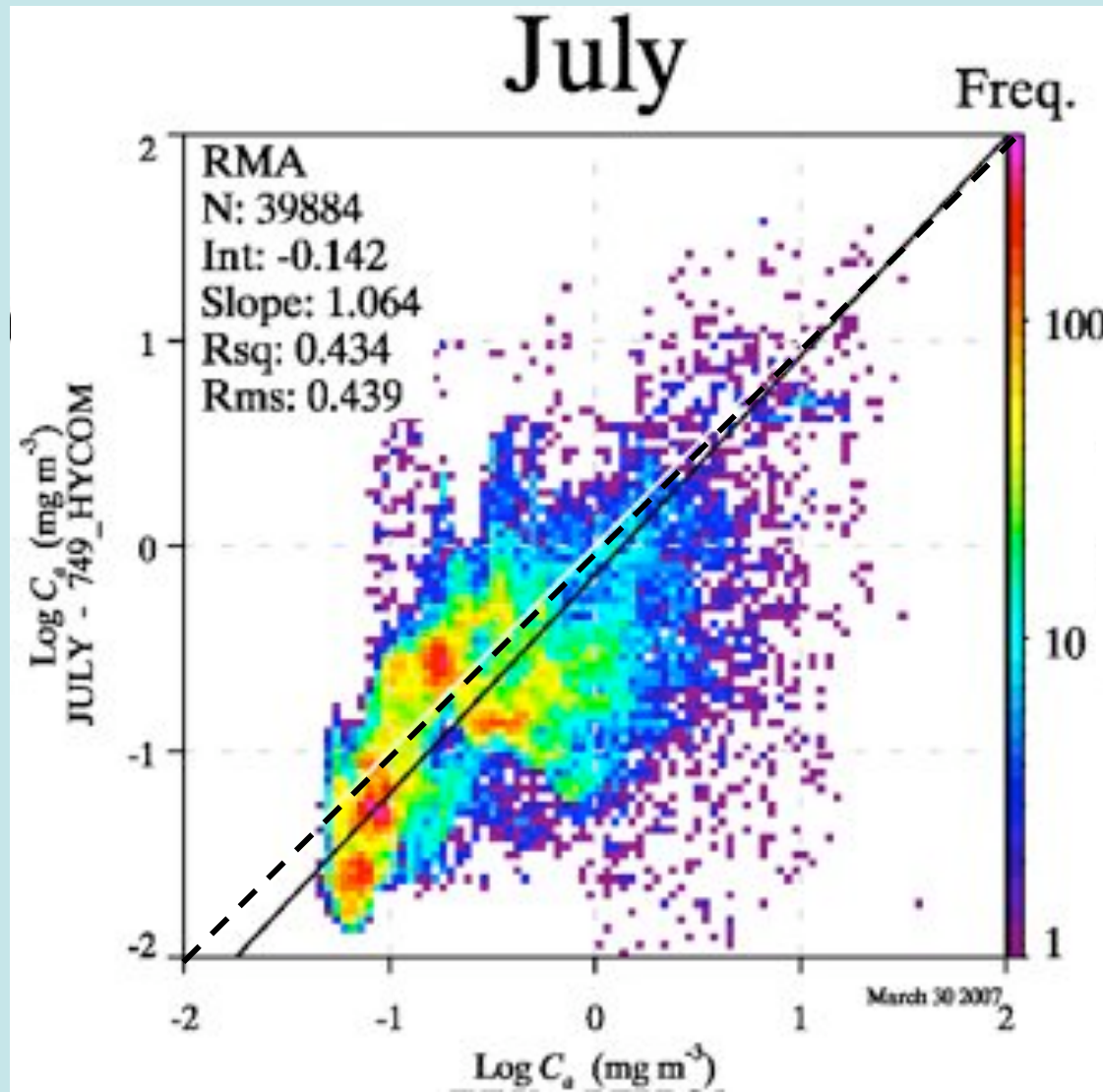
Qualitative model-data comparisons are not enough!



We need to assess model skill **quantitatively**

3. Quantitative Model Skill Assessment

NENA model
chlorophyll



SeaWiFS chlorophyll

Quantitative comparison by region

G. of Maine

Georges Bank

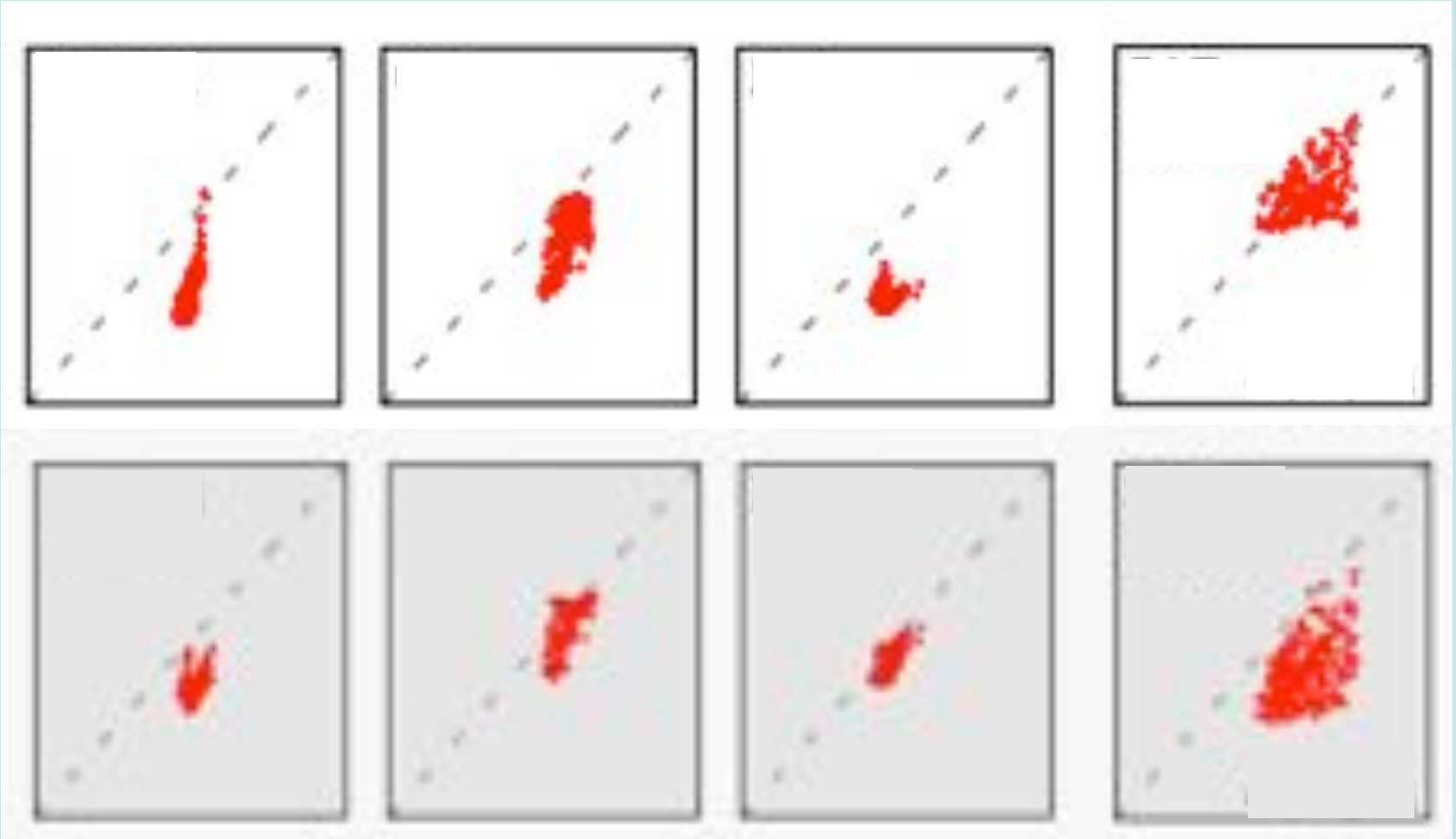
SE NScot Shelf

SAB Inner Shelf

NENA chlorophyll

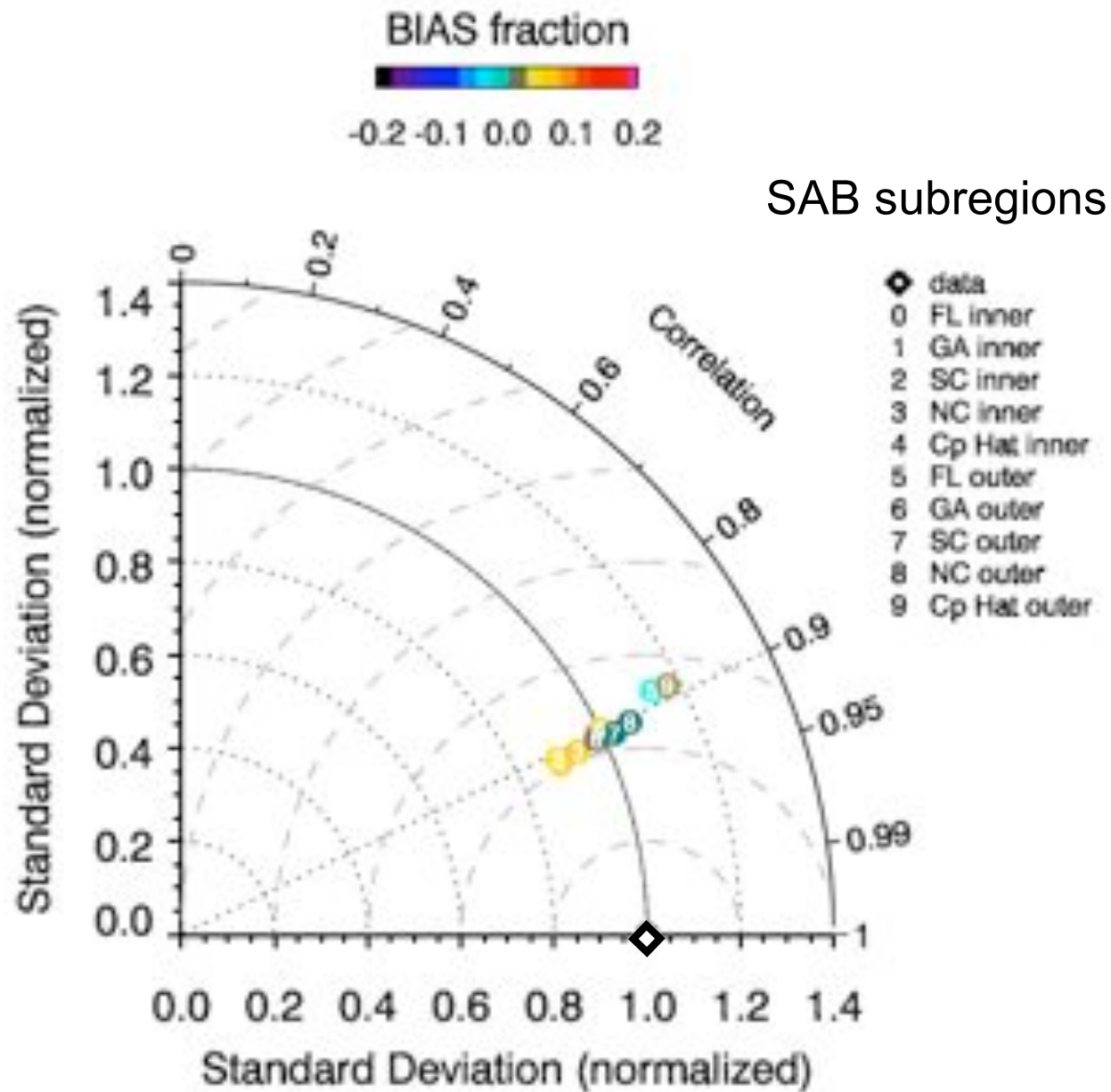
Old k_PAR

New k_PAR

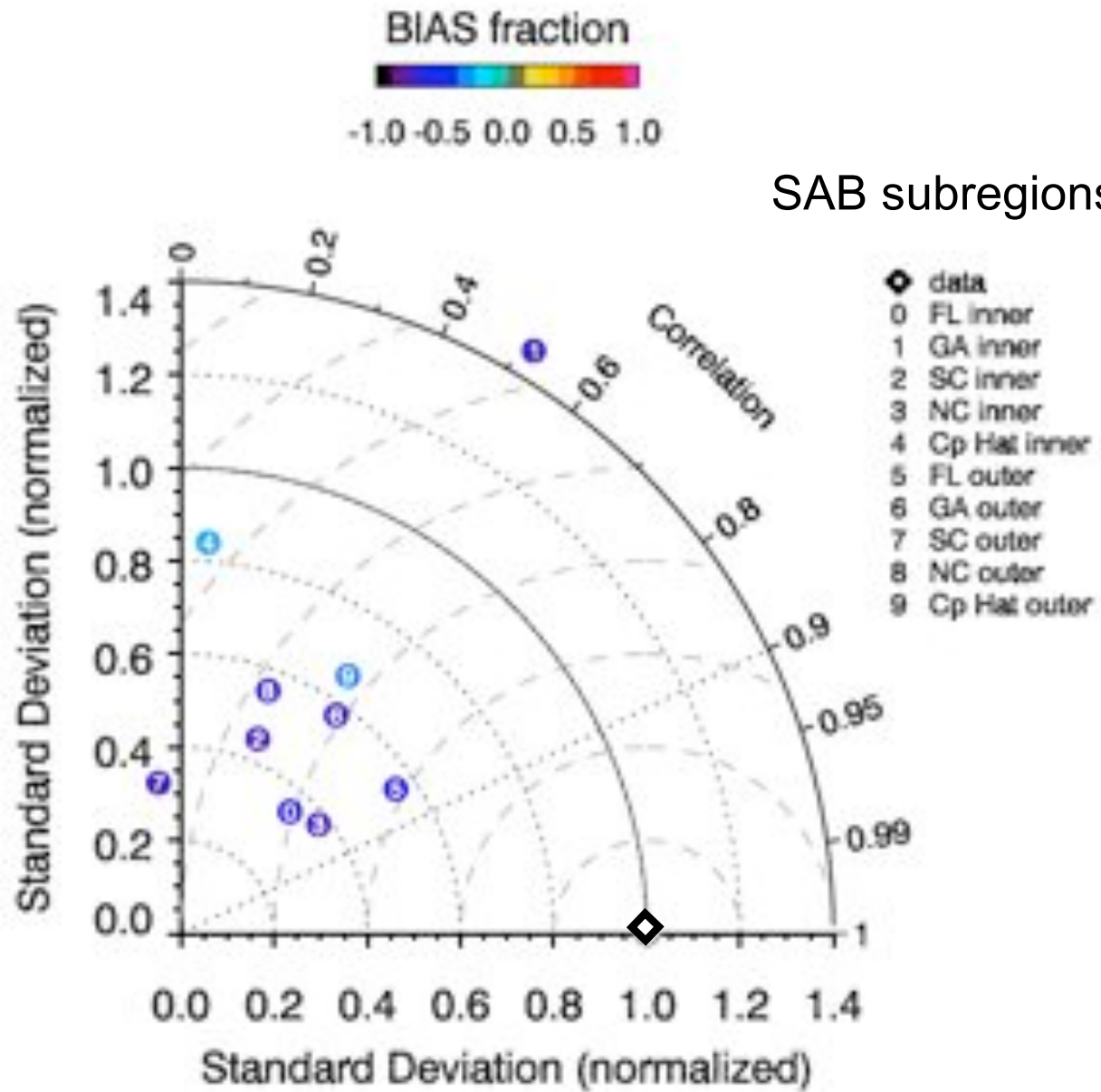


SeaWiFS chlorophyll

Normalized Taylor diagram for SST



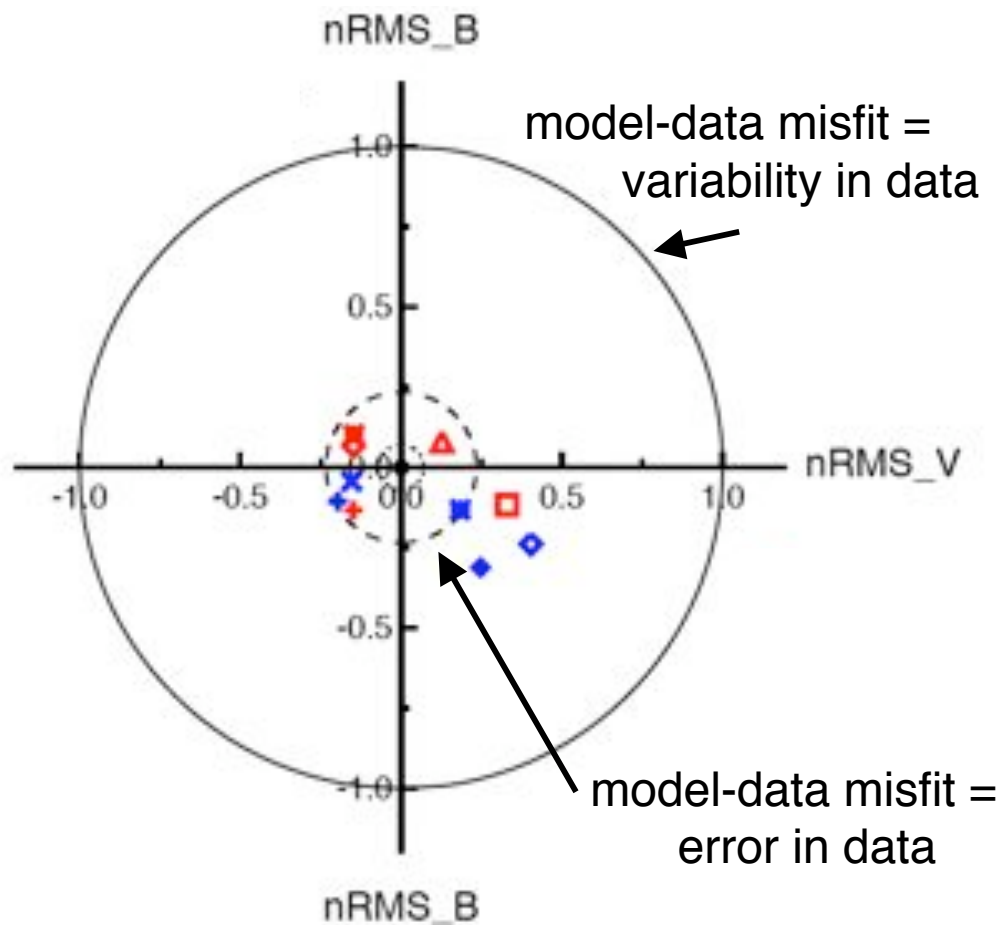
Normalized Taylor diagram for chl



Normalized Target diagram for SST

$$\text{RMS}_T^2 = \text{RMS}_B^2 + \text{RMS}_V^2$$

SAB SST climatology



SAB subregions

- + F1
- ⊠ G1
- ◇ SC1
- △ NC1
- CH1
- ◆ F2
- ⊗ G2
- + SC2
- ⊠ NC2
- ◇ CH2
- ◆ data

Data assimilation framework: 1D implementation

Approach:

1-D physics + horizontal advection terms from 3D model

Same biogeochemical model as is running in 3D;
reproduces 3D model results very well!

Assimilate ocean color or in situ data (variational adjoint method)
for optimization of biogeochemical parameters

(e.g. max. growth rate; C:chl ratio)

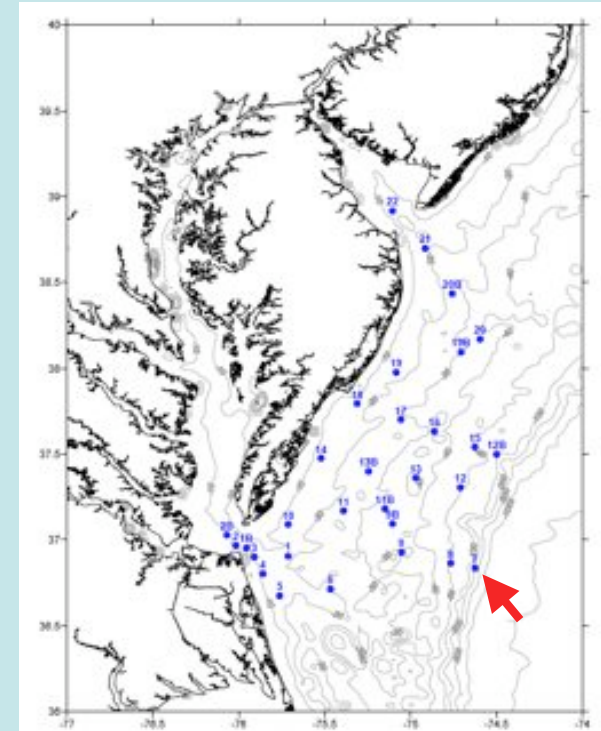
Runs quickly!

Goals:

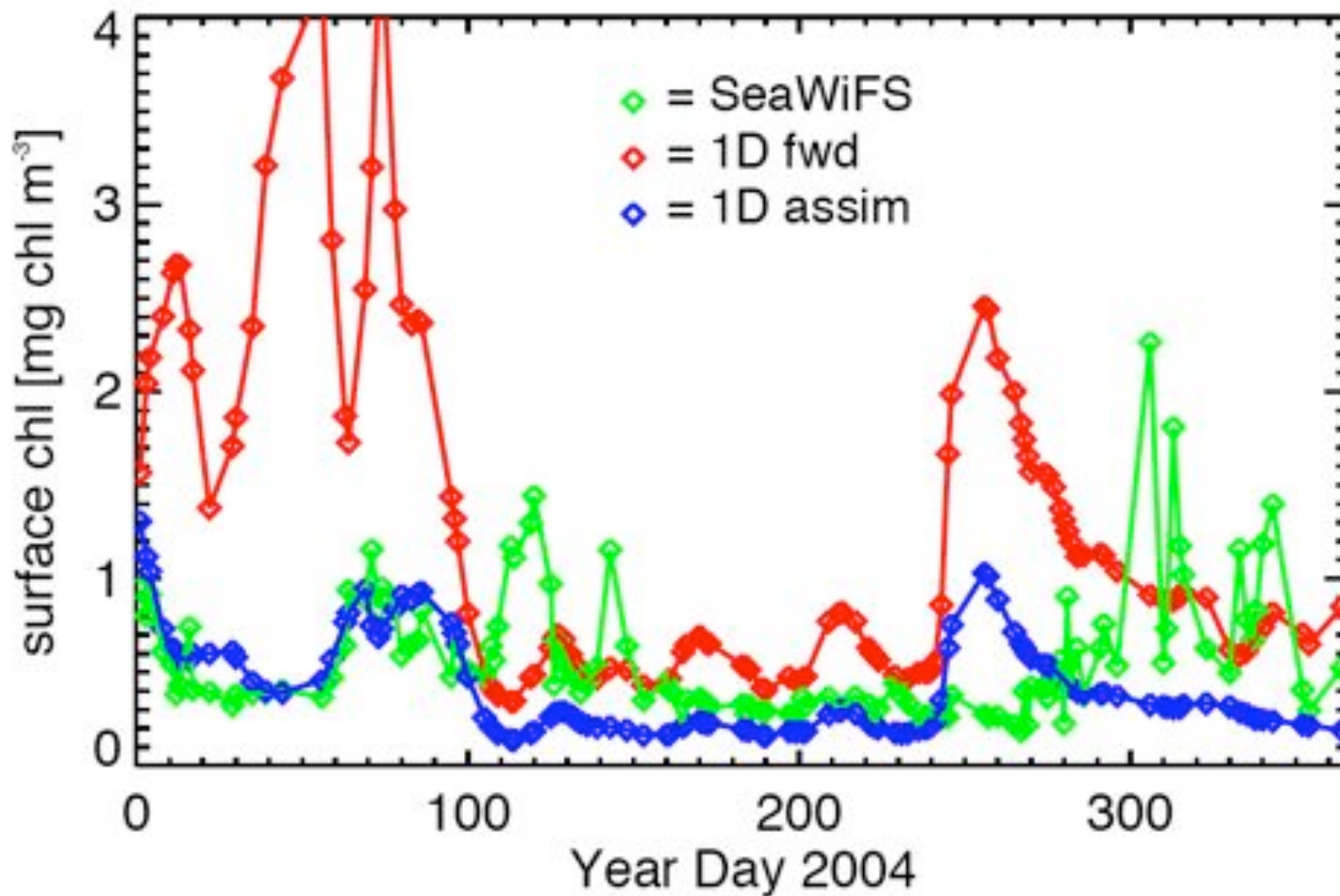
Test new parameterizations and formulations

Perform parameter sensitivity/optimization
analyses

Quantitatively assess optimal model-data fit
via cost function



SeaWiFS Assimilation Results



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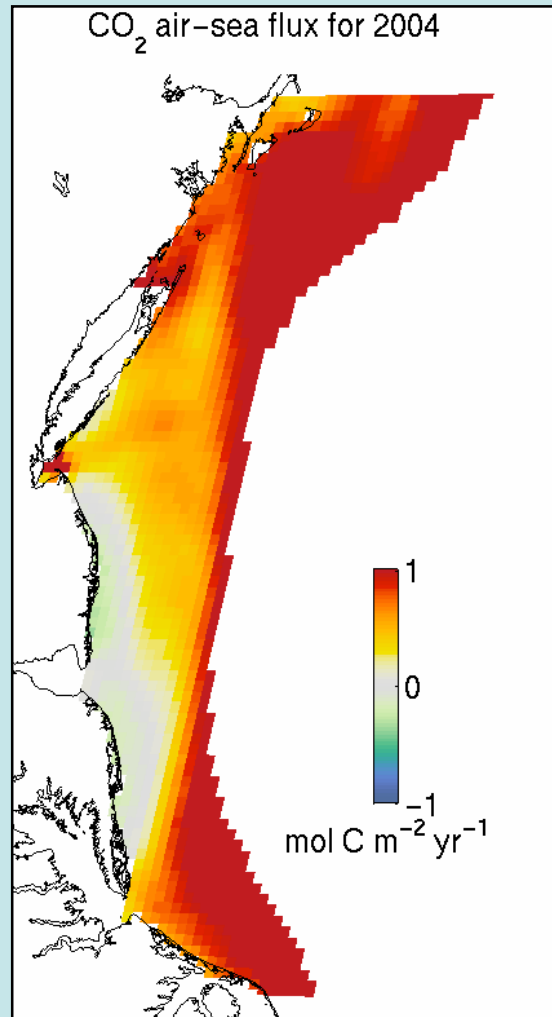
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4. Process Studies



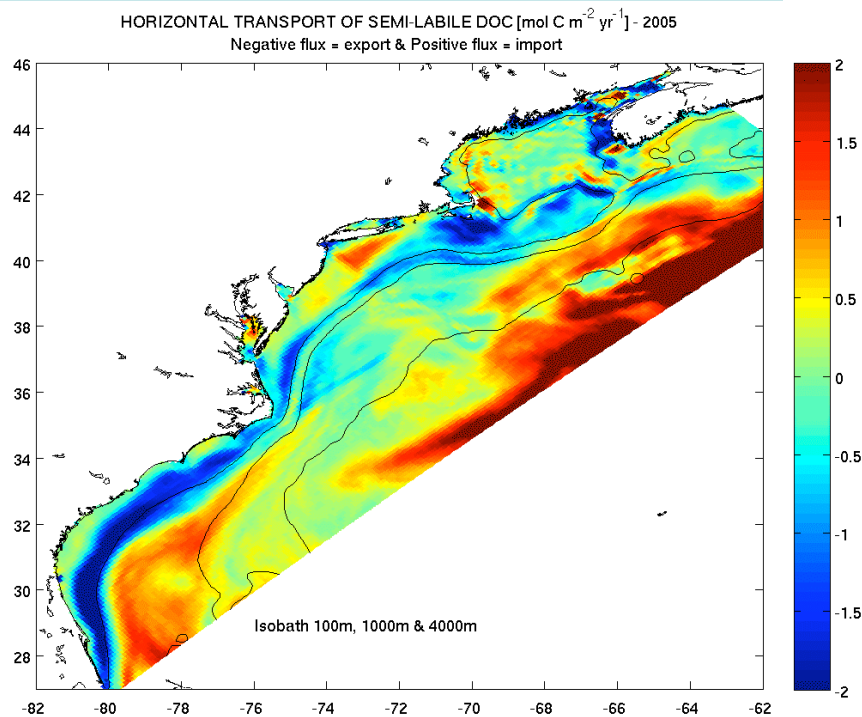
Simulated annual air-sea flux of CO₂
Explicit inorganic carbon cycling

Positive values indicate uptake by ocean

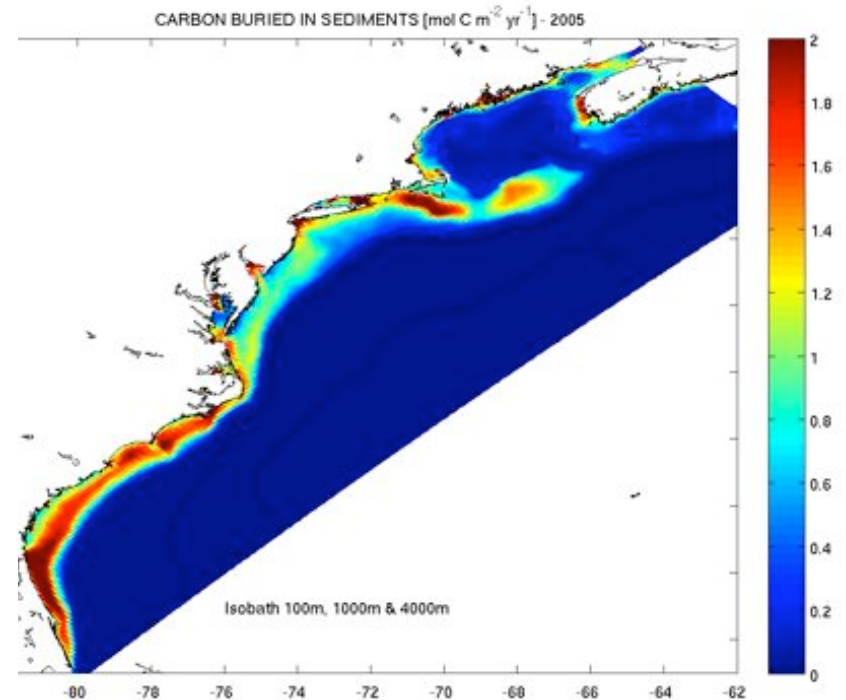
Outer Mid-Atlantic Bight continental shelf is a sink for atmospheric CO₂

No net uptake off NJ due to outgassing during summer from upwelling

Semi-labile DOC export



POC burial



Simulated **semi-labile DOC net horizontal fluxes** for 2005 ($\text{mol C.m}^{-2}.\text{yr}^{-1}$). Negative values correspond to areas of production and export, and positive values to areas of import.

Simulated **POC burial** for 2005 ($\text{mol C.m}^{-2}.\text{yr}^{-1}$).

Climate Studies

How will coastal regions respond to climate change, and what are the feedbacks on the carbon cycle?

Force the BGC-circulation model with climate change scenarios from a Regional Climate Model (RegCM3):

Present day scenario: 1980-2000

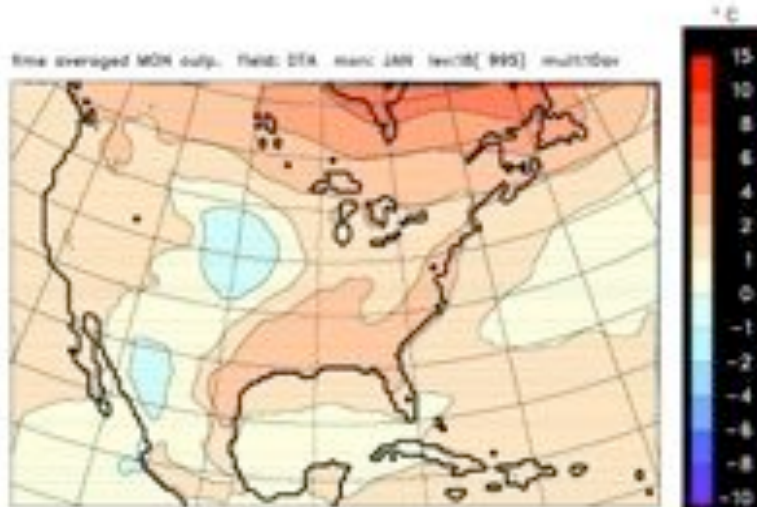
100 years later scenario: 2080-2100

Changes over 21st century

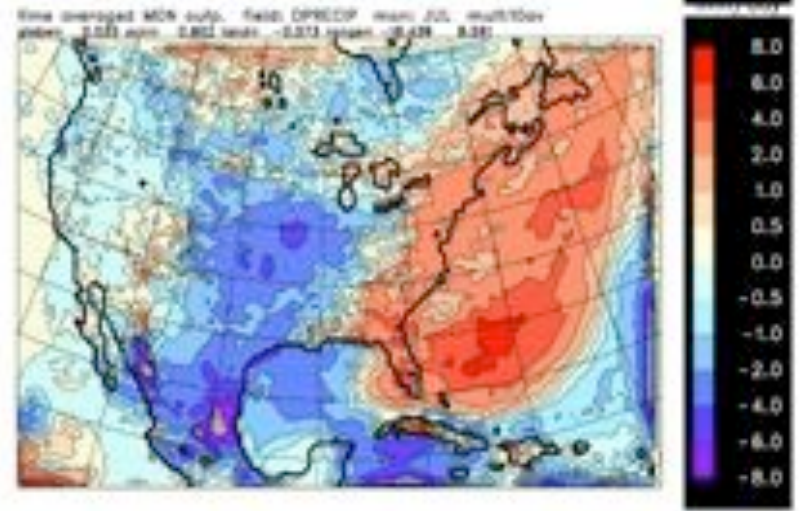
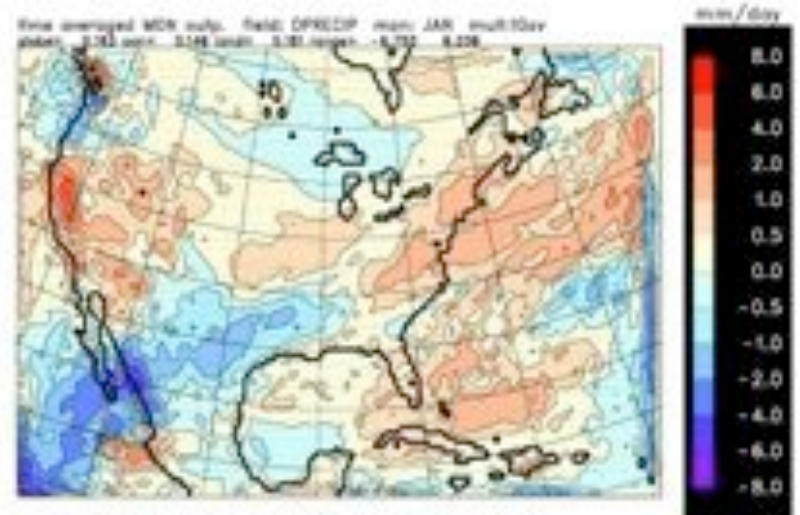
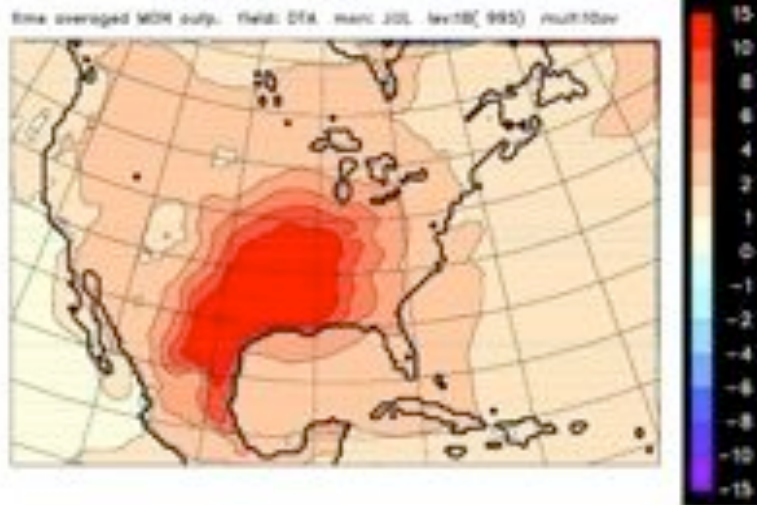
Δ Temperature [15 to -15°C]

Δ Precipitation [8 to -8 mm/d]

January



July



Summary

U.S. ECoS Goal: To increase our understanding of carbon cycling in U.S. east coast continental shelf waters

- Requires modeling effort coupled with satellite and *in situ* data analysis
- Requires observationalists and modelers to work together
- Requires quantitative skill assessment
- Ongoing effort



