



# Comparison of three SeaWiFS Atmospheric Correction Algorithms for Turbid Waters using AERONET-OC Measurements

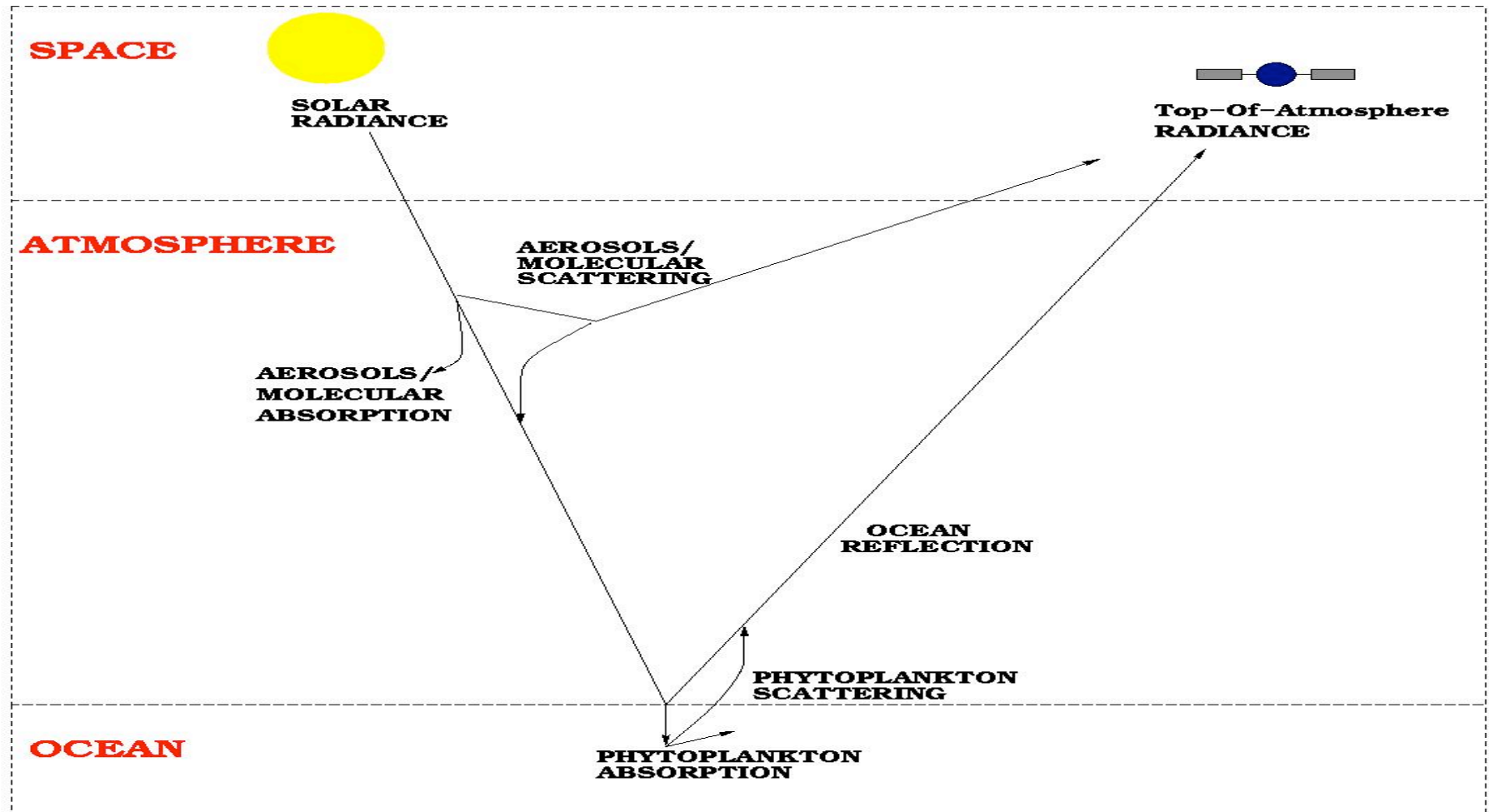
Jamet, C., C., Goyens, H., Loisel, K., Ruddick, C.P., Kuchinke, G., Zibordi and H., Feng  
AERONET-OC workshop  
24th, February 2011

# Context of the study

- SeaWiFS (R.I.P.): almost « 13 » years of data
  - Unique opportunity to study seasonal and intra-seasonal variability of IOPs in coastal waters
  - Need of very accurate Atmospheric Correction (AC)
- Since 2000: ~ half dozen AC for SeaWiFS
- Complement of the IOCCG report #10:  
« Atmospheric Correction for Remotely-Sensed Ocean-Colour Products » (Wang, 2010)
- **Goal:** understand where differences come from using *in-situ* and theoretical data to develop a new AC

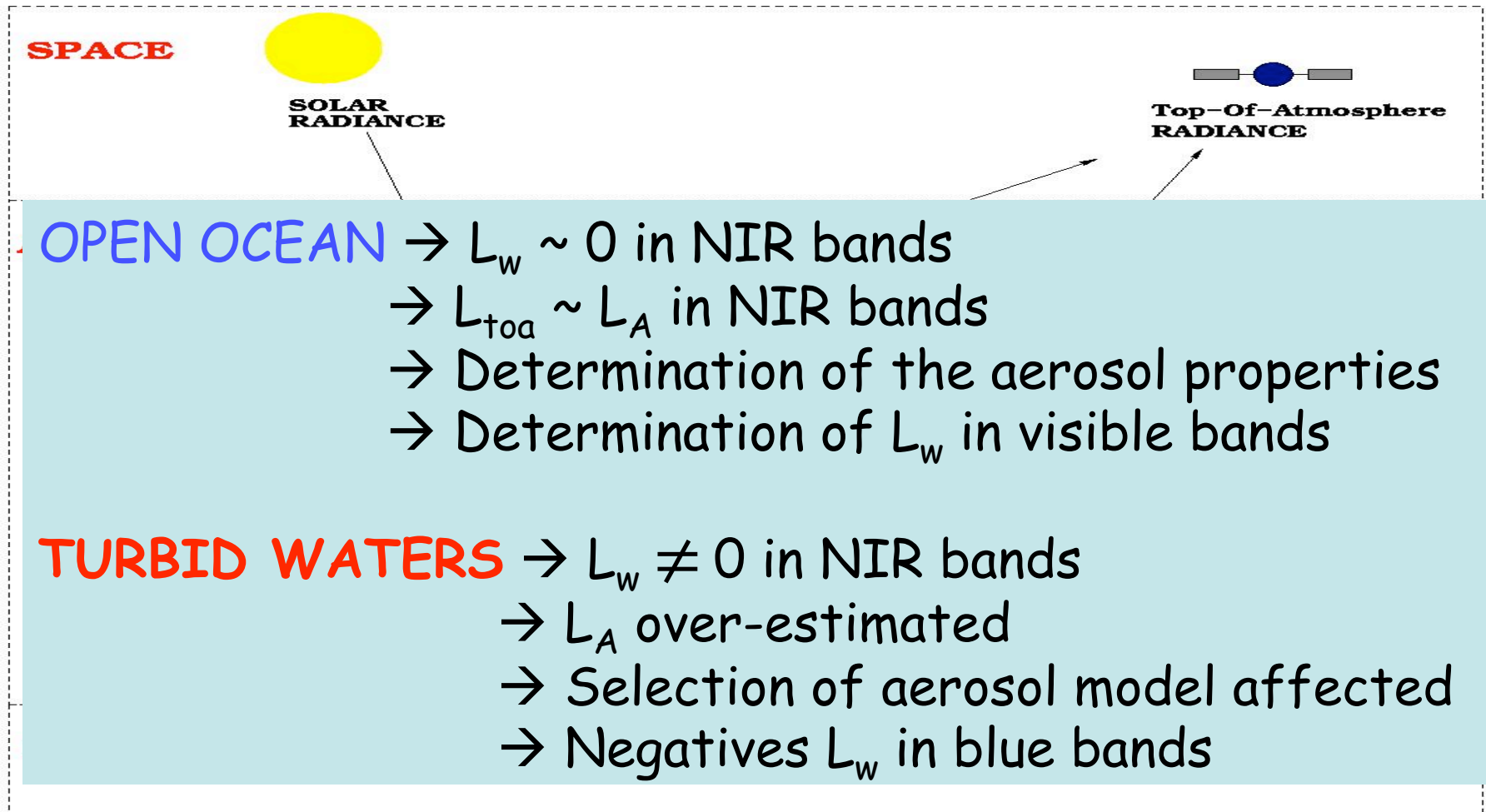
# Principle of Atmospheric Correction

- Radiative Transfer Equation:  $L_{toa} = L_r + L_A + t * L_w$



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$$L_{toa} = L_r + L_A + t * L_w$$







# Atmospheric Correction Algorithms

- Three NIR ocean contribution removing/AC algorithms
  - Stumpf et al. (2003)/ Bailey et al., (2010) S03:
    - Based on Gordon and Wang atmospheric correction (GW94)
    - SeaWiFS/MODIS standard algorithm
    - Iterative process
    - Bio-optical model used to determine  $b_b(670)$
  - Ruddick et al. (2000) R00:
    - Based on Gordon and Wang atmospheric correction (GW94)
    - Spatial homogeneity of the  $L_w(\text{NIR})$  and  $L_A(\text{NIR})$  ratios over the subscene of interest
    - $\frac{L_w}{L_A}$ : Ratio of  $L_w(\text{NIR})$  cst = 1.72
    - $\epsilon$ : Ratio of  $L_A(\text{NIR})$  determined for each subscene
  - Kuchinke et al. (2009) K09:
    - Spectral optimization algorithm
    - Junge aerosol models
    - GSM bio-optical model (Garver, 2002)
    - Atmosphere and ocean coupled

# DATA

- **Satellite data:**

- (M)LAC SeaWiFS 1km at nadir → Processed with SeaDAS 5.4 and 6.1 (Fu et al., 1998)
- nLw(412→865),  (865),  (510,865)

- ***In situ* data:** *AERONET-OC* network (Zibordi et al., 2006, 2009)

- **Three sites:**

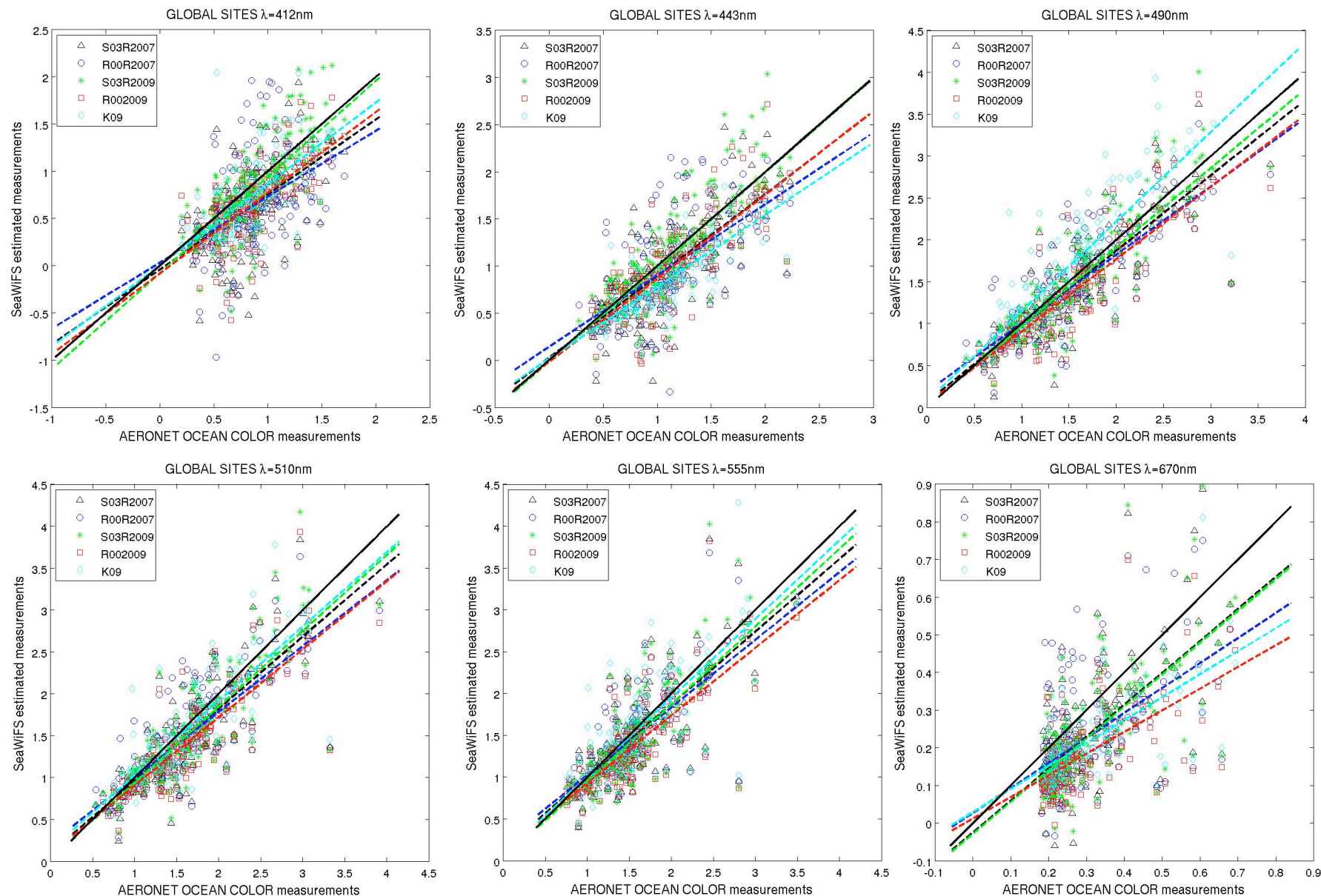
- AAOT: 2002-2007
    - COVE: 2006-2008
    - MVCO: 2004-2005

# Results

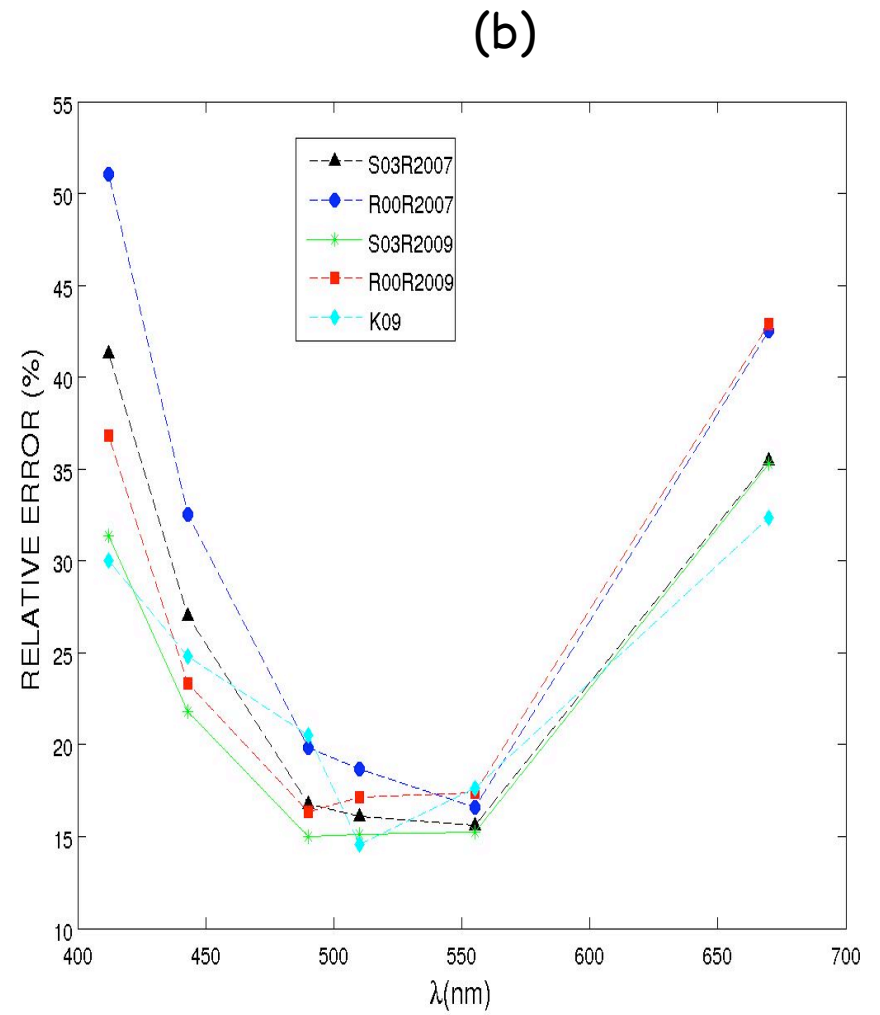
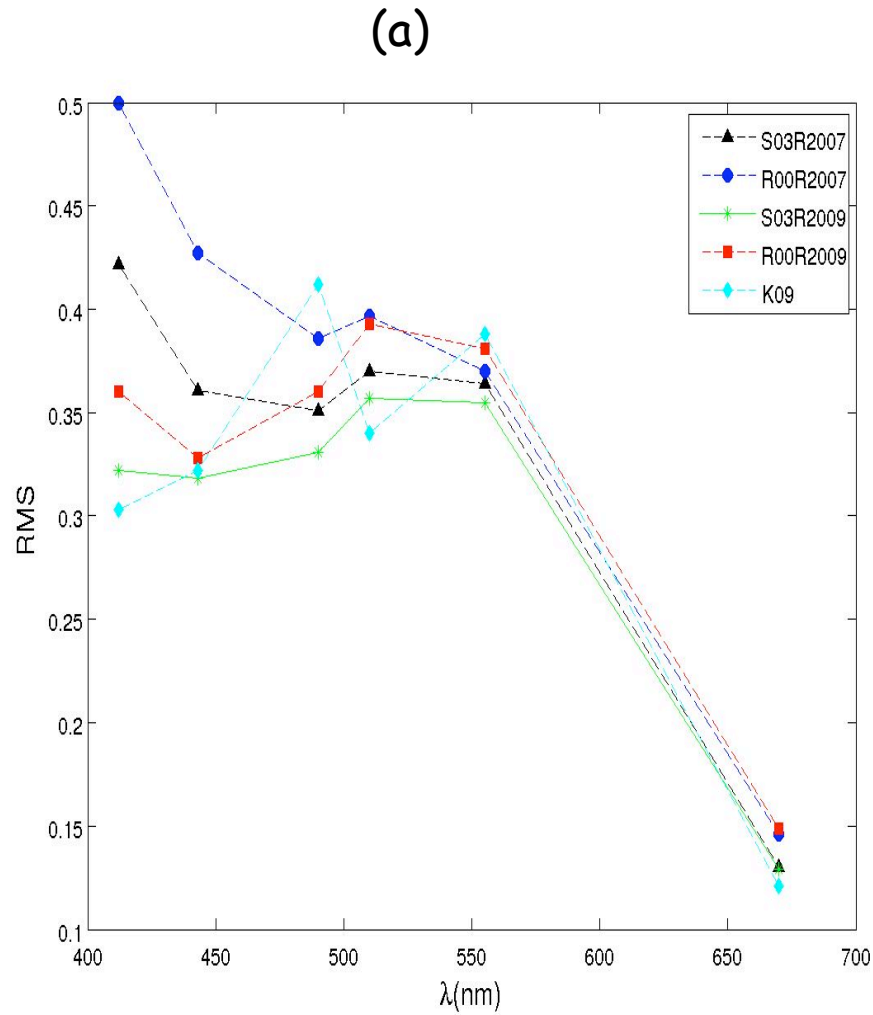
- Only **turbid** waters (Robinson et al., 2003):  $nL_w(670) > 0.186$
- Comparison of the **normalized water-leaving radiances**  $nL_w$  between 412 and 670 nm and of the aerosol optical properties (the **Ångström coefficient**  $K_d(510,865)$  and the **optical thickness**  $\tau(865)$ )

	MVCO	AAOT	COVE	TOTAL	$nL_w(412) < 0$
S03R2009	20	163	18	<b>201</b>	7
R00R2009	19	129	17	165	6
Kuchinke	13	134	13	160	<b>0</b>

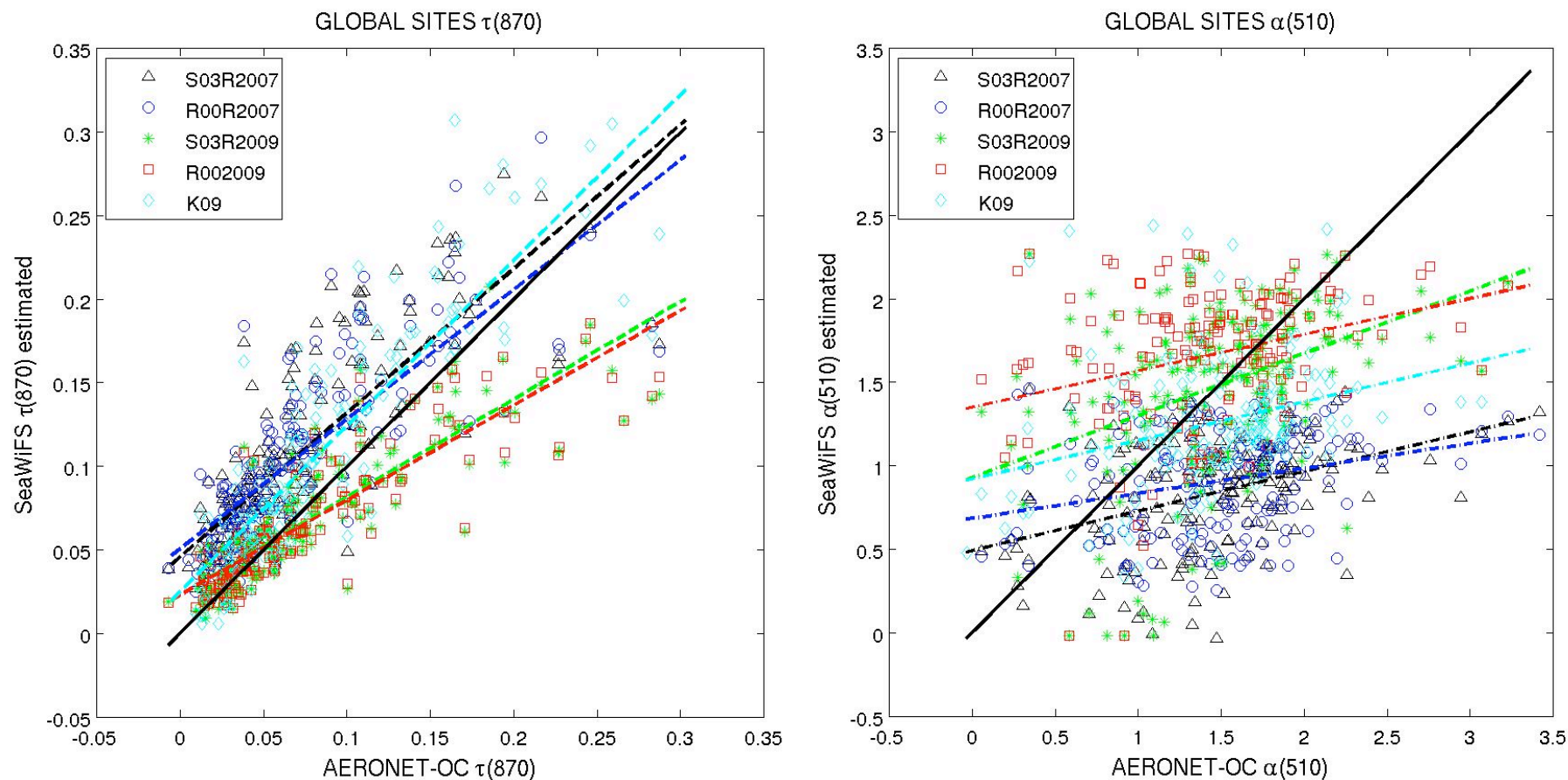
# of matchups for each algorithm and each AERONET-OC site



Scatter plots of the retrieved  $nL_w(\lambda)$  by S03R2007 ( $\Delta$ ), R00R2007 ( $\circ$ ), S03R2009 ( $*$ ), R002009 ( $\square$ ) and K09 ( $\diamond$ ) vs AERONET-OC measurements at the MVCO and AAOT sites. The continuous line represents the 1:1 line, the line -- represents the linear regression lines.



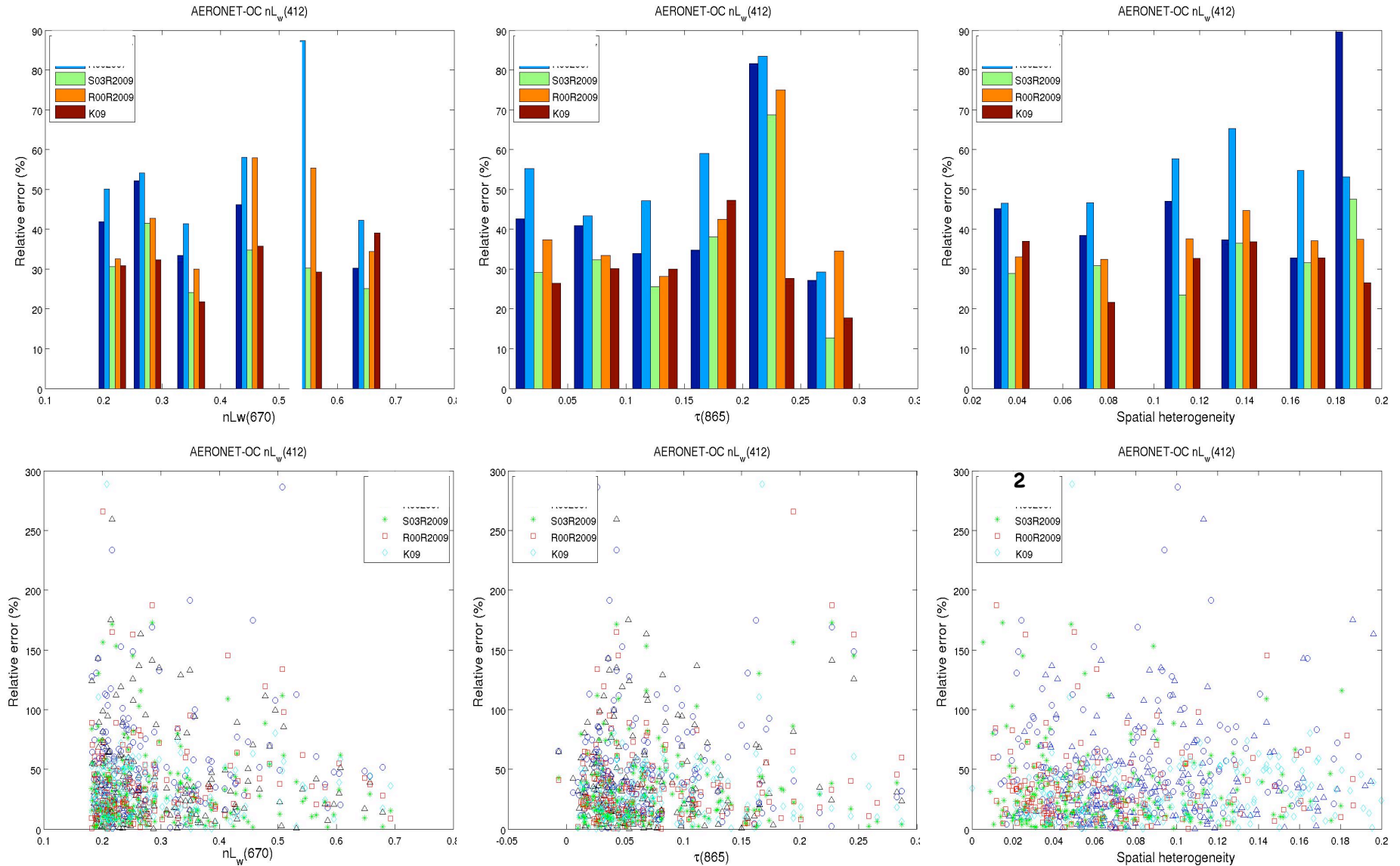
Variation of the RMS (a) and the relative error (b) as a function of the wavelength obtained with S03R2007 (  $\blacktriangle$  ), R00R2007 (  $\bullet$  ), S03R2009 (  $*$  ), R00R2009 (  $\square$  ) and K09 (  $\diamond$  ).



Scatter plots of the retrieved  $\tau(865)$  (left panel) and  $\alpha(510)$  (right panel) by S03R2007 ( $\Delta$ ), R00R2007 ( $\circ$ ), S03R2009 ( $*$ ), R00R2009 ( $\square$ ) and K09 ( $\diamond$ ) vs AERONET-OC measurements at the MVCO and AAOT sites. The continuous line represents the 1:1 line, the line -- represents the linear regression for S03 and the line -.- represents the linear regression for R00.



# Sensitivity to environmental factors



Variation of the relative error on  $nL_w(412)$  as a function of the values of (top to bottom):  
 (i)  $nL_w(670)$  (e.g., turbidity, (ii)  $\tau(865)$  and (iii) the spatial homogeneity.

# Impact of the aerosol models

- S03 and R00
  - 80 models based on AERONET *in situ* measurements → more realistic
  - Ratio of  $L_A(\text{NIR})$  cst over the region of interest → way to calculate  $\tau_{\text{NIR}}$  very sensitive → **Moderate to big impact** of the aerosol parameter  $\tau_{\text{NIR}}$  for **Ruddick for nLw**
  - **"no effect"** on the estimation of nLw with **standard algorithm R2009** (Ahmad, 2010)
  - **Improvement of the estimation of the aerosol properties**
    - Increase of  $\tau_{\text{NIR}}$ (510,865)
    - Decrease of  $\tau_{\text{NIR}}$ (865)
- K09:
  - Junge power-law distribution
  - Mainly designed for **absorbing carbonaceous aerosols** → **is it the case over our three sites??**



# Impact of the bio-optical model

- S03: **Big impact** of the change of the definition of  $nLw$  and  $b_b(670)$ 
  - **Better accuracy**, more noticeable for short wavelengths
  - **Less negative values**
- R00: **Very weak impact**
  - ratio of  $nLw(NIR)$  cst over the region of interest
- K09: **Big impact**
  - **Okay for** coastal regions where bio-optics are uniform but seasonally varying
  - **need to tune the bio-optical parameters in GSM model**

# Conclusions (1/2)

- Comparison of 3 SeaWiFS Atmospheric Correction algorithms
  - SeaWiFS standard algorithm: **best overall estimates**
  - Ruddick algorithm: **less accurate**
  - Kuchinke: **good estimates for short wavelengths**

## Conclusions (2/2)

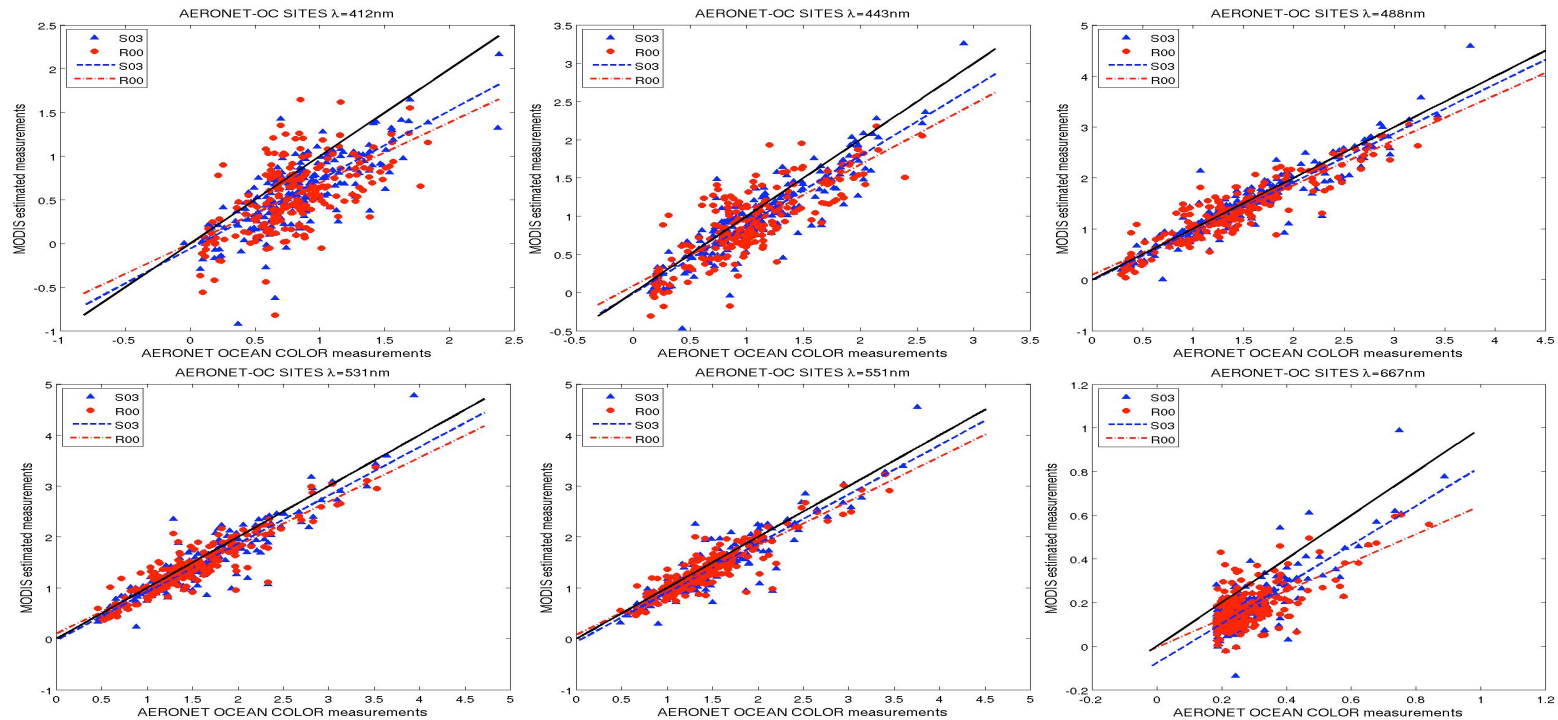
- **Sensitivity tests** on assumptions of each algorithm
  - *Ruddick: High impact* of a bias of the value of the aerosol ratio  $\varepsilon$
  - *Stumpf R2009: Low impact of the new aerosol models for nLw; Moderate to High impact of the new definition of  $b_b(670)$*
  - *Kuchinke: High impact of the Junge aerosol models; "high impact" of the bio-optical parameters in GSM → need to tune the bio-optical models*

# Perspectives

- Paper in revision in Remote Sensing of Environment journal
- PhD started on this subject on Oct. 2010: C. Goyens
- Adding others SeaWiFS AC: Hu (2000), Shanmugam (2007), Spurr (2007)
- Adding other AERONET-OC sites: Dalen Tower, Helsinki Lighthouse, Lucinda
- Adding very turbid waters sites (French Guyana, Eastern English Channel)
- Complete sensitivity study based on synthetic data → Comprehension of the assumptions of the AC
- Others OC sensors for all AERONET-OC sites:
  - MODIS- Aqua: SWIR (Wang, 2005), Schroeder (2007), ...
  - MERIS: Moore (1999), Doerrfer (2007), Schroeder (2007), Brajard (2010), S03, POLYMER (Steinmetz, 2011), ...
- Ultimate goal: Development of a new algorithm:
  - SWIR seems the most interesting AC but no SWIR bands in the near-future sensors (to my knowledge)
  - Based on iterative process (optimization technique)
  - Taking account of the spectral shape of nLw
  - Adding constrains as R00 ratios
  - Work on the bio-optical model in coastal waters (based on IOPs)

# Same work for MODIS-Aqua

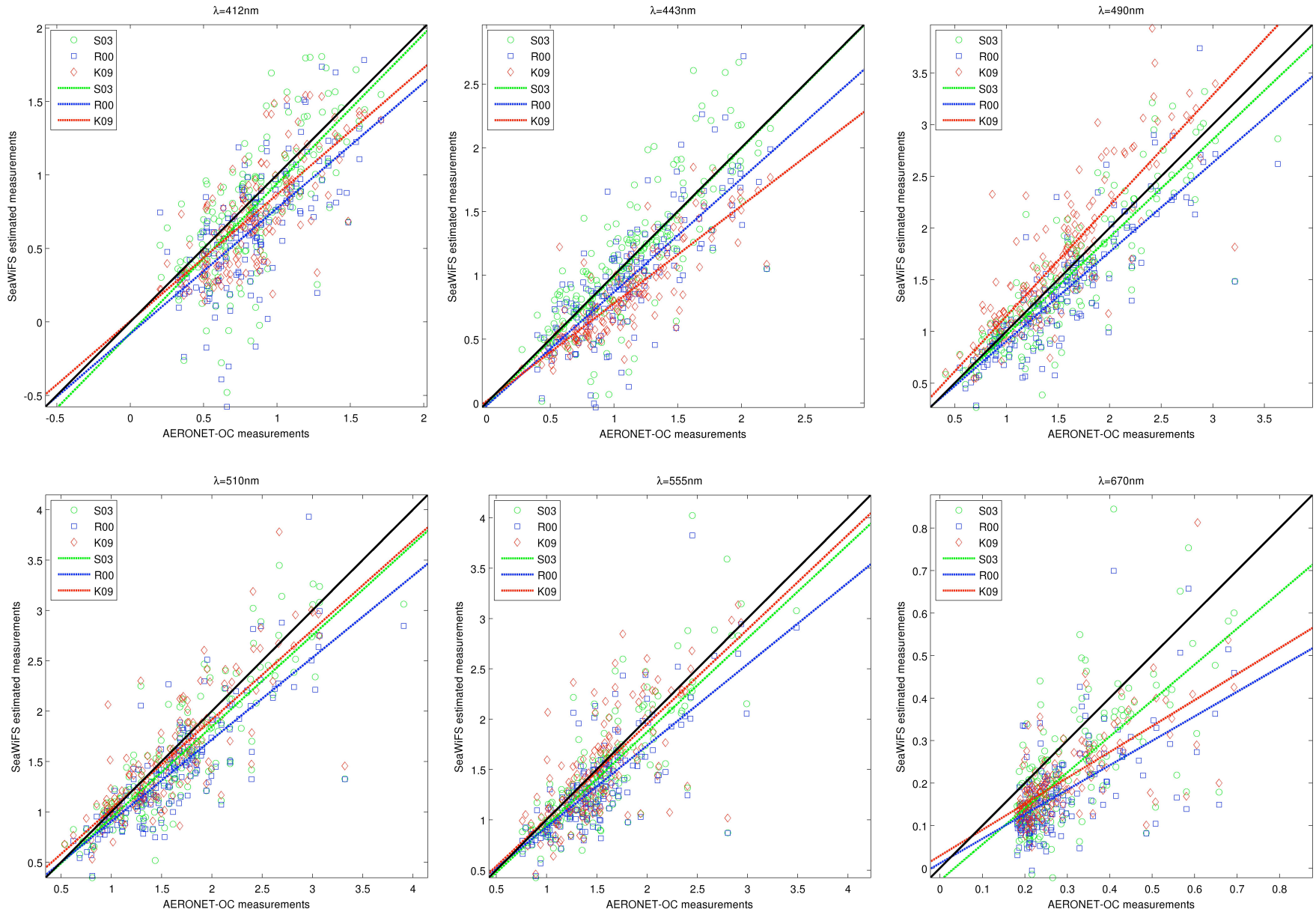
- S03 and R00 for two AERONET-OC sites: AOOT, MVCO for previous reprocessing (R2007)



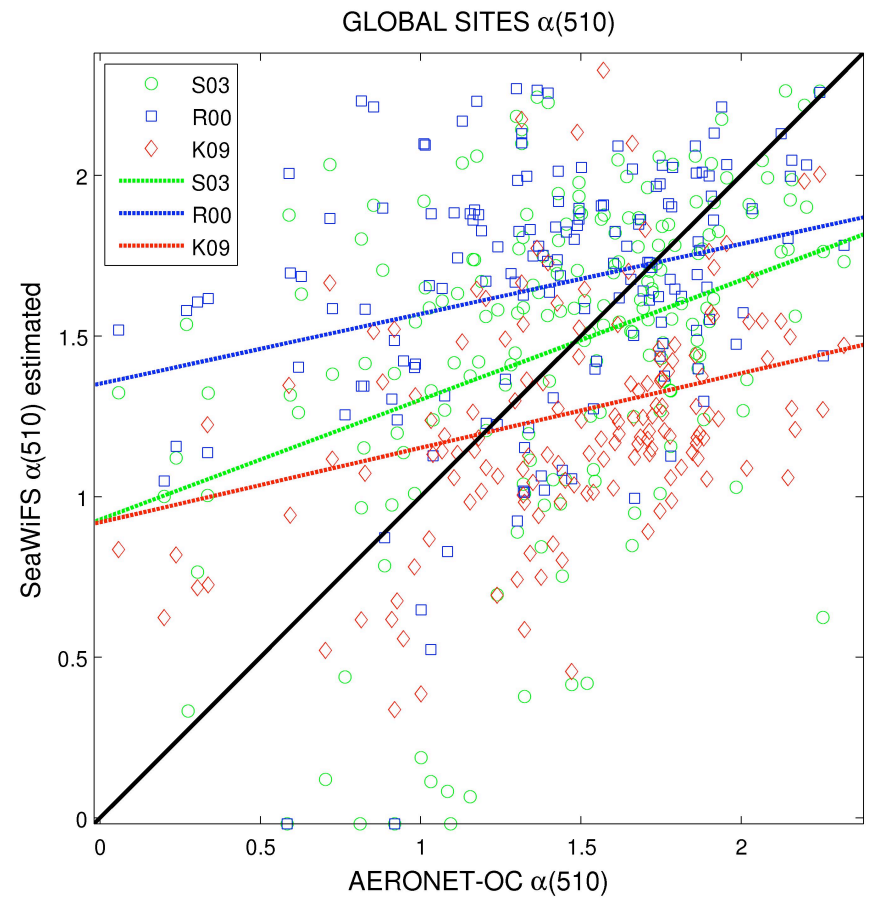
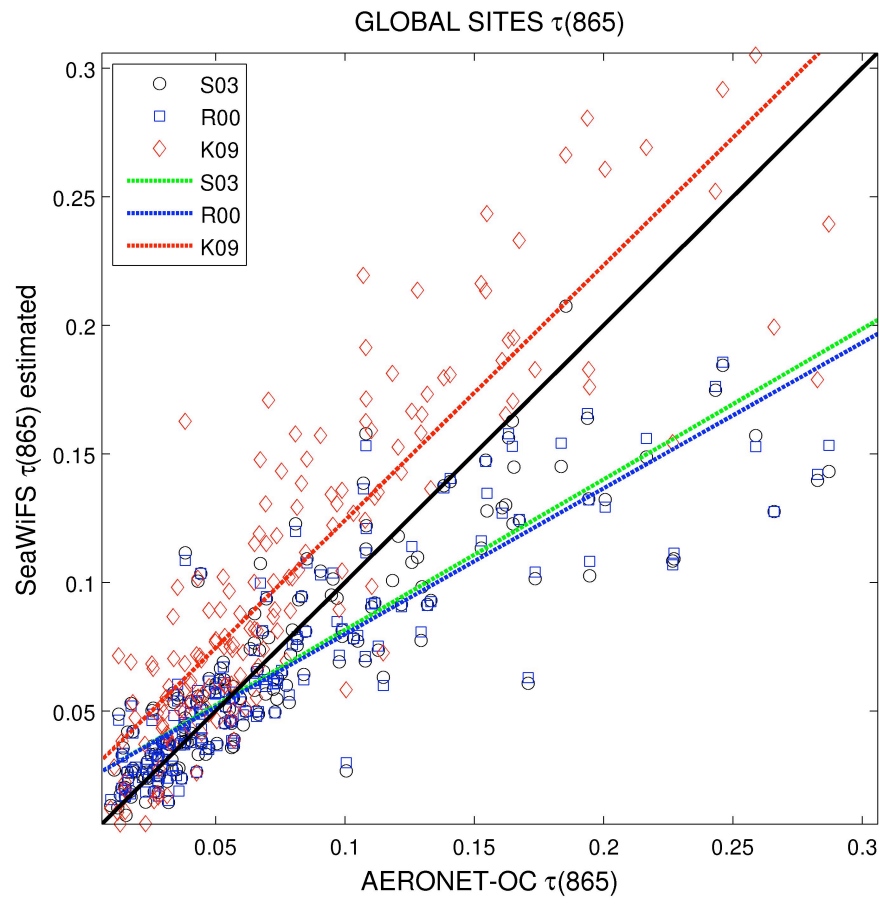
<b>Stumpf</b>	<b>Lwn(412)</b>	<b>Lwn(443)</b>	<b>Lwn(488)</b>	<b>Lwn(531)</b>	<b>Lwn(551)</b>	<b>Lwn(667)</b>
RMSE	0.353	0.256	0.243	0.261	0.254	0.129
Relative error (%)	41.31	22.32	13.06	12.02	12.53	41.06
<b>Ruddick</b>	<b>Lwn(412)</b>	<b>Lwn(443)</b>	<b>Lwn(488)</b>	<b>Lwn(531)</b>	<b>Lwn(551)</b>	<b>Lwn(667)</b>
RMSE	0.425	0.323	0.255	0.248	0.235	0.136
Relative error (%)	55.66	32.18	16.74	13.29	12.66	41.77




# Acknowledgments

- CNES for funding through the TOSCA program
- Dr. Brent Holben and co-workers for maintaining the COVE SeaPRISM site
- GSFC NASA for providing the SeaWiFS L1 data
- OBPG for advices and discussions for the use of SeaDAS



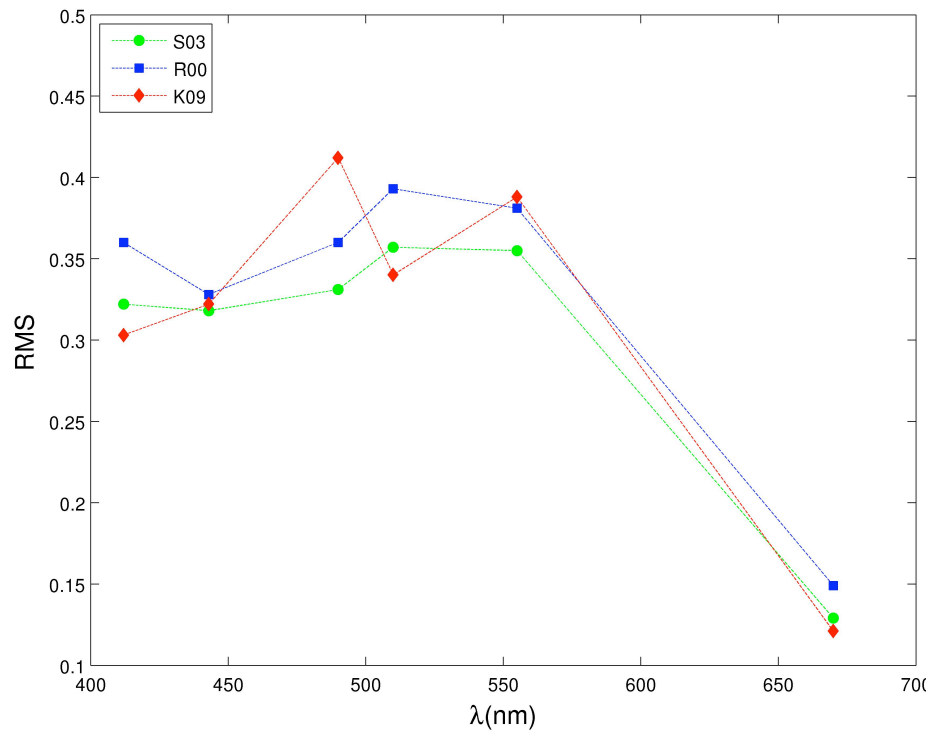
Scatter plots of the retrieved  $nL_w(\lambda)$  by S03 (○), R00 (□) and K09 (◇) vs AERONET-OC measurements at the MVCO, COVE and AAOT sites. The continuous line represents the 1:1 line, the colored lines represent the linear regression lines.



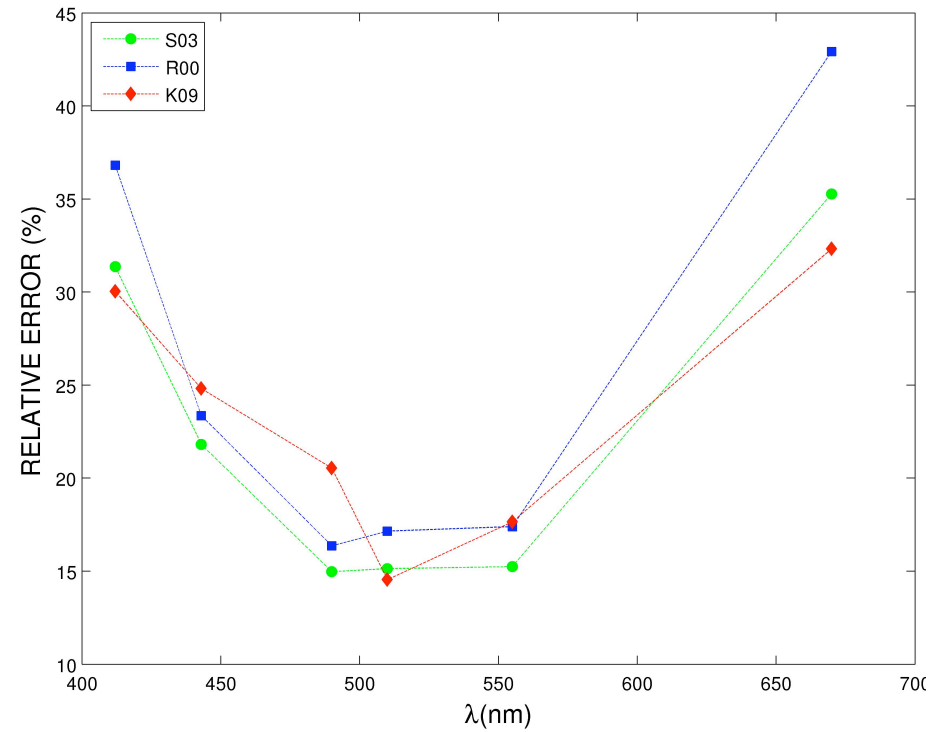
Scatter plots of the retrieved  $\tau(865)$  (left panel) and  $\alpha(510)$  (right panel) by S03 () , R00 () and K09 () vs AERONET-OC measurements at the MVCO, COVE and AAOT sites. The continuous line represents the 1:1 line, the colored lines represent the linear regression lines.



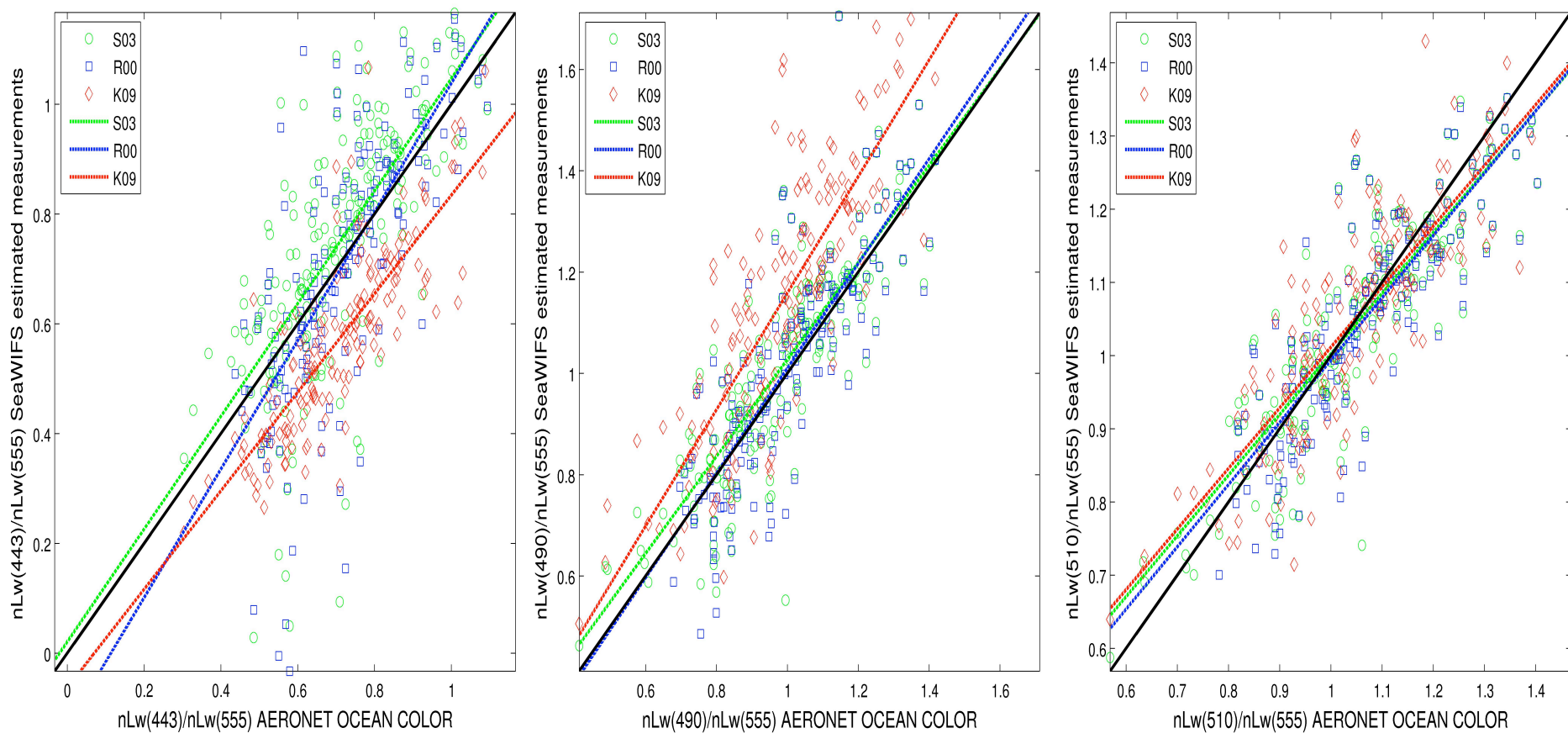
(a)



(b)




Variation of (a) the RMS and (b) the relative error as a function of the wavelength obtained with S03 (●), R00 (■) and K09 (◆)



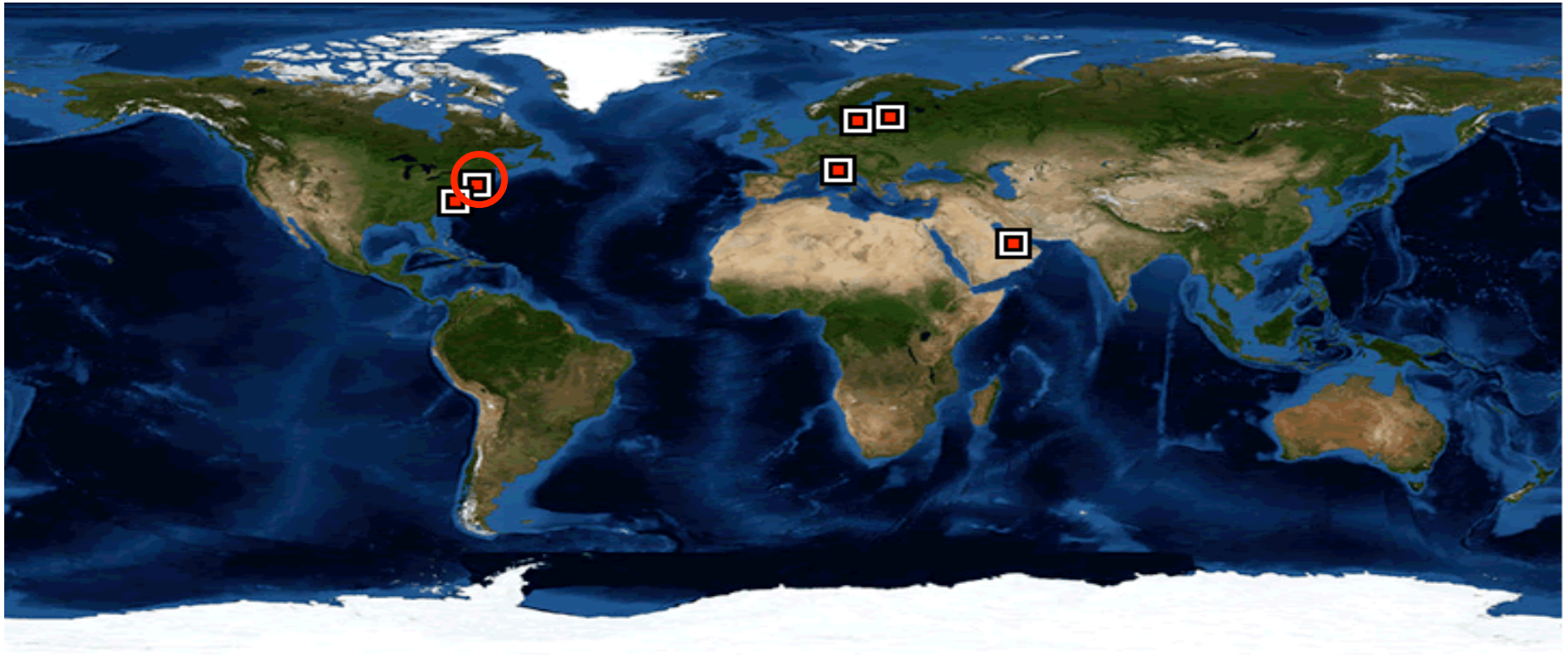
**Fig.3.** Same as Fig.2 but for the ratios from the left to the right:  $nL_w(443)/nL_w(555)$ ,  $nL_w(490)/nL_w(555)$ ,  $nL_w(510)/nL_w(555)$ .

# Protocols of comparison:match-ups

- Similar protocol that Bailey & Wang (2001) and Feng et al. (2008)
- 2-hour time window
- Valid pixel criterion:
  - No exclusion flags (land effect, high sun glint, high solar zenith (higher than  $70^\circ$ ), high satellite viewing zenith (higher than  $60^\circ$ ), cloud or ice, and total radiance saturation)
  - Match-up accepted if all 6 (9 for AAOT) 'valid'.
- Mean on 2x3 pixels box for MVCO (3x3 box for AAOT and COVE)
- Match-up pair accepted if coeff. spatial variation  $< 0.2$  in  (865).

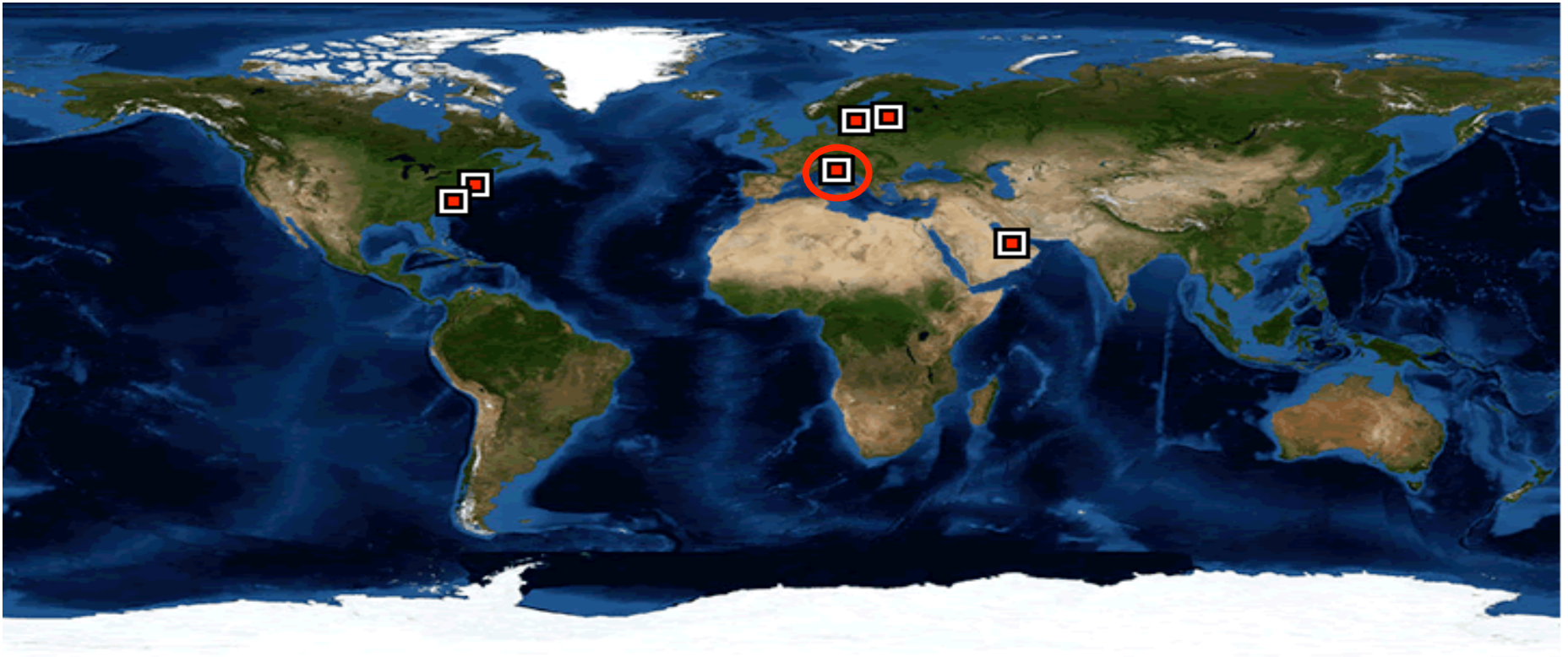
# SeaWiFS 2009 reprocessing

- Two SeaWiFS reprocessings: R2007 and R2009 for S03 and R00
  - Change in aerosol models
    - R2007: 12 Gordon and Wang (1994) models
    - R2009: 80 models based on AERONET *in situ* measurements → more realistic
  - Change in the bio-optical model (Bailey, 2010)
    - Change of the definition of  $nLw$  and  $b_b(670)$ 
      - Alternative spectral backscattering relationship
      - Alternative estimate for absorption in the red wavelength
    - Revised iteration scheme
  - Change in vicarious calibration (Stumpf, 2010)

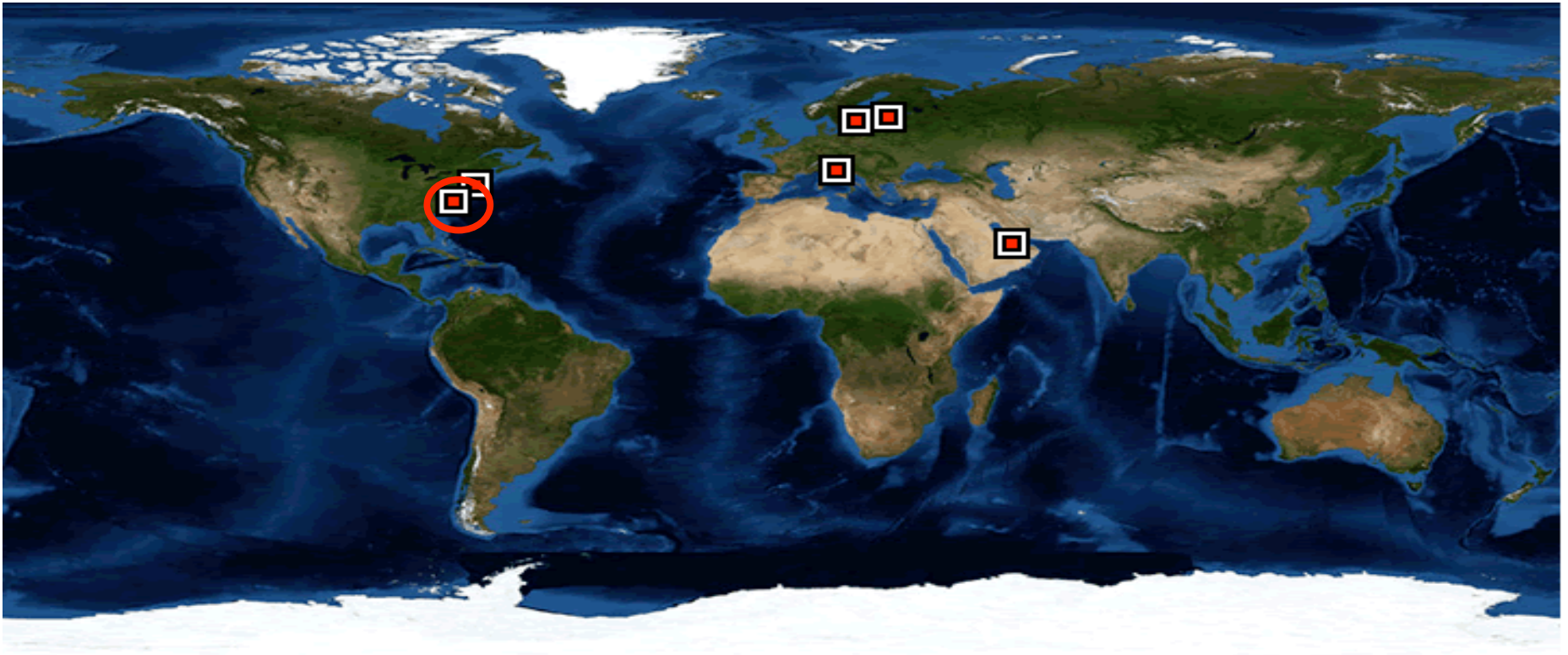


- *MVCO* (Feng et al., 2008) :
  - North Atlantic Bight:  $41.33^{\circ}\text{N}$  and  $70.57^{\circ}\text{W}$
  - 5 km offshore
  - 14 months: Feb. 2004  $\rightarrow$  Nov. 2005
  - Moderately dominated by sediments
  - TSM:  $1.5 \pm 0.9 \text{ mg.L}^{-1}$ ;  $a_{ys} = 0.12 \pm 0.01 \text{ m}^{-1}$

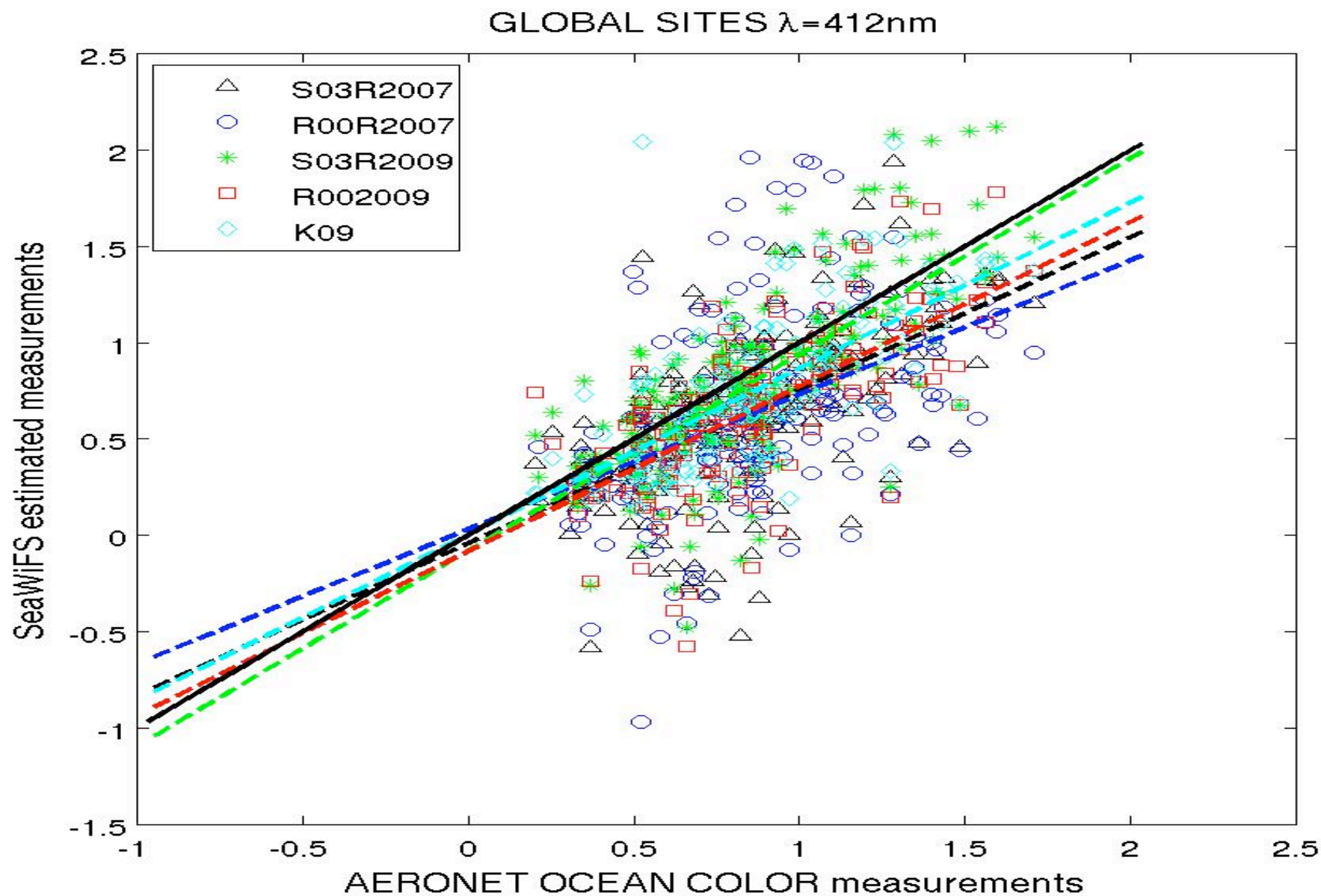




- *AAOT* (Zibordi et al., 2006) :
  - Northern Adriatic Sea: 45.31°N; 12.50°E
  - 14.8 km off the Venice Lagoon
  - 68 months: Apr. 2002 → Nov. 2007
  - Characterized by case-I (65%) and -II waters (35%)
  - TSM: 1.1 +/-0.7 mg.L<sup>-1</sup>;  $\alpha_{ys}$ =0.20+/-0.10 m<sup>-1</sup>

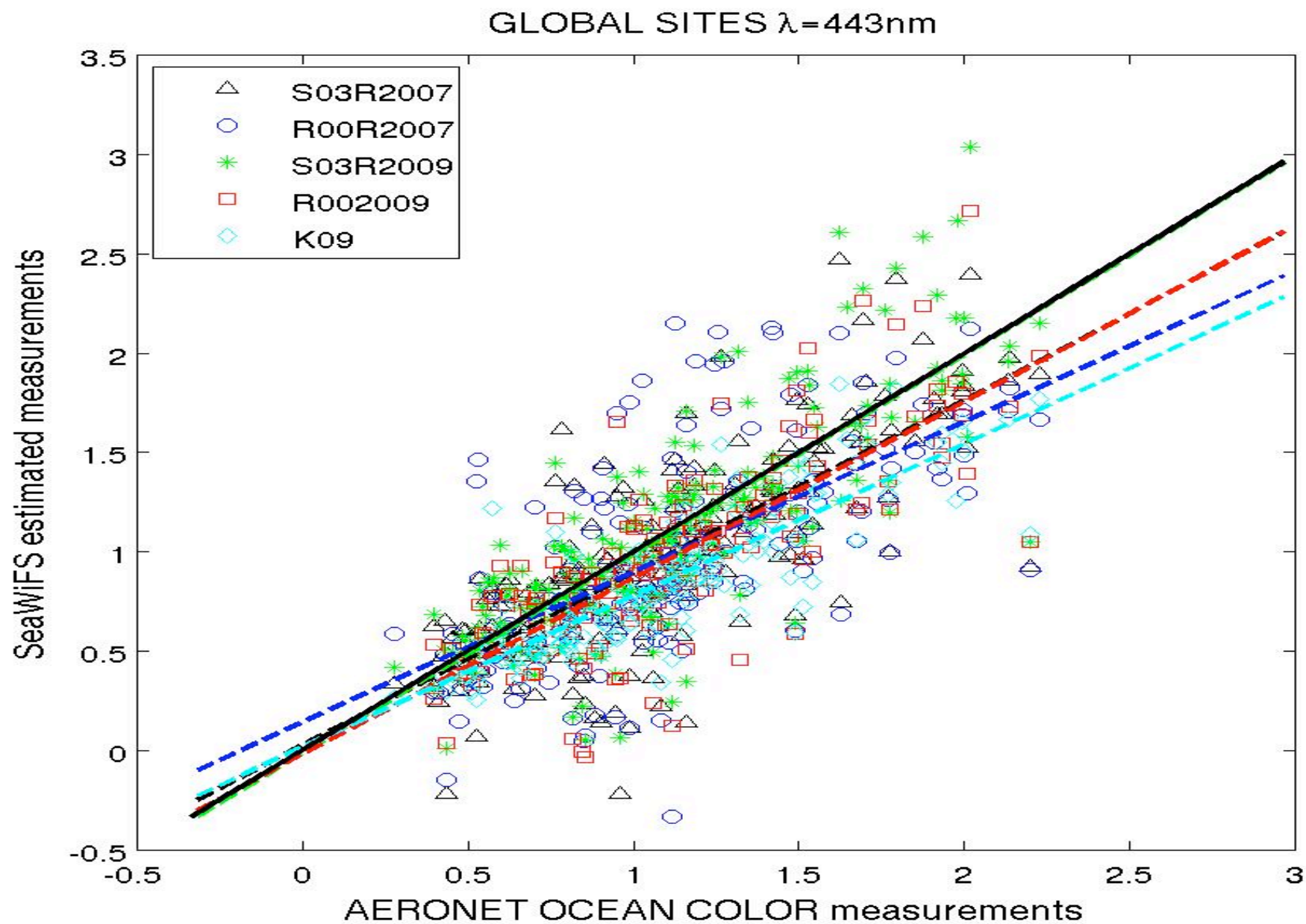


- *COVE* (Zibordi et al., 2009) :
  - Chesapeake Bay offshore: 36.90°N; 75.71°E
  - 25 km off Virginia Beach, Virginia
  - 24 months: Apr. 2006 → Dec. 2008
  - Moderately dominated by sediments
  - TSM:  $a_{ys} = 0.17 \pm 0.06 \text{ m}^{-1}$

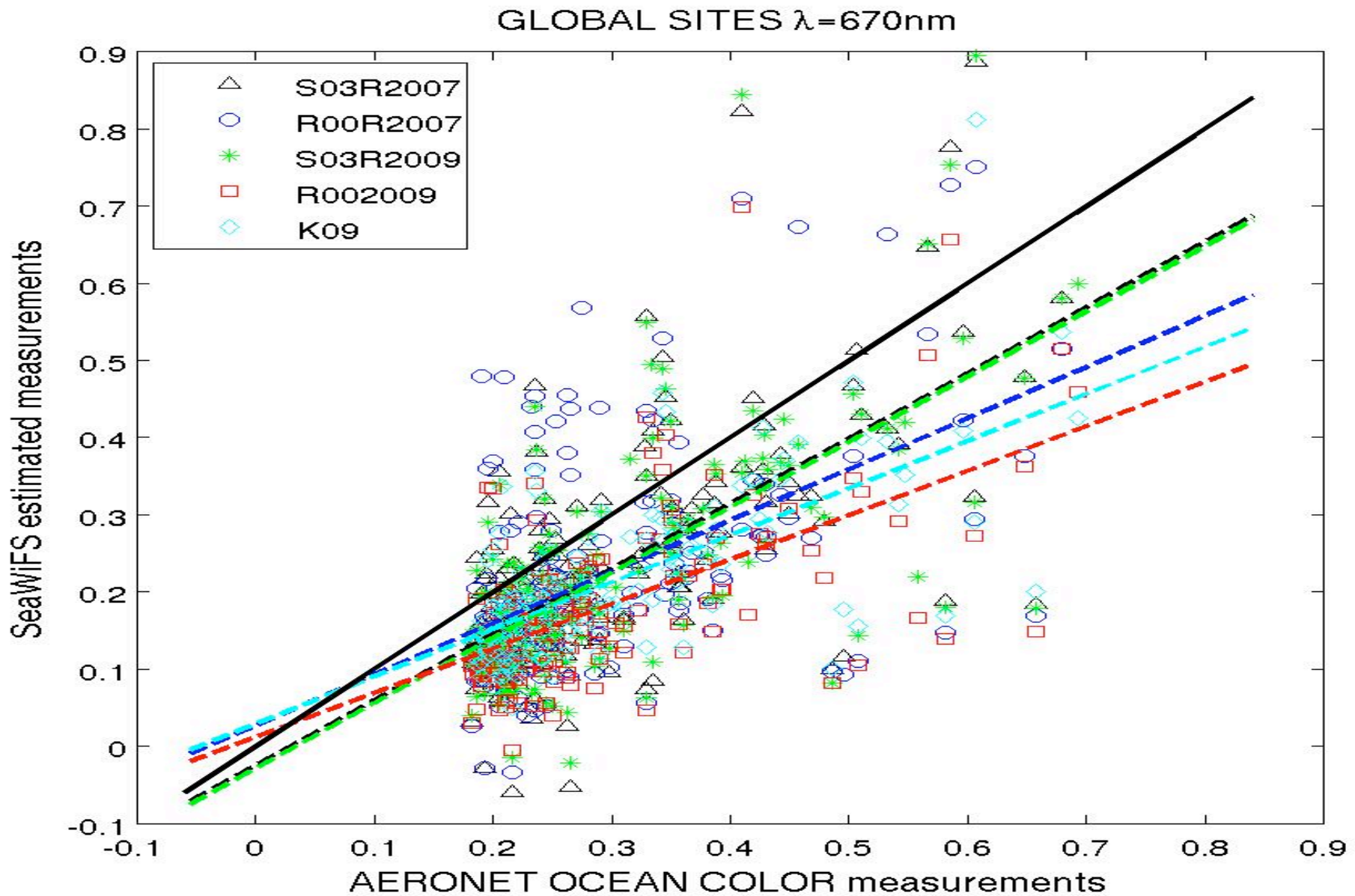


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# Conclusions (3/3)

- *Time processing:*
  - Standard algorithm: **fastest algorithm**
  - Kuchinke: **very time consuming** (as any optimization technique)
  - Ruddick: **twice slower than standard algorithm** (need to process two times the same image)