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# Validation of Sentinel-2 MSI Atmospheric Correction Products Over Perialpine Lakes Using Automated Radiometers and Field Campaign Data

Mortimer Werther<sup>1</sup>, Abolfazl Irani Rahaghi<sup>1,2</sup>, Mariano Bresciani<sup>3</sup>, Marina Amadori<sup>3,4</sup>, Claudia Giardino<sup>3</sup>, Vittorio Brando<sup>5</sup>, Daniel Odermatt<sup>1,2</sup>

<sup>1</sup>Eawag, Swiss Federal Institute of Aquatic Science and Technology, Dübendorf, Switzerland

<sup>2</sup>University of Zürich, Zürich, Switzerland

<sup>3</sup>IREA-CNR, Milan, Italy

<sup>4</sup>University of Trento, Trento, Italy

<sup>5</sup>ISMAR-CNR, Rome, Italy

# Modelling complex biogeochemical patterns

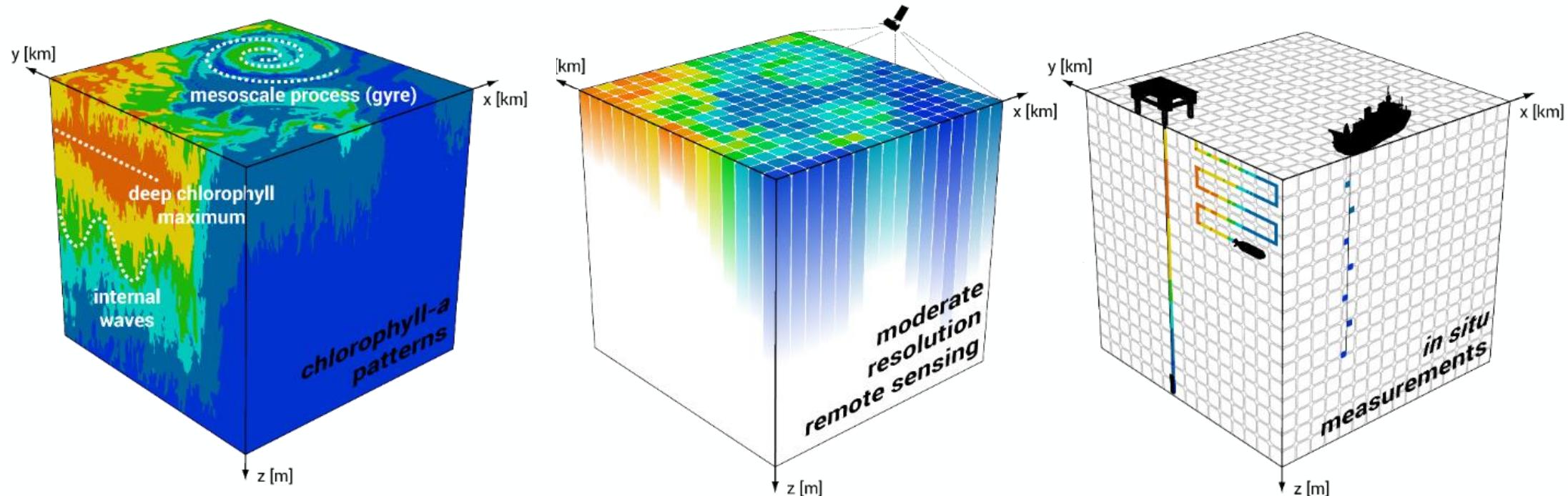


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aquatic research ooo



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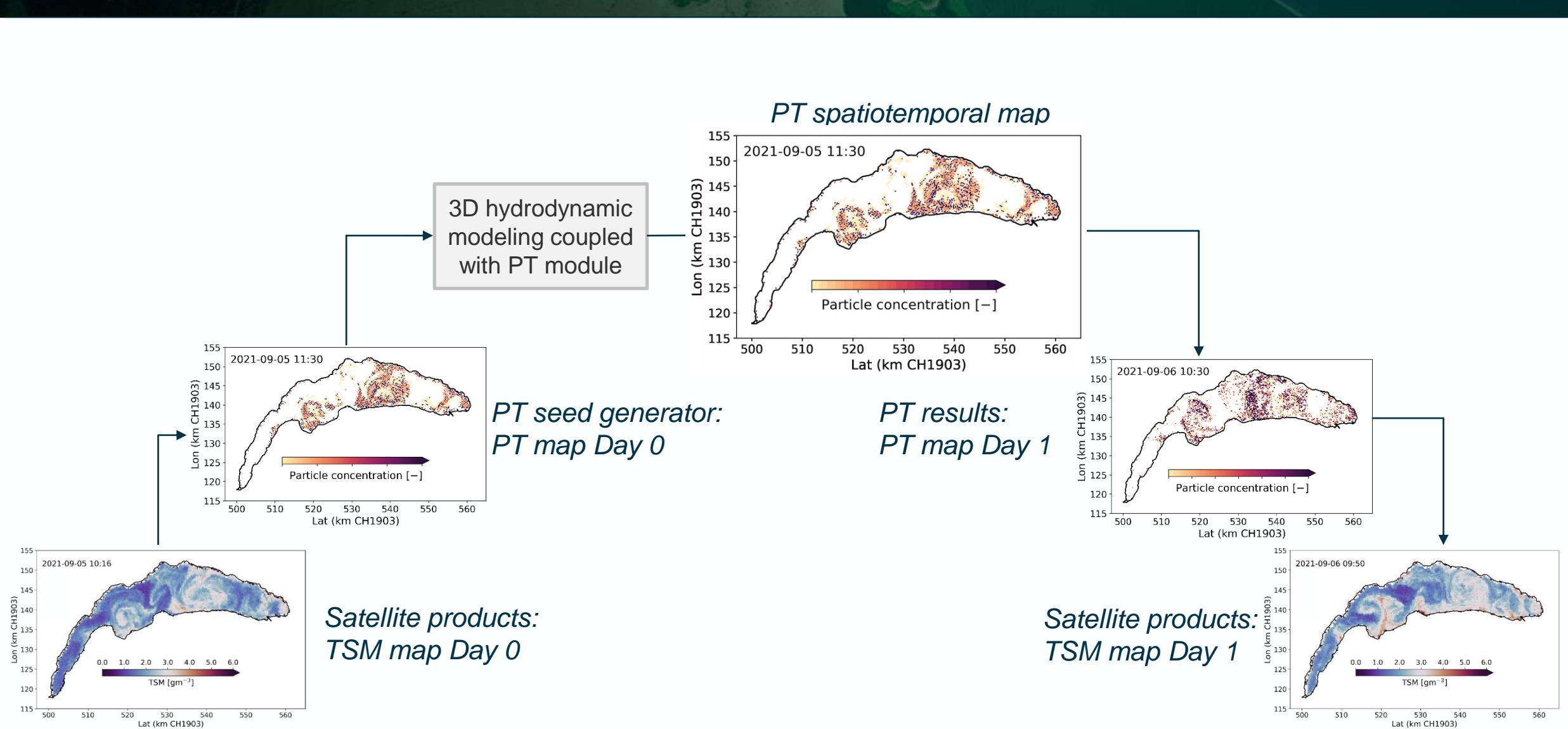


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**ALPLAKES**



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# Alplakes: sites

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Lakes with diverse morphological and hydrological features, trophic status, and climatic conditions located in the northern and southern Alps

# Alplakes: automated radiometry



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Lake Geneva (Switzerland/France)

*LéXPLORÉ platform*

- (i) WaterInsight WISPstation
- (ii) Satlantic HyperOCR
- (iii) PML So-Rad



Lake Garda (Italy)

*Pilone Sesarole*

- (i) HYPSTAR



Greifensee (Switzerland)

*Eawag research platform*

- (i) WaterInsight WISPstation
- (ii) JB Hyperspectral RoX

# In situ radiometry



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Lake	Time frame	Radiometer	Type
Aegeri	06/2022	WISP3	Campaign
Caldonazzo	2019 - 2023	HyperOCR	Campaign
Garda	2015 – 2023	HyperOCR/WISP3	Campaign
Geneva	09/2022 – 07/2023	WISPStation	Automated radiometer
Greifensee	04/2022 – 07/2023	WISPStation	Automated radiometer
Morat	07/2022	WISP3	Campaign
St. Moritz	07/2022	WISP3	Campaign
Zurich	08/2022	TriOS Ramses	Campaign

# Research questions



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1. What is the impact of MSI spatial resolution on atmospheric correction (AC) algorithm performance for the Alplakes sites?
2. How does a single center pixel compare to 3x3 pixel aggregation?
3. Is a generalized Alplakes AC feasible or do we require lake-specific AC selection?

# Match-up process



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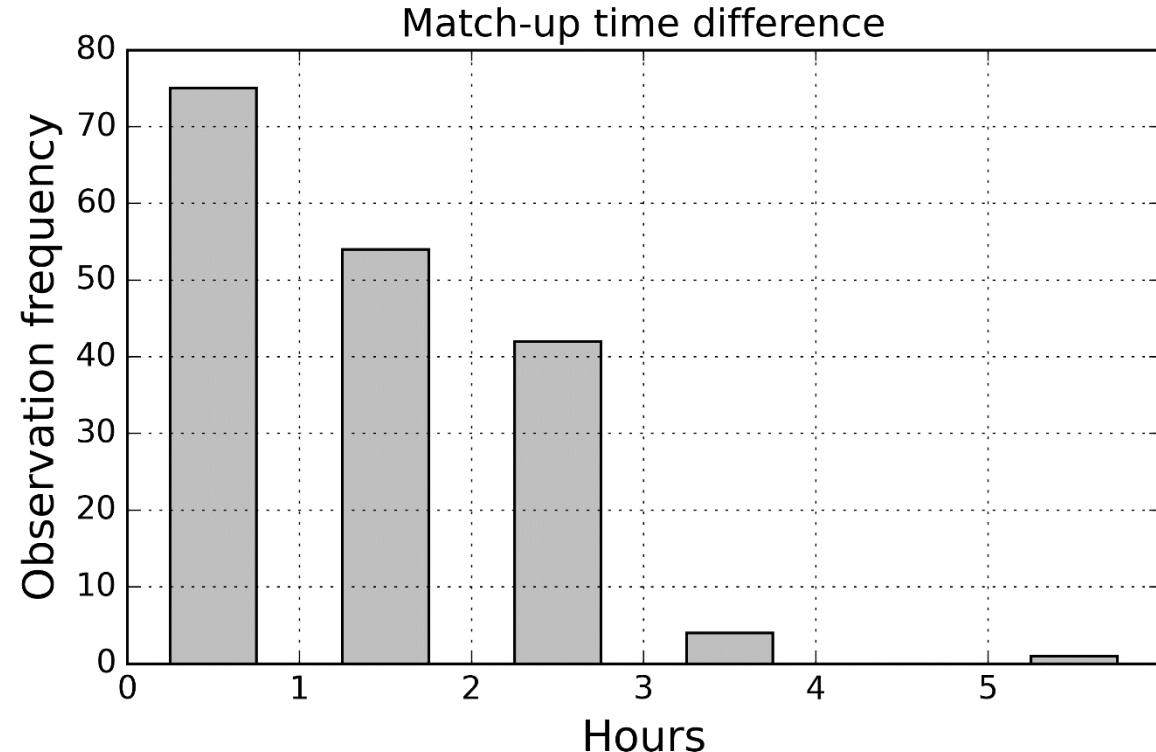
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## Sentinel-2 MSI:

- 20m, 60m
- 1x1 (centre location), 3x3 (median of nine valid pixels)
- ACs: C2RCC, POLYMER, ACOLITE
- Valid water pixel identification through IdePix (Brockmann Consult; Skakun et al., 2022)
- $R_{rs}$  quality scoring



Skakun, S., Wevers, J., Brockmann, C., Doxani, G., Aleksandrov, M., Batič, M., Frantz, D., Gascon, F., Gómez-Chova, L., Hagolle, O., López-Puigdollers, D., Louis, J., Lubej, M., Mateo-García, G., Osman, J., Peressutti, D., Pflug, B., Puc, J., Richter, R., Roger, J.-C., Scaramuzza, P., Vermote, E., Vesel, N., Zupanc, A., Žust, L., 2022. Cloud Mask Intercomparison eXercise (CMIX): An evaluation of cloud masking algorithms for Landsat 8 and Sentinel-2. *Remote Sensing of Environment* 274, 112990.

# $R_{rs}$ quality assurance – Wei et al. 2016

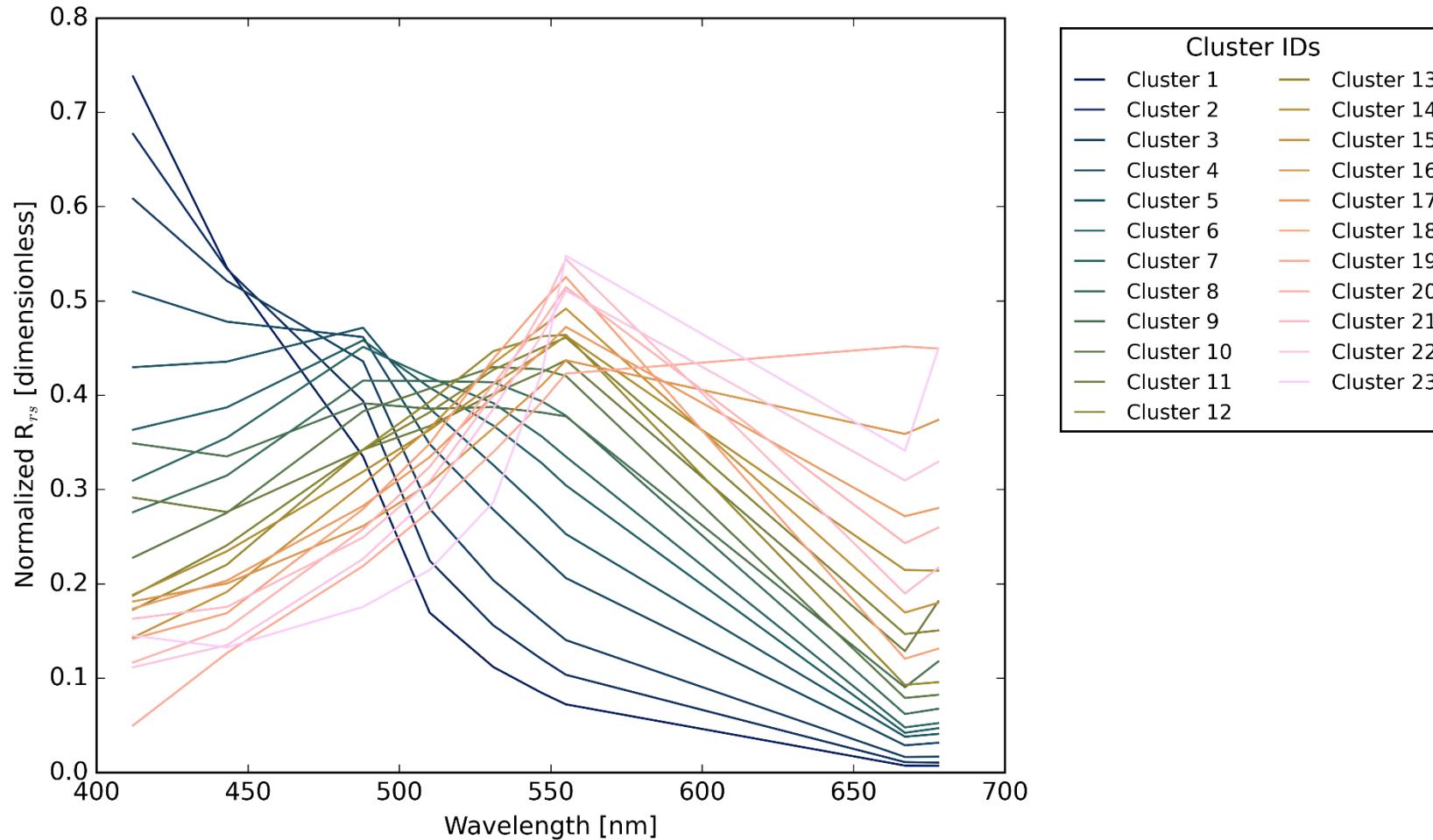


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- Scoring against 23 simulated OWTs (open ocean and coastal waters)
- 0 – 1 score,  $\leq 0.5$  poor quality
- Original band settings SeaWiFS, MODIS, VIIRS, Landsat-8
- Only 443 nm from MSI directly comparable

Wei, J., Lee, Z., Shang, S., 2016. A system to measure the data quality of spectral remote-sensing reflectance of aquatic environments. *Journal of Geophysical Research: Oceans* 121, 8189–8207.

# $R_{rs}$ quality assurance – Wei scoring

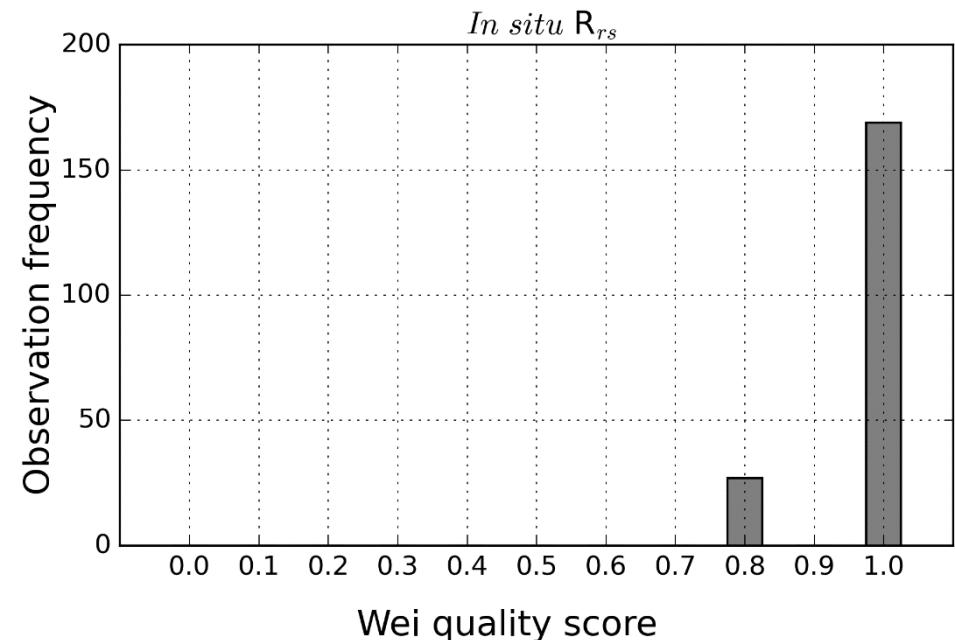
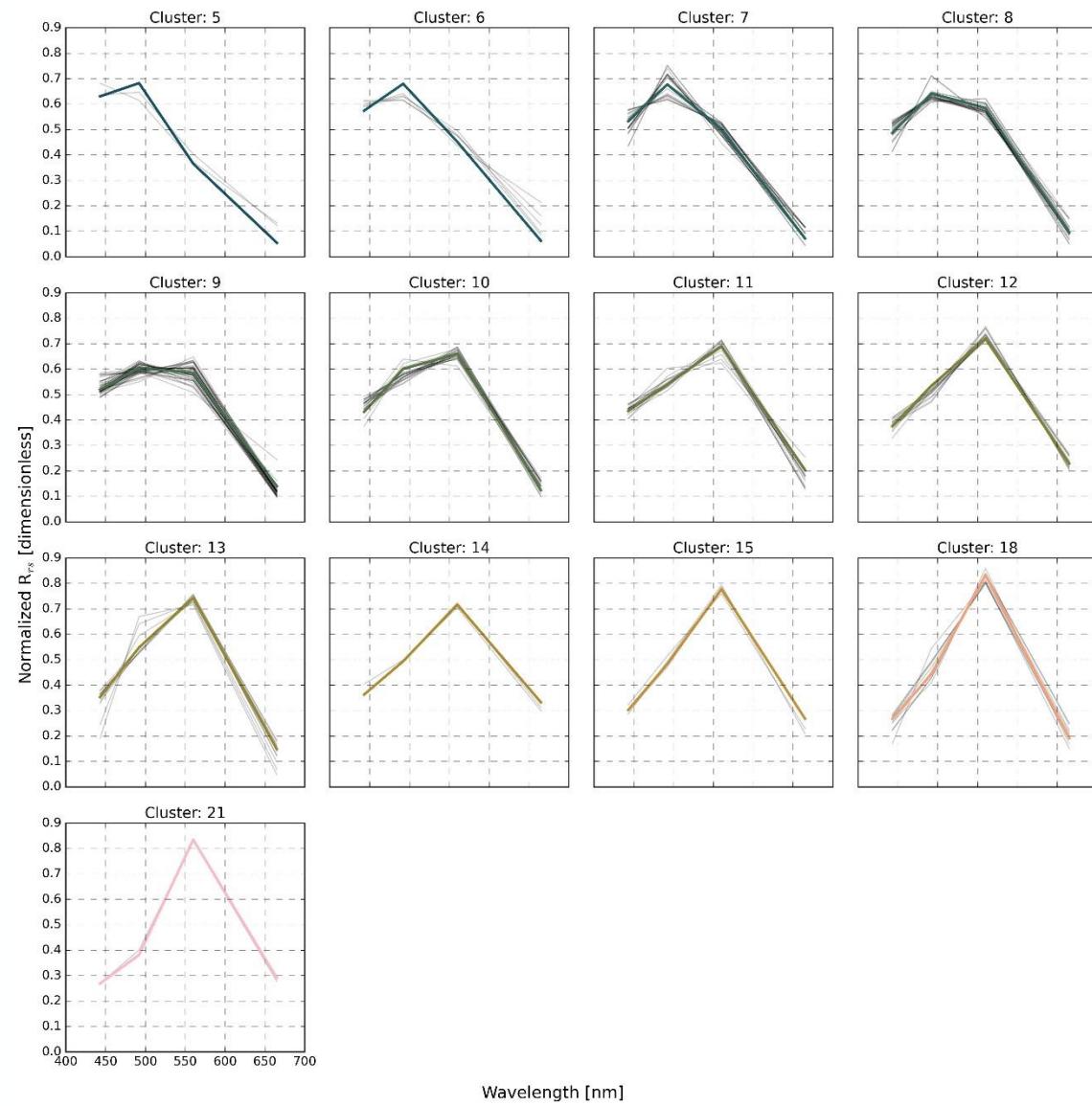


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Groetsch, P.M.M., Gege, P., Simis, S.G.H., Eleveld, M.A., Peters, S.W.M., 2017.  
Validation of a spectral correction procedure for sun and sky reflections in above-water reflectance measurements. *Opt. Express*, OE 25, A742–A761.

# $R_{rs}$ quality assurance – Wei scoring

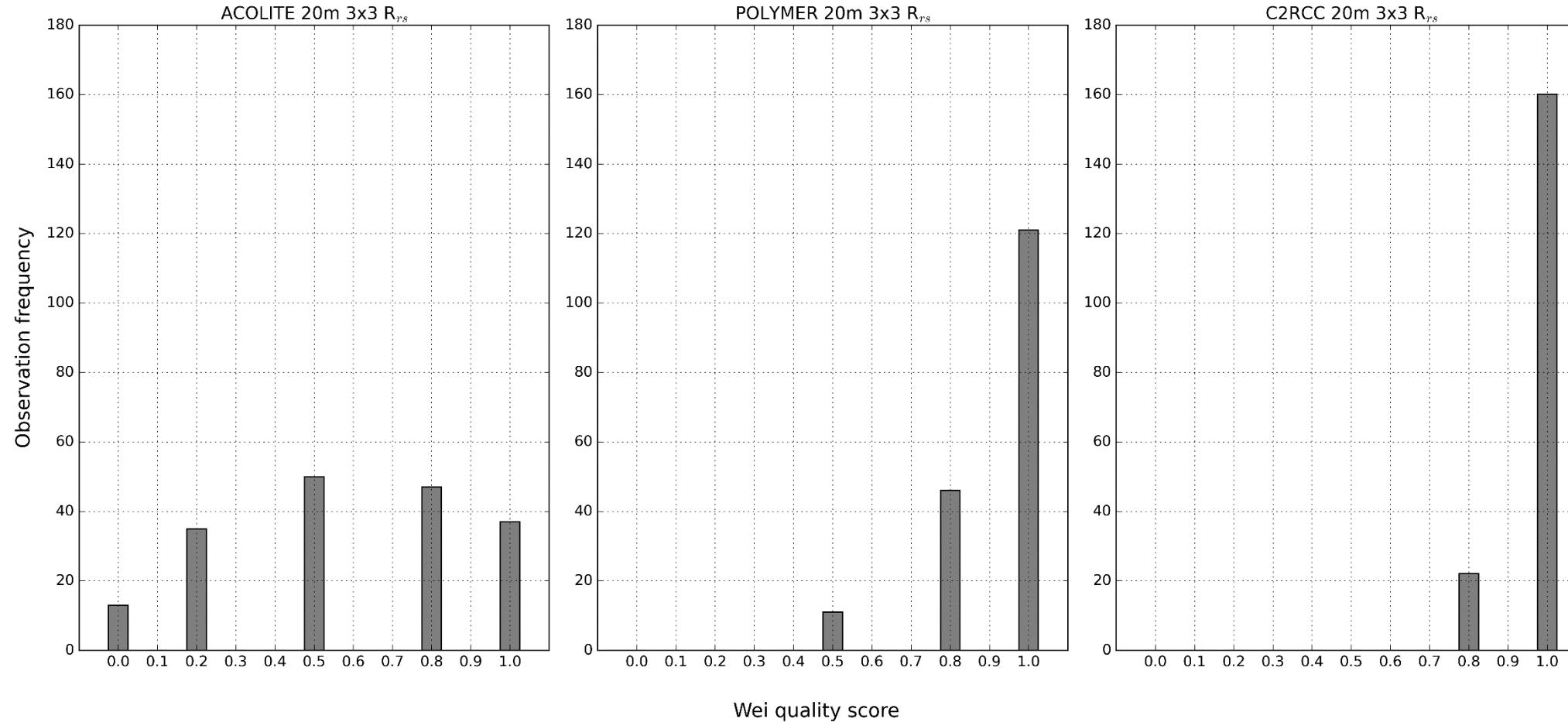


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12 combinations:

- 3x AC (C2RCC, ACOLITE, POLYMER)
- 2x match-up box (1x1, 3x3)
- 2x spatial resolution (20m, 60m)

Comparison of median symmetric accuracy (MdSA [%]) per lake per band per AC:

$$MdSA[\%] = \left( 10^{\text{median}(|\log_{10}(\frac{e}{o})|)} - 1 \right) \times 100$$

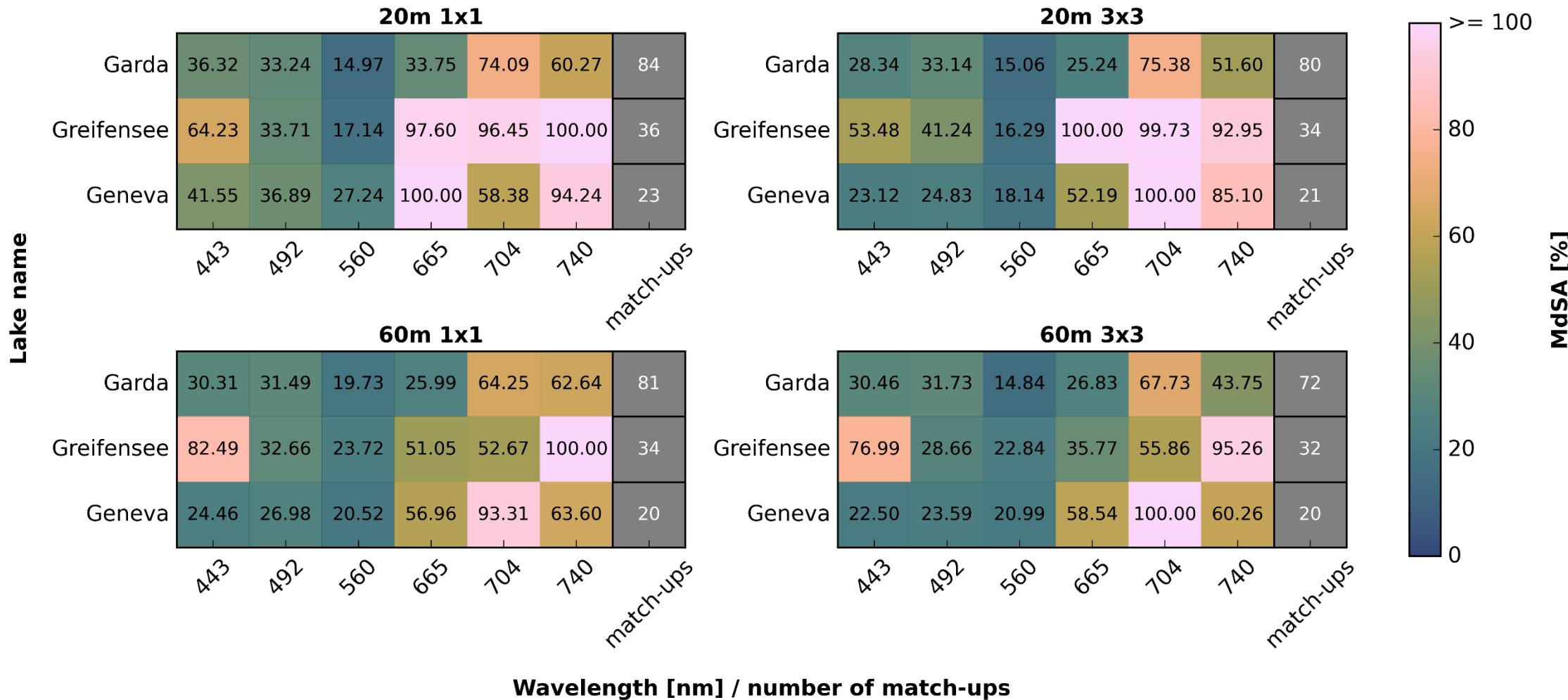
# Lowest MdSA per lake per band from an AC



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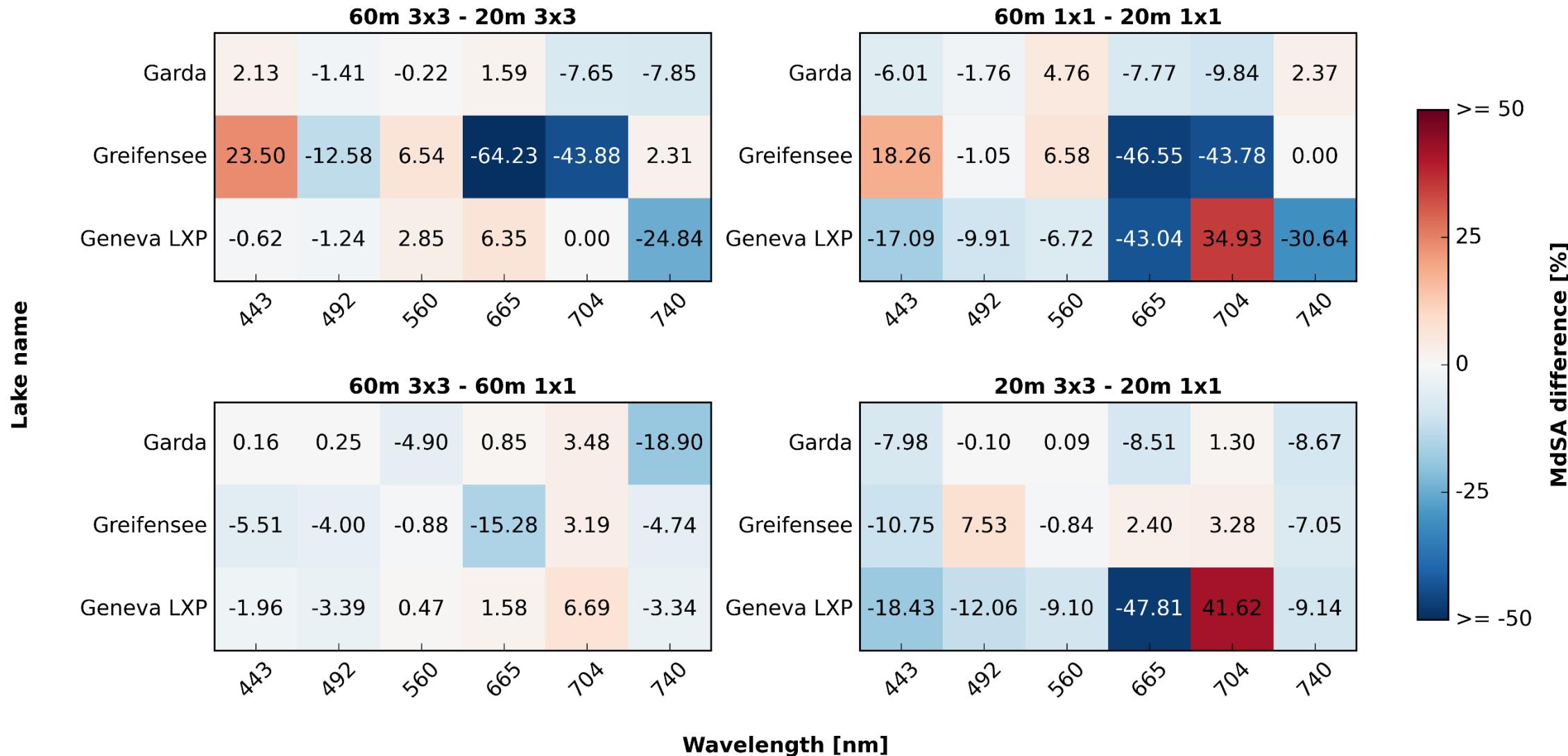
# MdSA difference between configurations



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# Lowest MdSA: corresponding AC

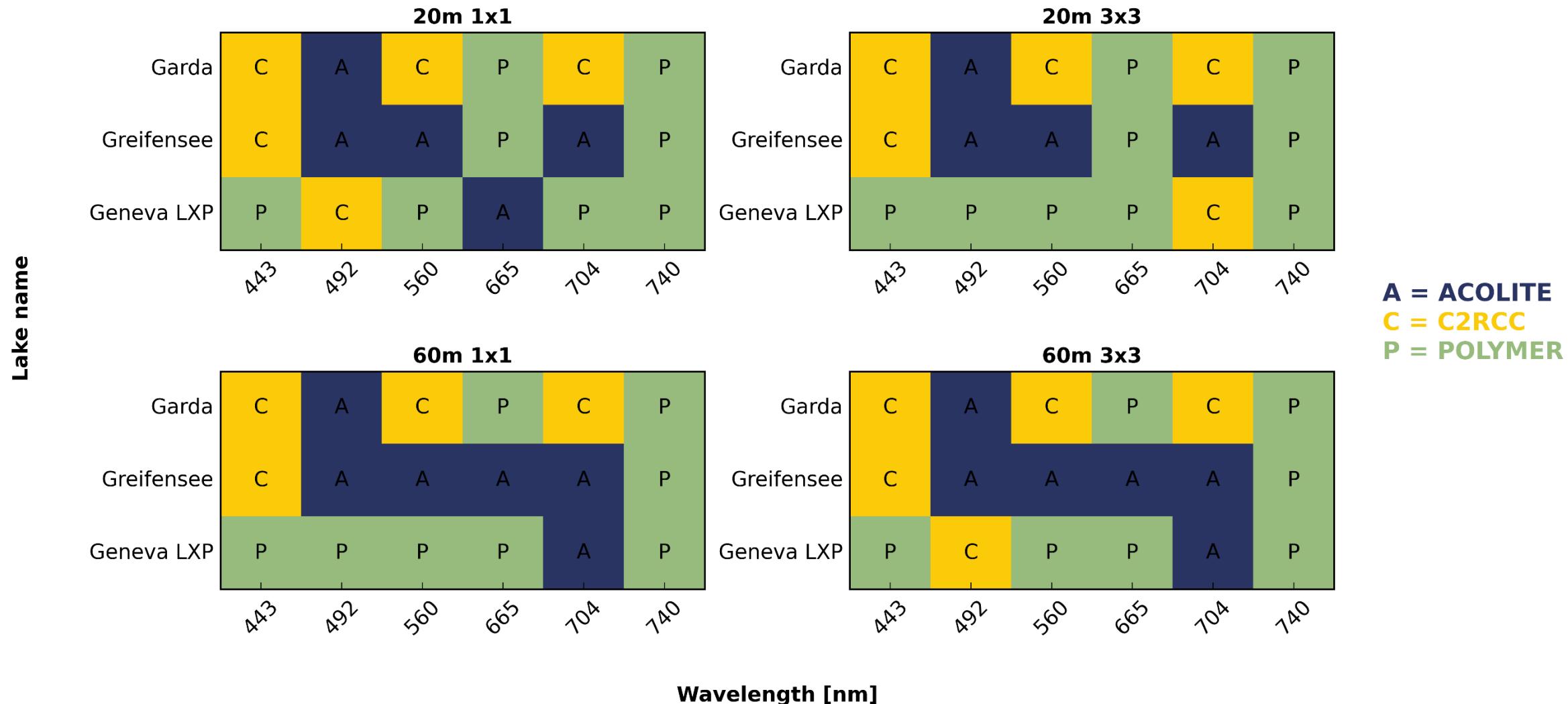


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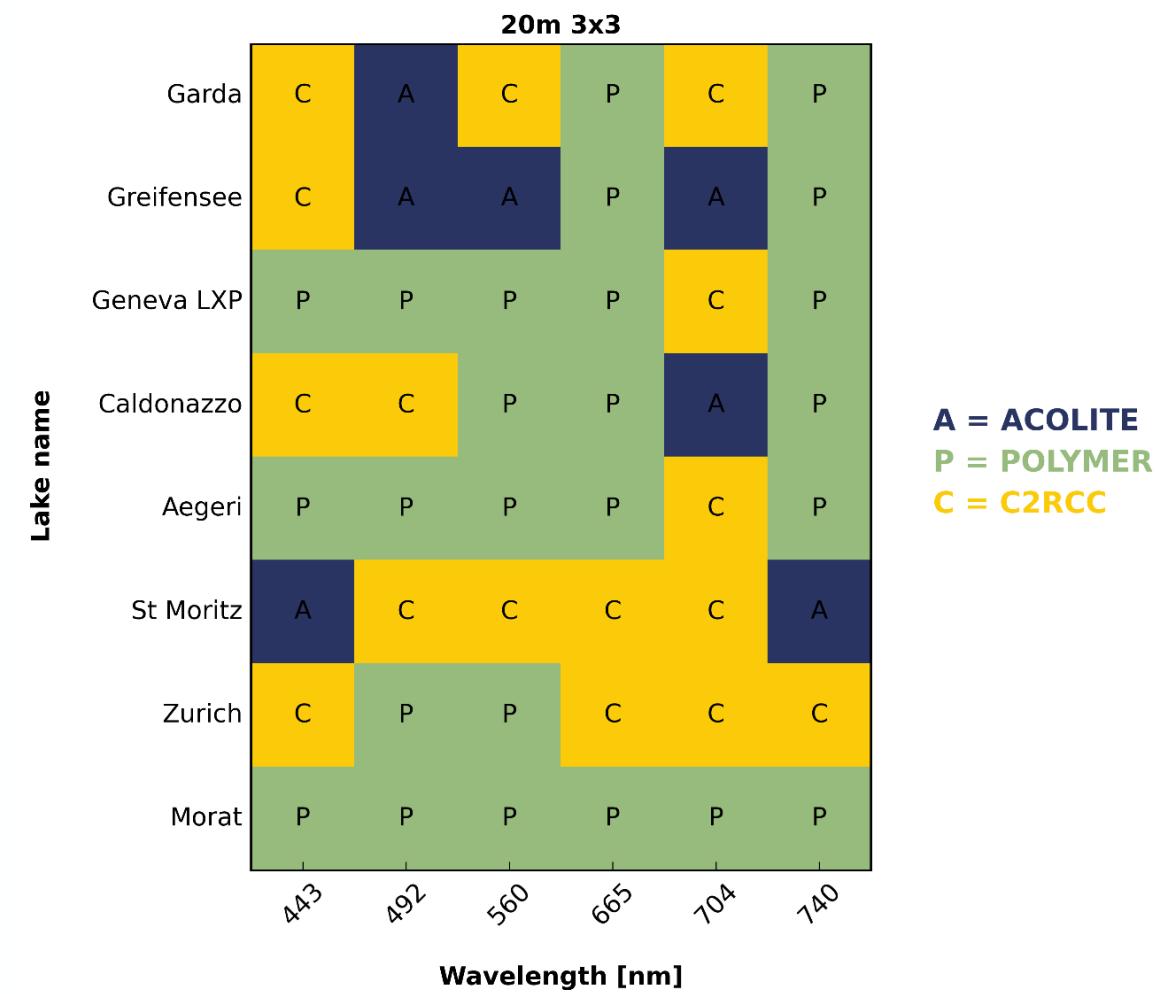
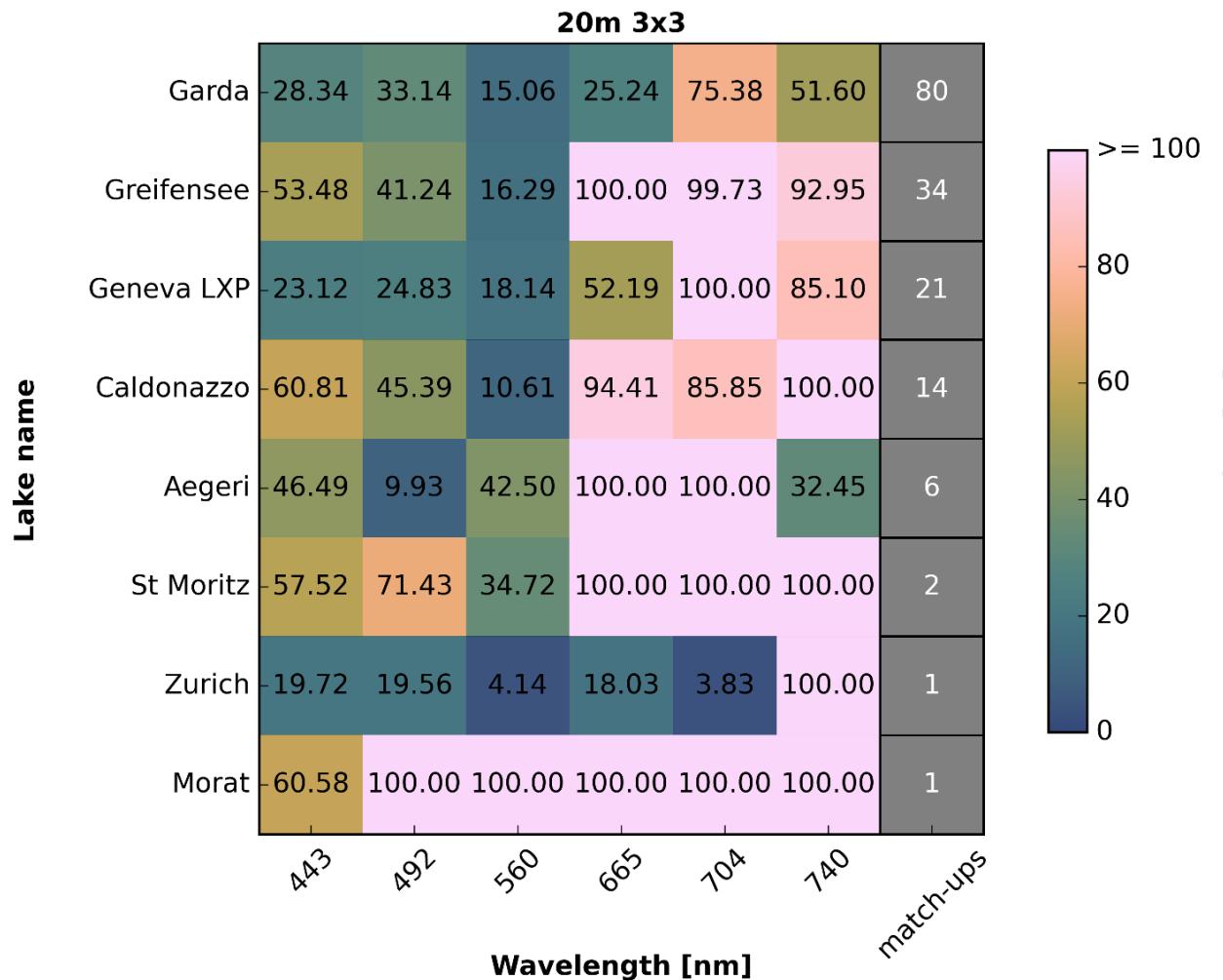
# MdSA and AC for all sites

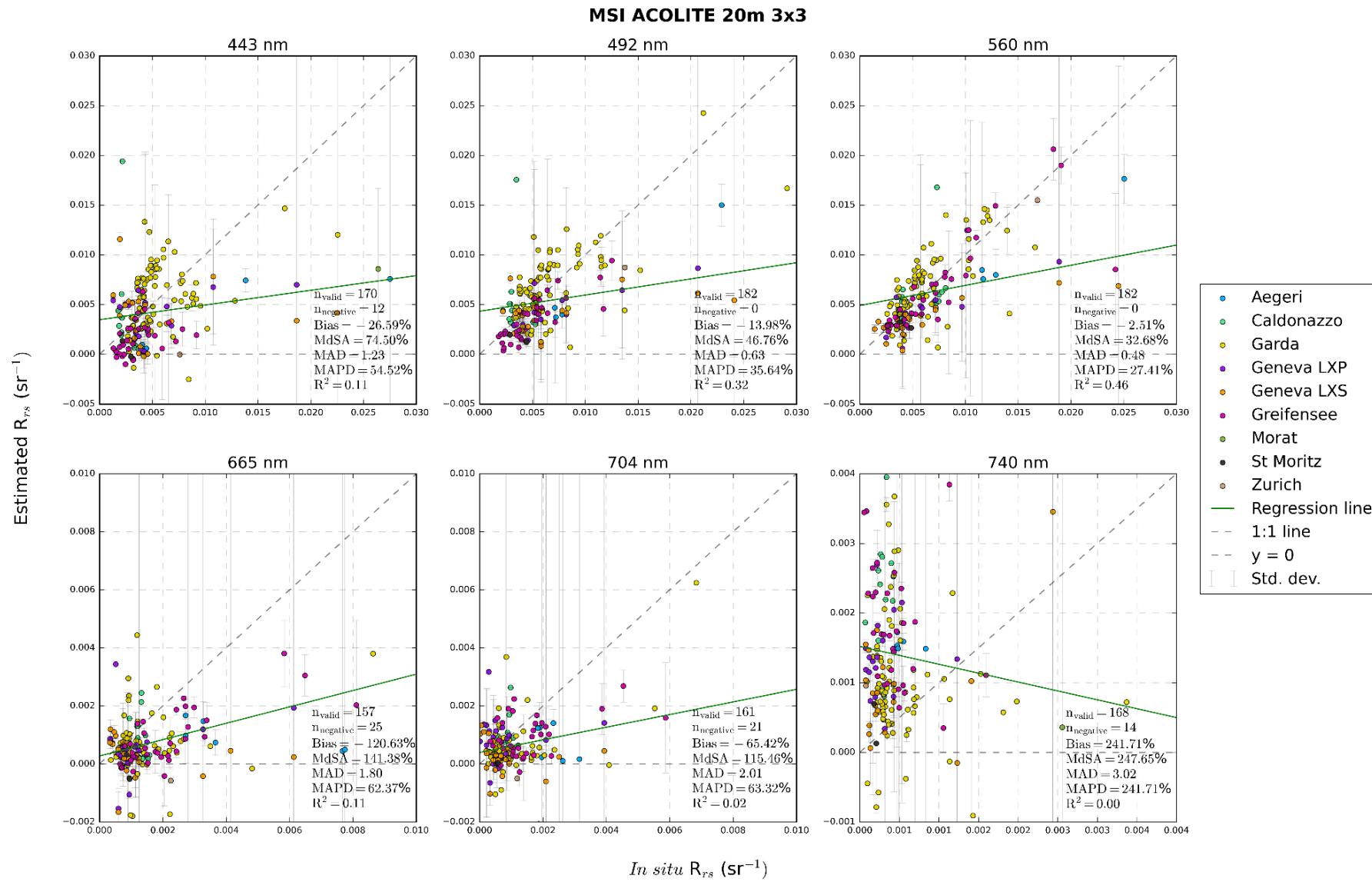


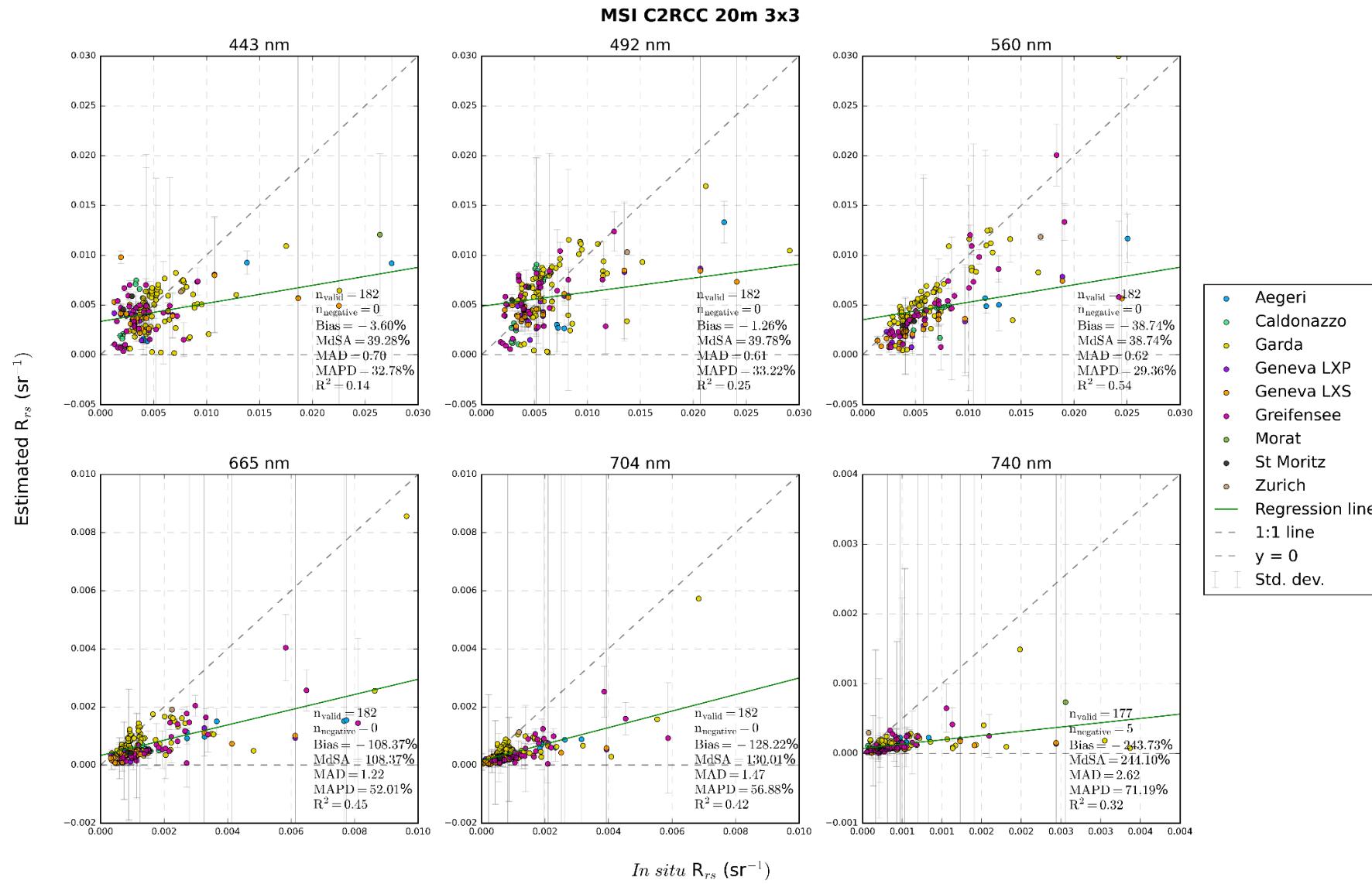
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# POLYMER MSI 20m 3x3



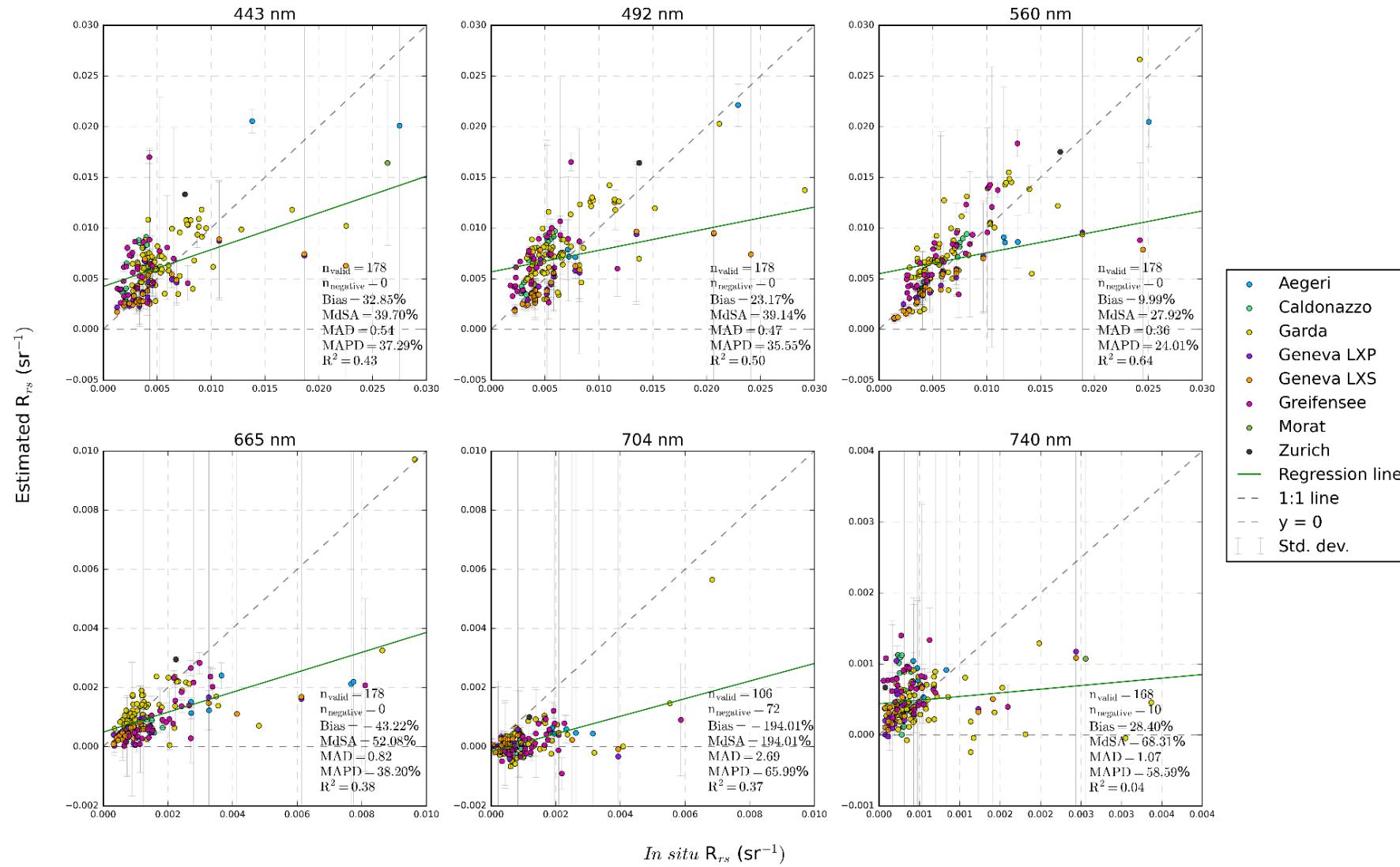
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MSI POLYMER 20m 3x3



# Match-up $R_{rs}$

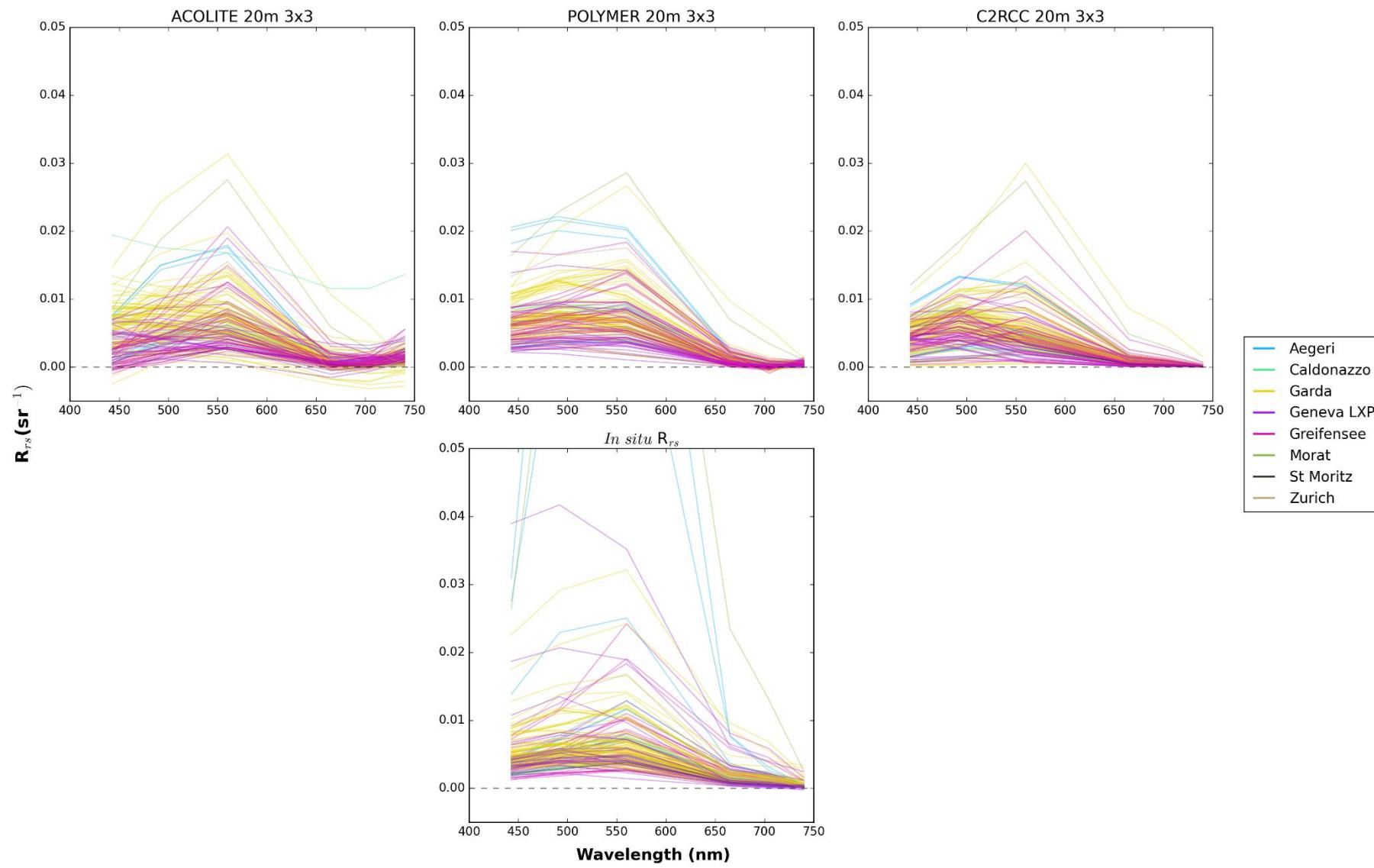


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# Secchi depth ( $Z_{SD}$ ) retrievals: Lake Garda match-ups

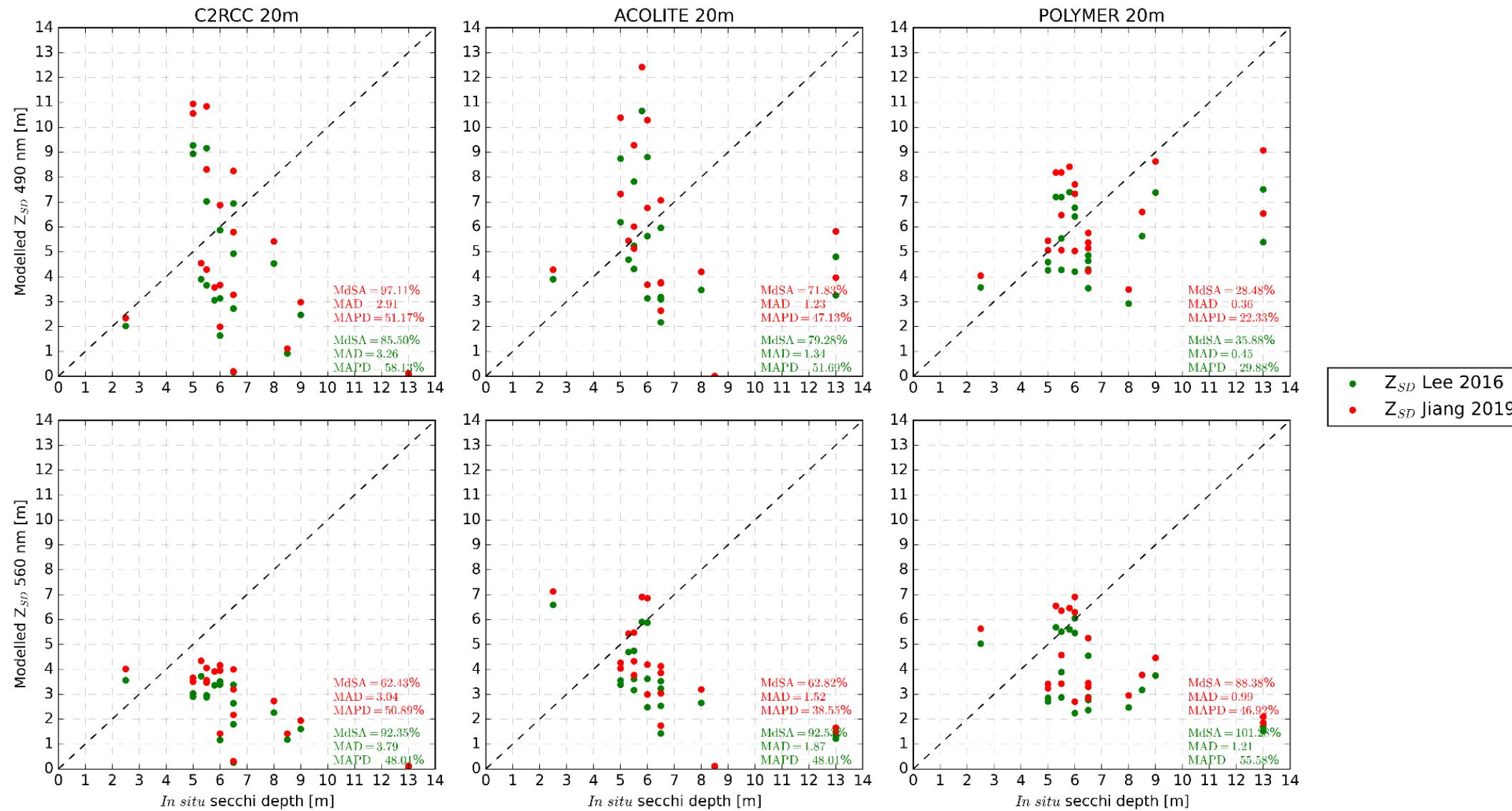


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# Time series Secchi - Lake Garda

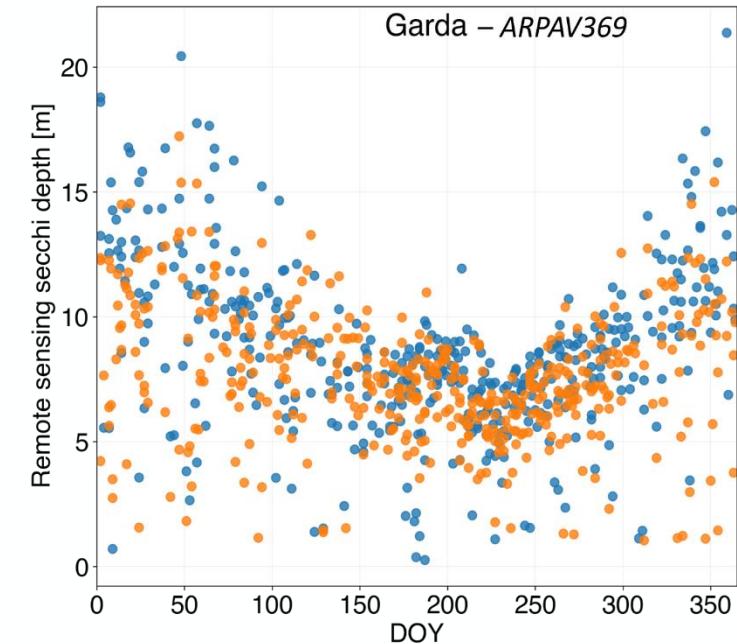
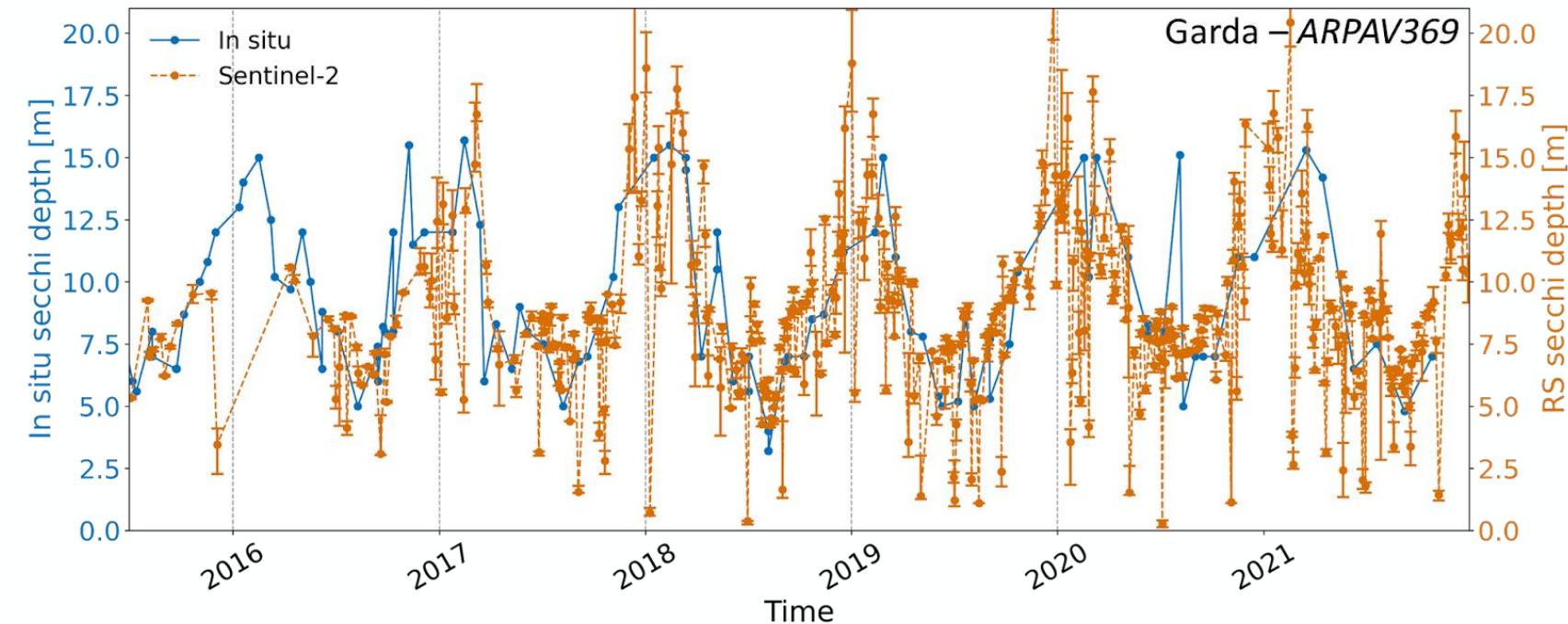


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Jiang, D., Matsushita, B., Setiawan, F., Vundo, A., 2019. An improved algorithm for estimating the Secchi disk depth from remote sensing data based on the new underwater visibility theory. *ISPRS Journal of Photogrammetry and Remote Sensing* 152, 13–23.

# Conclusions



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1. 20m resolution outperforms 60m: Lower error, more match-ups, higher spatial detail
2. 1x1 vs 3x3: Single center pixel leads to increased error
3. Algorithm comparison: POLYMER 20m 3x3 is most consistent across evaluations, followed by C2RCC and ACOLITE for the dataset under study
4. Lake-specific AC: Necessity for switching depending on downstream algorithm retrieval
5. Regional tuning: Accurate downstream retrieval [ $MdSA < 30\%$ ] of  $Z_{SD}$  and TSM possible when coefficients are adjusted
6. Inaccuracies: Noticeable in red/NIR bands across sensors and lakes, hinting at possible signal to noise ratio limitations or the need for additional glint correction
7. Outstanding issue: Lack of uncertainty provision in current algorithms for TSM and  $Z_{SD}$

# Thank you for listening!



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Available online:  
[www.alplakes.eawag.ch](http://www.alplakes.eawag.ch)  
[www.datalakes-eawag.ch](http://www.datalakes-eawag.ch)

ALPLAKES

Lakes API About Sort By

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**Lake Geneva**  
46.45, 6.5  
Situated 372 m above sea level with a surface area of 580 km<sup>2</sup>, an average depth of 154 m, and a maximum depth of 310 m.

**Lake Zurich**  
47.24, 8.68  
Situated 406 m above sea level with a surface area of 89 km<sup>2</sup>, an average depth of 49 m, and a maximum depth of 104 m.

**Lake Biel**  
47.08, 7.17  
Situated 429 m above sea level with a surface area of 39.3 km<sup>2</sup>, an average depth of 28 m, and a maximum depth of 74 m.

**Lake Greifen**  
47.36, 8.68  
Situated 435 m above sea level with a surface area of 8.45 km<sup>2</sup>, an average depth of 18 m, and a maximum depth of 32 m.

**Lake Garda**  
45.58, 10.63  
Situated 65 m above sea level with a surface area of 370 km<sup>2</sup>, an average depth of 136 m, and a maximum depth of 346 m.

**Lake Lugano**  
45.99, 8.97  
Situated 271 m above sea level with a surface area of 48.7 km<sup>2</sup>, an average depth of 134 m, and a maximum depth of 288 m.

**Lake Murten**  
46.93, 7.08  
Situated 429 m above sea level with a surface area of 22.8 km<sup>2</sup>, an average depth of 24 m, and a maximum depth of 45 m.

**Lake Caldonazzo**  
46.02, 11.24  
Situated 449 m above sea level with a surface area of 5.38 km<sup>2</sup>, an average depth of 26 m, and a maximum depth of 49 m.

Mortimer.Werther  
@eawag.ch



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