

## The Chesapeake Bay Program $C_a$ algorithm round robin

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[http://seabass.gsfc.nasa.gov/eval/cbp\\_eval.cgi](http://seabass.gsfc.nasa.gov/eval/cbp_eval.cgi)



## ALGORITHMS

to start,

a brief description of the algorithms and their forms ...



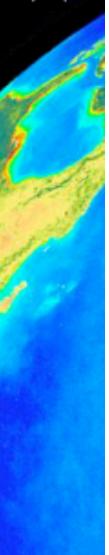
## ALGORITHMS

### empirical (statistical) algorithms

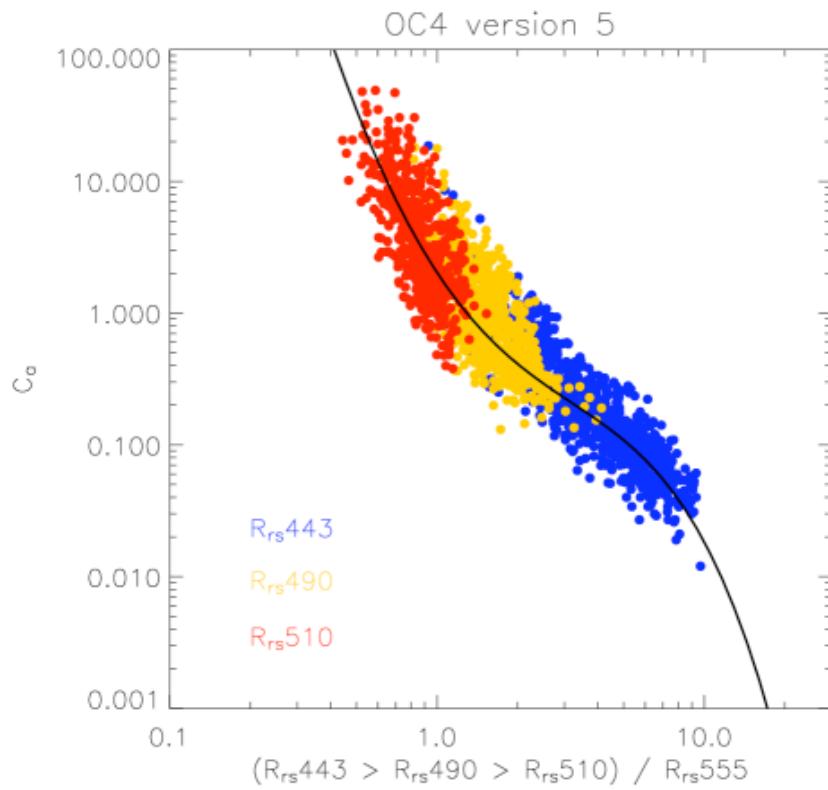
- OC4 version 4 (operational SeaWiFS; *O'Reilly et al. 2000*)
- OC4 version 5 (for next SeaWiFS reprocessing)
- OC3 version 5 (operational MODIS)
- OC2 version 5
- OC3-CB (Old Dominion University; tuned to Bay)
- Clark (NOAA; tuned to Bay; full-band; OC2 analog)
- Carder (operational VIIRS; OC2 analog)

### semi-analytical algorithms

- GSM01 (*Maritorena et al. 2002*)
- GSM01-CB (tuned to Bay; *Magnuson et al. 2004*)



## EMPIRICAL ALGORITHMS



general form of algorithm

$$\log_{10}(C_a) = (c_0 + c_1 R + c_2 R^2 + c_3 R^3 + c_4 R^4)$$

where  $R$  is  $\log_{10}(R_{rs} \lambda / R_{rs} 555)$

wavelengths used

OC4 = 443 > 490 > 510 / 555

OC3 = 443 > 490 / 555

OC2 = 490 / 555

Clark = 490 / 555

Carder = 490 / 555

principle differences

development data set ( $R_{rs}$  and  $C_a$ )

coefficients / regression

## SEMI-ANALYTICAL ALGORITHMS

$$R_{rs} = g_0 \left( \frac{b_b}{a + b_b} \right) + g_1 \left( \frac{b_b}{a + b_b} \right)^2 \quad (\text{simplification of the radiative transfer equation})$$

$R_{rs}$  == remote sensing reflectance

$a$  == absorption coefficient

$b_b$  == backscattering coefficient

$g$  == constant

$a$  separated into contributions by:

water ( $w$ ) , dissolved + non-algal detrital material ( $dg$ ), and phytoplankton ( $\phi$ )

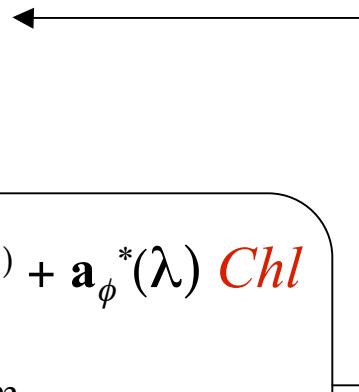
$b_b$  separated into contributions by:

water ( $w$ ), and particles ( $p$ )



## SEMI-ANALYTICAL ALGORITHMS

$$R_{rs} = g_0 \left( \frac{b_b}{a + b_b} \right) + g_1 \left( \frac{b_b}{a + b_b} \right)^2$$



$$a(\lambda) = a_w(\lambda) + a_{dg}(443) e^{-S(\lambda - 443)} + \mathbf{a}_\phi^*(\lambda) Chl$$

$$b_b(\lambda) = b_{bw}(\lambda) + b_{bp}(443) \left( \frac{443}{\lambda} \right)^\eta$$

$R_{rs}(\lambda)$  from satellite(s)

$S, \eta, g_0, g_1, \& \mathbf{a}_\phi^*(\lambda)$  are constants

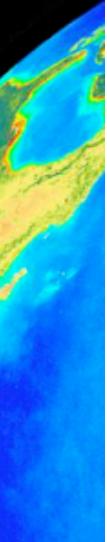
$a_{dg}(443), b_{bp}(443), \& Chl$  are unknown



## ALGORITHMS

next,

a review of SeaWiFS processing and evaluation protocols ...



## SUMMARY

### satellite data processing

5,000 SeaWiFS MLAC files acquired  
processed using MSL12 5.4.1 -- 3 runs per file  
mapped and combined into single hdf files using SeaDAS  
statistical and visual QC applied  
900 final files considered, spanning 1998 through 2005

### comparison with *in situ* data

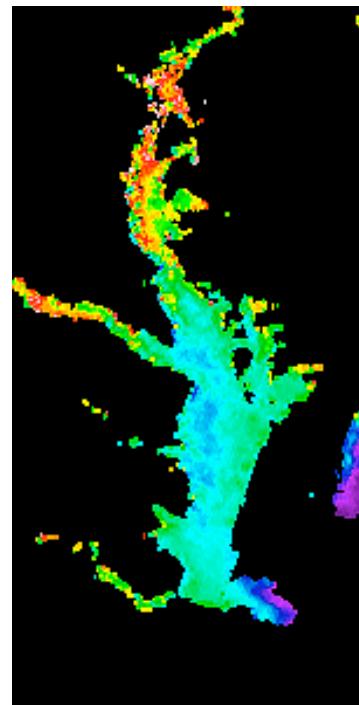
data distributions via histograms  
time-series of monthly averages  
match-ups with level-2 data

### data stratification

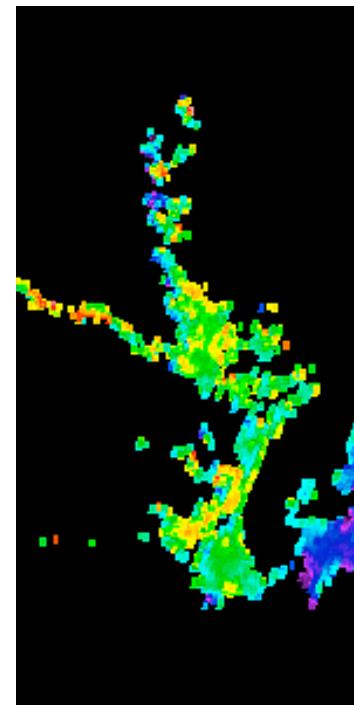
spatially: upper, middle, and lower Bay  
temporally: Winter, Spring, Summer, and Fall

## SATELLITE QC METRICS

eliminate scenes with high satellite zenith angles in Bay  
require > 25% of Bay ocean pixels to be cloud free  
visual inspection:



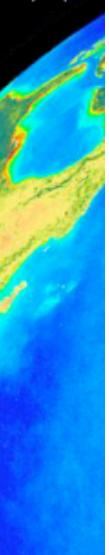
*good*



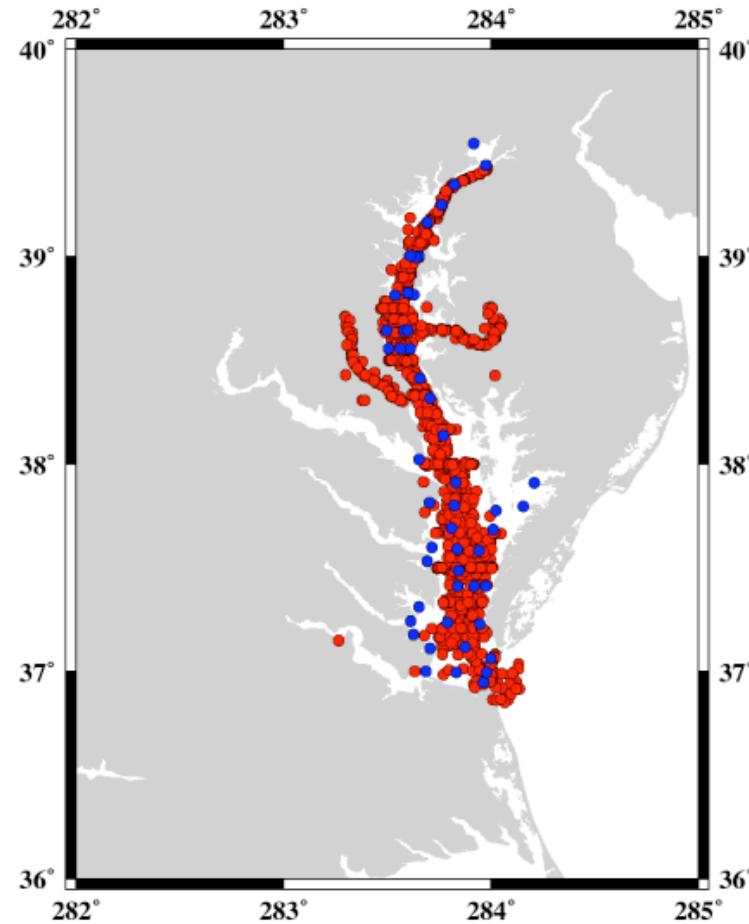
*bad*

consider only  $0.1 \leq C_a \leq 100 \text{ mg m}^{-3}$

require > 200 valid pixels per scene for regional analyses



*IN SITU* DATA



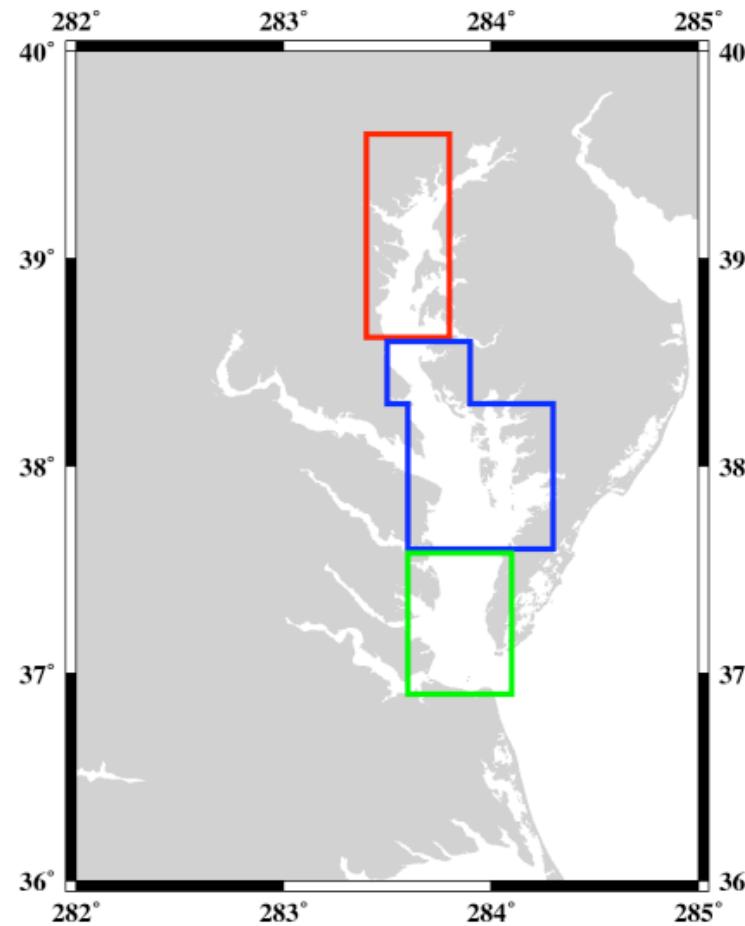
SIMBIOS/Harding  
3,000 stations

CBP  
15,000 stations

( fluorometrically derived )



## SPATIAL STRATIFICATION



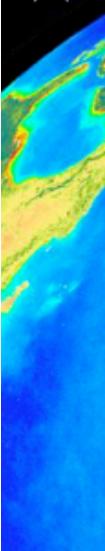
upper  
middle  
lower

from *Magnuson et al. 2004*

## INTERMISSION

before we move on to the results ...

let's pause for a discussion on algorithm evaluation criteria



## POSSIBLE EVALUATION CRITERIA

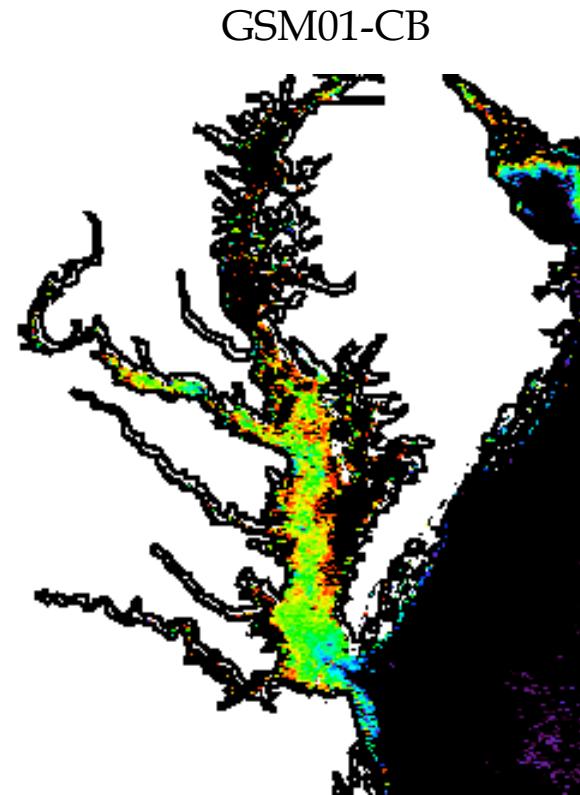
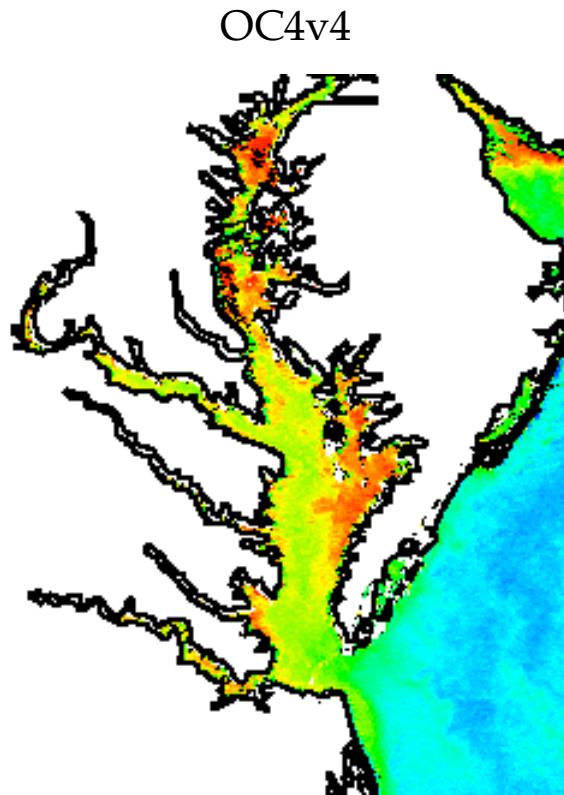
the histograms, time-series, and scatter plots convey comparative information in rather different ways

given pre-defined CBP requirements, certain analyses may prove more powerful than others

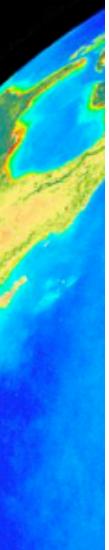
### possible considerations

- (1) geographic coverage (# of valid satellite pixels)
- (2) absolute accuracy (quantitative evaluation?)
- (3) reproduction of temporal features (qualitative evaluation?)

## COVERAGE ISSUES

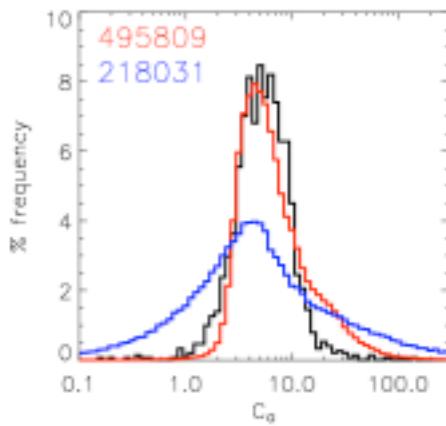


Scene from Spring 2005;  $C_a$  from 0.1 to 100 mg m<sup>-3</sup> shown

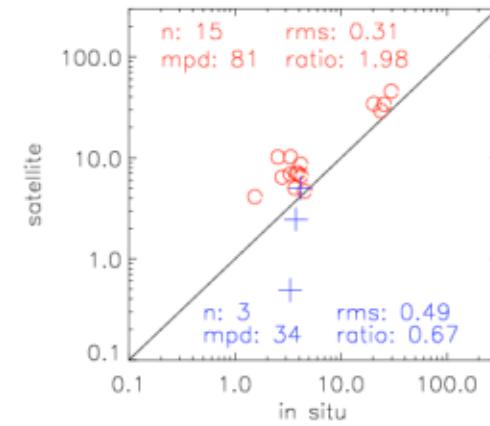


## EXAMPLE ANALYSES

distributions

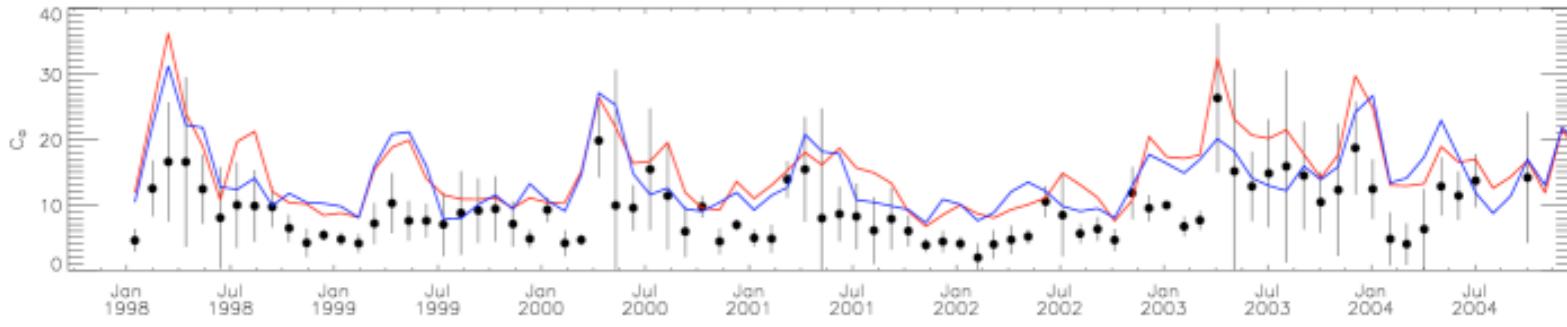


match-ups



results generated  
for each algorithm  
for each region  
for each season

time-series



## EXAMPLE RESULTS

distributions

Winter			Spring			Summer			Fall		
low	mid	upper	low	mid	upper	low	mid	upper	low	mid	upper
OC4	OC4	OC4	OC3	OC4	OC4	OC4	OC4	X	OC2	OC4	OC4
OC3	Carder	Carder	OC3-CB	OC3-CB	Carder	OC3	GSM-01	X	Clark	Carder	Carder

match-ups

Winter			Spring			Summer			Fall		
low	mid	upper	low	mid	upper	low	mid	upper	low	mid	upper
OC3-CB	OC3-CB	X	OC4	Carder	Carder	OC4	OC3	Carder	OC4	OC4	Clark
GSM-CB	GSM-CB	X	GSM-CB	GSM-CB	OC4	GSM-CB	OC2	OC2	OC3	OC3	X

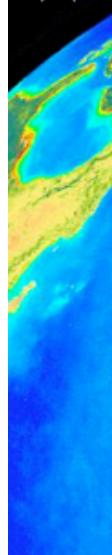
time-series

low	mid	upper
OC4	OC4	OC4
OC3-CB	OC3-CB	Carder

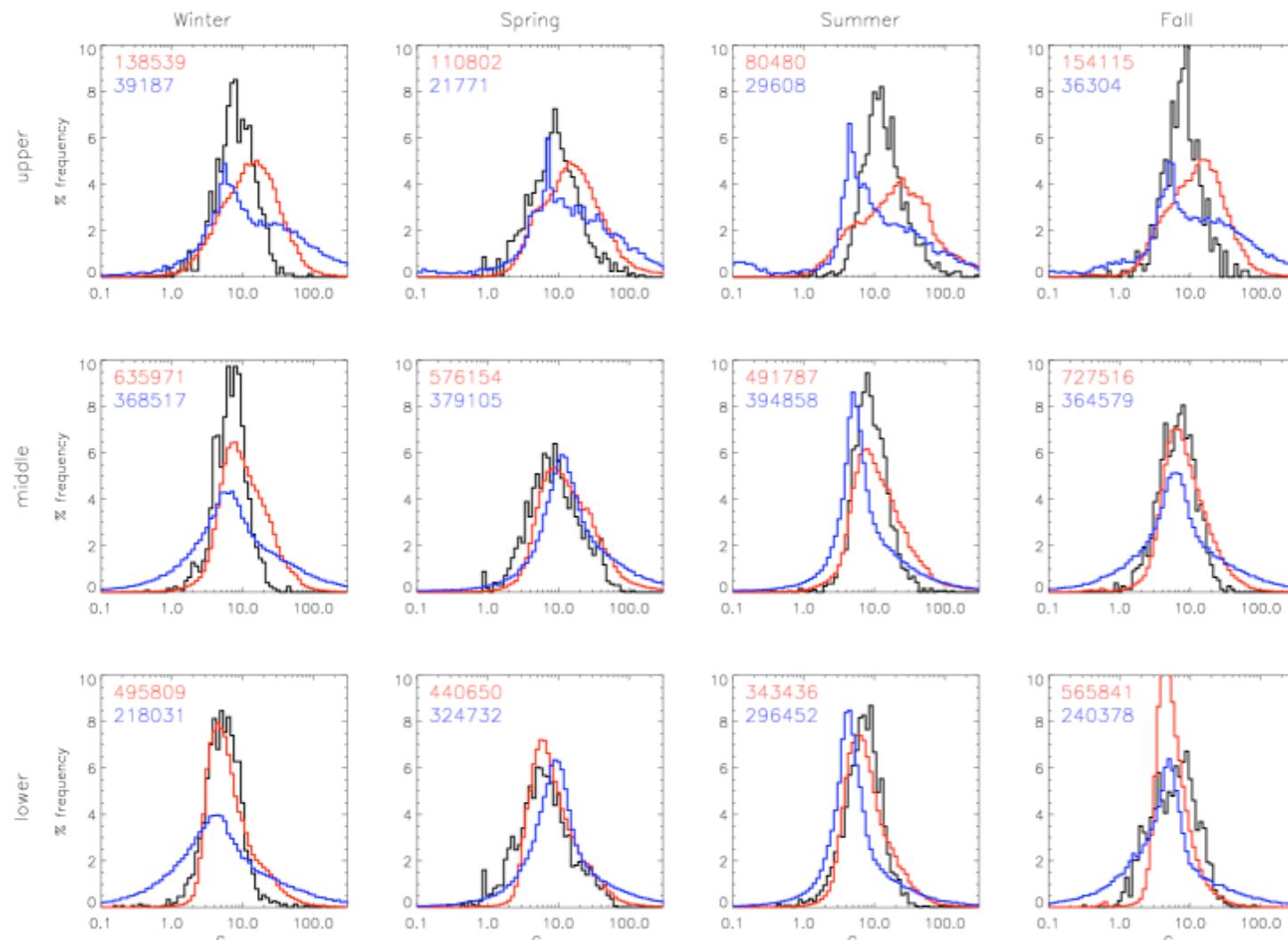
first attempt to identify  
top 2 performers for each analysis

## INTERMISSION

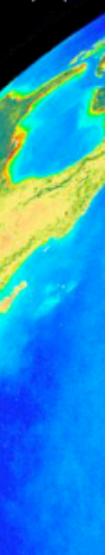
rather than delve into results for each algorithm,  
here are example results for OC4v5 and GSM-CB  
(one empirical, one semi-analytical)



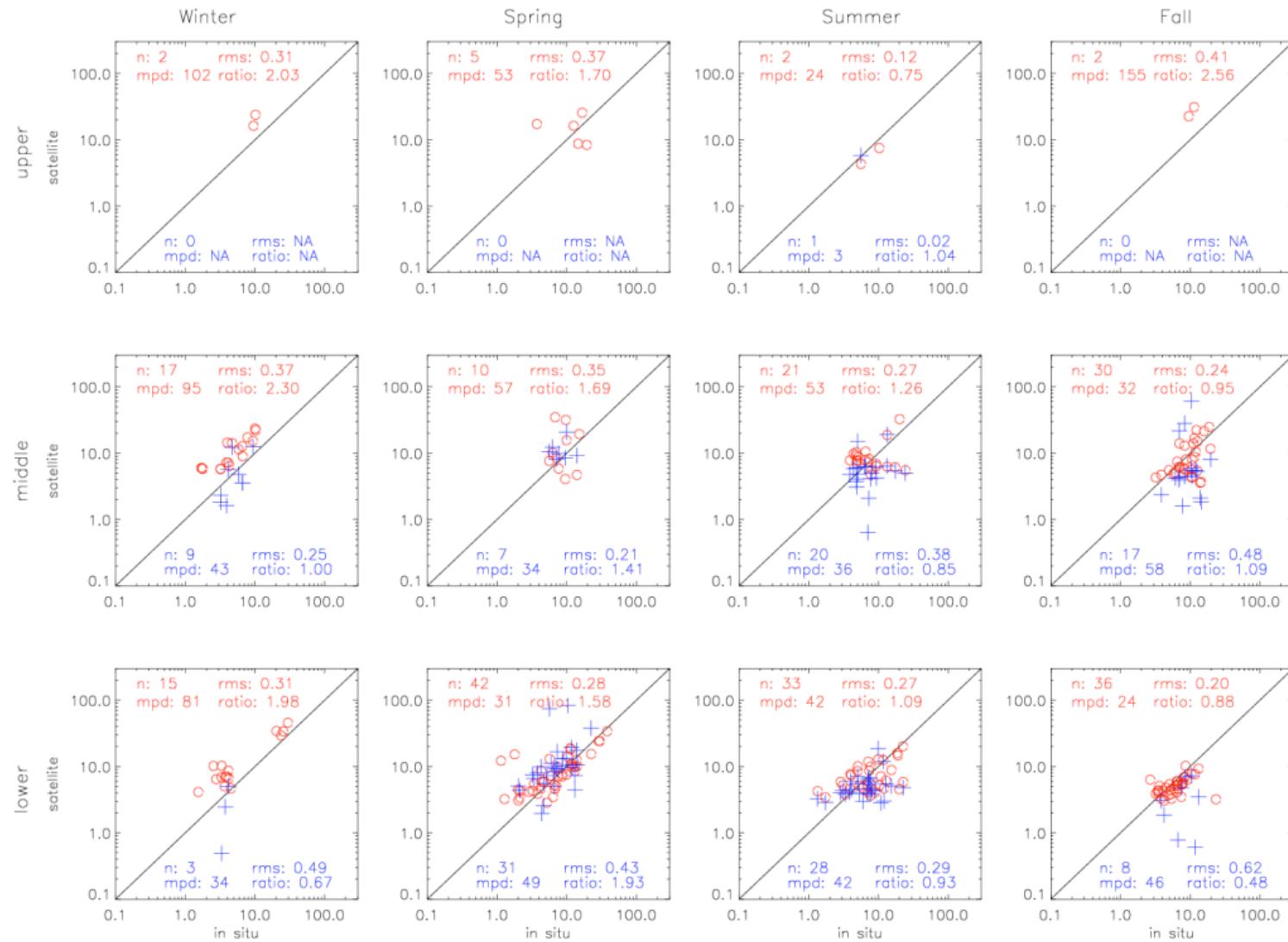
## DATA DISTRIBUTIONS



*in situ* OC4v5 GSM-CB



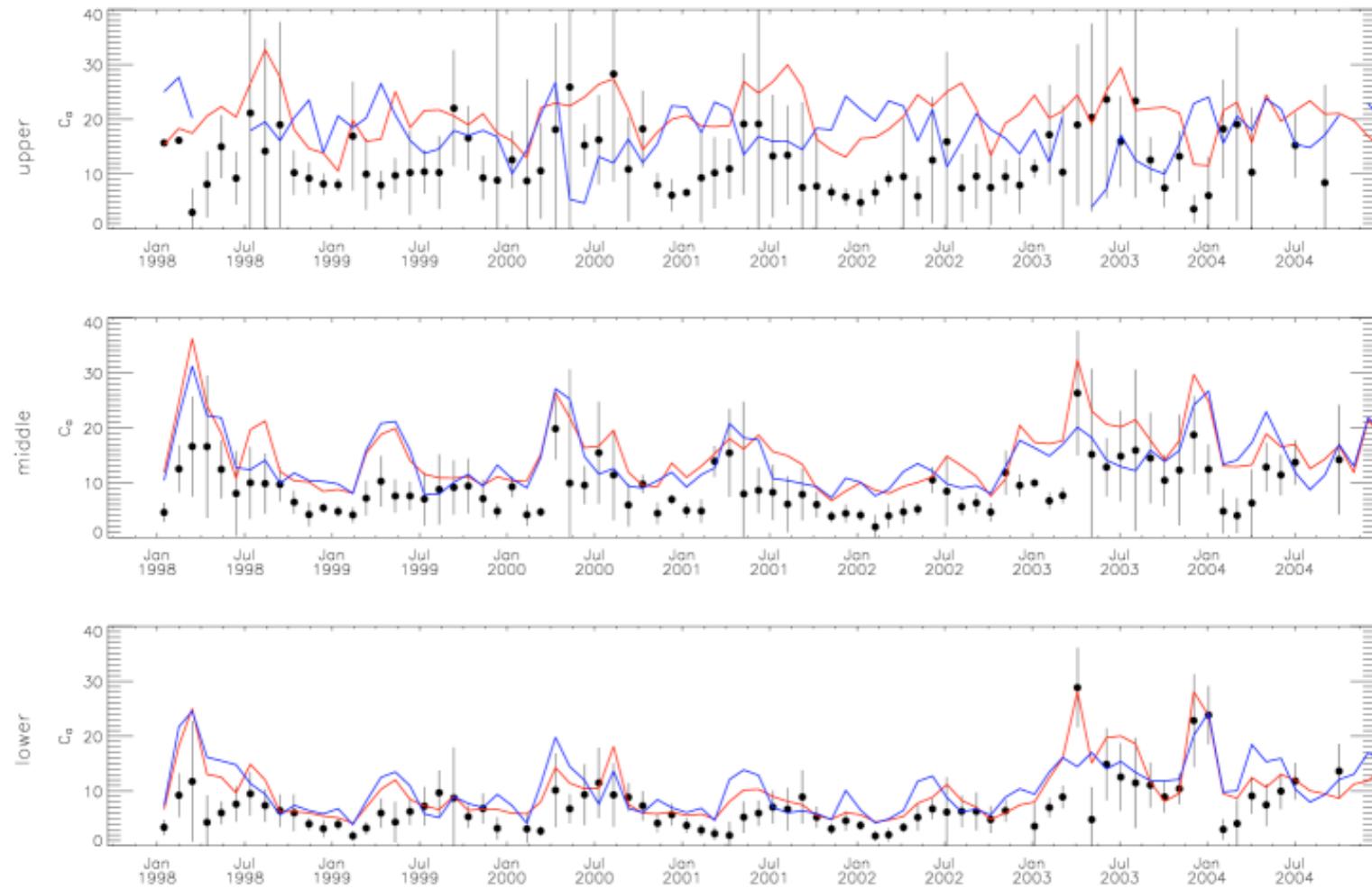
## SATELLITE MATCH-UPS



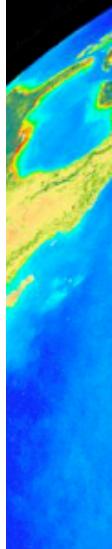
OC4v5 GSM-CB



## TIME-SERIES



*in situ* OC4v5 GSM-CB



## KNOWN ISSUES WITH ANALYSES

varying statistical approaches (e.g., median vs. mean in time-series)  
additional statistical approaches (e.g., K-S tests for distributions)

alternative satellite and *in situ* exclusion criteria  
alternative satellite flagging and masking schemes

alternative averaging approaches for match-ups and time-series

nuances of semi-analytical algorithms

## NEXT STEPS

considering what was presented in the preceding slide,  
this meeting provides an introduction to the activity ...

in the coming months, this group should focus on:

- (1) review and discussion of existing results
- (2) implementation of alternative analyses
- (3) selection of algorithm(s)
- (4) transition to CoastWatch
- (5) MODIS