

# Vicarious Calibration of Ocean Colour Sensors

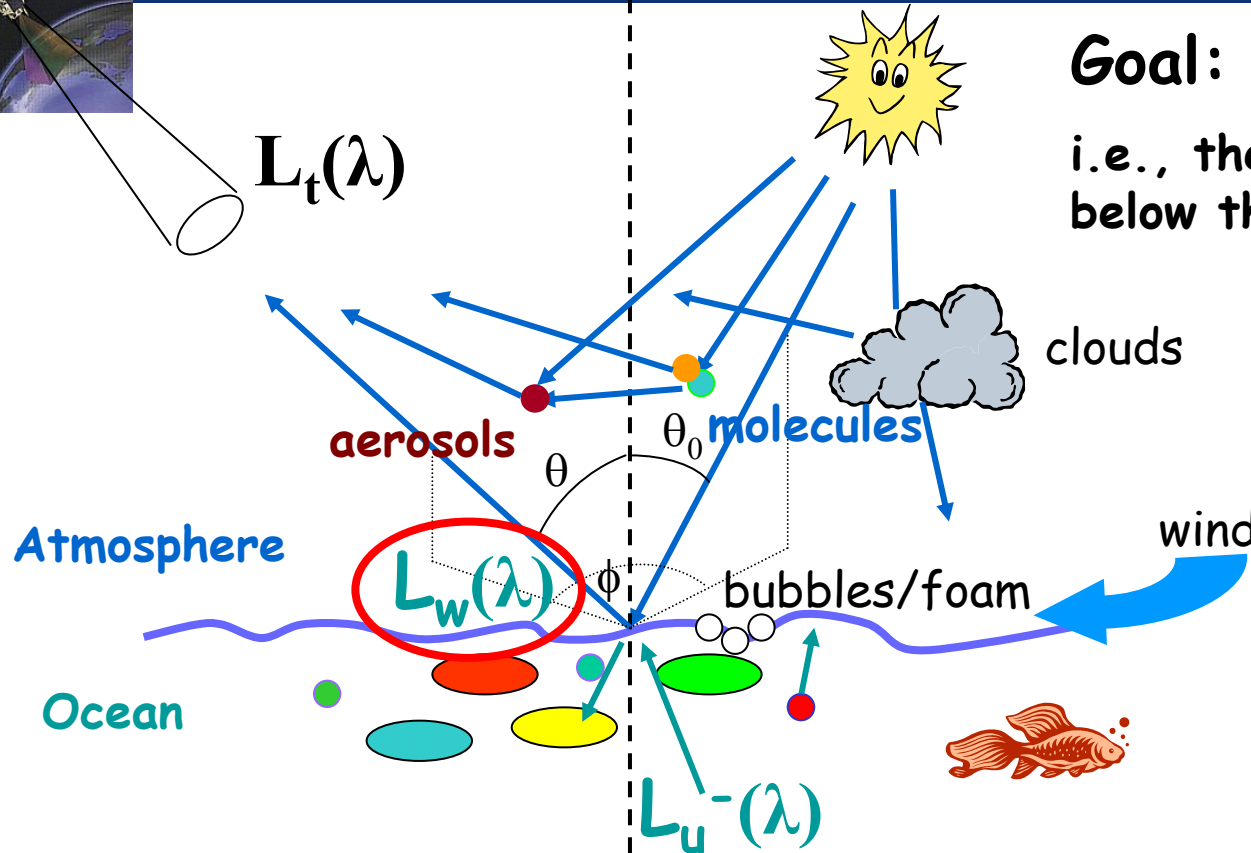
Frédéric Mélin & Sean Bailey

- Ocean Colour Radiometry
- Principles of Vicarious Calibration
- Data Sources for Vicarious Calibration
- Applications

# Ocean Colour Radiometry

Ispra – 20.10/2010

**Goal: retrieve  $L_w(\lambda)$  or  $R_{rs}(\lambda)$ ,**  
i.e., the radiance emerging from  
below the sea surface



$$L_{toa}(\lambda) = L_{atm}(\lambda) + t_d(\lambda) \cdot L_w(\lambda) + t_d(\lambda) \cdot L_{wc}(\lambda) + t(\lambda) \cdot L_g(\lambda)$$

Rayleigh ( $L_r$ ) + water-leaving  
aerosol ( $L_a$ ) radiance

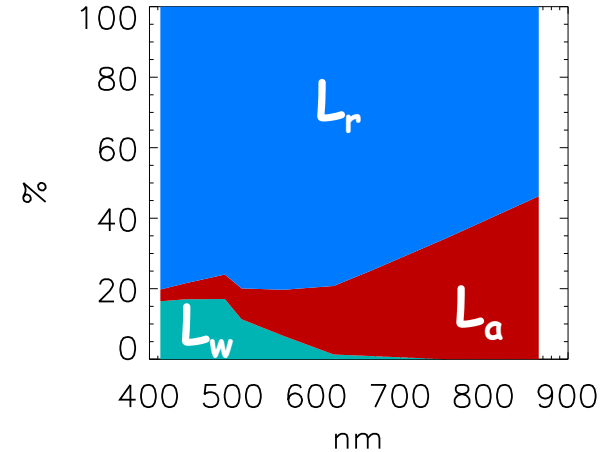
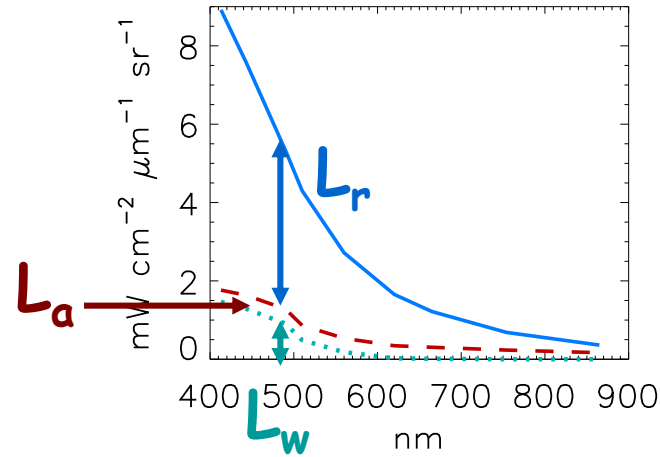
modelled

masked or corrected

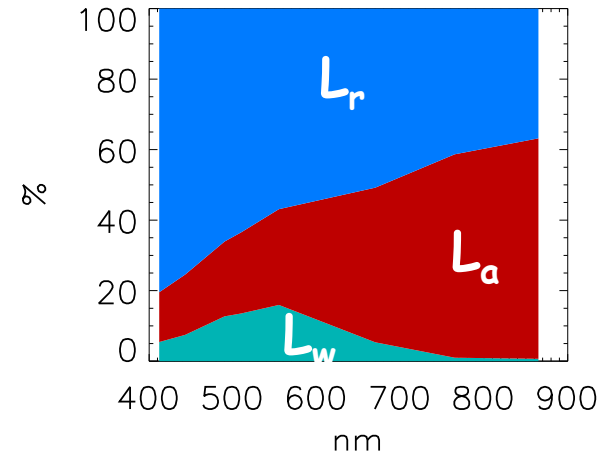
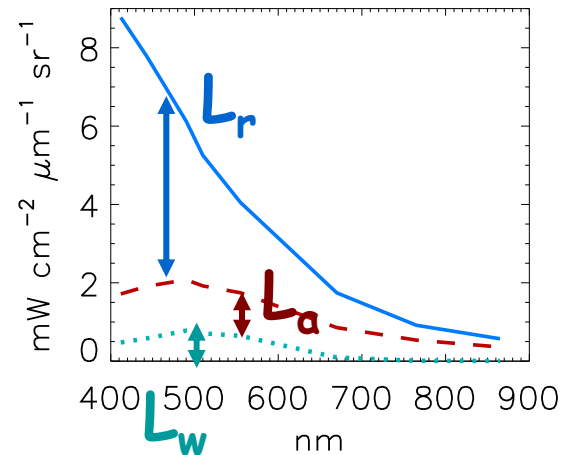
# Ocean Colour Radiometry: Radiance Budget

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MERIS  
MOBy  
29/05/2002  
Clear water  
Clear marine  
atmosphere



SeaWiFS  
AAOT  
18/07/2002  
Coastal waters  
Continental air mass



➡ Rule of thumb:  $L_w$  accounts for ~10% of  $L_t$

# Ocean Colour Radiometry: Requirements

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Typical requirements for  $L_w$  retrieval: 5% (abs.)



e.g., McClain et al., 1992

Requirements for  $L_+$  uncertainty: 0.5%

To fulfill such stringent requirements:  
a comprehensive cal/val strategy for the duration of the mission

- pre-launch calibration  
(that might be affected by transfer-to-orbit)
- on-board devices
- stability tracking (lunar measurements, solar diffusers,...)
- vicarious calibration
- ...

# Vicarious Calibration: One piece of the puzzle (1)

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Vicarious calibration is one, albeit important, aspect to the total instrument calibration process - a process that begins with prelaunch characterization and is continued throughout the life of the mission.

... makes use of a single set of fractional gains, where unity indicates no correction.

$$L_t(\lambda) = g(\lambda) \cdot K(\lambda) \cdot f(t-t_0, \lambda) [DC(\lambda) - DC_{\text{dark}}(\lambda)]$$

TOA radiance

vicarious gain

counts-to-radiance conversion

temporal dependence

digital counts

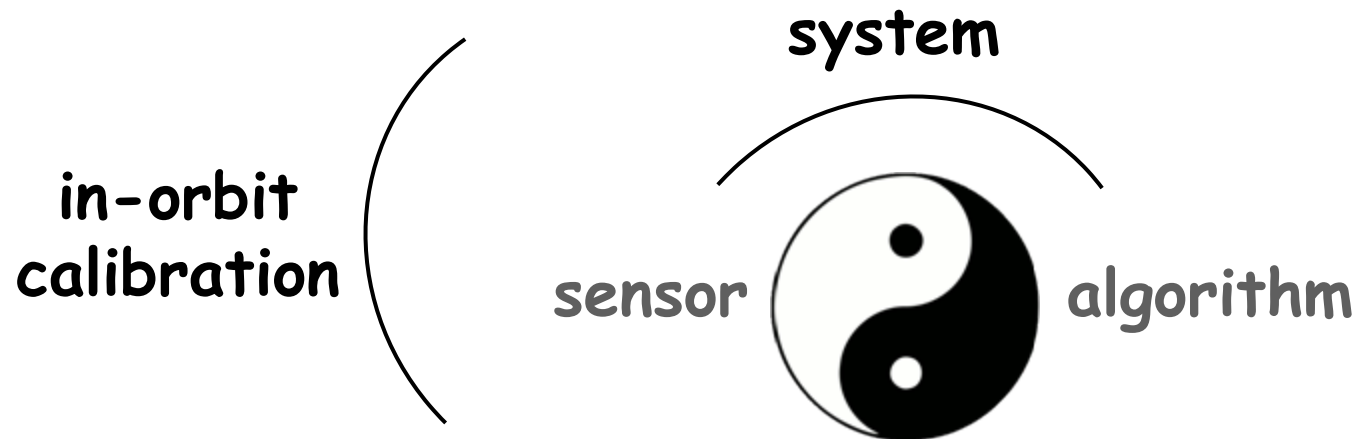
dark counts

# Vicarious Calibration: One piece of the puzzle (2)

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... is derived by minimizing the difference between satellite  $L_w$  and ground-truth  $L_w$  (for the NIR,  $L_w$  is assumed to be zero)

... modifies the **integrated instrument-atmospheric correction system**. It effectively accounts for undetermined post-launch instrument changes and atmospheric correction biases, assuming that temporal trends are independently removed.

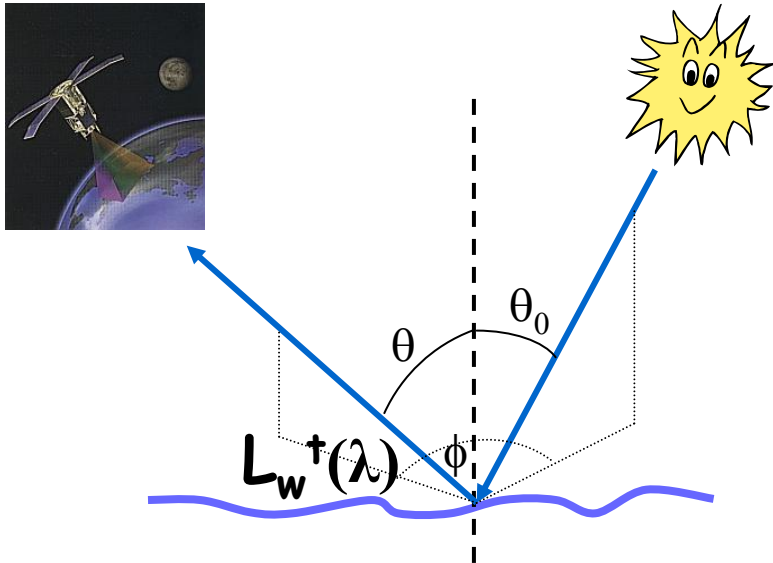


# Vicarious Calibration in Practice

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$$\left. \begin{aligned} L_t(\lambda) &= L_{\text{atm}}(\lambda) + t_d(\lambda) L_w(\lambda) \\ \text{Target: } L_t^t(\lambda) &= L_{\text{atm}}(\lambda) + t_d(\lambda) L_w^t(\lambda) \end{aligned} \right\} g(\lambda) = L_t^t(\lambda) / L_t(\lambda)$$

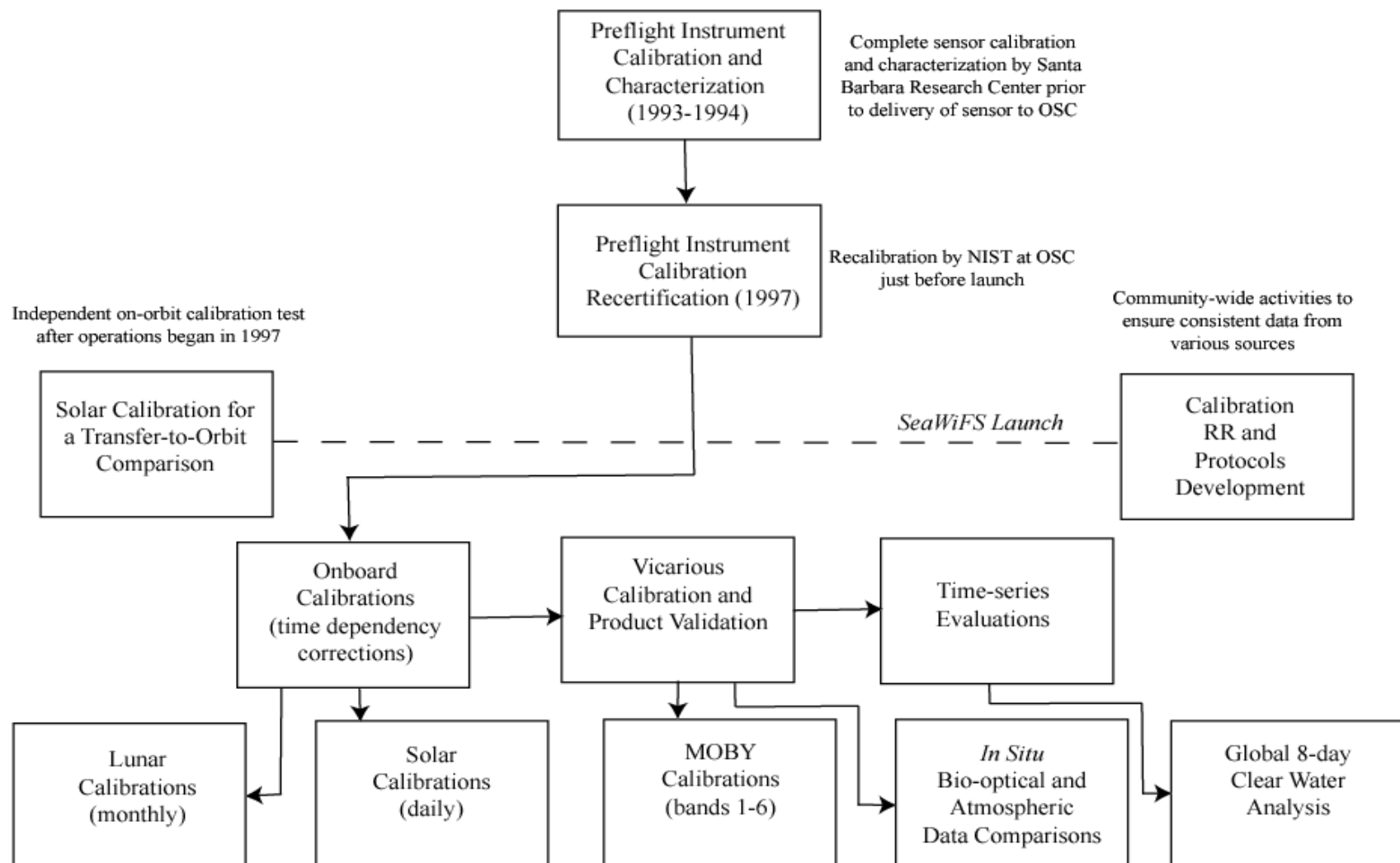
surface  
measurements



$$L_w^t(\lambda, \theta, \theta_0) \leftarrow L_w(\lambda', \theta', \theta'_0)$$

accounting for spectral characteristics  
and bidirectional effects

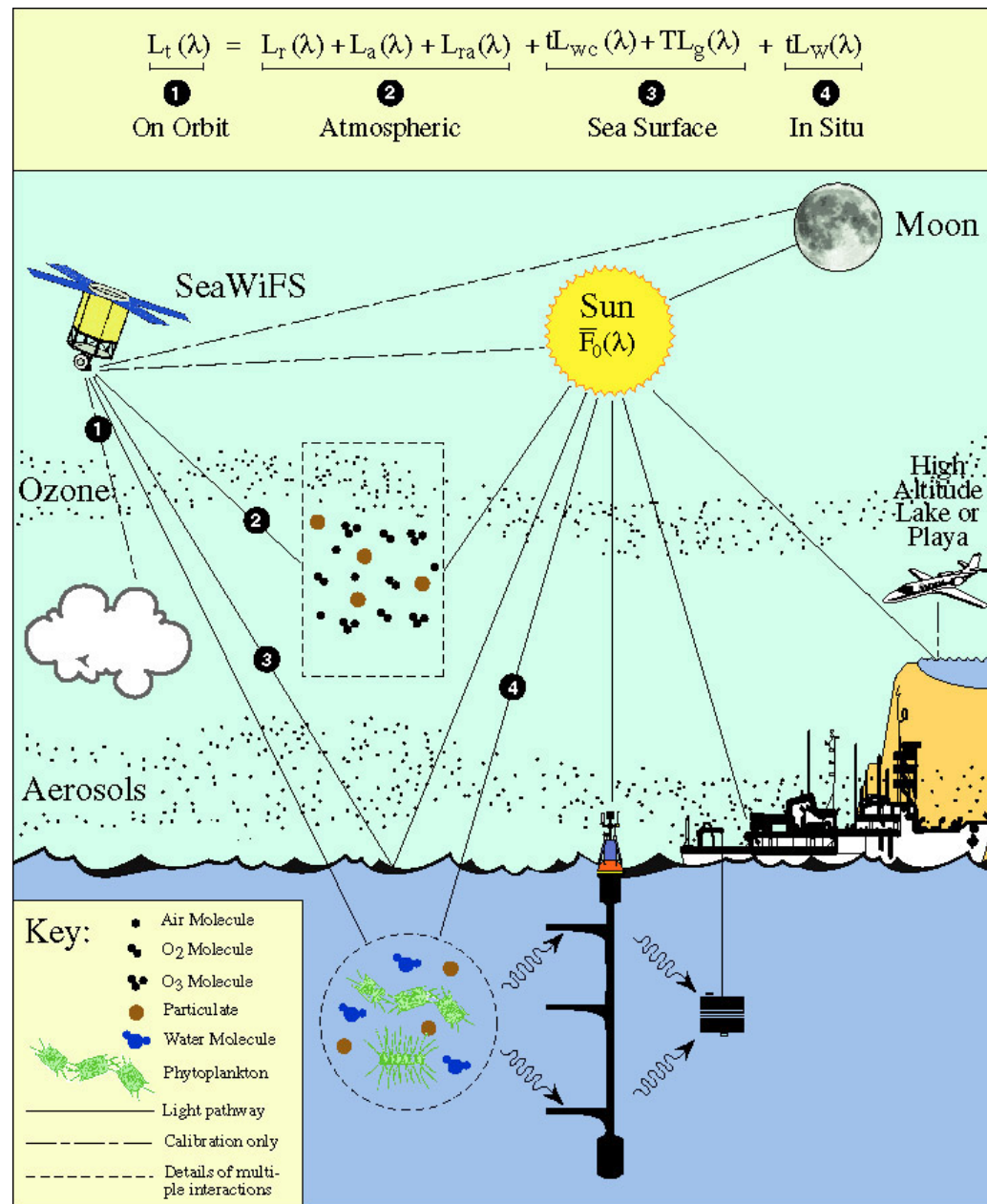
# SeaWiFS Calibration Strategy





## Satellite Calibration Elements:

- **Laboratory** - before launch, sensor is calibrated in lab
- **On-orbit** - daily solar and monthly lunar observations are used to track changes in sensor response
- **Vicarious** - comparison of data retrievals to in-water, ship, and airborne sensors is used to adjust instrument gains



# Data Sources for Vicarious Calibration

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**Original (SeaWiFS pre-launch) ideal requirements on sea-truth data for vicarious calibration activities**

- 
- (1) clear maritime atmosphere
  - (2) clear-water site
  - (3) horizontally homogeneous water mass
  - (4) hyperspectral instrumentation
  - (5) extraordinary calibration
  - (6) daily-to-weekly monitoring of derived  $L_{wn}$
  - (7) avoidance of platform perturbation
  - (8) cloud-free site
  - (9) coincident aerosol measurements
  - (10) atmosphere free of terrestrial influence
  - (11) free from biofouling
- 

**A Virtual Laboratory  
for Calibration**

Table from Bailey et al., *AO*, 2008

**This resulted in the Marine Optical Buoy (MOBy) taking a major role in vicarious calibration activities**

# Alternatives Choices for Data Sources

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## Alternatives have provided satisfactory results:

- data sets derived from commercial, off-the-shelf instrumentation (globally-distributed data, BOUSSOLE) Bailey et al., *AO*, 2008
- ocean reflectance model Werdell et al., *AO*, 2007
- coastal sites (above-water radiometry) Mélin & Zibordi, *AO*, 2010

# Match-up Selection Protocol

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Whichever site is selected, the match-up selection protocol is more restrictive than for validation purposes.

- Square of  $N \times N$  pixels
- Set of excluding flags (clouds, glint, ...)
- Maximum time difference (e.g., 1-h)
- Maximum viewing and solar zenith angles (e.g.,  $56^\circ$  and  $70^\circ$ )
- Maximum  $\tau_a$
- Maximum  $Chl a$
- Maximum wind speed
- Homogeneity of  $L_w$  and  $\tau_a$
- ...

# Vicarious Calibration: Examples (1)

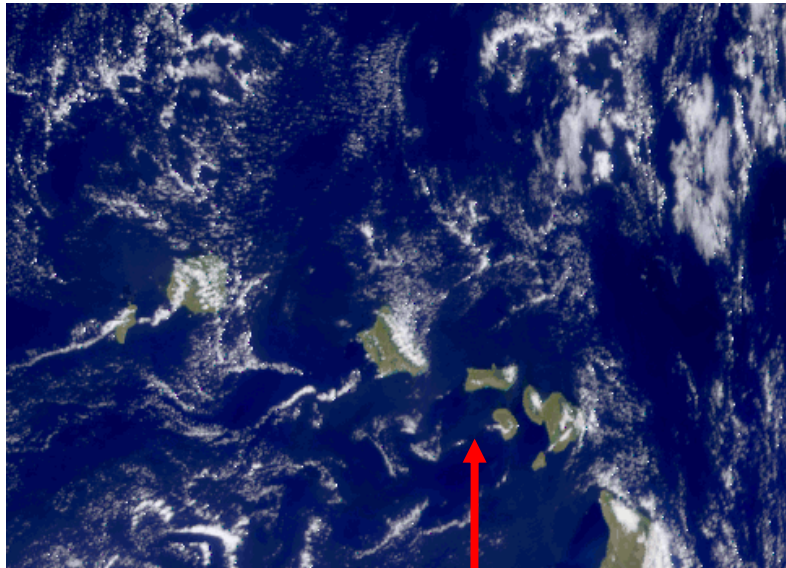
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Ocean Biology Processing Group  
(OBPG) - NASA

SeaWiFS

MODIS

OCTS / POLDER



MOBy  
(Hawaii)

Table 1. Derived Vicarious Gain Coefficients for OCTS and POLDER Spectral

Wavelength (nm)	Gain Coefficient $G^{(VC)}(\lambda)$	
	OCTS	POLDER
412	1.12426	—
443	1.01539	1.06465
490	0.95084	1.02350
520	1.01784	—
565	1.03255	0.97541
670	1.00859	1.01845
765	0.92093	1.02946
865	1.00000	1.00000

Wang et al., AO, 2002

# Vicarious Calibration: Examples (2)

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Vicarious calibration  
for POLDER ocean color bands  
using spatially-distributed field  
measurements

## Vicarious calibration coefficients

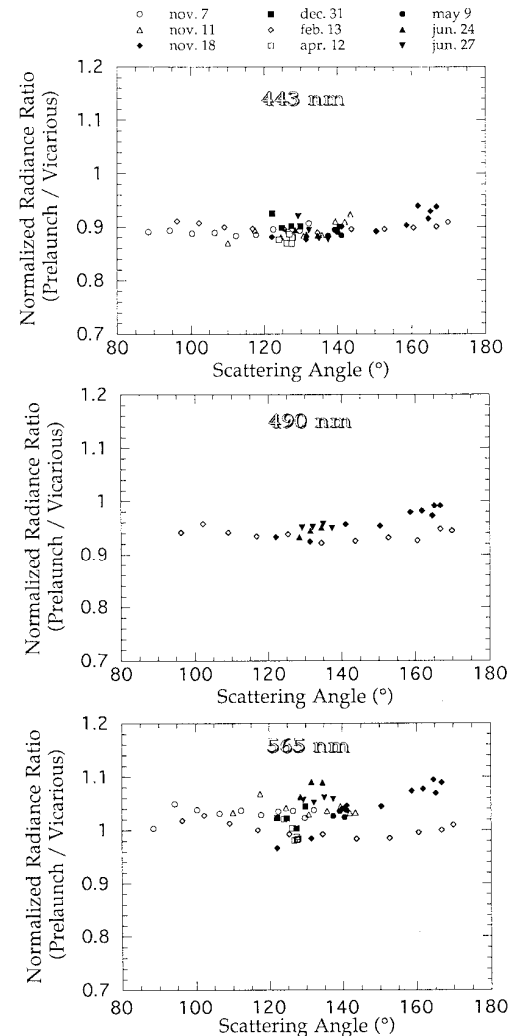


Fig. 5. Ratio of prelaunch- and postlaunch-calibrated (this study) POLDER normalized radiances  $A_k(\lambda)$  as a function of scattering angle for the spectral bands centered at 443, 490, and 565 nm, and for the whole matchup data set.

# Vicarious Calibration: Examples (3)

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Vicarious calibration  
for GLI (ADEOS-2)  
using MOBy (7 days)  
or land target, or SeaWiFS

## Vicarious calibration coefficients

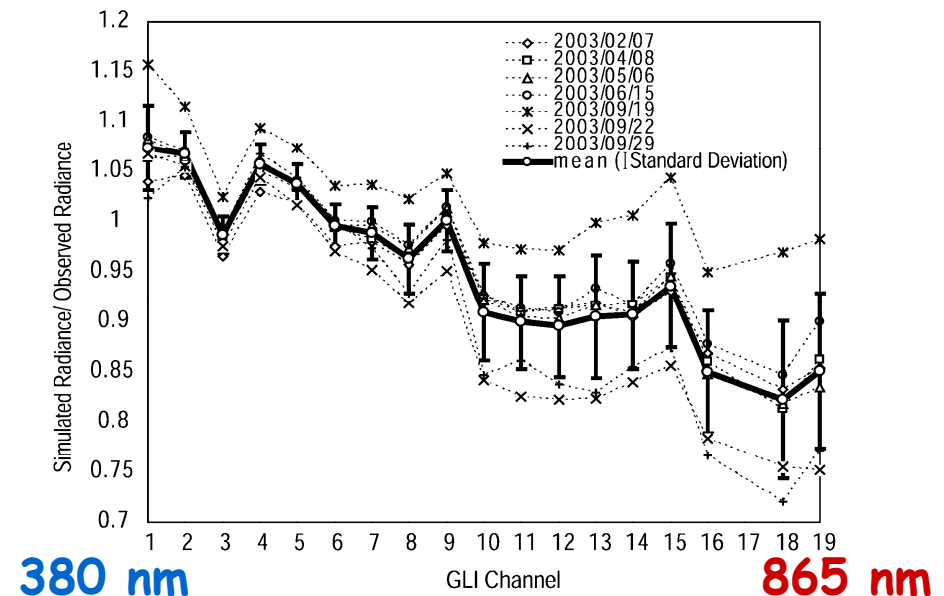


Fig. 2. Vicarious calibration coefficient for each channel except for channel 17. The dotted lines show the coefficients for the seven days in Table II. The solid line shows (open circle) the mean and (error bar) the standard deviation of the seven coefficients.

Yoshida et al., *IEEE*, 2005

Murakami et al., *IEEE*, 2005

# Inter-Sensor Calibration

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**Target:**  $L_t^t(\lambda) = L_{\text{atm}}(\lambda) + t_d(\lambda) L_w^t(\lambda)$  ← reference satellite

MOS wrt SeaWiFS

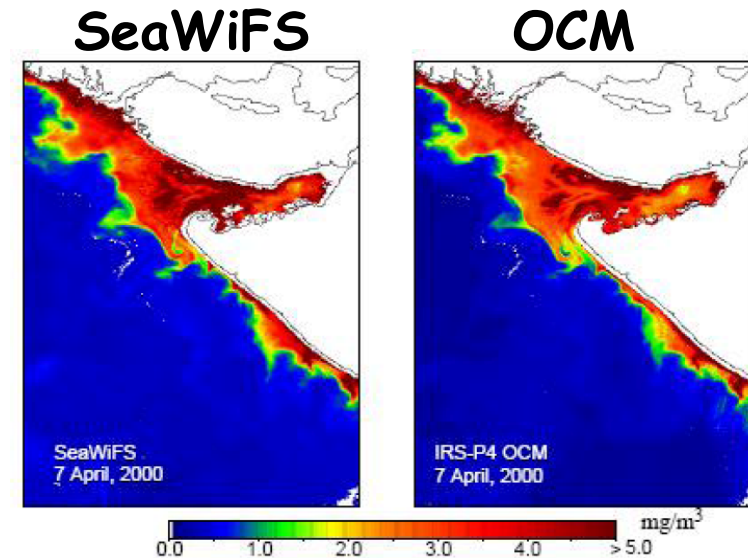
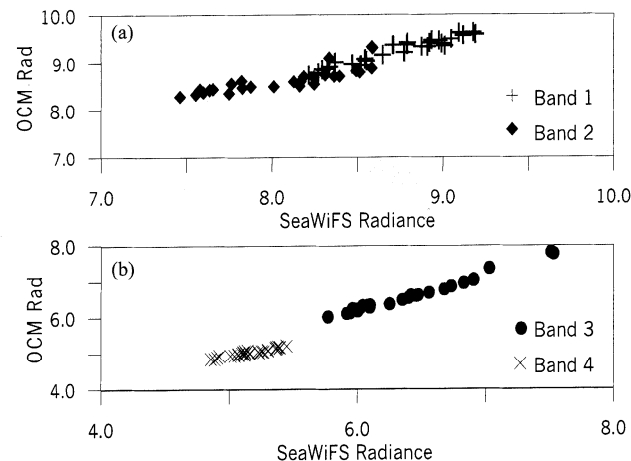
Wang & Franz, *AO*, 2000

COCTS (HY-1A) wrt SeaWiFS

Pan et al., *CSB*, 2004

OCM (IRS-P4) wrt SeaWiFS

Chauhan et al., *IEEE*, 2003



Suresh et al., *SPIE*, 2006



# Atmospheric Correction

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## Main principles of 'standard' atmospheric correction"

$$\left. \begin{aligned} L_t(\lambda_{\text{nir1}}) &= L_r(\lambda_{\text{nir1}}) + L_a(\lambda_{\text{nir1}}) + t_d(\lambda_{\text{nir1}}) \cancel{L_w(\lambda_{\text{nir1}})} \\ L_t(\lambda_{\text{nir2}}) &= L_r(\lambda_{\text{nir2}}) + L_a(\lambda_{\text{nir2}}) + t_d(\lambda_{\text{nir2}}) \cancel{L_w(\lambda_{\text{nir2}})} \end{aligned} \right\} \xrightarrow{\text{black pixel}} \frac{L_a(\lambda_{\text{nir1}})}{L_a(\lambda_{\text{nir2}})} \downarrow$$

black pixel

$$L_t(\lambda_{\text{vis}}) = L_r(\lambda_{\text{vis}}) + L_a(\lambda_{\text{vis}}) + t_d(\lambda_{\text{vis}}) L_w(\lambda_{\text{vis}}) \xleftarrow{\text{aerosol model}}$$

Conditions of non-negligible  $L_w$  in the NIR are handled with an iterative process.

# NASA-OBPG Vicarious Calibration

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Derives adjustment factors, one per sensor band, to minimize mean bias between in situ calibration source and satellite  $R_{rs}(\lambda)$  retrievals.

- system calibration
  - compensates for error in both instrument calibration and retrieval algorithm
- two step process:
  - calibrate NIR bands to improve aerosol retrieval
  - calibrate visible using calibrated aerosol retrieval and in situ radiometry
- calibration site considerations
  - prefer clear water location to minimize heterogeneity and  $R_{rs}$  (NIR)
  - prefer stable (known) aerosol type

# OBPG Vicarious Calibration: NIR Bands (1)

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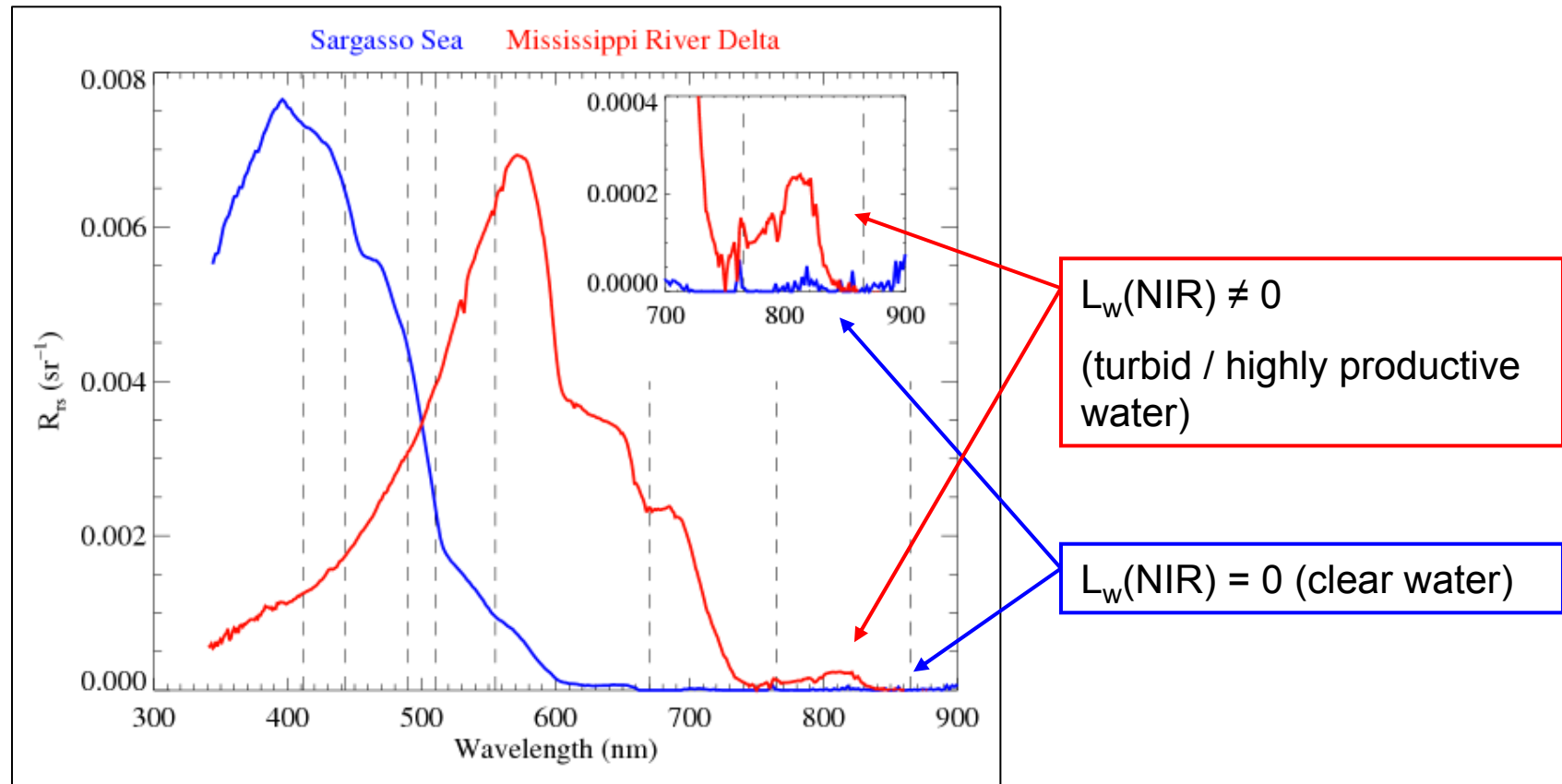
- At 865 nm (SeaWiFS): no vicarious calibration; measurements are used to provide aerosol amounts in the atmospheric correction algorithm based on the assumption that the water-leaving radiance component is negligible and can be ignored in the NIR
- This is a valid assumption in clear, open ocean waters
- The shorter NIR band (765 nm for SeaWiFS) is adjusted relative to the 865-nm band by fixing the aerosol model in the atmospheric correction process
  - This requires the additional assumption that the aerosol type is known
  - A maritime model is chosen based on measurements from the AERONET sunphotometer stationed at Tahiti.

# OBPG Vicarious Calibration: NIR Bands (2)

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$R_{rs}(\lambda)$  is small in NIR ( $\lambda > 700\text{nm}$ )

*... but not necessarily insignificant*

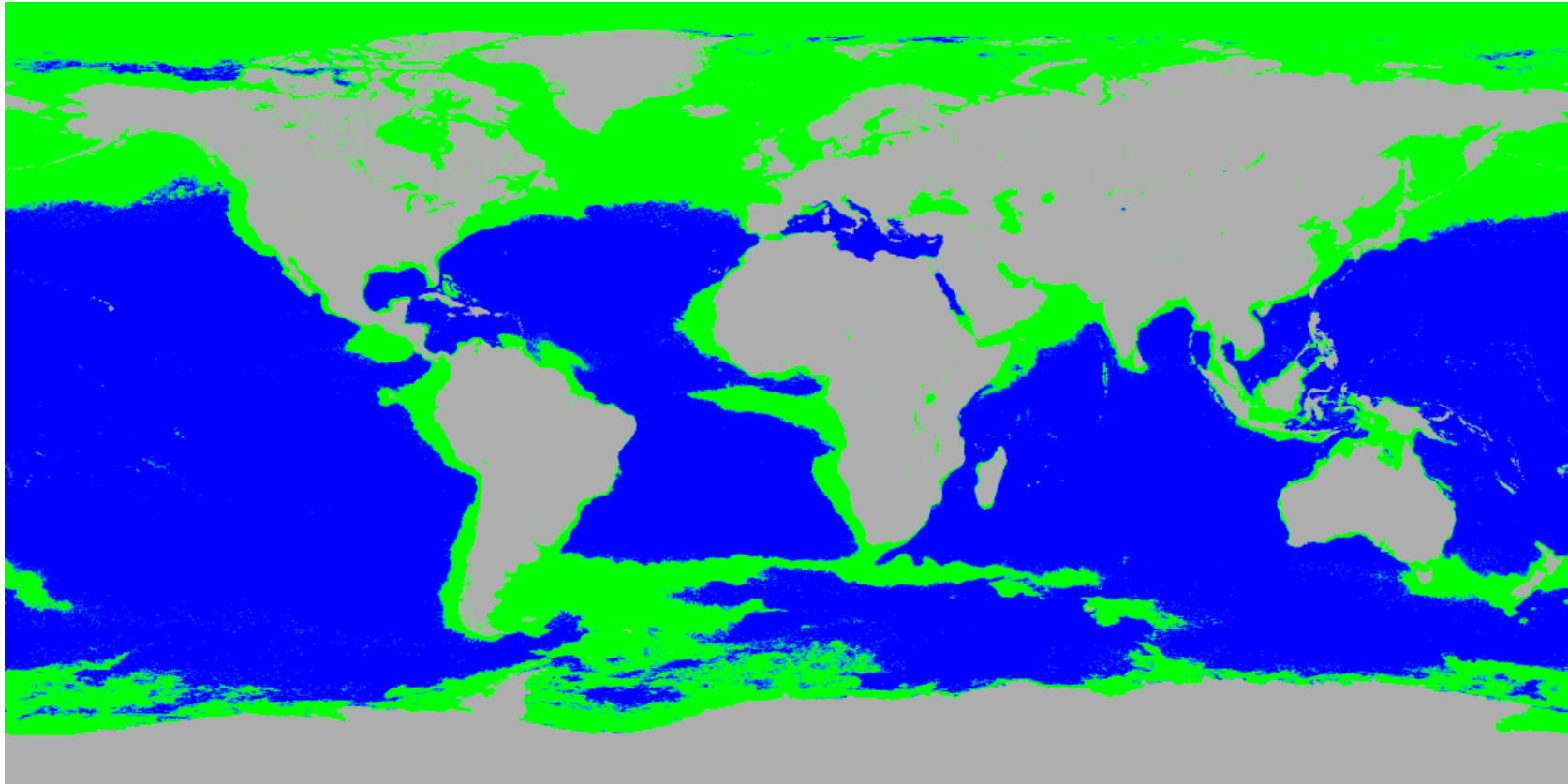


To reduce uncertainties in the aerosol model selection process for vicarious calibration targets, it is best to avoid vicarious calibration in turbid/productive waters

# OBPG Vicarious Calibration: NIR Bands (3)

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$R_{rs}(\lambda)$  is small in NIR ( $\lambda > 700$  nm)



**Green** is where the NIR correction is likely to be applied

(Chl  $> 0.3$  mg m $^{-3}$ )

# OBPG Vicarious Calibration: Visible Bands

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Once the NIR calibration is fixed, the VIS bands are adjusted using a consistent, well calibrated / characterized in situ source

For SeaWiFS and the MODIS instruments this source has been the Marine Optical Buoy (MOBY)

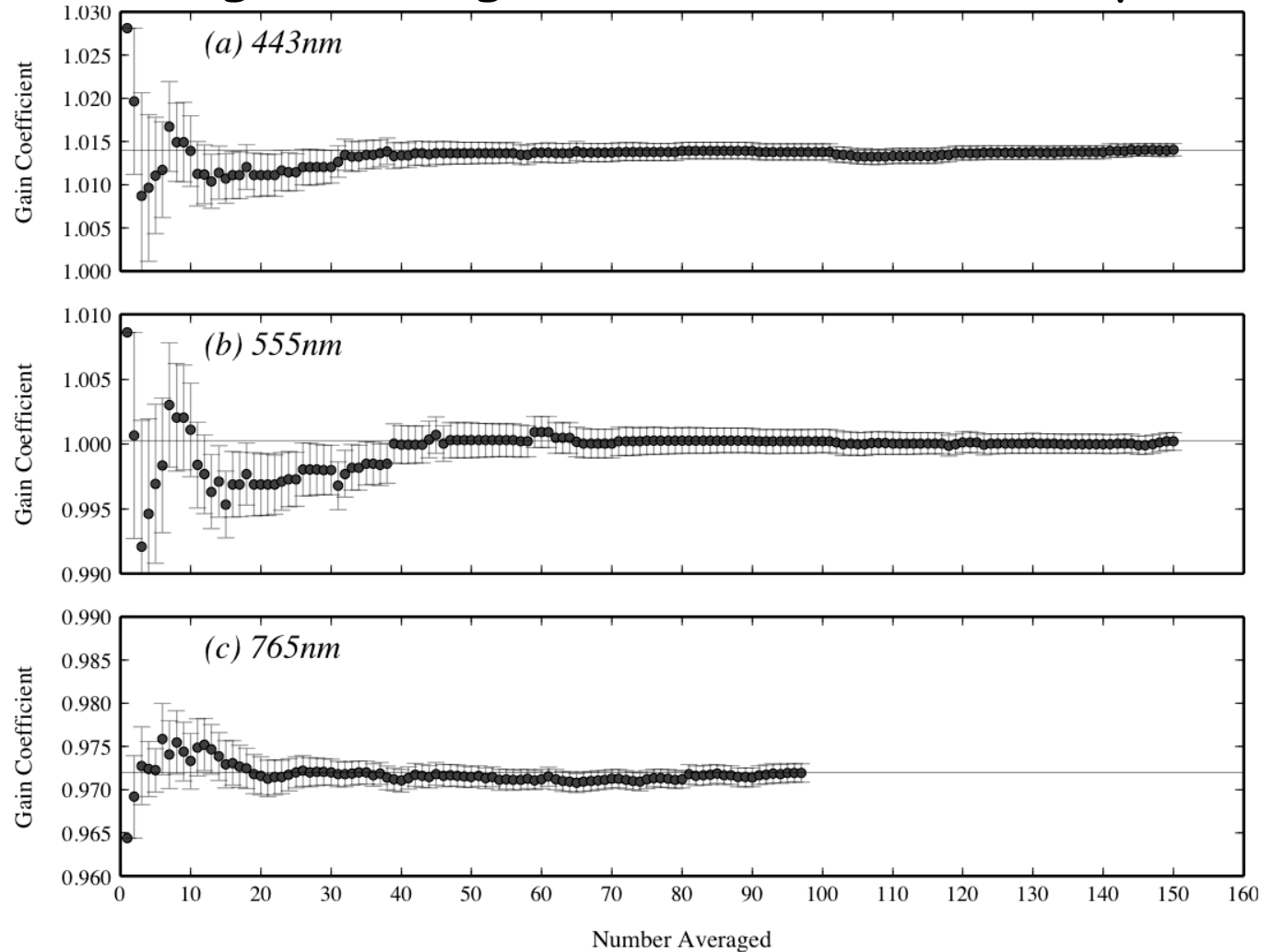
**Gain calculation:**

$$g_i(\lambda) = \frac{L_t^{predicted}}{L_t^{observed}} \quad g(\lambda) = \frac{1}{n} \sum_{i=1}^n g_i(\lambda) \quad \text{in practice: using robust mean of semi-interquartile}$$

# SeaWiFS Vicarious Gains

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## Convergence of $g$ 's calculation with sample size



Franz et al., AO, 2007

It takes time to gather a sufficient number of samples to reach a stable vicarious calibration

# Vicarious Calibration with ORM (1)

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## OCEAN SURFACE REFLECTANCE MODEL

$$R(0^-) = f'(C_a) \frac{b_b(C_a)}{a(C_a) + b_b(C_a)}$$

$$L_{wn} = \Re F_0 \frac{R(0^-)}{Q(C_a)}$$

$b_b$ ,  $a$ ,  $f'$ , and  $Q$  estimated using  $C_a$

$R$  and  $F_0$  are constants

in Case-1 water, plausible estimates of  $L_{wn}$   
can be derived from  $C_a$   
using an ocean surface reflectance model

Morel and Maritorena (2001)

Morel, Antoine, and Gentili (2002)

Ciotti, Cullen, and Lewis (1999)



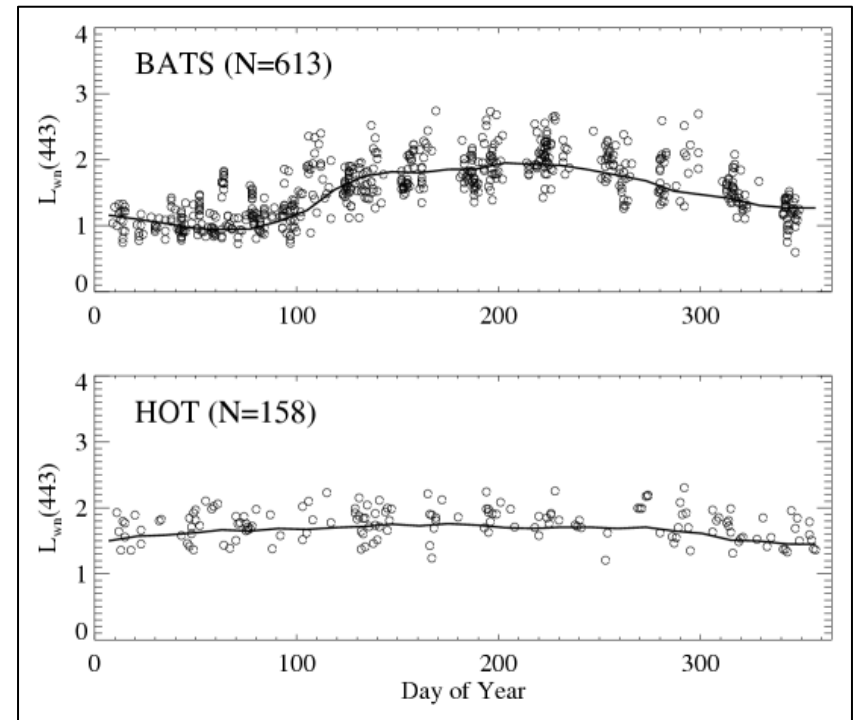
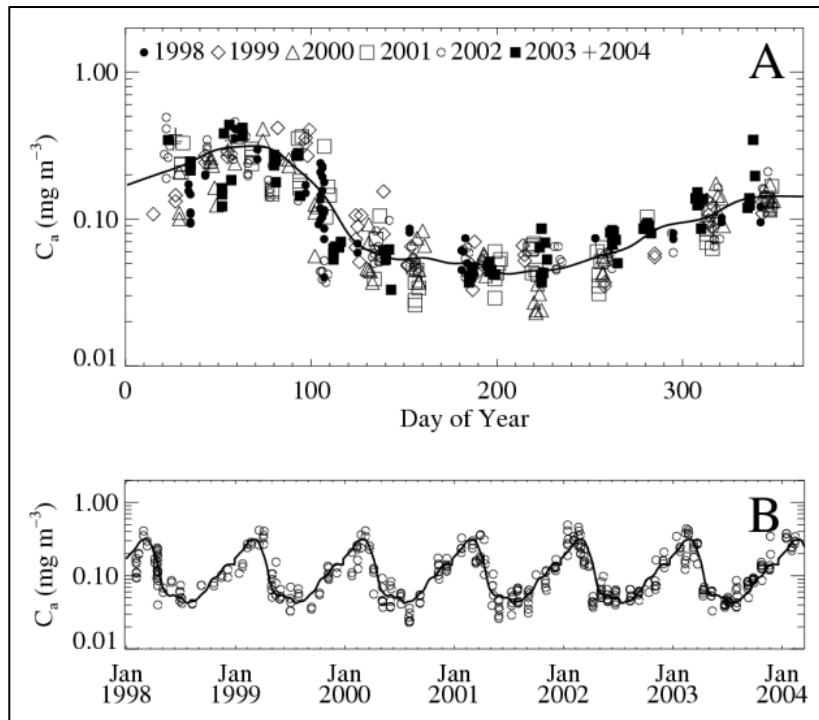
# Vicarious Calibration with ORM (2)

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general  $C_a$  expressions developed for BATS and HOT

here is the expression for BATS fluorometric  $C_a$ :

verified the "ORM- $C_a$  model" combination through comparisons with in situ  $L_{wn}$



# Vicarious Calibration with ORM (3)

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- using the  $C_a$  expressions as input into an ORM, we can estimate  $L_{wn}$  for every day of the year at both BATS and HOT
- these  $L_{wn}$  are then input into the vicarious calibration system

# Vicarious Calibration with ORM (4)

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**Table 3. Percent differences<sup>a</sup> between the MOBY and ORM  $\bar{g}$ .**

	412	443	490	510	555	670
BATS	-0.31	-1.18	-1.14	-0.52	0.14	-0.07
HOTS	-0.74	-0.53	-0.48	-0.14	0.44	-0.21
BATS + HOTS	-0.52	-0.86	-0.81	-0.33	0.29	-0.13

<sup>a</sup> Calculated via  $(\bar{g}_{\text{ORM}} - \bar{g}_{\text{MOBY}}) * 100\% / \bar{g}_{\text{MOBY}}$ .

**Table 4. Percent differences<sup>a</sup> between the HOT and BATS ORM  $\bar{g}$ .**

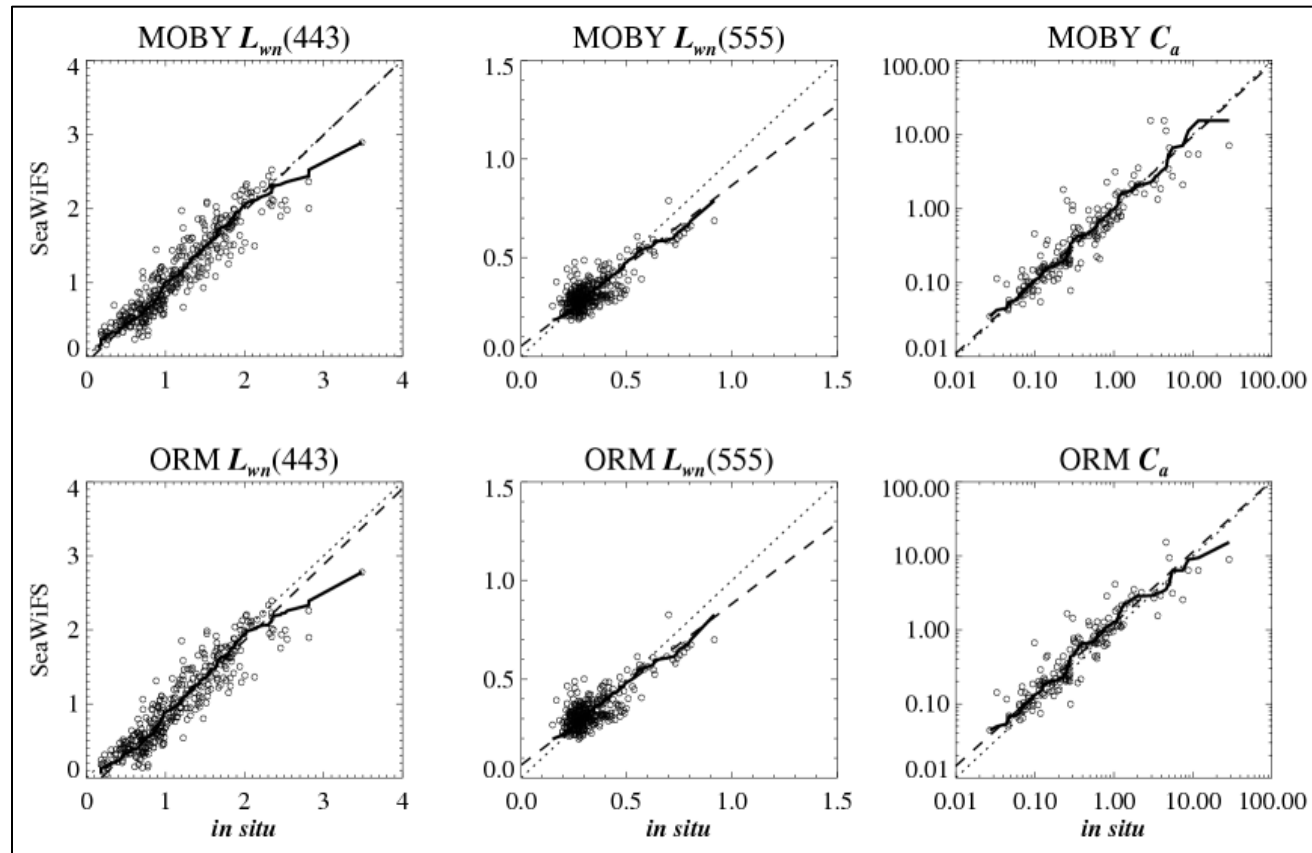
412	443	490	510	555	670
-0.44	0.66	0.66	0.38	0.30	-0.13

<sup>a</sup> Calculated via  $(\bar{g}_{\text{HOT}} - \bar{g}_{\text{BATS}}) * 100\% / \bar{g}_{\text{BATS}}$ .

# Vicarious Calibration with ORM (5)

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MOBY g's



ORM g's

not obvious in the validation scatter plots, but ...

changes in  $L_{wn}(443)$  of -7% and  $L_{wn}(555)$  of +4% create changes in  $C_a$  of +30%

# A Case Study: Regional Vicarious Calibration

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Vicarious calibration corrects for a systematic bias  
Remaining bias in some coastal regions

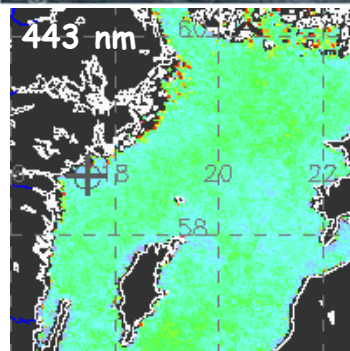
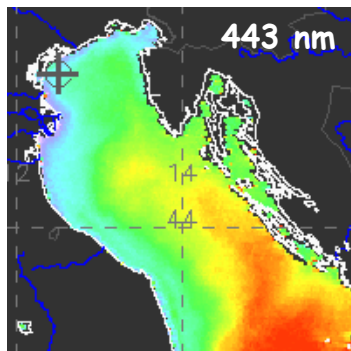


Regionally-specific vicarious calibration

Franz et al., *AO*, 2007



**AERONET-OC sites:**  
Availability of  $L_w(\lambda)$ ,  
 $\tau_a(\lambda)$ , aerosol optical properties



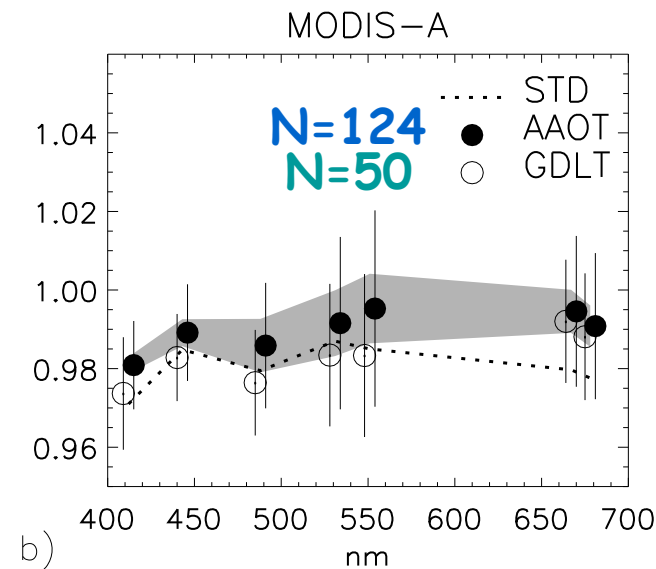
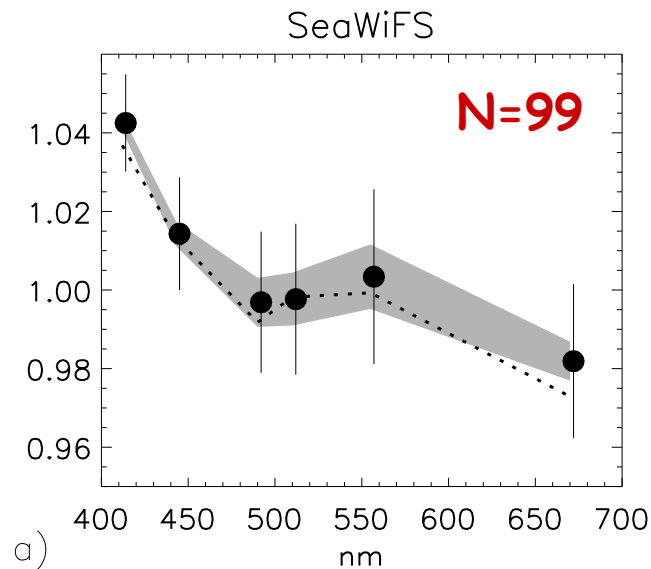
Zibordi et al., *JAOT*, 2009

# Regional Vicarious Calibration (1)

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Target:  $L_w(\lambda)$  in the VIS only, keeping NIR coef. as standard

## Vicarious Calibration Coefficients



Mélin & Zibordi, AO, 2010

# Regional Vicarious Calibration (2)

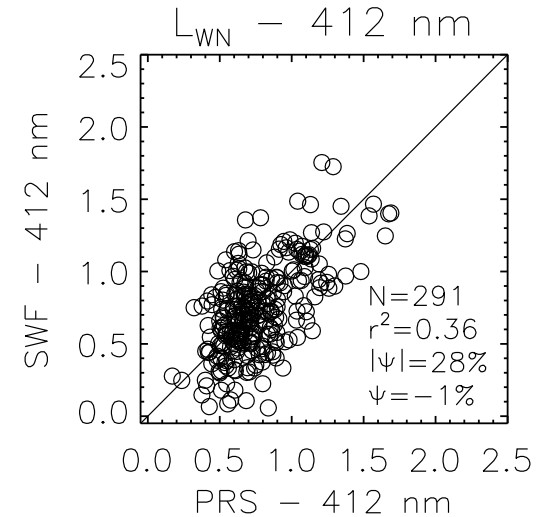
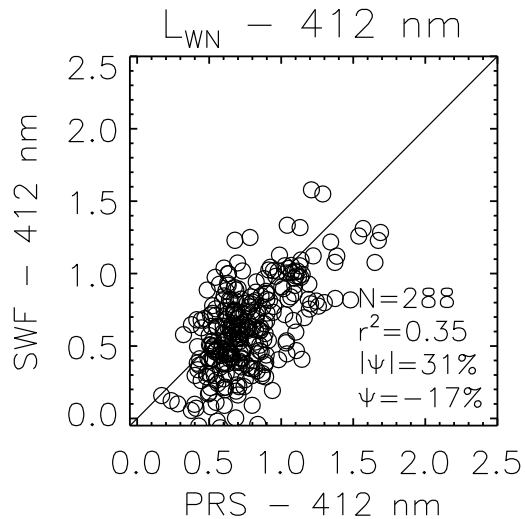
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**STD**

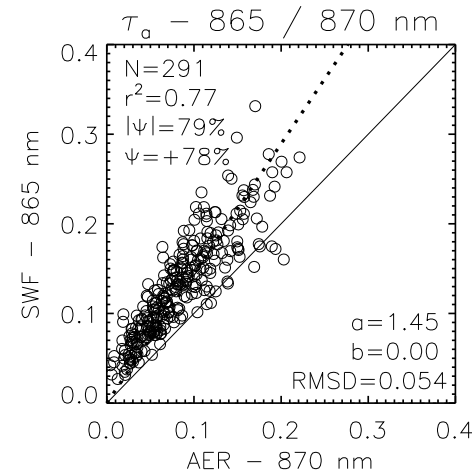
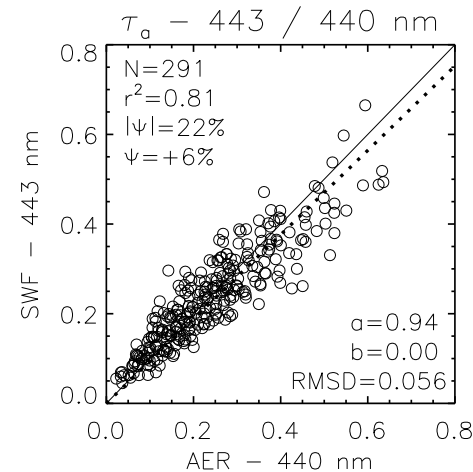
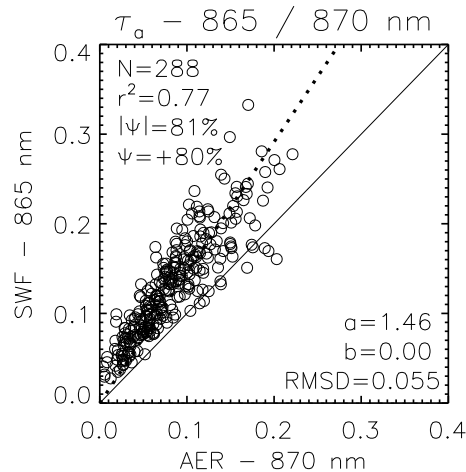
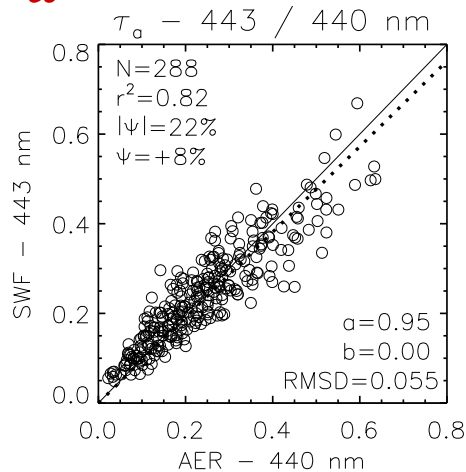
**Validation Statistics**

**AAOT-VIS**

$L_{wn}(\lambda)$



$\tau_a(\lambda)$

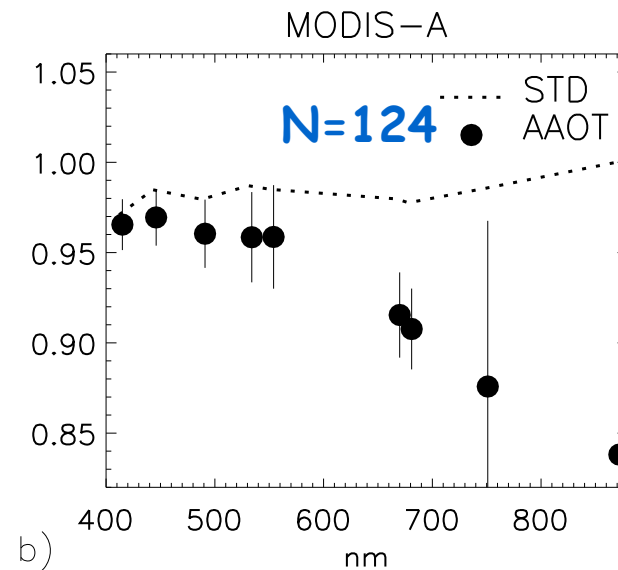
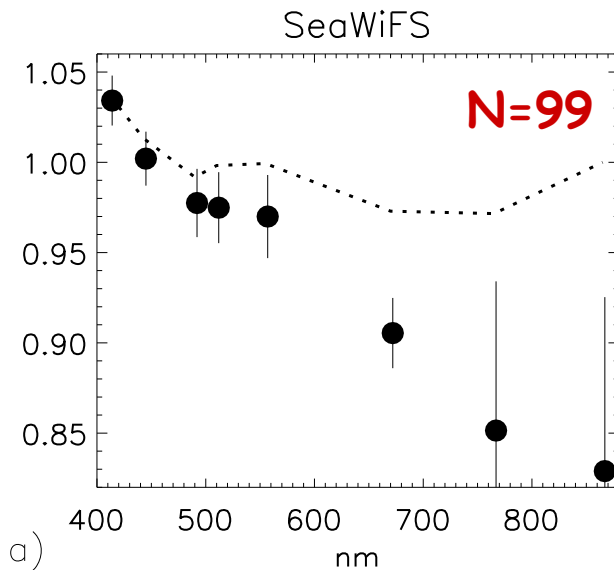


# Regional Vicarious Calibration (3)

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Target:  $L_w(\lambda)$  in the VIS &  $\tau_a(\lambda)$  in the NIR

## Vicarious Calibration Coefficients



Mélin & Zibordi, AO, 2010



# Regional Vicarious Calibration (4)

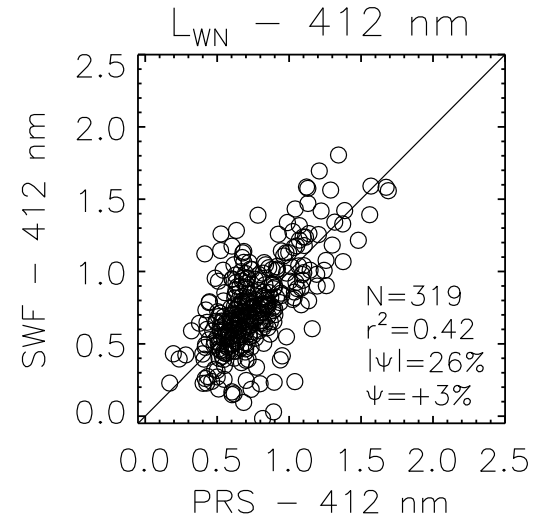
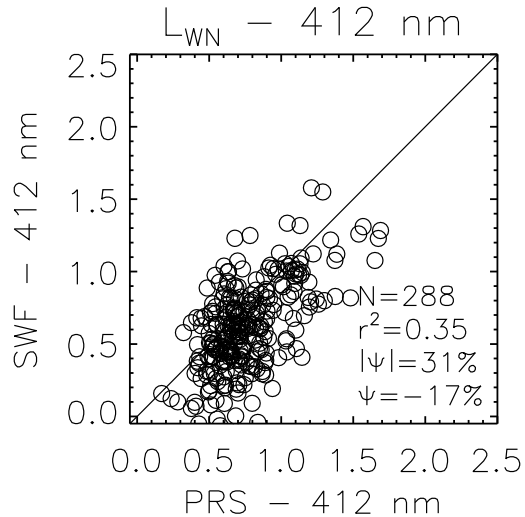
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**STD**

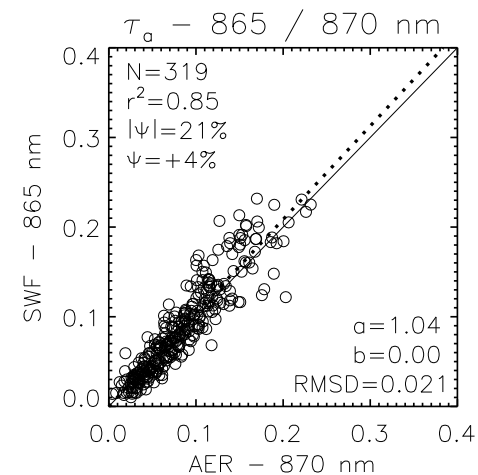
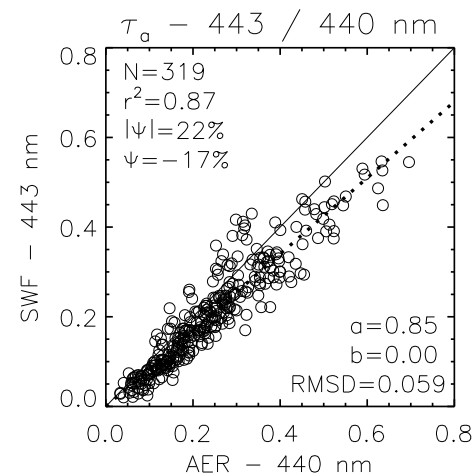
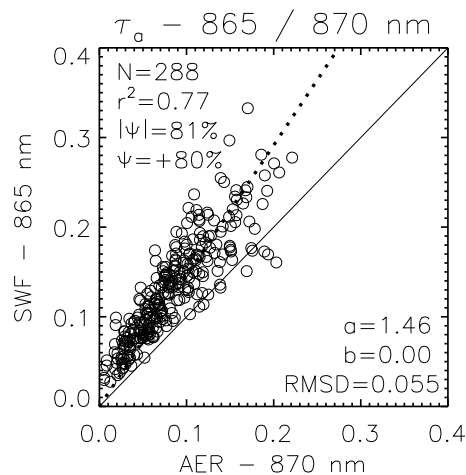
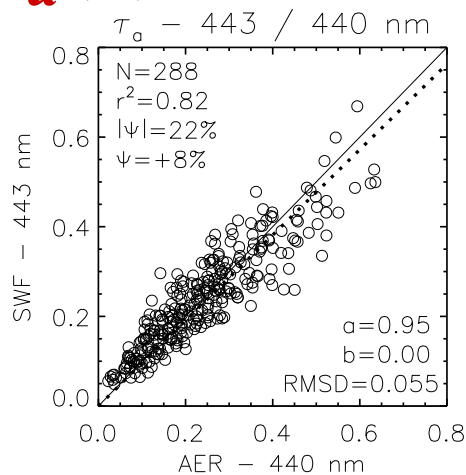
**Validation Statistics**

**AAOT-VIS/NIR**

$L_{wn}(\lambda)$



$\tau_a(\lambda)$



## Lessons:

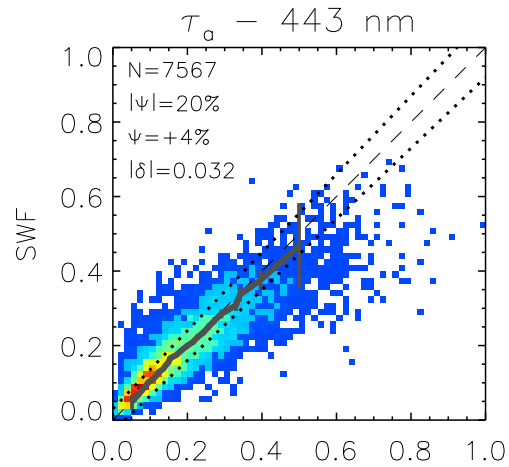
- Derived consistent VC coef. at 2 different coastal sites
- Successfully targeted both  $L_w(\lambda)$  and  $\tau_a(\lambda)$ ,  
but obtaining large VC corrections ([0.85,0.83] in the NIR!)
- Underlined deficiencies in the aerosol models  
of the atmospheric correction

# Regional Vicarious Calibration (6)

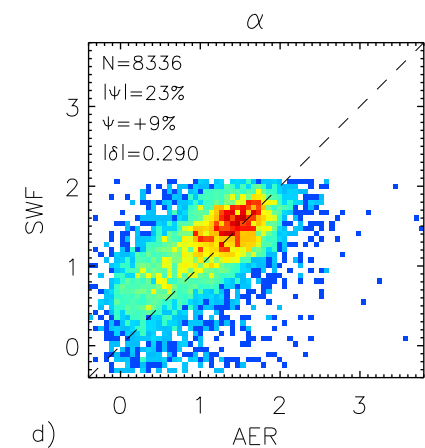
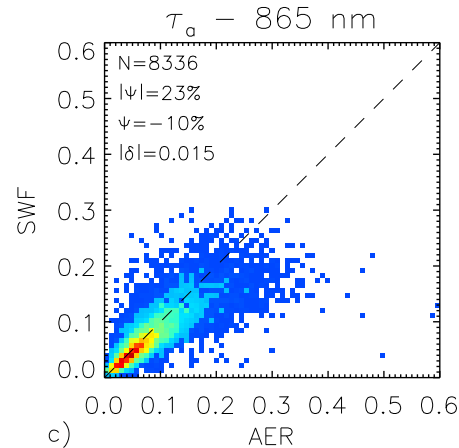
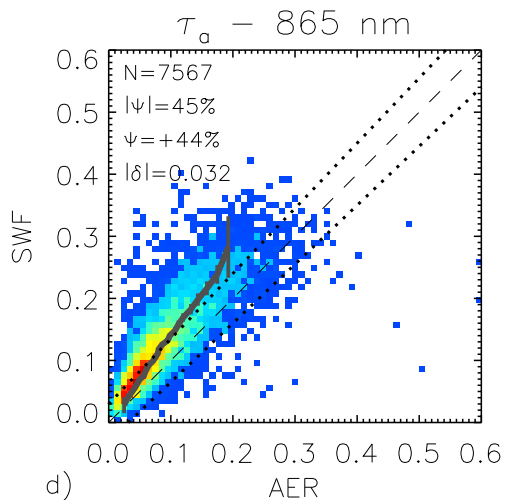
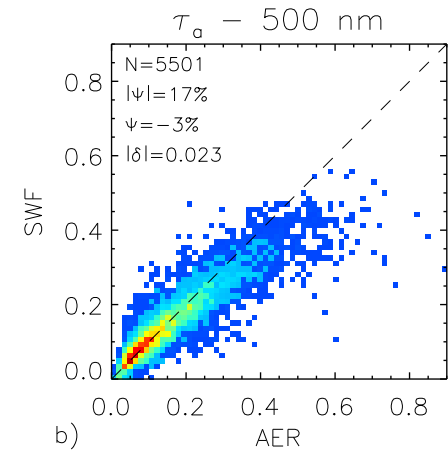
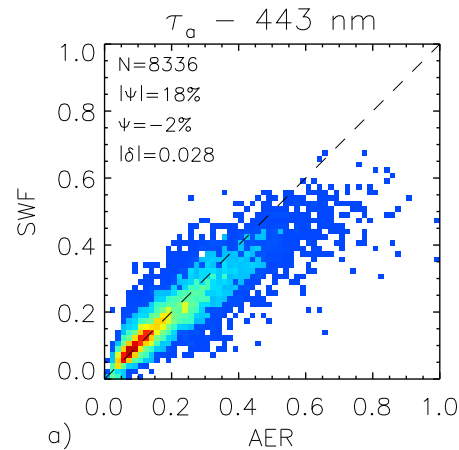
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## Recent updates in the atmospheric correction

Ahmad et al., *AO*, 2010, Bailey et al., *OE*, 2010



after update

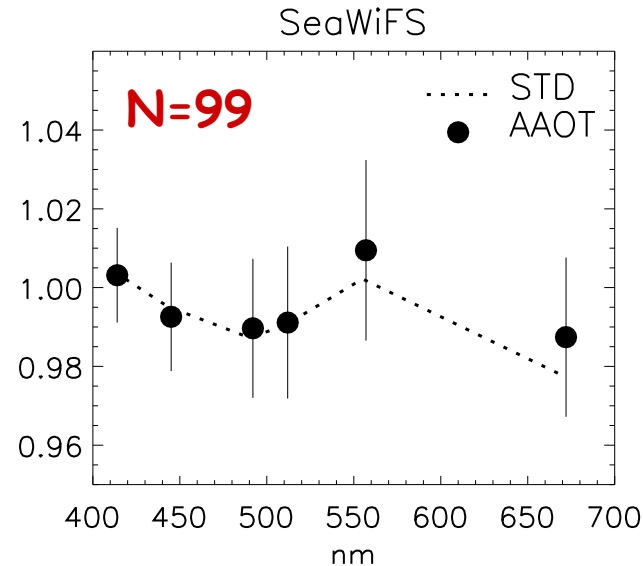
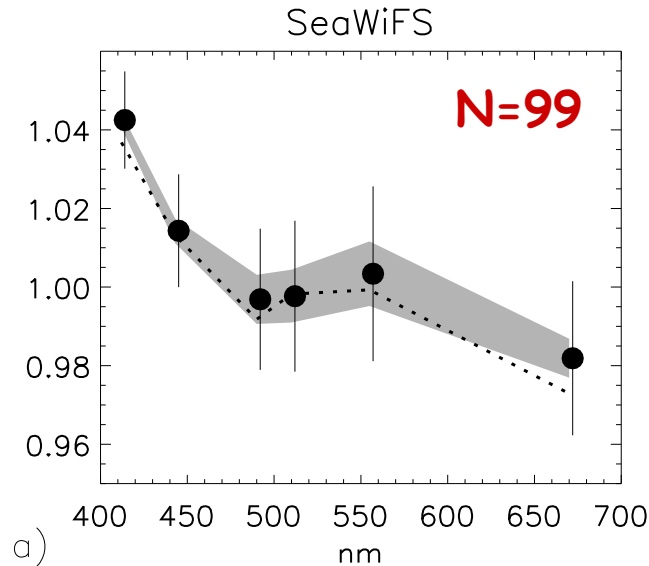


Mélin et al., *RSE*, 2010

# Regional Vicarious Calibration (7)

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## new atmospheric correction



Differences (%) between standard and regional coef.

$\lambda$	412	443	490	510	555	670 nm
	0.548	0.112	0.512	-0.052	0.409	0.919 %
<b>NEW:</b>	-0.096	-0.263	0.239	0.083	0.723	0.990 %

The convergence of g's is a measure of the improvements in the atmospheric correction

# CONCLUSIONS

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Calibration of the system [sensor+algorithms]

One element in the overall calibration strategy

Effectively removes the bias in  $L_w$  (or  $R_{rs}$ )

Need for high-quality radiometric field measurements

Stringent requirements applied for the choice of the VC site(s)

Alternative approaches are good tests for the atmospheric correction