



📅 19 – 21 OCTOBER 2022 📍 FRASCATI, ITALY

2ND WORKSHOP ON INTERNATIONAL COOPERATION IN SPACEBORNE IMAGING SPECTROSCOPY

Exploitation of new hyperspectral sensors in the remote sensing of aquatic ecosystems

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Presentation outline

AIM: Evaluation of the consistency of Remote sensing reflectance (Rrs) derived from PRISMA hyperspectral sensor in inland and coastal waters in order to generate water quality maps.

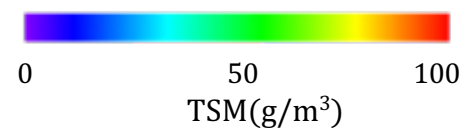
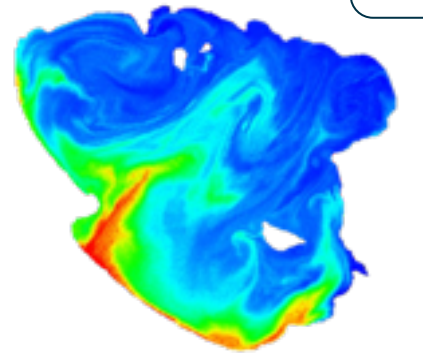
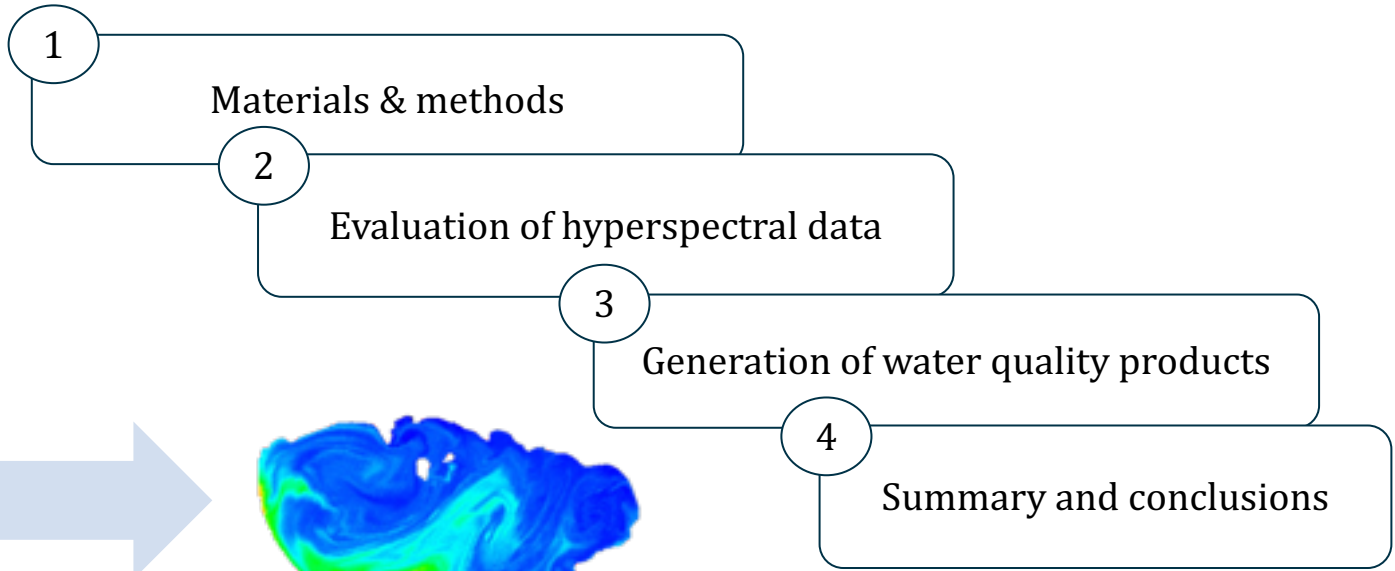
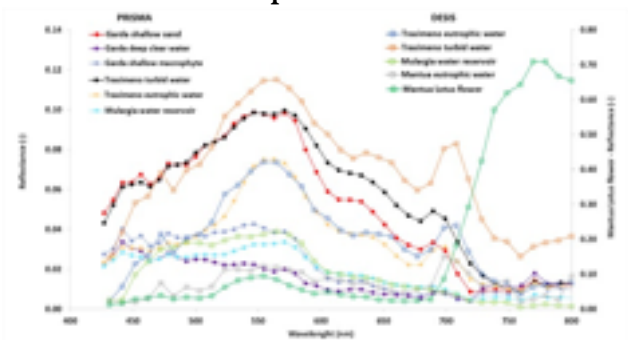


Imagery



Mapping

Spectra



REFERENCE DATA

sentinel-2 sentinel-3

- Autonomous fixed radiometers (CIMEL, WISPStation, PANTHYR)
- Ad-hoc field campaign



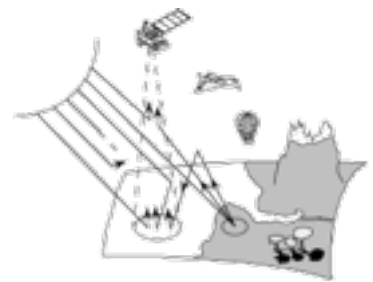


HYPERNETS
 EOMORES
 NASA

Bresciani et al., 2020
Vansteenwegen et al., 2019

L1 DATA ANALYSIS

In situ → **6SV** → TOA L



INPUT day, month, illumination geometry, view geometry, altitude, AOT

Vermote et al., 2006

Materials & methods

L2 DATA ANALYSIS

(ATMOSPHERIC CORRECTION)


- ASI automatic processor
- ATCOR
- ACOLITE
- 6SV

INPUT day, month, illumination geometry, view geometry, altitude, AOT

Nazeer et al., 2014
Vanhellemont, 2019
Vermote et al., 2006


L2 DATA ANALYSIS (SUNGLINT CORRECTION)

De-glint processor (*Sen2coral* plugin)



Hedley et al., 2005
Kay et al., 2008

L2 DATA ANALYSIS (NOISE CALCULATION)



Brando & Dekker, 2003

Materials & methods

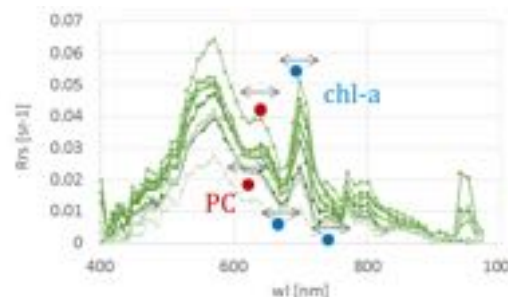
GENERATION OF WATER QUALITY MAPS

BOMBER (Bio-Optical Model Based tool for Estimating water quality and bottom properties from Remote sensing images) is a software package for simultaneous retrieval of the optical properties of water column and bottom from remotely sensed imagery (Giardino et al., 2012) based on Lee et al., (1998, 1999)

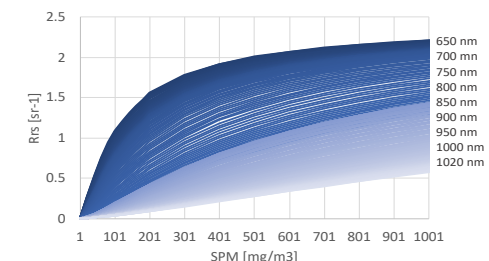


$$AIM = \min_{\text{Chl-a, TSM}} \sqrt{\sum_{\lambda=1}^N [(R_{rs}^l(\lambda) - \Delta) - R_{rs}^s(\lambda)]^2}$$

Reflectance ratio taking advantage of continuous-narrow bands, so based on e.g. wavelength-dependent peaks/dips (phyto) (Bresciani et al., 2013)



Hyperspectral-wavelength-switching algorithm (spm)

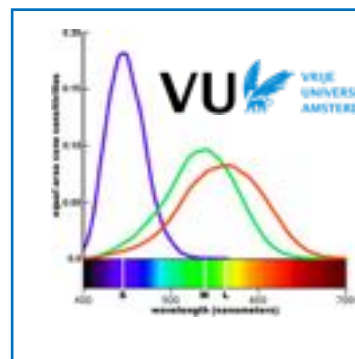


Fwd modelling spectra

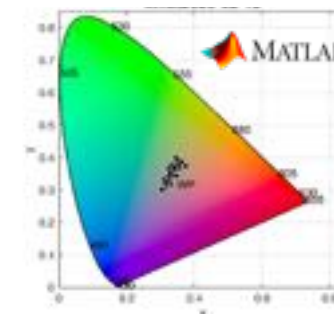
GENERATION OF AQUATIC VEG. MAPS

Macrophytes characterization

Classification and thresholding of selected hyperspectral features in VNIR to SWIR ranges, sensitive to association groups of macrophytes (IDL scripts, free). Semi-empirical modelling of macrophyte functional traits (LAI, Chl content) calibrated with in-situ data



Convolution with eye response filters (no coeff. needed), kindly checked by Hans van der Woerd



Water colour categories using the Forel-Ule scale



Evaluation of hyperspectral data

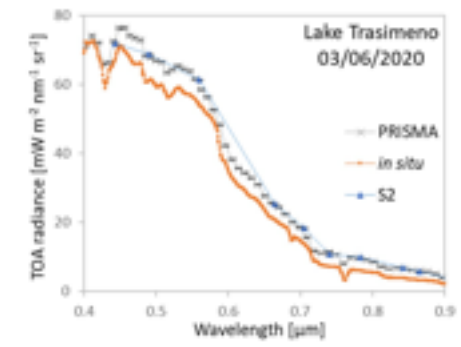
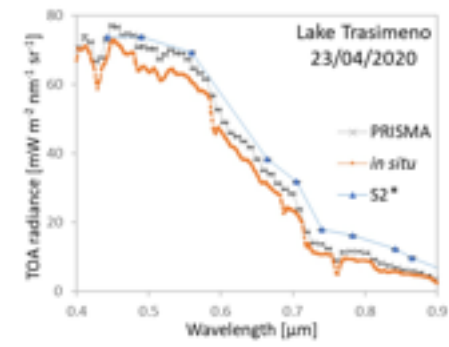
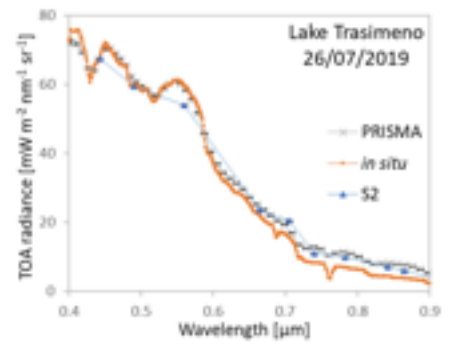
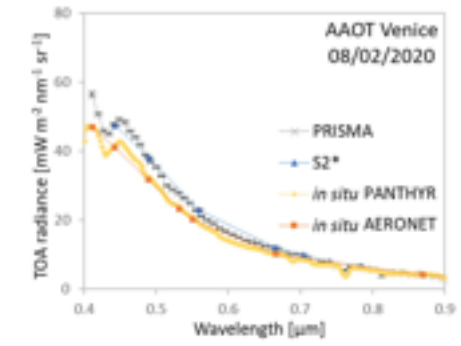
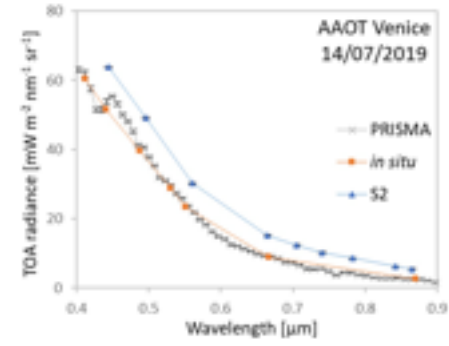
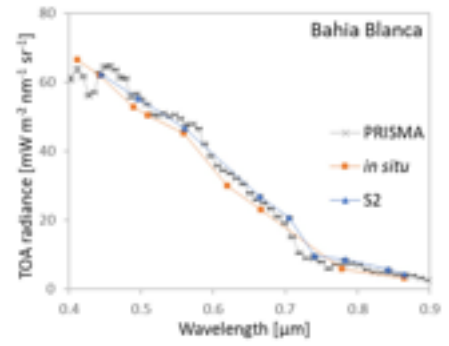
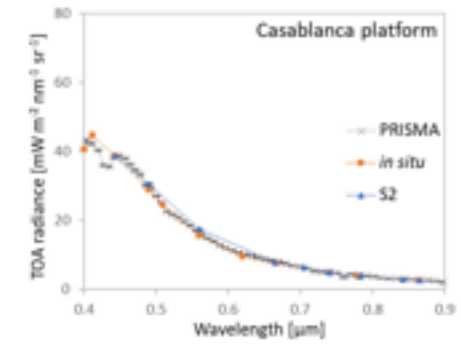
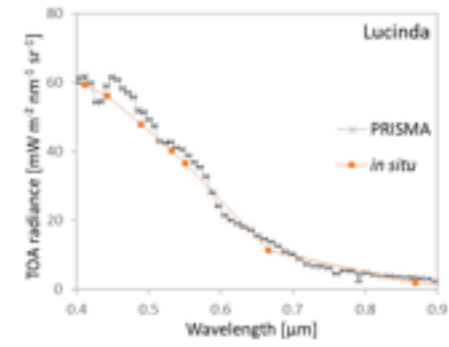
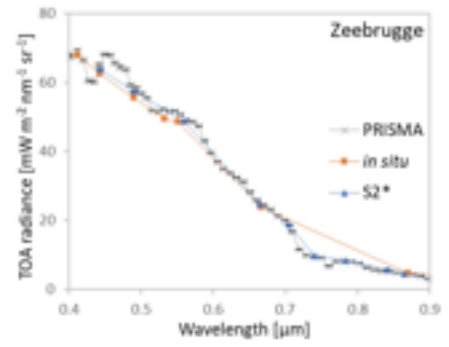
PRISMA L1 data



```

52: for ( j in 1 : 11 )
53:   output_name = file_path ( satr, satbr,
54:     point ( colnames(ground_ref)[j+1], ". ", j, ".net" )
55: )
56:   output_content = c (
57:     "User defined sensor",
58:     "Geometry: 0km 200km, Sun altitude: sensor",
59:     "Aperture for water vapor and ozone",
60:     "Water vapor and ozone",
61:     "Atmospheric model: Orliteatm2000",
62:     "Ray-trace model: Clear11000 2scatstr",
63:     "A",
64:     "AOP value",
65:     "AOP target level (km), negative value",
66:     "AOP sensor level",
67:     "AOP constant filter function",
68:     "AOP band start/end",
69:     "AOP homogeneous surface",
70:     "AOP no directional effects",
71:     "AOP constant value for reflectance",
72:     "AOP reflectance value 0 bar",
73:     "AOP no atm. corrections selected",
74:     "ground_ref[ j, :sp+1 ]",
75:   )
76:   writeLines( output_content, output_name )

```



PRISMA vs *In-situ* data
 SA = 0.8 - 3.39
 RMSE = 0.98

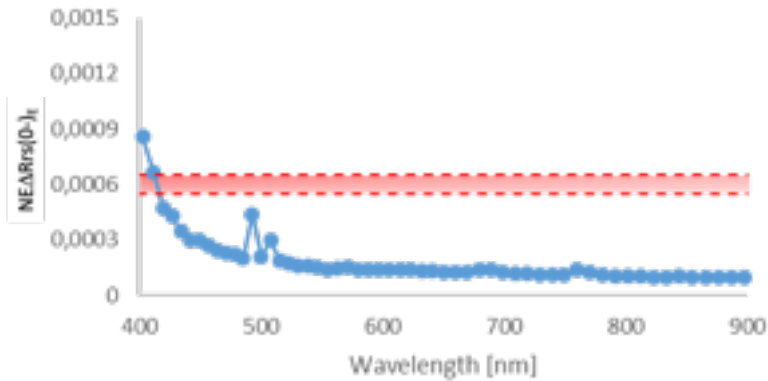
Giardino et al., 2020



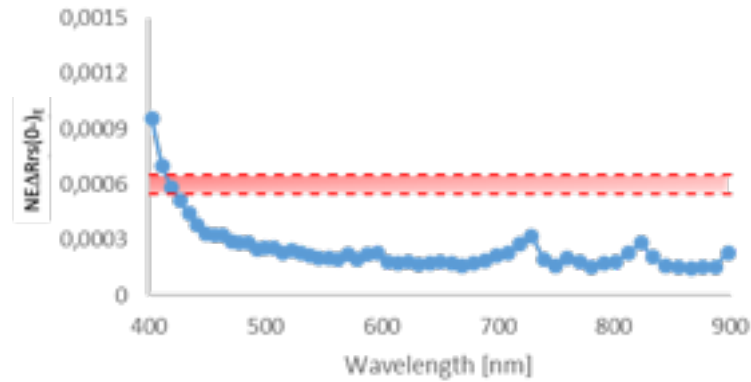
Evaluation of hyperspectral data

Examples noise-equivalent reflectance difference calculation (in accordance with Brando & Dekker, 2003)

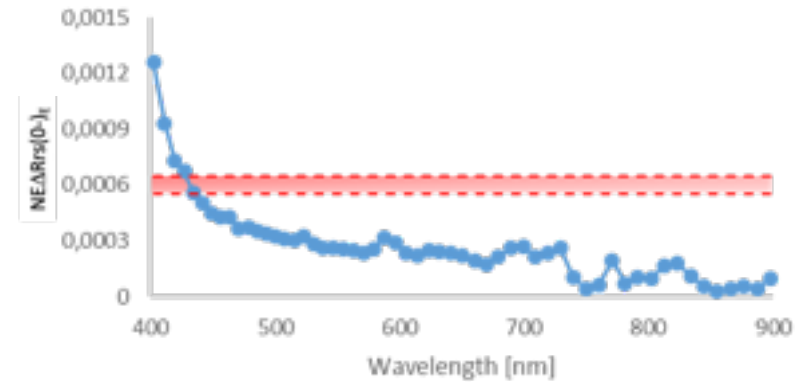
Ariake Tower, 2021/10/03



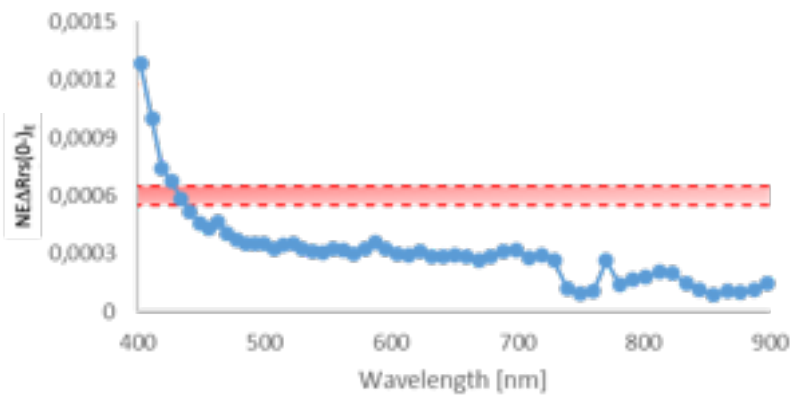
Lake Erie, 2021/08/23



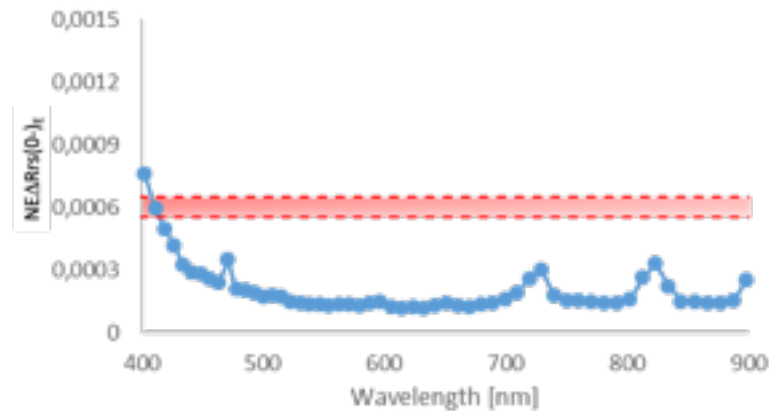
Kemigawa, 2022/02/17



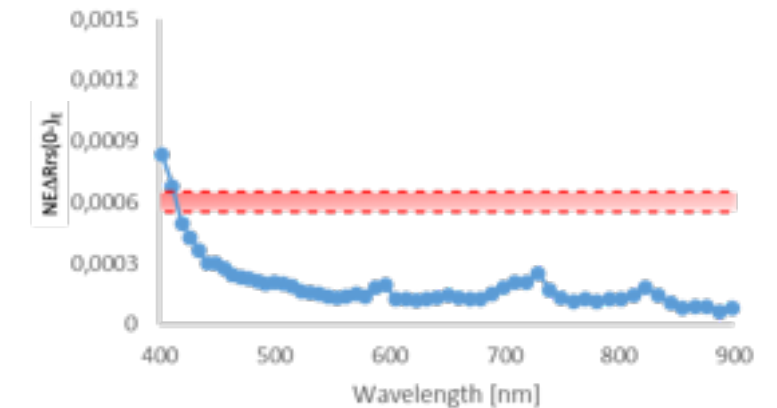
LISCO, 2022/02/28



Lake Okeechobee, 2022/04/10



AAOT Venice, 2021/09/10

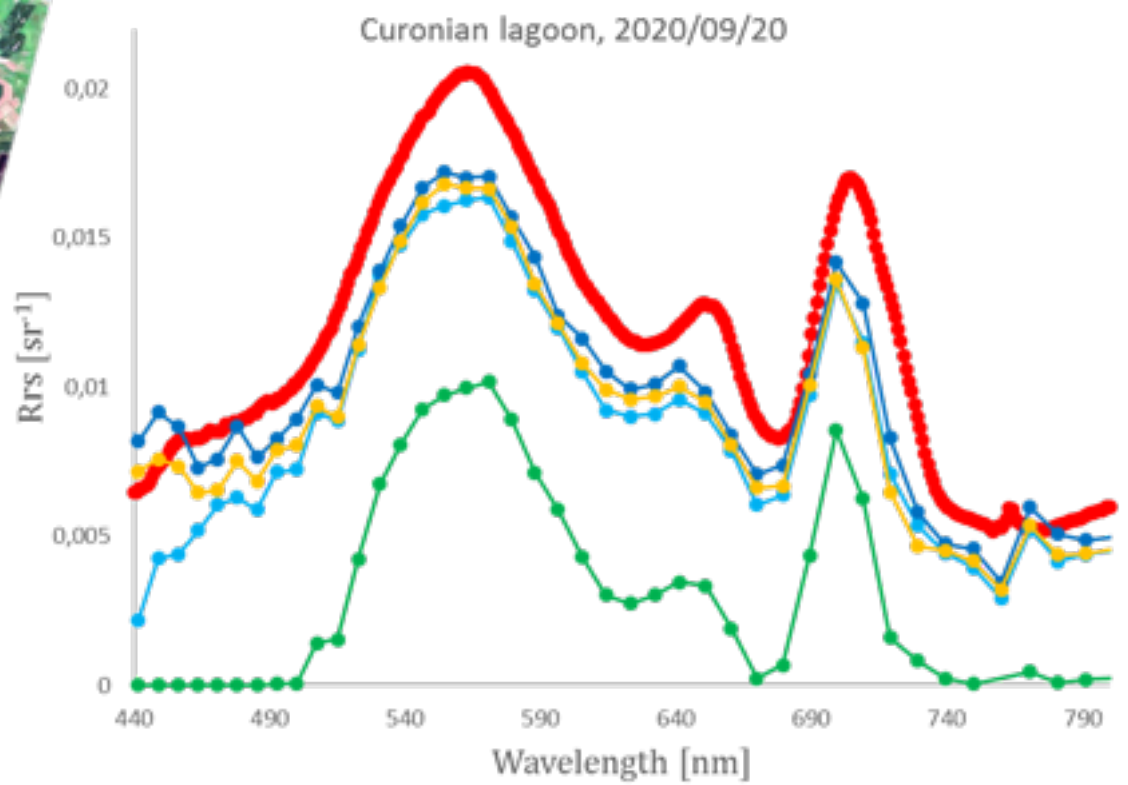


Removal of the noisiest bands (402-411-419-427 nm), for values in the range 0.00055 and 0.00065 [sr⁻¹] and above



Evaluation of hyperspectral data

PRISMA L2d processor versions provided by ASI automatic processor



Processor version id	Available since
v 2.2.0	April 2020
v 02.03	January 2021
v 02.04	July 2021
v 02.05	October 2021

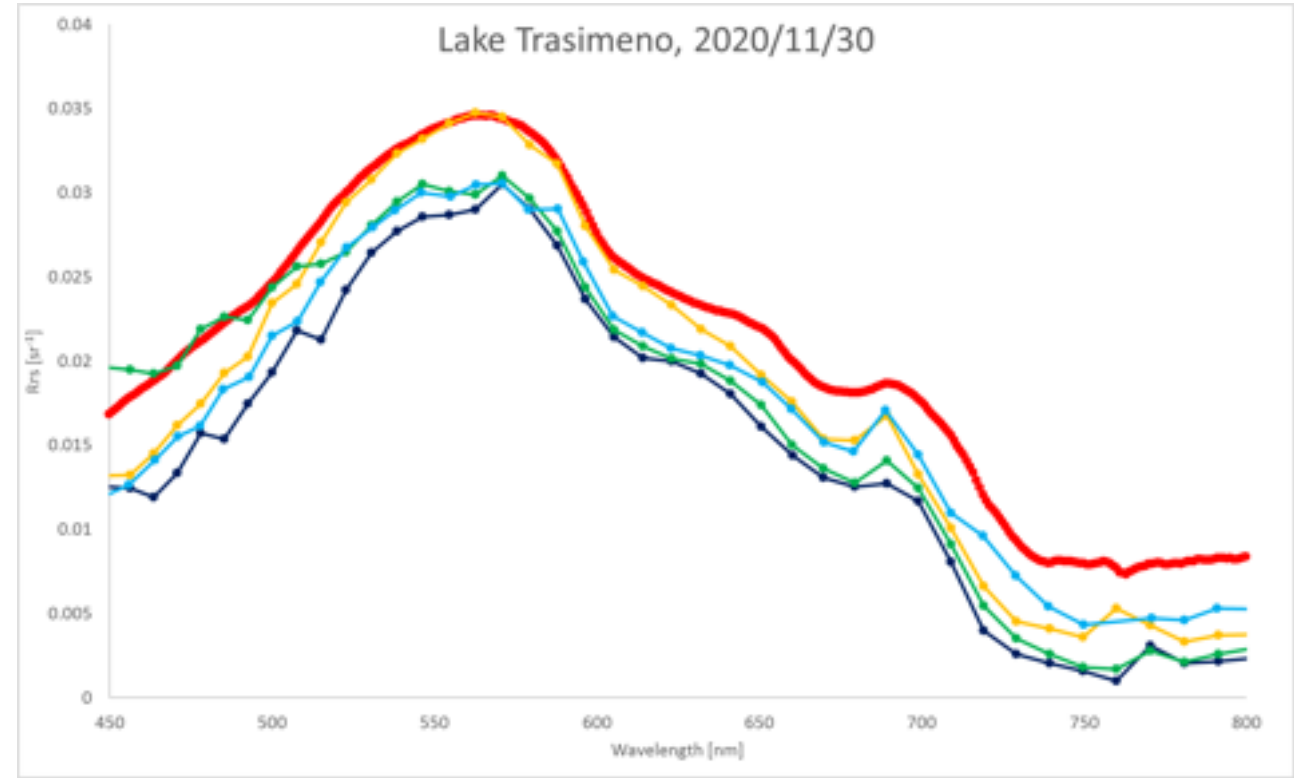
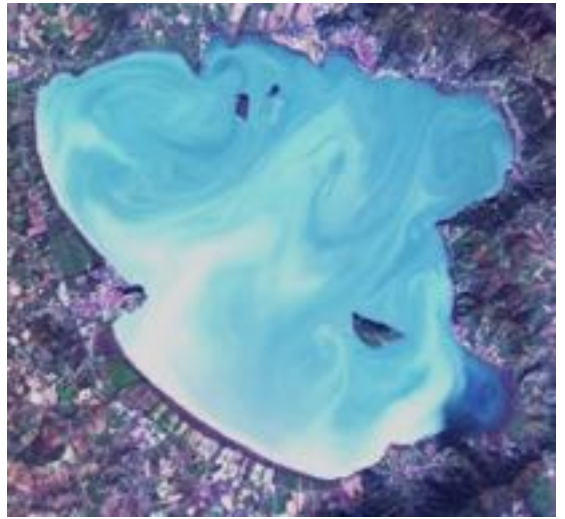
- PRISMA L2d v 2.2.0 (oldest)
- PRISMA L2d v 02.03
- PRISMA L2d v 02.04
- PRISMA L2d v 02.05 (newest)
- IN-SITU





Evaluation of hyperspectral data

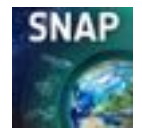
Atmospheric correction



- PRISMA L1 + ATCOR
- PRISMA L1 + ACOLITE
- PRISMA L1 + 6Sv
- PRISMA L2d v 02.05
- *IN-SITU*

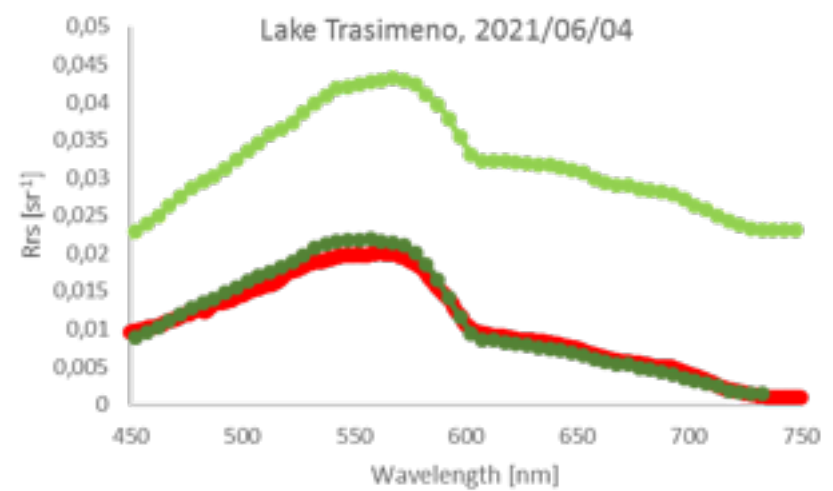
	In-situ VS PRISMA L2d v02.05	In-situ VS PRISMA L1 + ATCOR	In-situ VS PRISMA L1 + ACOLITE	In-situ VS PRISMA L1 + 6Sv
R ²	0.99	0.92	0.98	0.99
RMSE	0.0057	0.0043	0.0045	0.0037

De-glint processor
(*Sen2coral* plugin)



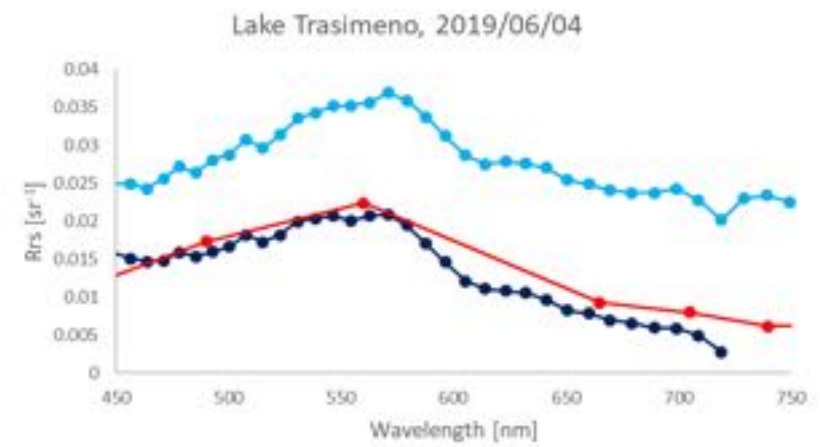
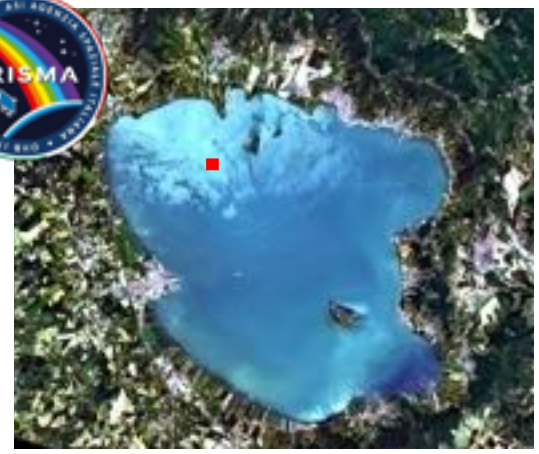
Evaluation of hyperspectral data

Sun-glint correction



- AVIRIS
- AVIRIS Deglint
- In-situ

	IN-SITU VS AVIRIS	IN-SITU VS AVIRIS Deglint
R ²	0.8	0.99
RMSE	0.022	0.001



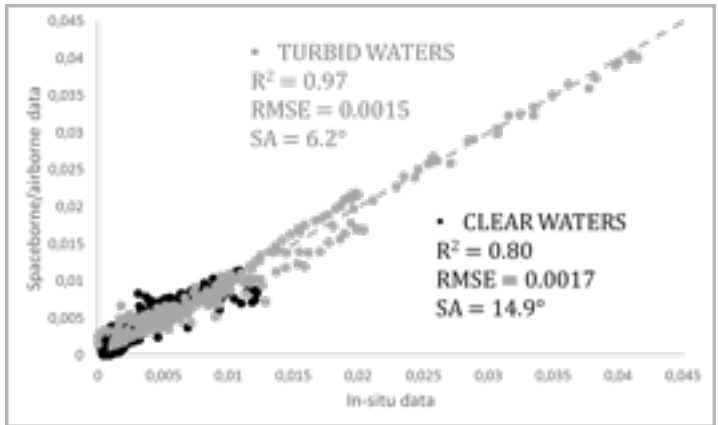
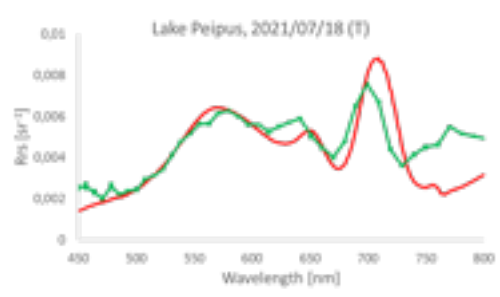
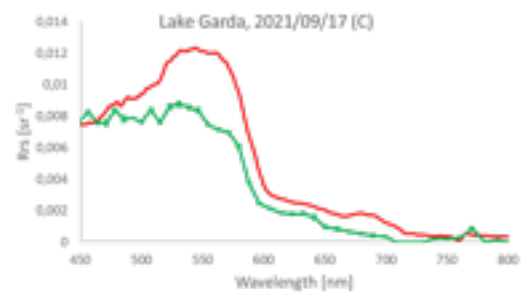
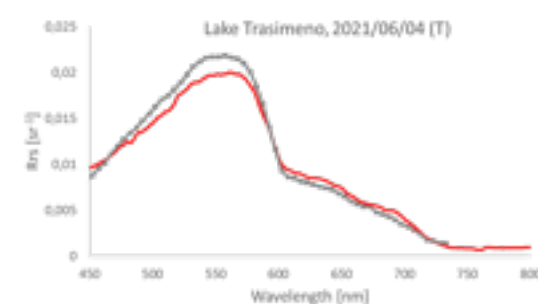
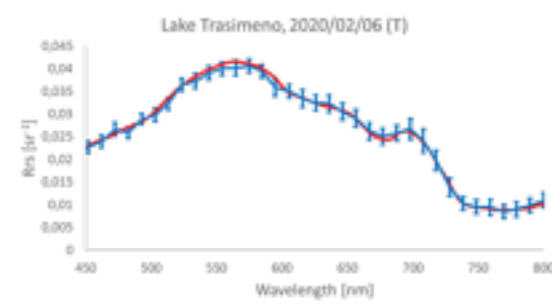
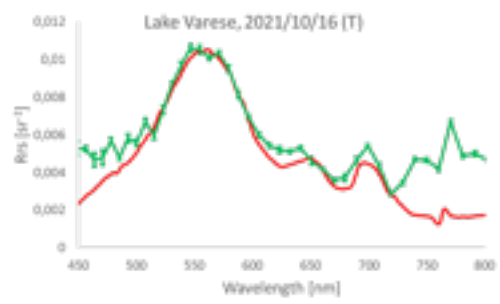
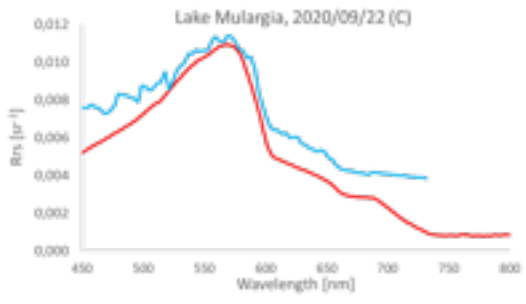
- PRISMA L2d v 02.05
- PRISMA L2d v 02.05 Deglint
- SENTINEL-2 (S2)

	S2 VS PRISMA	S2 VS PRISMA Deglint
R ²	0.86	0.88
RMSE	0.0179	0.0046



Evaluation of hyperspectral data

Comparison between hyperspectral spaceborne and airborne data with *in-situ* data Turbid water (T) vs Clear water (C)



- In- situ
- PRISMA L2d v02.05
- DESIS L2A
- AVIRIS Deglint
- HYSPEX Deglint



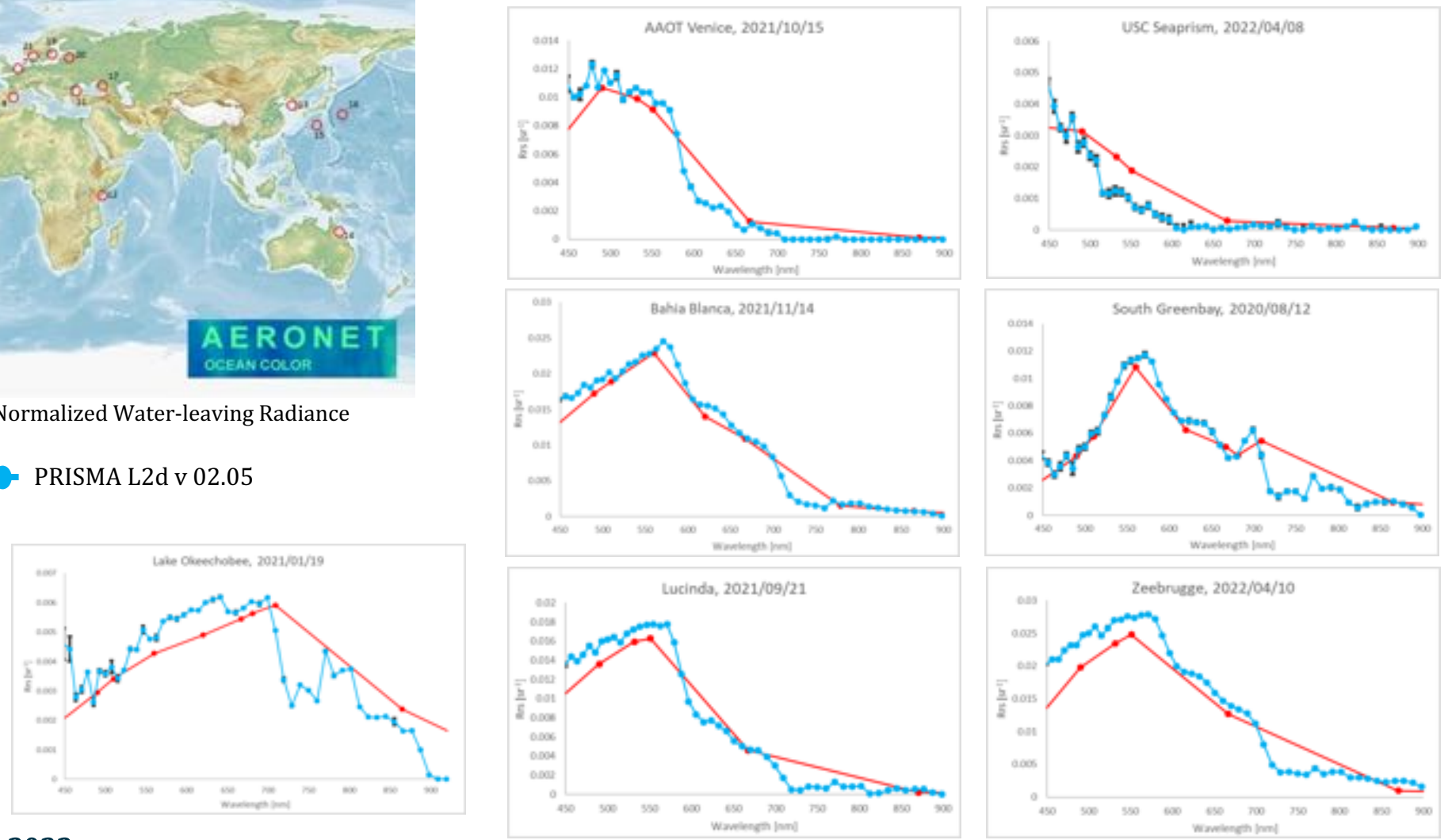
Evaluation of hyperspectral data: ongoing activities

109 PRISMA images (L2d v 02.05) acquired with Cloud Coverage $\leq 2\%$ were selected over the ~ 300 images available (synchronous with AERONET-OC measure). Period: July 2019 – July 2022



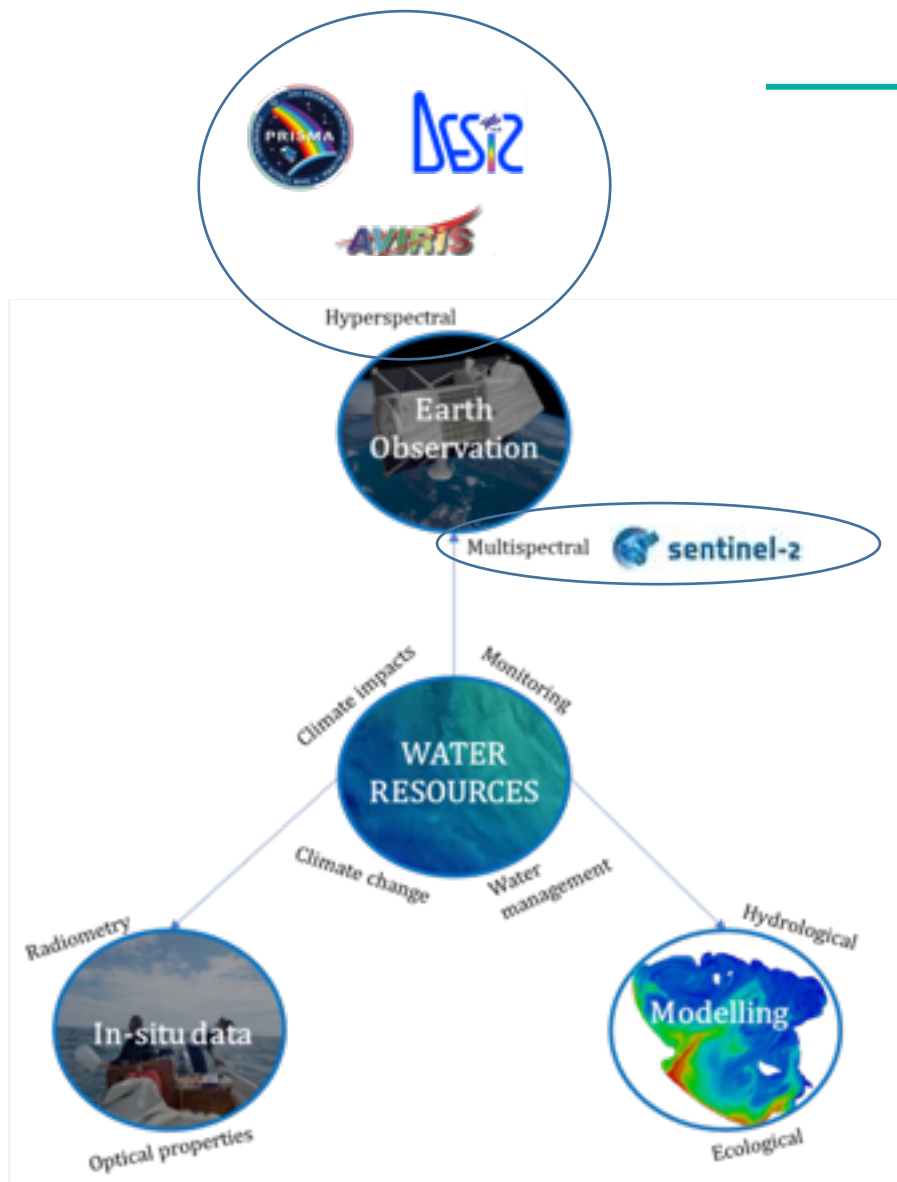
In-situ data: Version 3 Level 1.5 Normalized Water-leaving Radiance

AERONET PRISMA L2d v 02.05



Generation of water quality products

Applications in different study areas

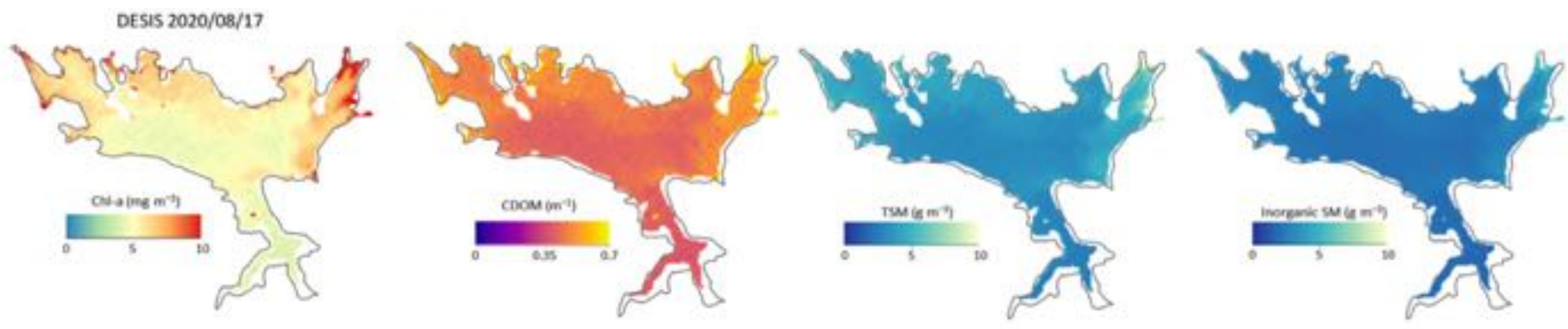


- Curonian lagoon (LT)
- Venice lagoon (IT)
- Lake Trasimeno (IT)
- Lakes of Mantua (IT)
- Lake Oggiono (IT)
- Lake Garda (IT)
- Lake Mulargia (IT)
- Lake Varese (IT)
- Lake Okeechobee (US)
- Lake Hume (AU)
- WTP Melbourne (AU)



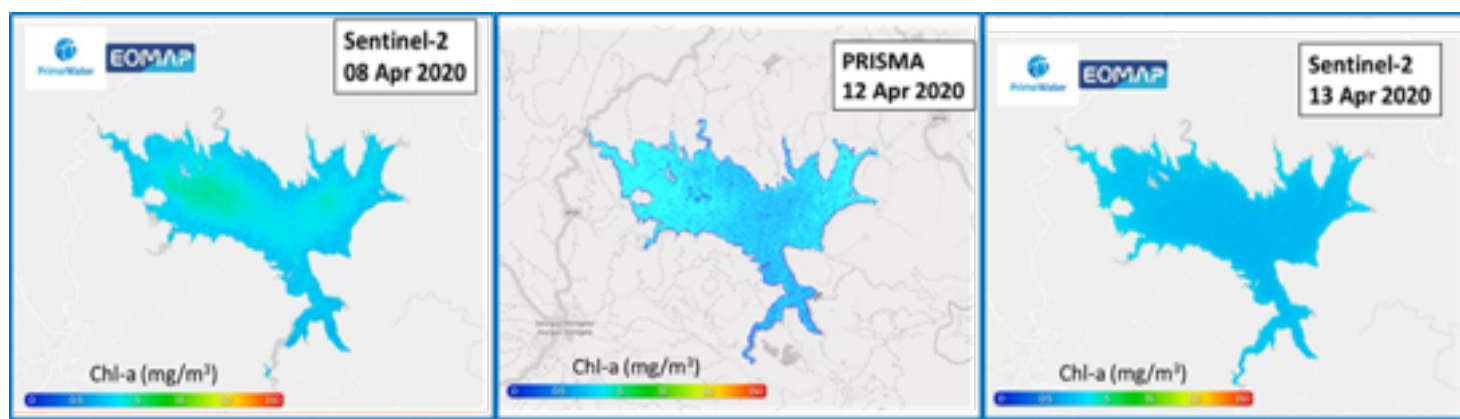
Generation of water quality products

Water quality products



Simultaneous retrieval from BOMBER of Chl-a, CDOM, TSM and Inorganic SM.

Bresciani et al., 2022

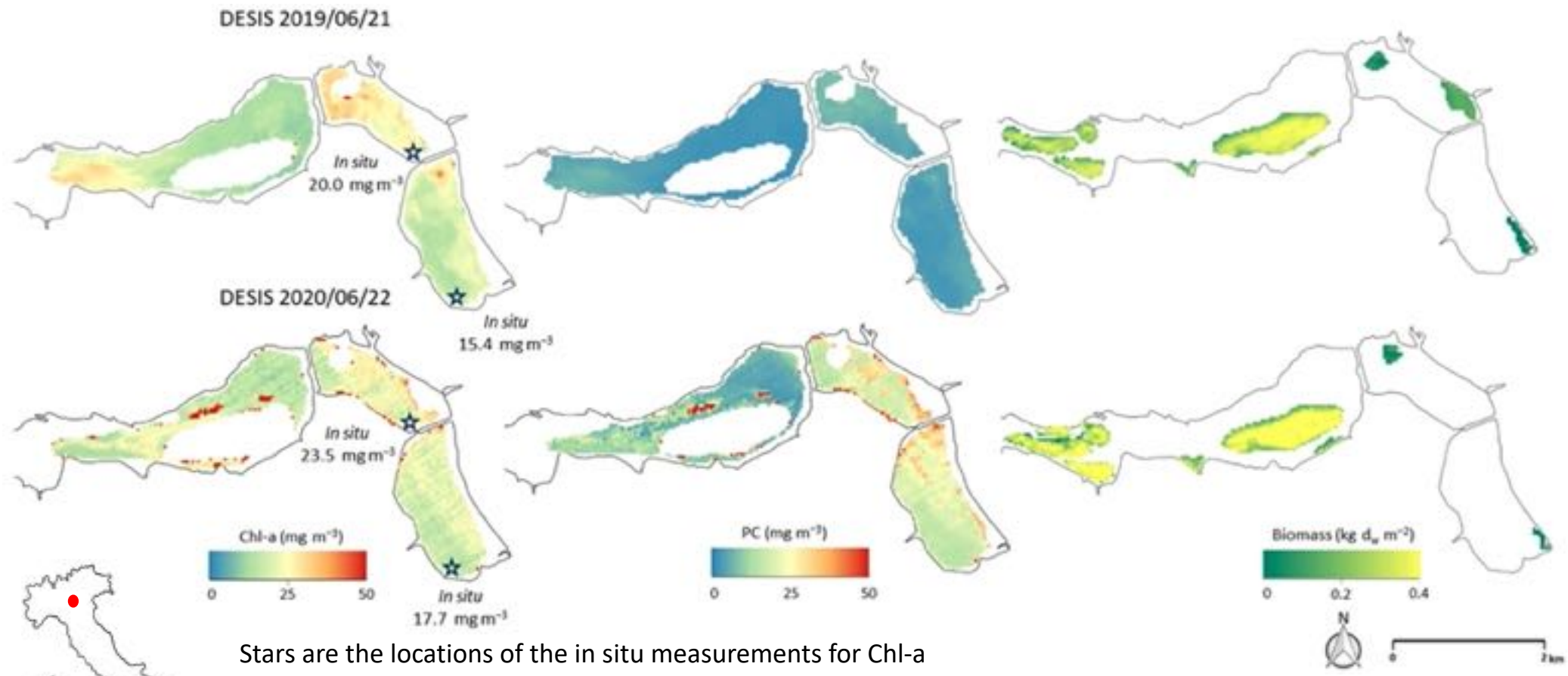


Temporal dynamic (8-13 April 2020) of Chl-a mapping from S2-MSI and PRISMA



Generation of water quality products

Aquatic vegetation



Maps of concentration of phytoplankton pigments (Chl-a and PC) and of floating-leaved and emergent macrophyte biomass



Stars are the locations of the in situ measurements for Chl-a

Bresciani et al., 2022



Generation of water quality products

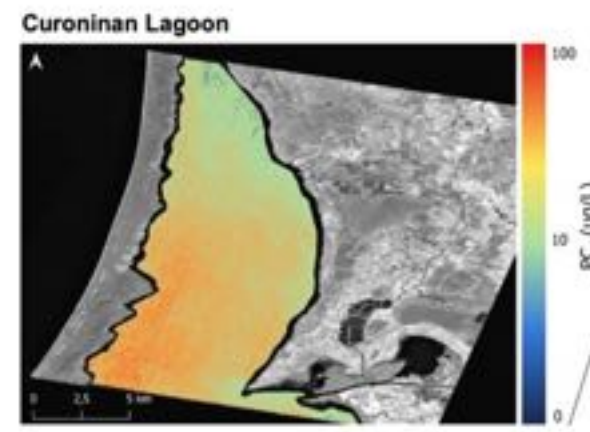
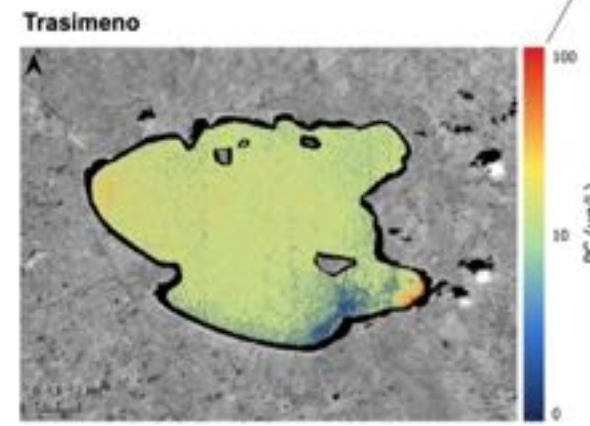
Water quality maps in terms of Phycocyanin

Mixture Density Networks (MDN) for mapping PC from HICO or PRISMA:

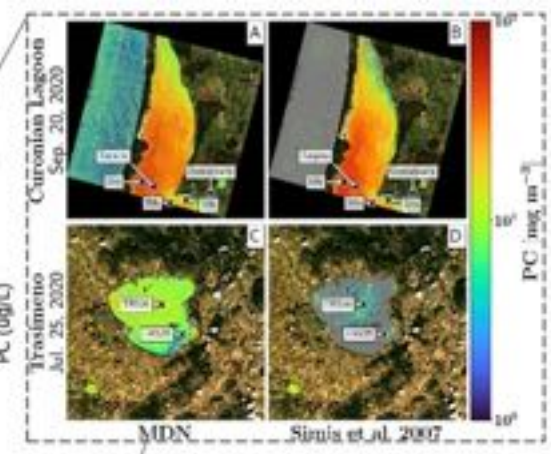
<https://github.com/STREAM-RS/STREAM-RS>



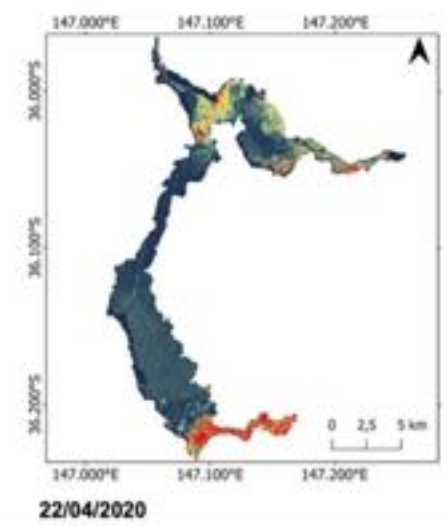
MDN – application examples



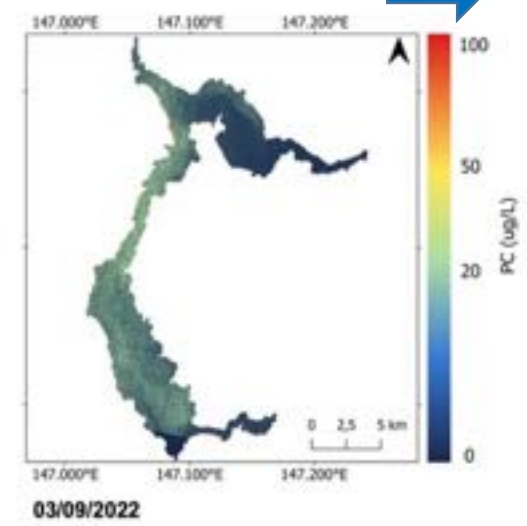
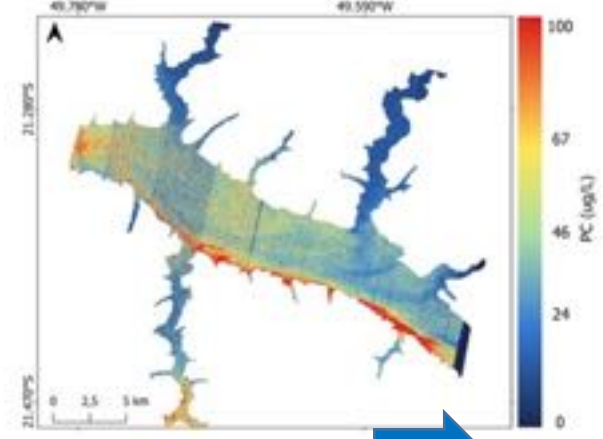
O'Shea et al., 2021



Hume Lake



Promissão – 04/09/2021

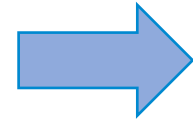




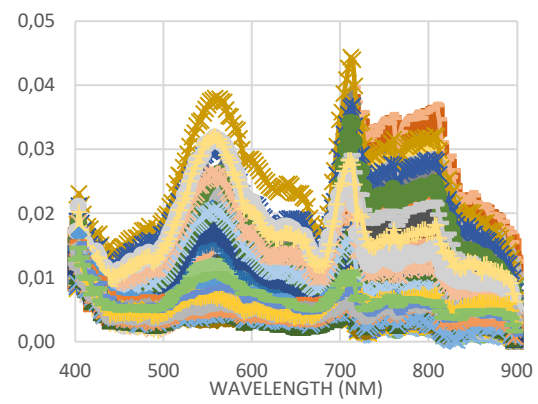
Generation of water quality products



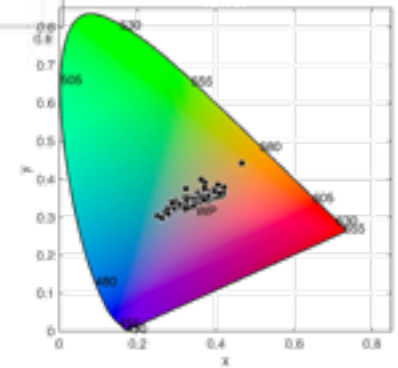
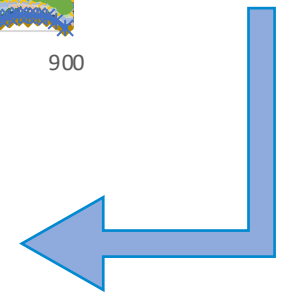
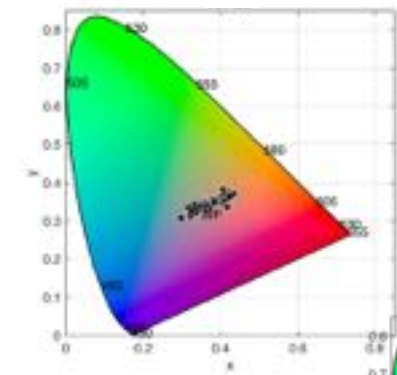
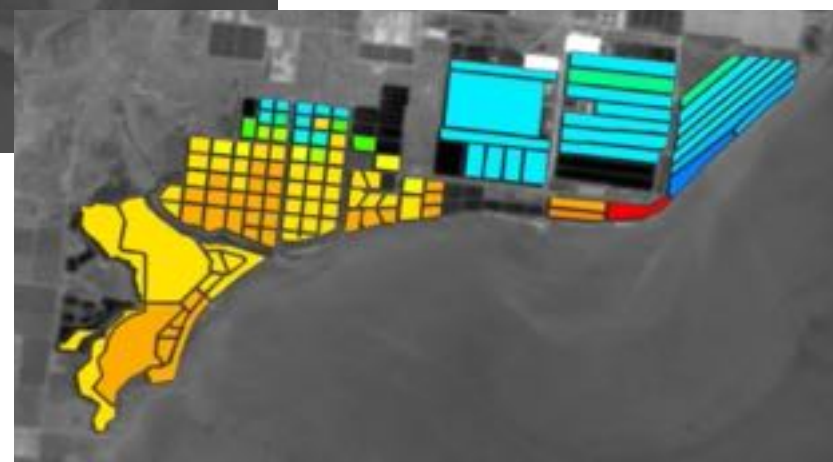
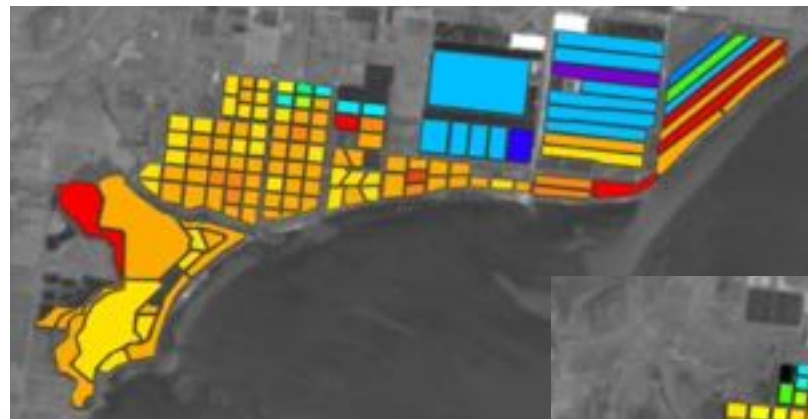
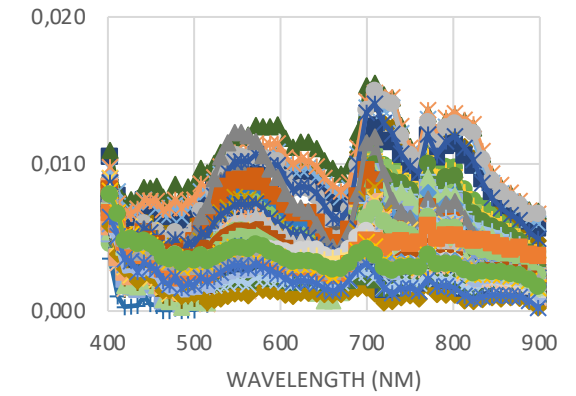
126 ROIs



114 ROIs



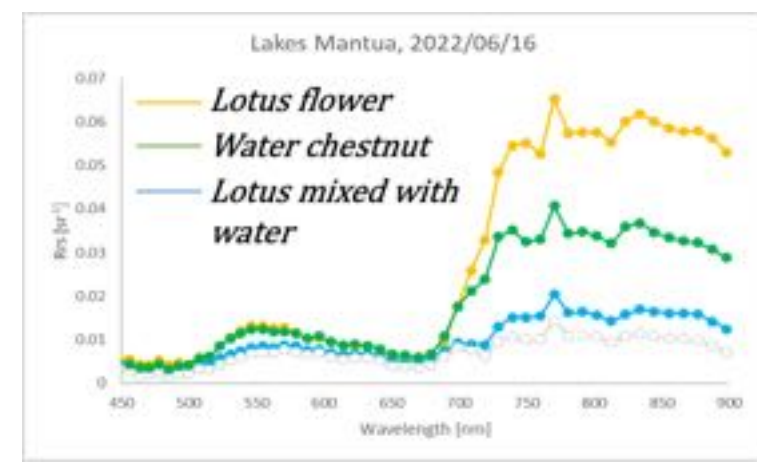
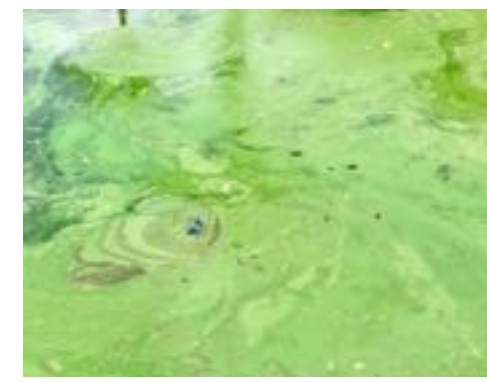
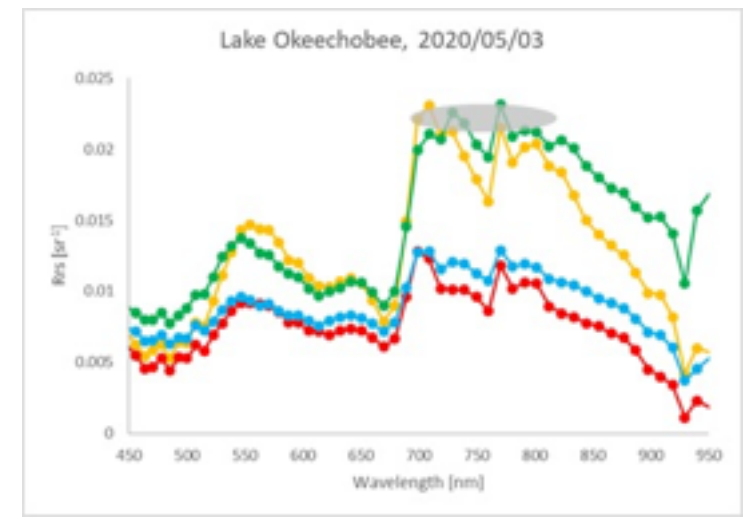
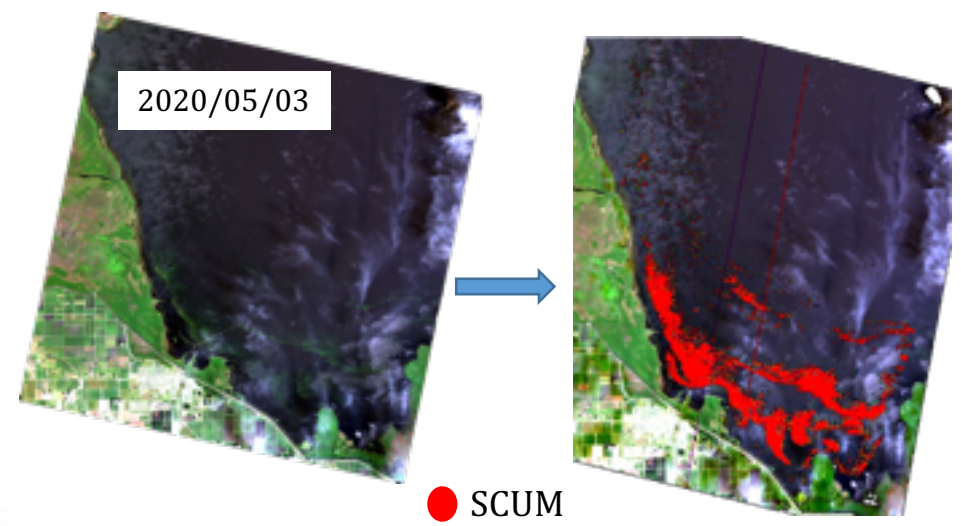
Chromaticity analysis





Generation of water quality products

Water quality map: Floating matter

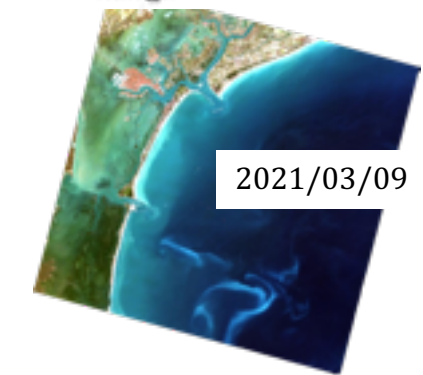
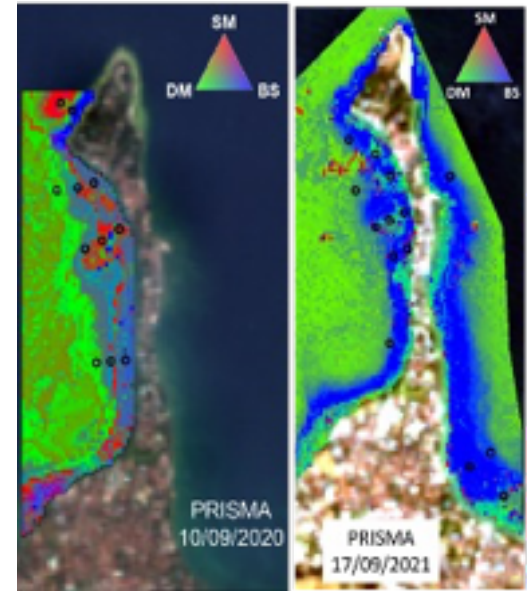
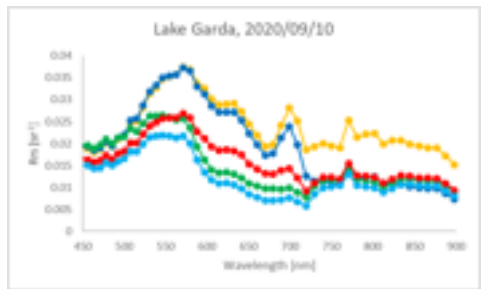




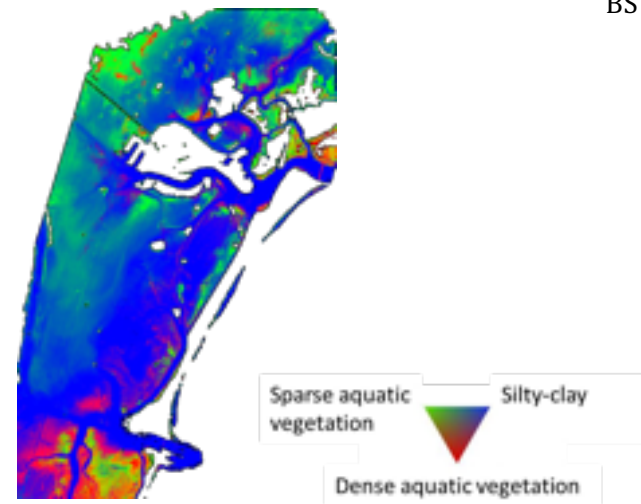
Generation of water quality products



2020/09/10



2021/03/09



Water quality map: Bottom substrates

		In situ			User's Accuracy
		BS	SM	DM	
Classified	BS	5	0	0	100%
	SM	2	5	1	62.5%
	DM	0	1	8	88.9%
Producer's Accuracy		71.4%	83.3%	88.9%	81.8%

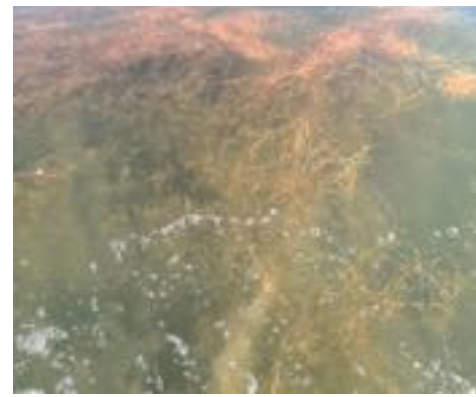
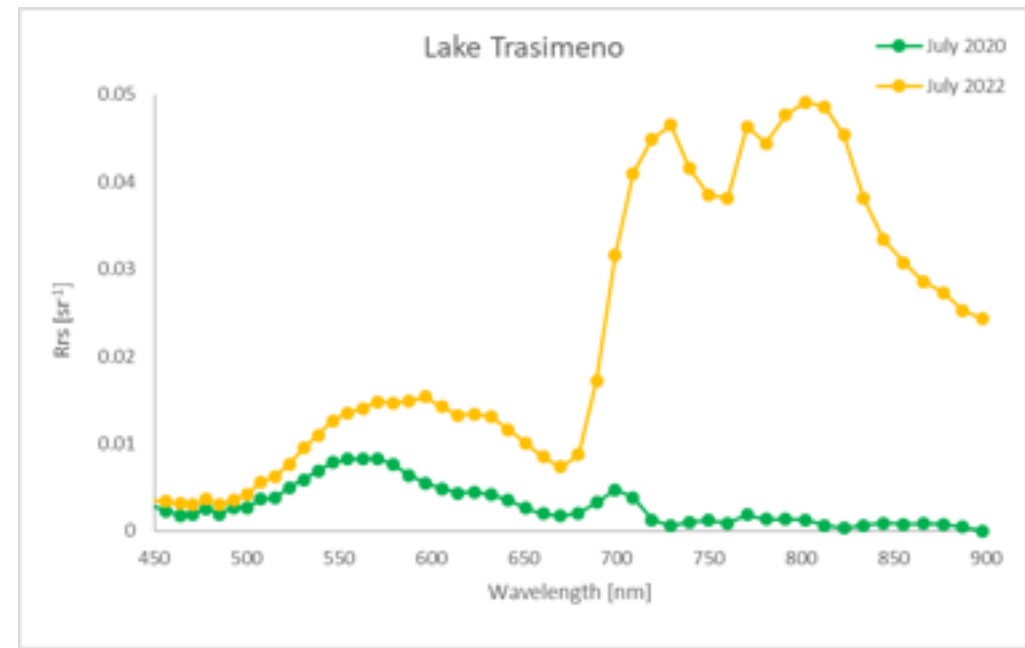
BS = Bare Sediment, SM = Sparse Macrophyte, and DM= Dense Macrophyte

		In situ			User's Accuracy
		BS	SM	DM	
Classified	BS	7	1	0	88.0%
	SM	1	7	1	80.0%
	DM	0	2	6	75.0%
Producer's Accuracy		87.5%	70.0%	85.7%	80.0%



Generation of water quality products

Submerged aquatic vegetation

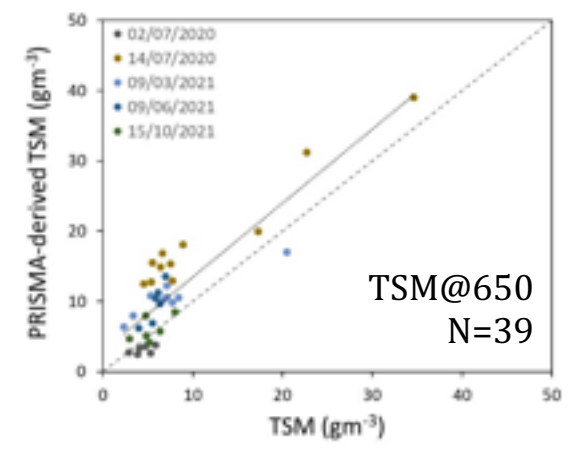
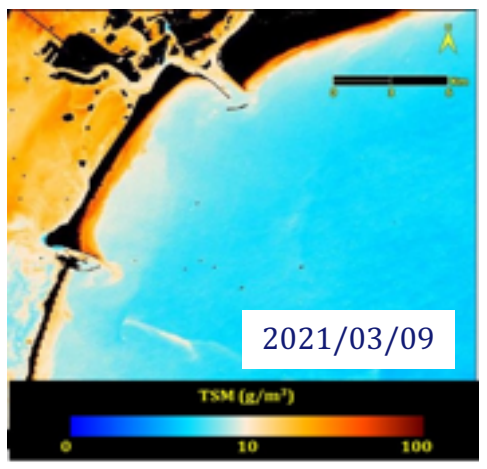


In 2022, hydrometric levels were recorded approximately 145 cm lower than the reference

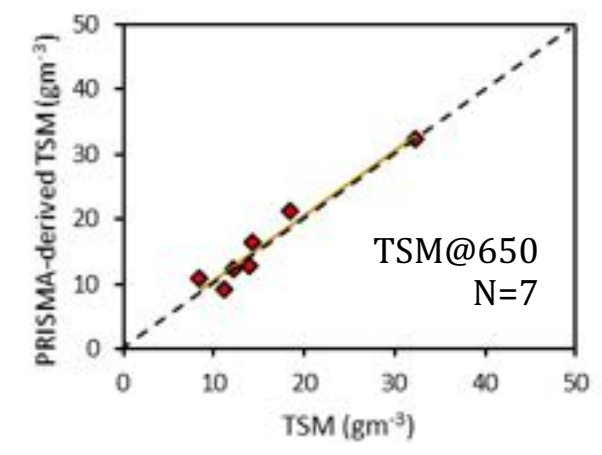
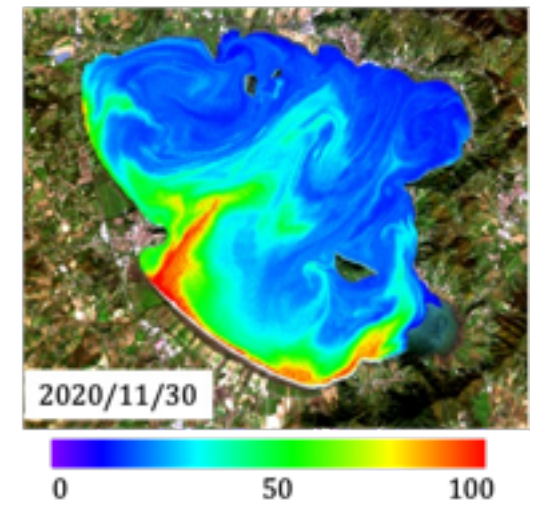
Generation of water quality products

Validations of the water quality products

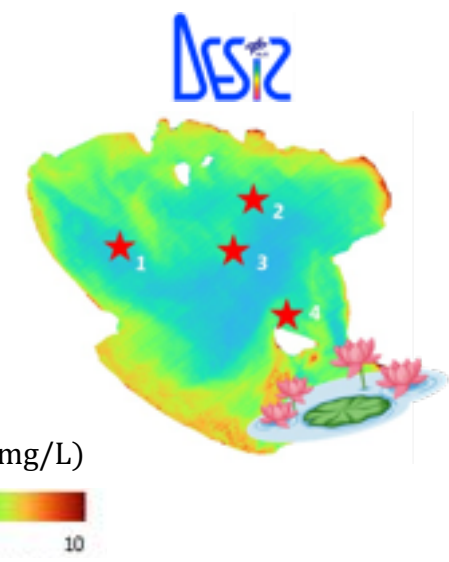
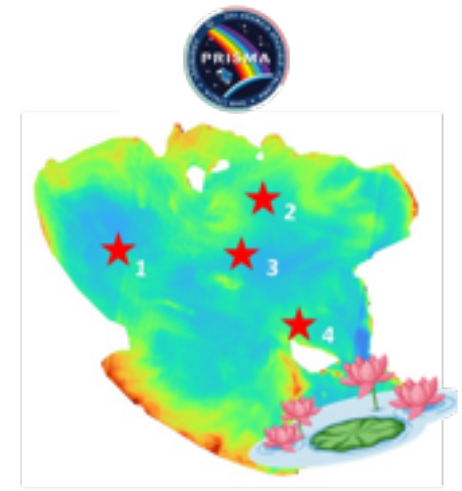
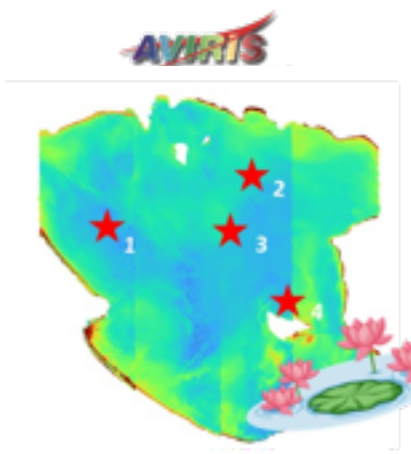
Venice lagoon



Lake Trasimeno



Lake Trasimeno, 2021/06/04

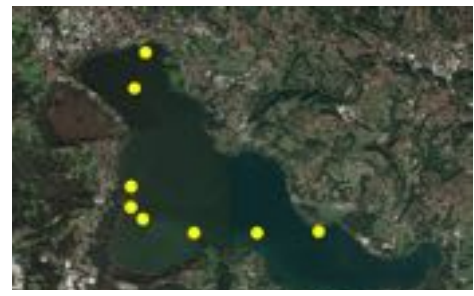


Sensors data VS <i>in-situ</i> data TSM (mg/L)			
Statistic	PRISMA	DESIS	AVIRIS DEGLINT
MAE	0.5	0.5	0.5
RMSE	0.7	0.7	0.6

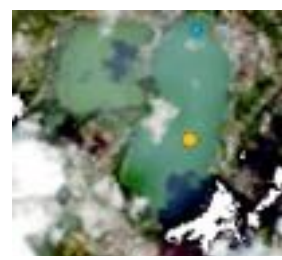


Generation of water quality products

Validation of the water quality products



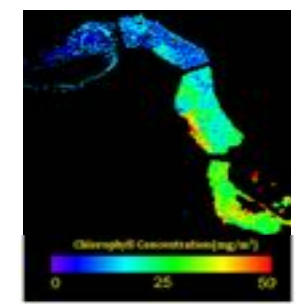
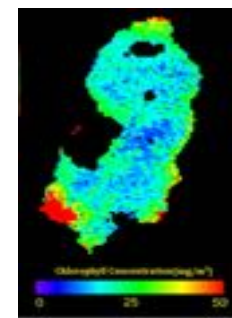
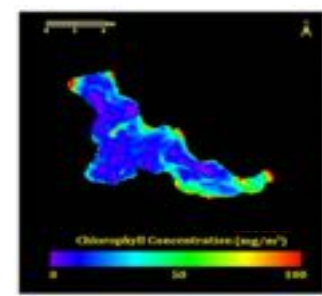
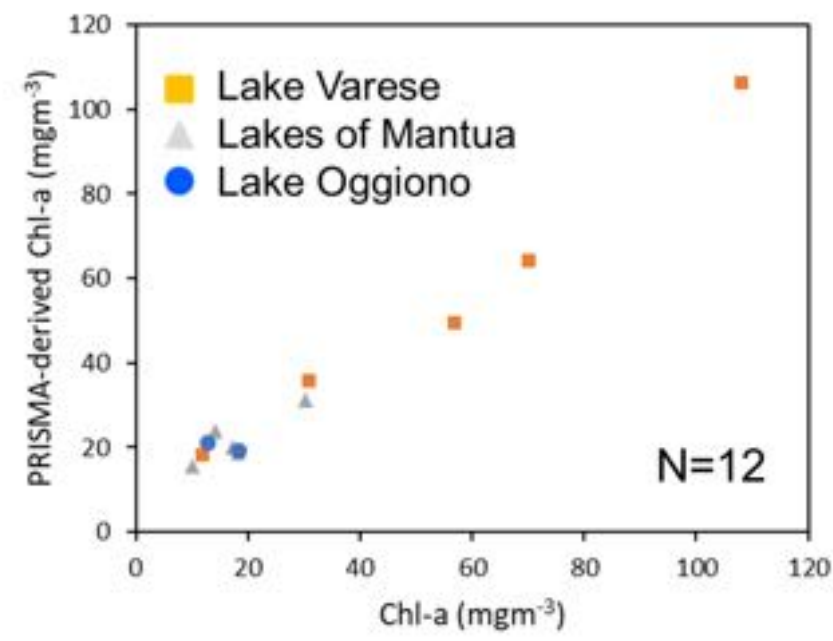
Lake Varese - 2021/10/16



Lake Oggiono - 2021/08/31



Lake Mantua - 2021/10/27



	R ²	RMSD	MAD	Bias	Intercept	Slope
Chl-a	0.93	5.48	4.61	1.96	-6.20	1.12

Summary & conclusions

- Water quality products were evaluated in inland and coastal waters characterised by different optical properties. The results highlight the hyperspectral contribution in the retrieval of adequate water quality products.
- The results are very promising for the synergic use of spaceborne imaging spectroscopy with the existing operational satellites (e.g. Sentinel-2, Sentinel-3).
- Under specific environmental conditions (i.e. oligotrophic waters, glint), the retrieval of water reflectance seems challenging and ad-hoc processing might be necessary to include the specific requirements of atmospheric correction of water targets (e.g. ACIX-III Aqua).
- Further validation activities are needed to extend performance analysis to other water bodies, characterised by a wider range of water optical properties (e.g. need of expanding hyperspectral validation sites).



HySpex



PrimeWater



Agenzia Spaziale Italiana

PRISCAV



AN ASI/TELESPIAZIO COMPANY



Consiglio Nazionale delle Ricerche

HYPER-prototypes



CNR ISMAR

CHIME: Mission Requirement Consolidation Study



ISPRA Istituto Superiore per la Protezione e la Ricerca Ambientale

Principal Investigators



Water - ForCE



Thank you for your attention 😊