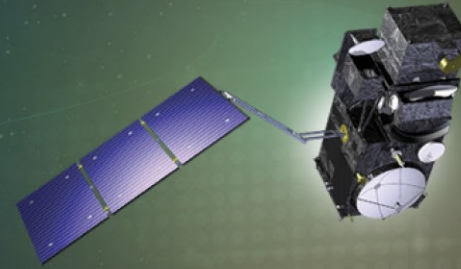




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# 7<sup>th</sup> Sentinel-3 Validation Team Meeting 2022

18-20 October 2022 | ESA-ESRIN | Frascati (Rm), Italy

## Validation of OLCI L2 Collection 3 water products and comparison with C2RCC over coastal and inland waters

Carole Lebreton<sup>a</sup>, Kerstin Stelzer<sup>a</sup>, Jorrit Scholze<sup>a</sup>, Dagmar Müller<sup>a</sup>, Petra Philipson<sup>b</sup>

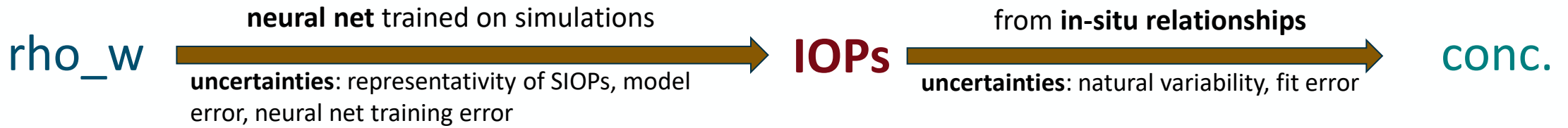
<sup>a</sup>*Brockmann Consult*, <sup>b</sup>*Brockmann Geomatics*

ESA UNCLASSIFIED – For ESA Official Use Only



## Short overview: C2RCC provides IOPs and mass concentrations

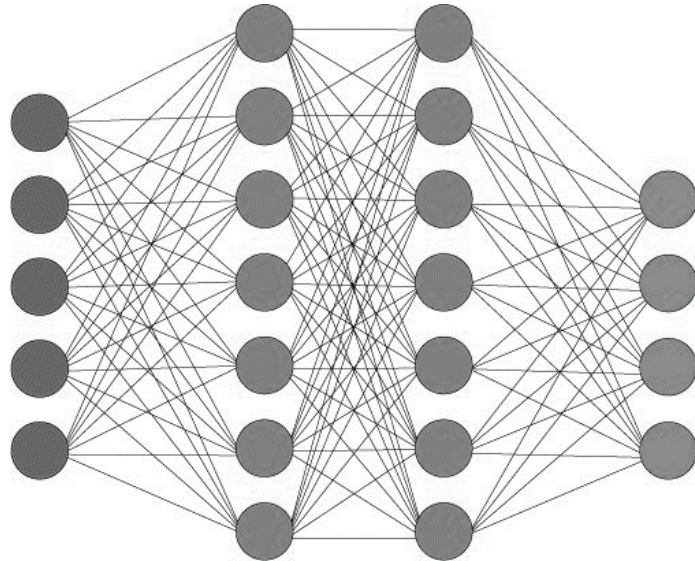
concentrations derived from in-situ relationships



reflectances corrected for gaseous absorption

sun and observation angles

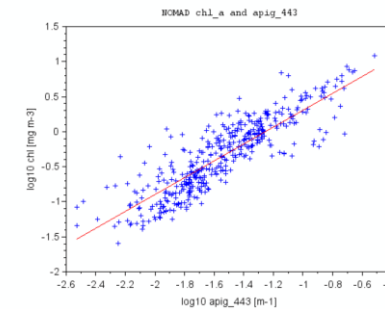
Surface pressure



$a_{pig}$

$a_{gelb}$ ,  $a_{detritus}$

$b_p$ ,  $b_{white}$



CHL\_NN

ADG443\_NN

TSM\_NN

- Available internally in IPF  
- Output in SNAP



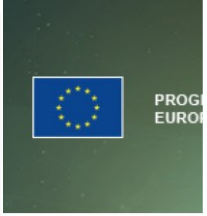
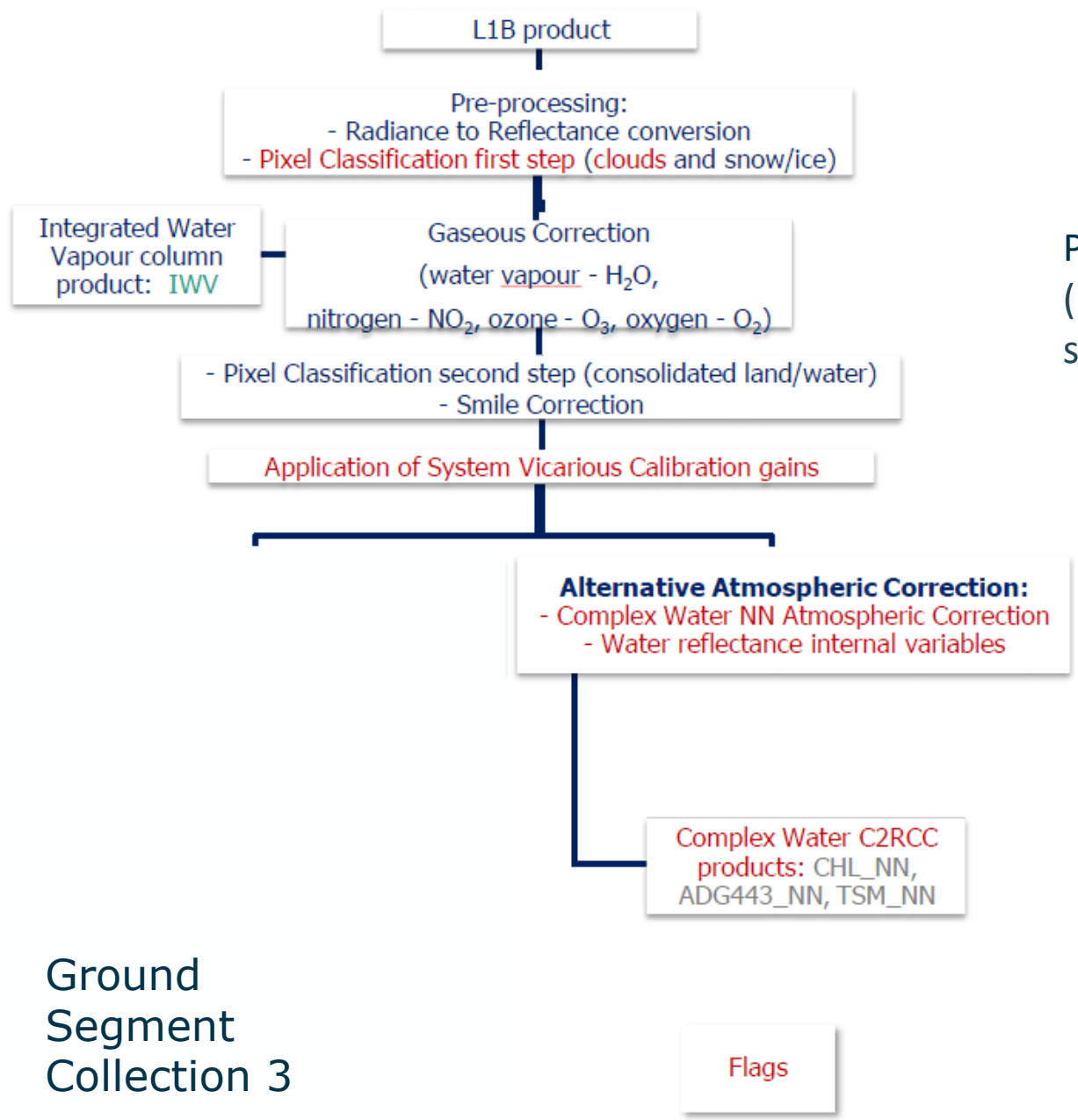
- Available in L2 product  
- Output in SNAP



## C2RCC in SNAP = AAC in IPF

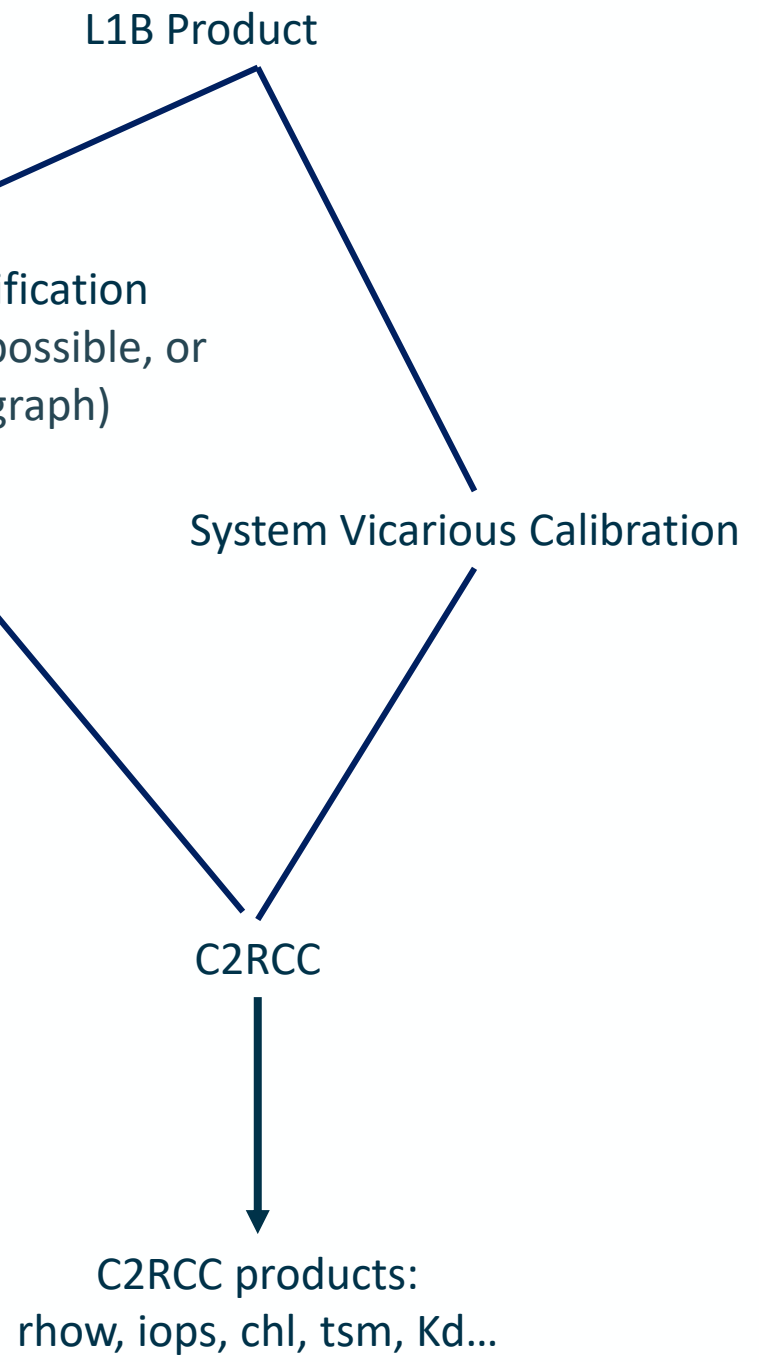
C2RCC v2: SNAP 9 (and 8) default net & implemented in OLCI IPF (Collection 3)

- Bio-optical model - New exponent for ad spectrum (detritus)
- Extended training range and co-variance ranges
  - → Better coverage of specifically high backscatter water (river estuaries and lakes)
- Forward modelling → combination procedure for Hydrolight and CC atmosphere model
- Improved training sample and training process
  - Larger number of samples
  - noise in training data set and NN architecture combined to optimize noise reduction and overshooting of NNs (interpolation)
- → reduced noise in results
- → more plausible values specifically in open ocean waters



Pre-processing: Pixel Classification  
(Idepix in a separate step possible, or same processing within a graph)

SNAP



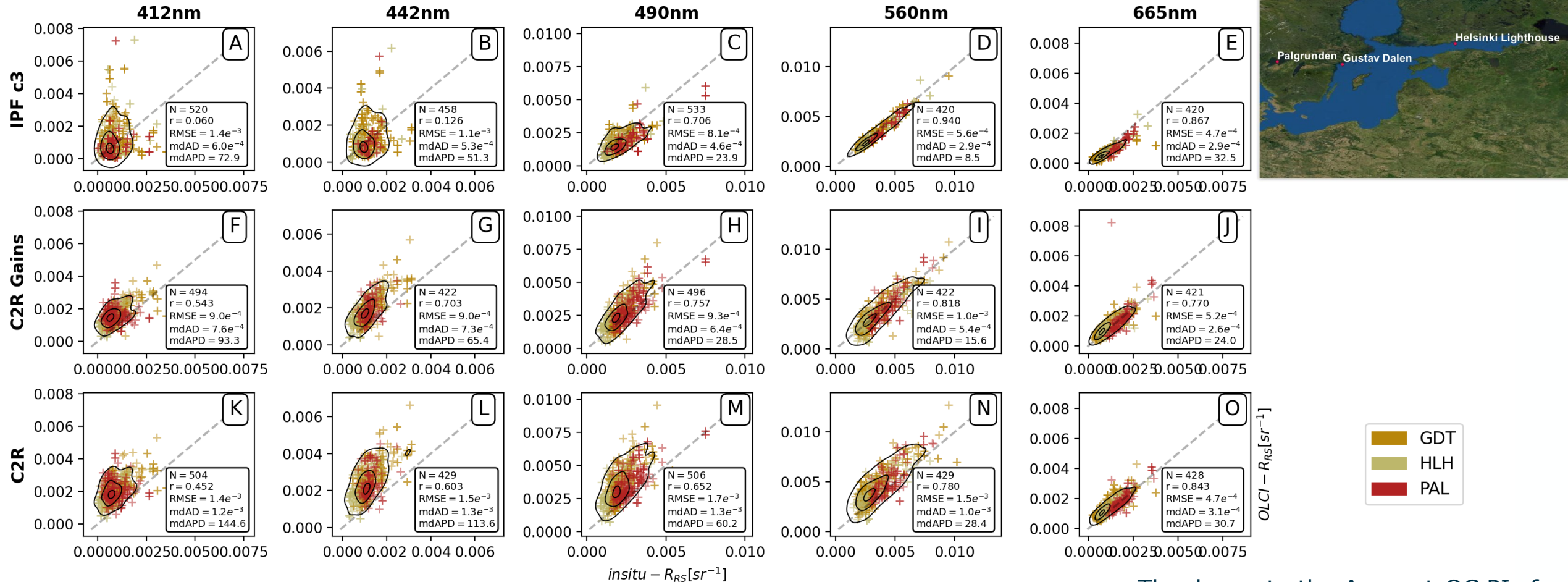


## Matchup procedure

- Remote sensing reflectances at AERONET-OC stations:
  - 5x5, with 1.5 std outlier removal and minimum of 13 valid pixels, +/- 3 hours, CV 20% based on 560 nm band
  - Median Absolute Deviation and Median Absolute Percentage Deviation
  - IPF: WQSF\_Isb.CLOUD, WQSF\_Isb.CLOUD\_AMBIGUOUS, WQSF\_Isb.CLOUD\_MARGIN, WQSF\_Isb.INVALID, WQSF\_Isb.COSMETIC, WQSF\_Isb.SATURATED, WQSF\_Isb.SUSPECT, WQSF\_Isb.HISOLZEN, WQSF\_Isb.HIGHGLINT, WQSF\_Isb.SNOW\_ICE, WQSF\_Isb.AC\_FAIL, WQSF\_Isb.WHITECAPS, WQSF\_Isb.ADJAC, WQSF\_Isb.OC4ME\_FAIL, WQSF\_msb.RWNEG\_XX
  - C2RCC: pixel\_classif\_flags.IDEPIX\_CLOUD, pixel\_classif\_flags.IDEPIX\_CLOUD\_BUFFER, pixel\_classif\_flags.IDEPIX\_CLOUD\_SHADOW, pixel\_classif\_flags.IDEPIX\_SNOW\_ICE, c2rcc\_flags.Rhow\_OOR, c2rcc\_flags.Rtosa\_OOR
- Chlorophyll in lakes:
  - 3x3 with 1.5 std outlier removal and minimum of 5 valid pixels, +/- 3 hours
  - Mean absolute Deviation and Mean Absolute Percentage Deviation
  - IPF: WQSF\_Isb.CLOUD, WQSF\_Isb.CLOUD\_AMBIGUOUS, WQSF\_Isb.CLOUD\_MARGIN, WQSF\_Isb.INVALID, WQSF\_Isb.COSMETIC, WQSF\_Isb.SATURATED, WQSF\_Isb.SUSPECT, WQSF\_Isb.HISOLZEN, WQSF\_Isb.HIGHGLINT, WQSF\_Isb.SNOW\_ICE, WQSF\_Isb.OCNN\_FAIL
  - C2RCC: pixel\_classif\_flags.IDEPIX\_CLOUD, pixel\_classif\_flags.IDEPIX\_CLOUD\_AMBIGUOUS, pixel\_classif\_flags.IDEPIX\_CLOUD\_BUFFER, pixel\_classif\_flags.IDEPIX\_CLOUD\_SHADOW, pixel\_classif\_flags.IDEPIX\_SNOW\_ICE, c2rcc\_flags.Rhow\_OOR, c2rcc\_flags.Rtosa\_OOR, c2rcc\_flags.Cloud\_risk, (c2rcc\_flags.Rtosa\_OOS and conc\_chl<1)

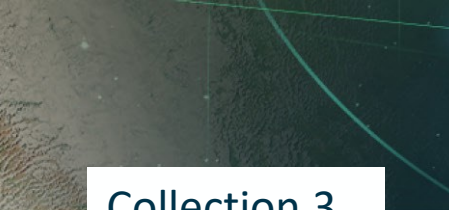


## Rrs matchups at Gustav Dalen (GDT), Helsinki Lighthouse (HLH), and Palgrunden (PAL)



Thank you to the Aeronet-OC PIs for providing the in situ data!



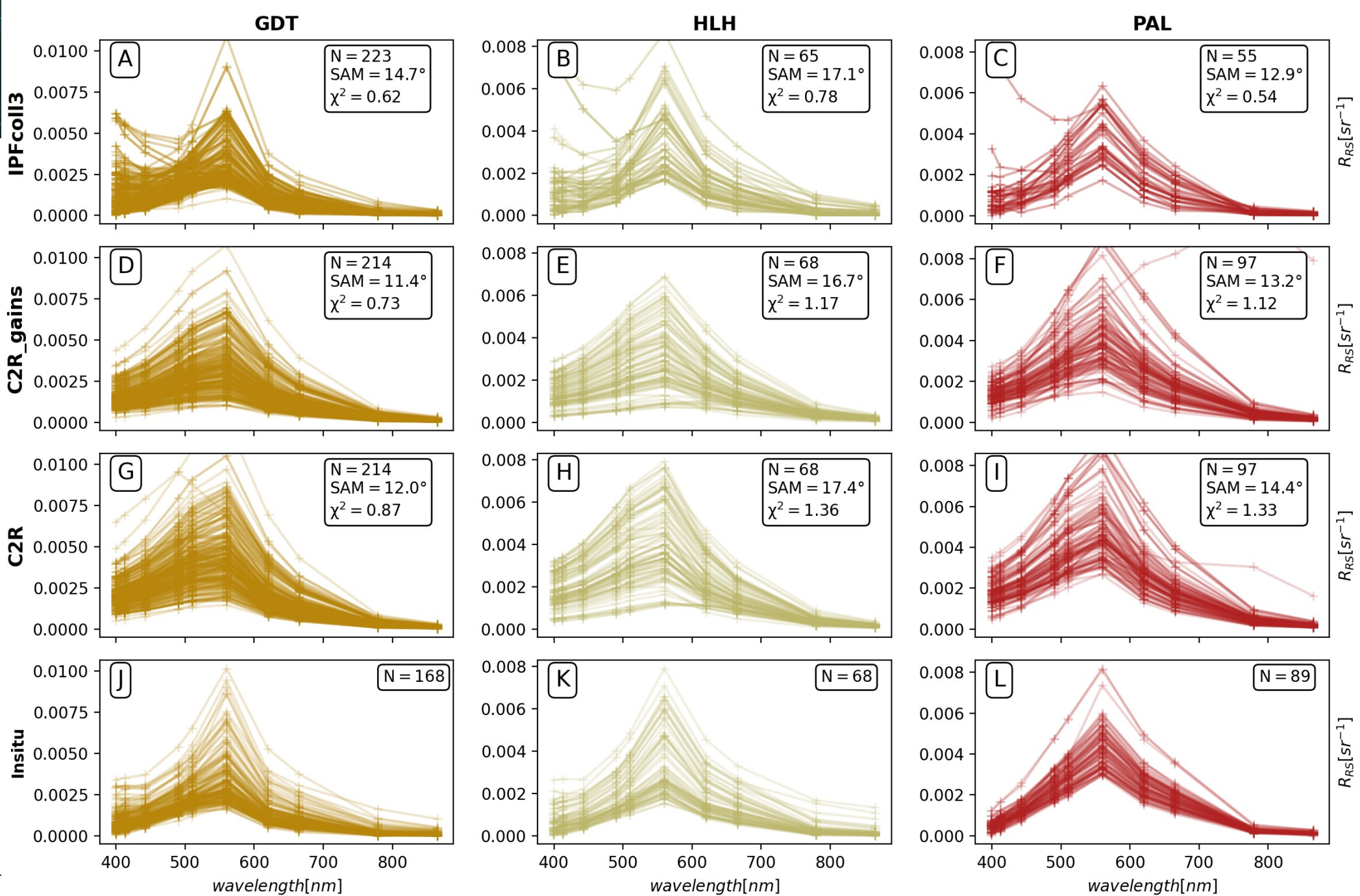


Collection 3

C2RCC gains

C2RCC no gains

AERONET-OC



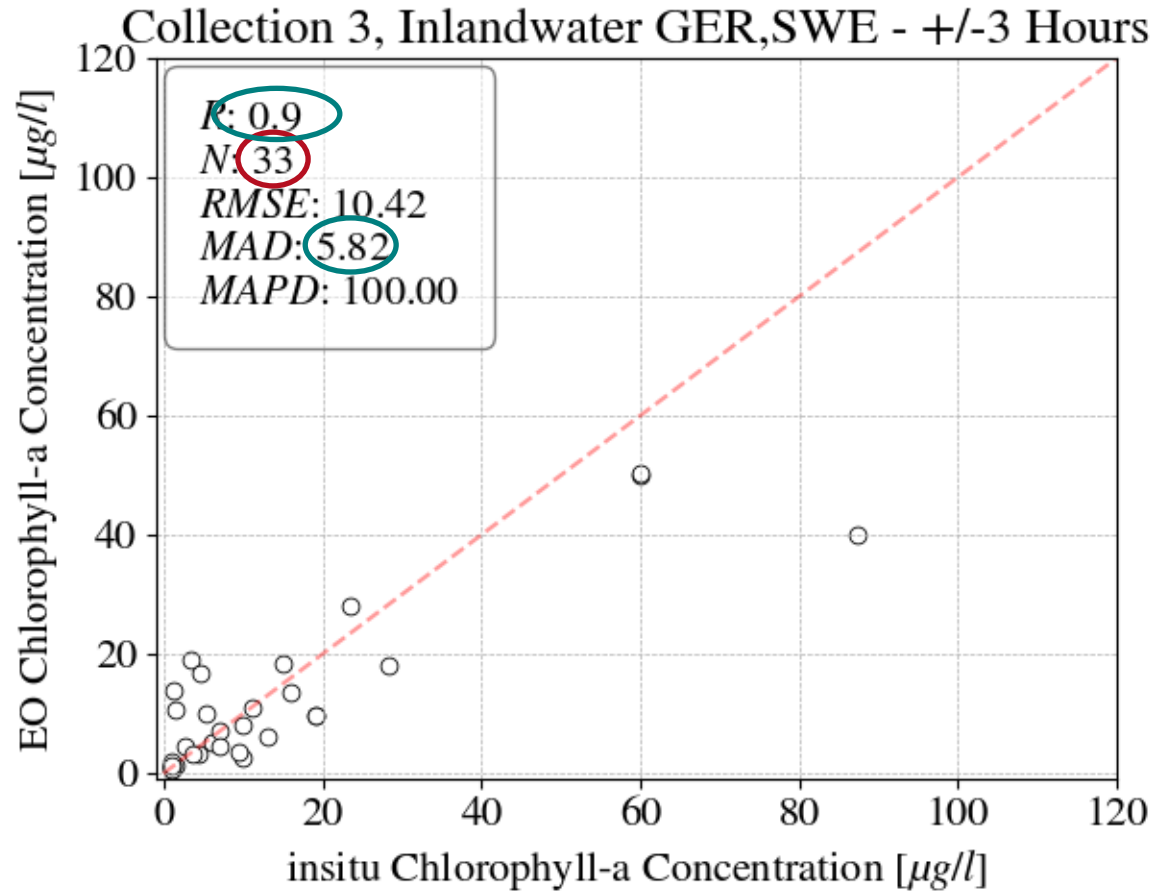
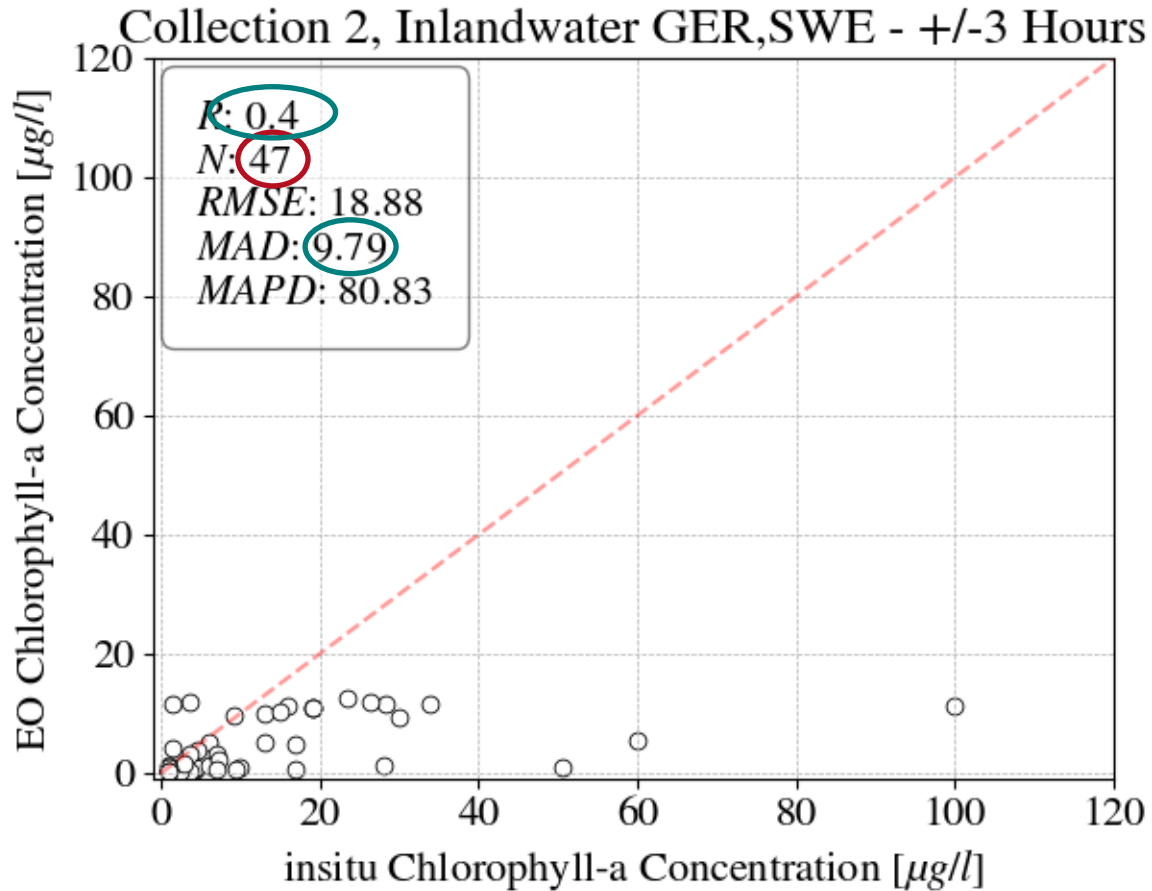
## Validations Stations over inland waters



165 stations in lakes going along a low to high chlorophyll spectrum, as well as ranging from clear to brown (high CDOM) waters

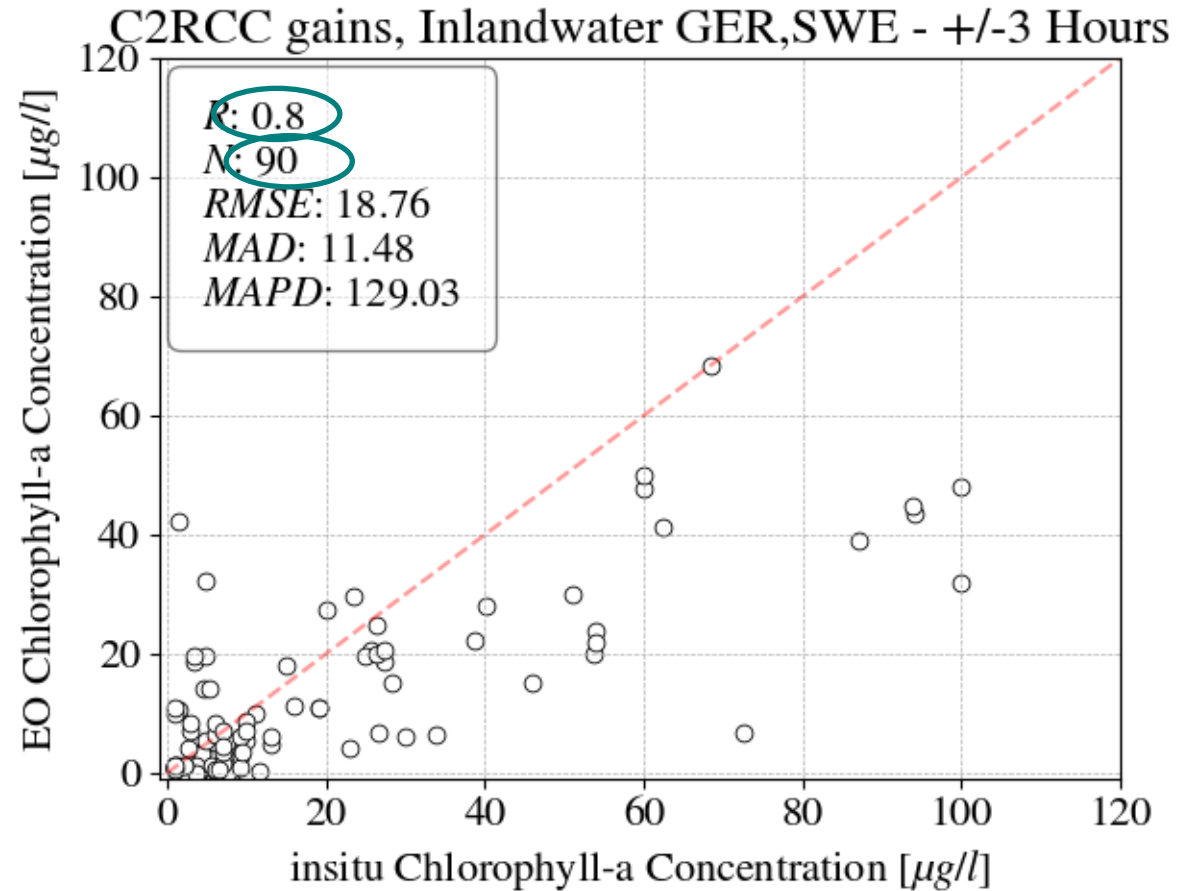
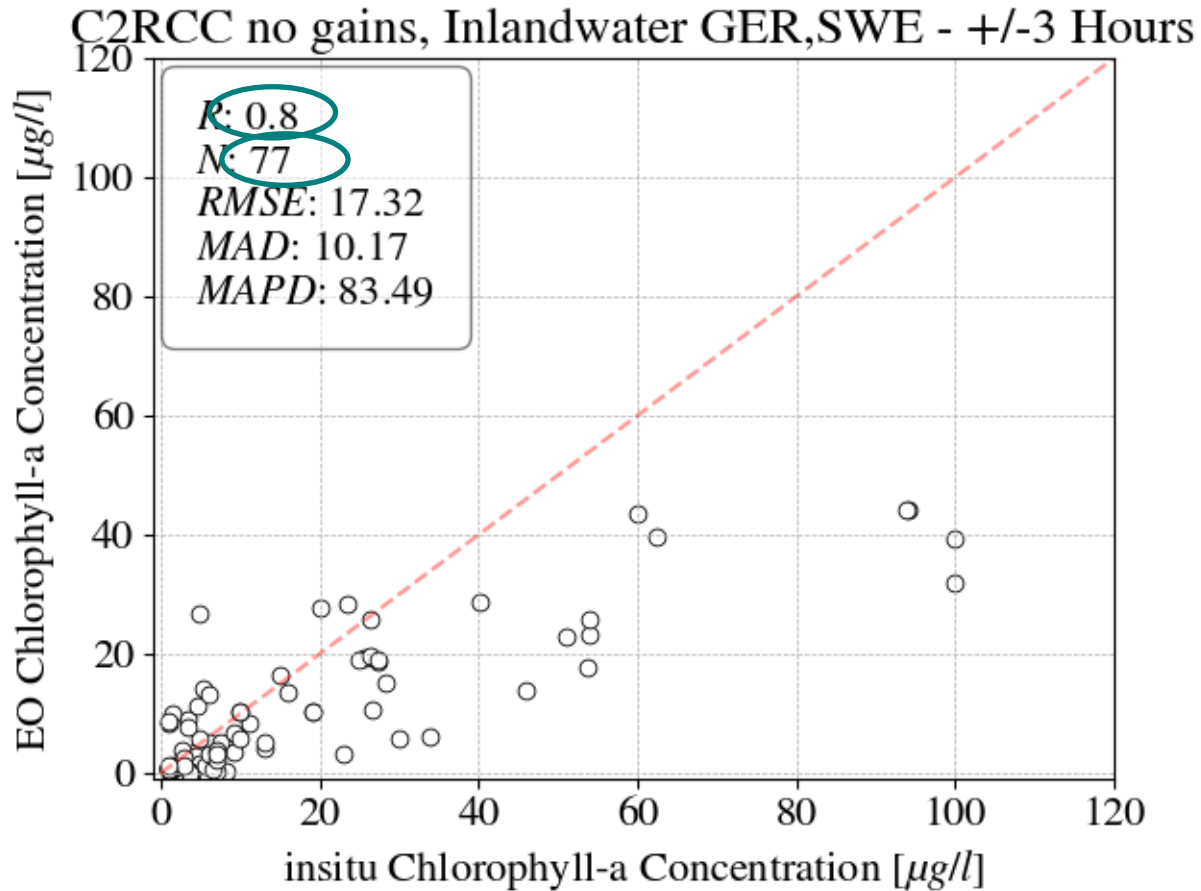


## Scatter Plots CHL\_NN Collection 2 (left) compared to CHL\_NN AAC Collection 3 (right)

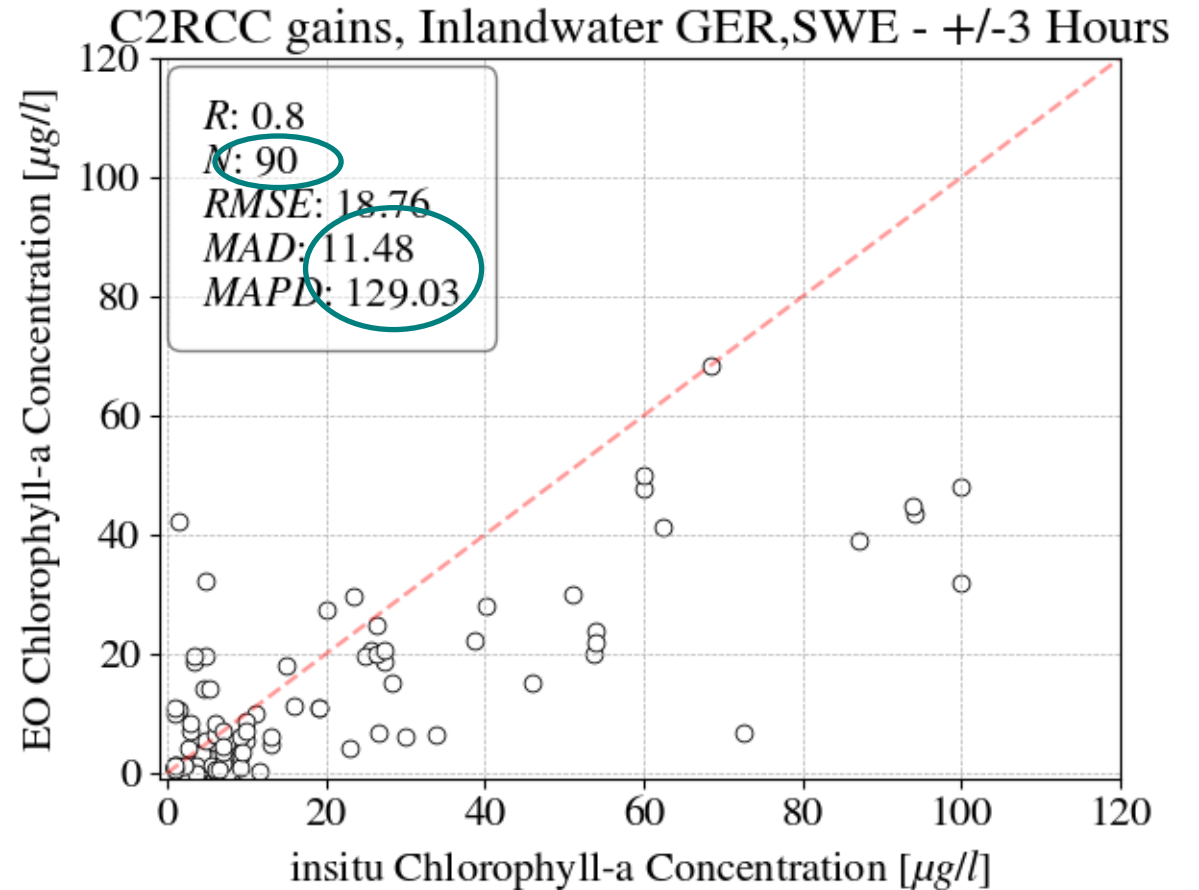
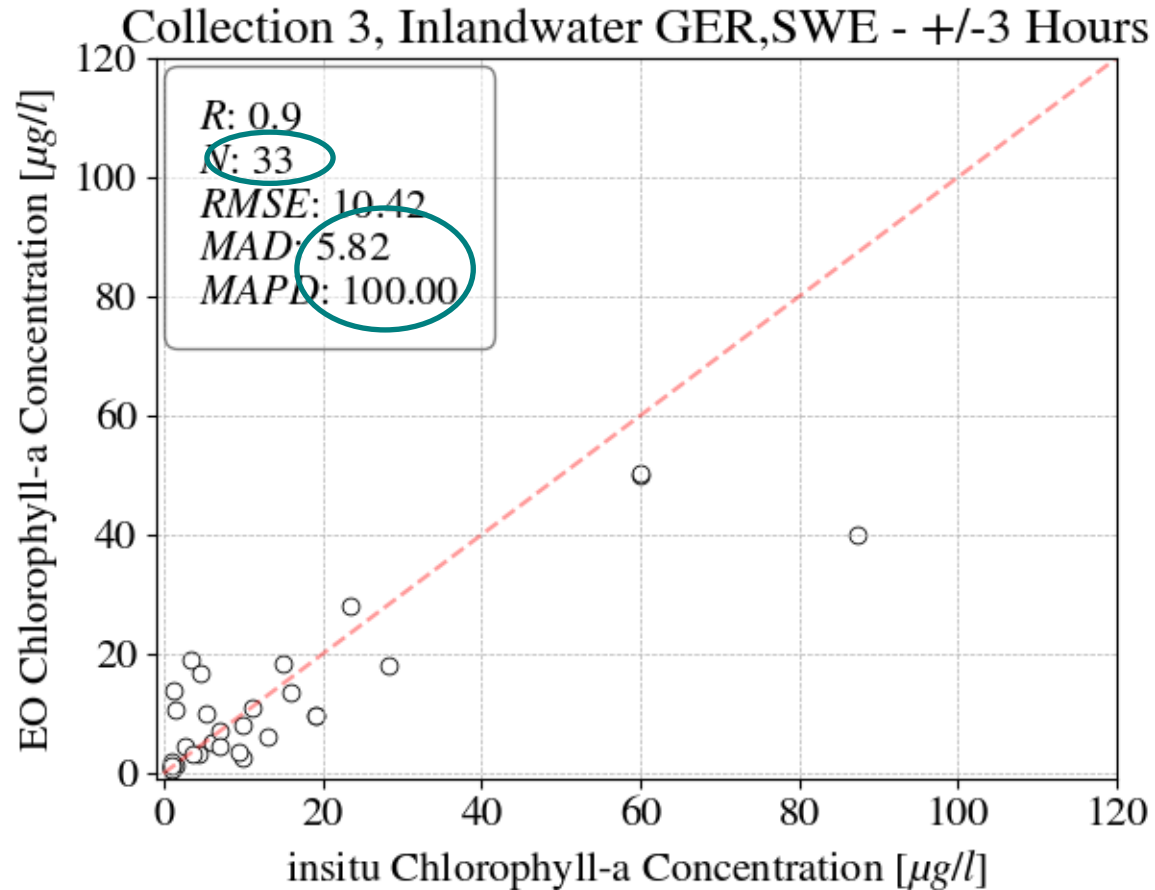


Loss of valid data but large improvement in statistics

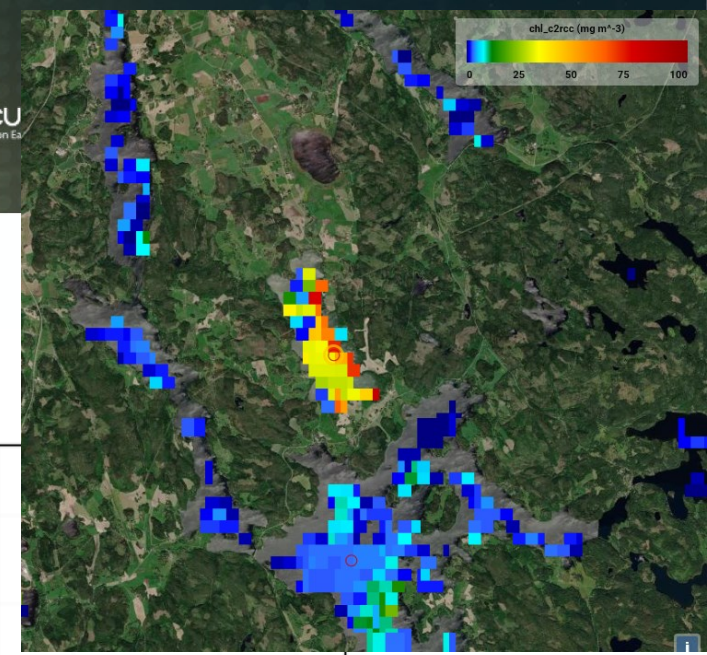
## Scatter Plots C2RCC no gains 2 (left) compared to C2RCC gains (right)



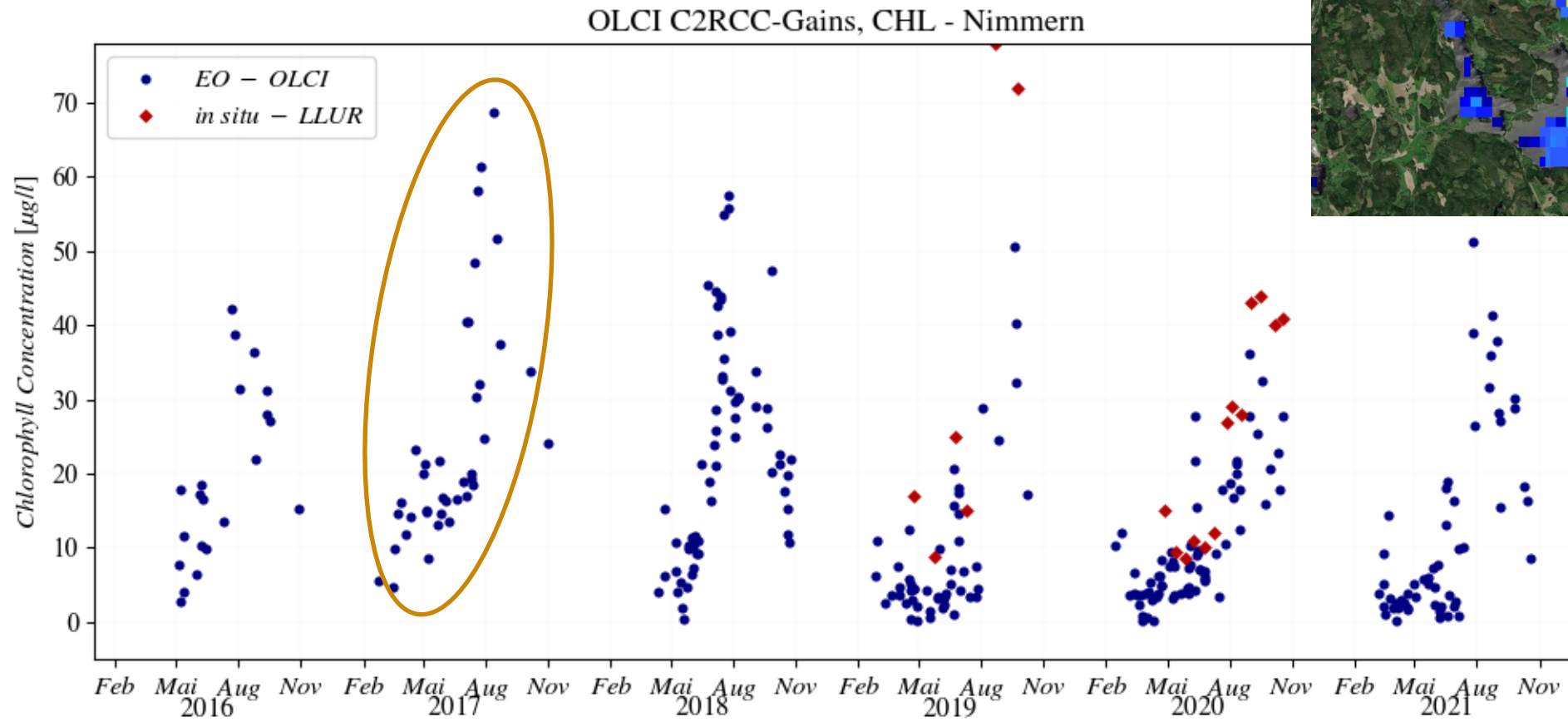
## Comparison between CHL\_NN Collection 3 (left) and C2RCC gains (right)

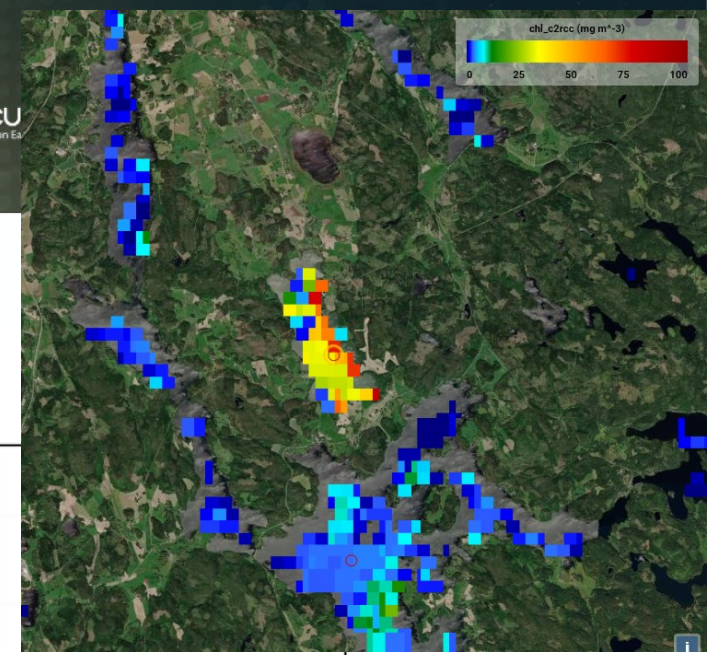


→ Different matchup numbers (different flagging applied) 3x less for Collection 3 but statistics comparatively less different

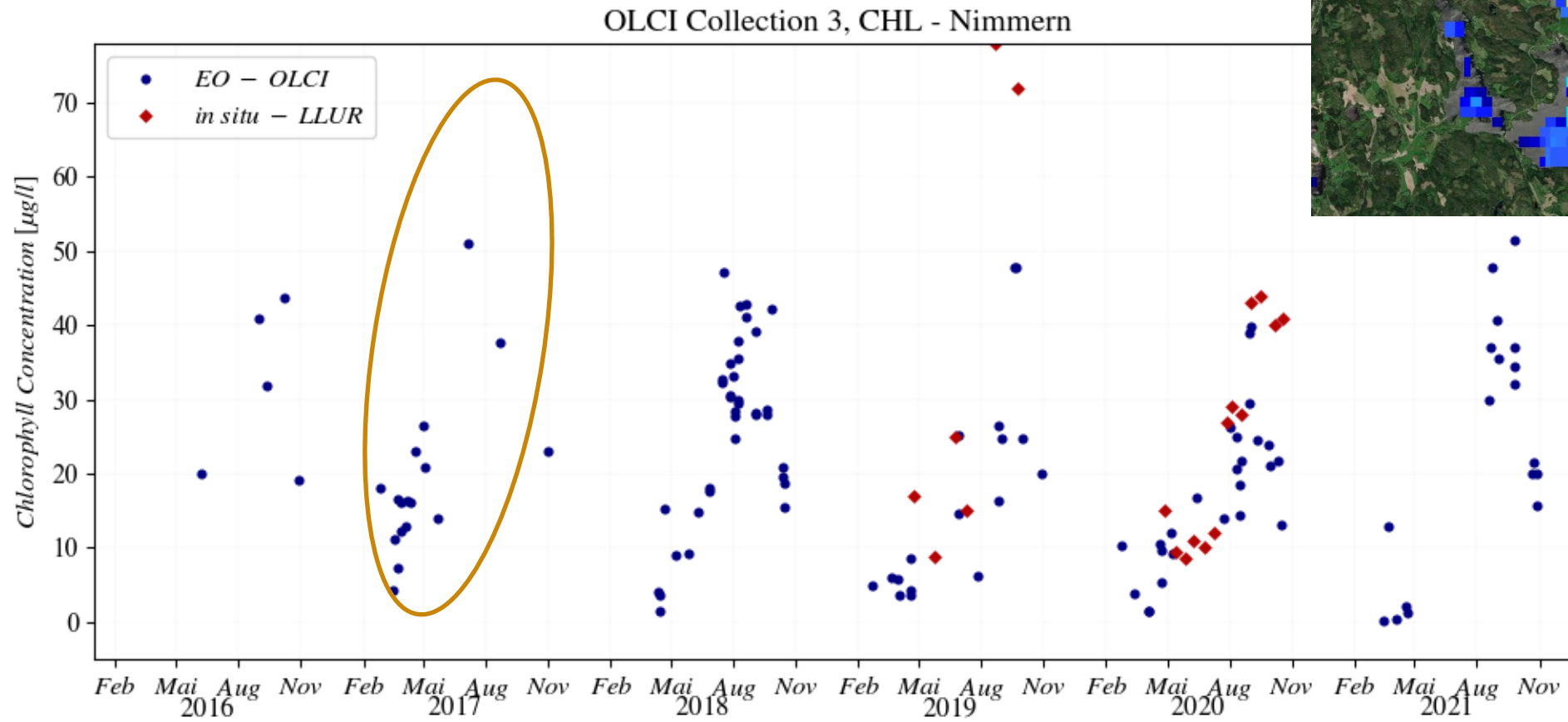


## Timeseries Comparisons – C2RCC gains

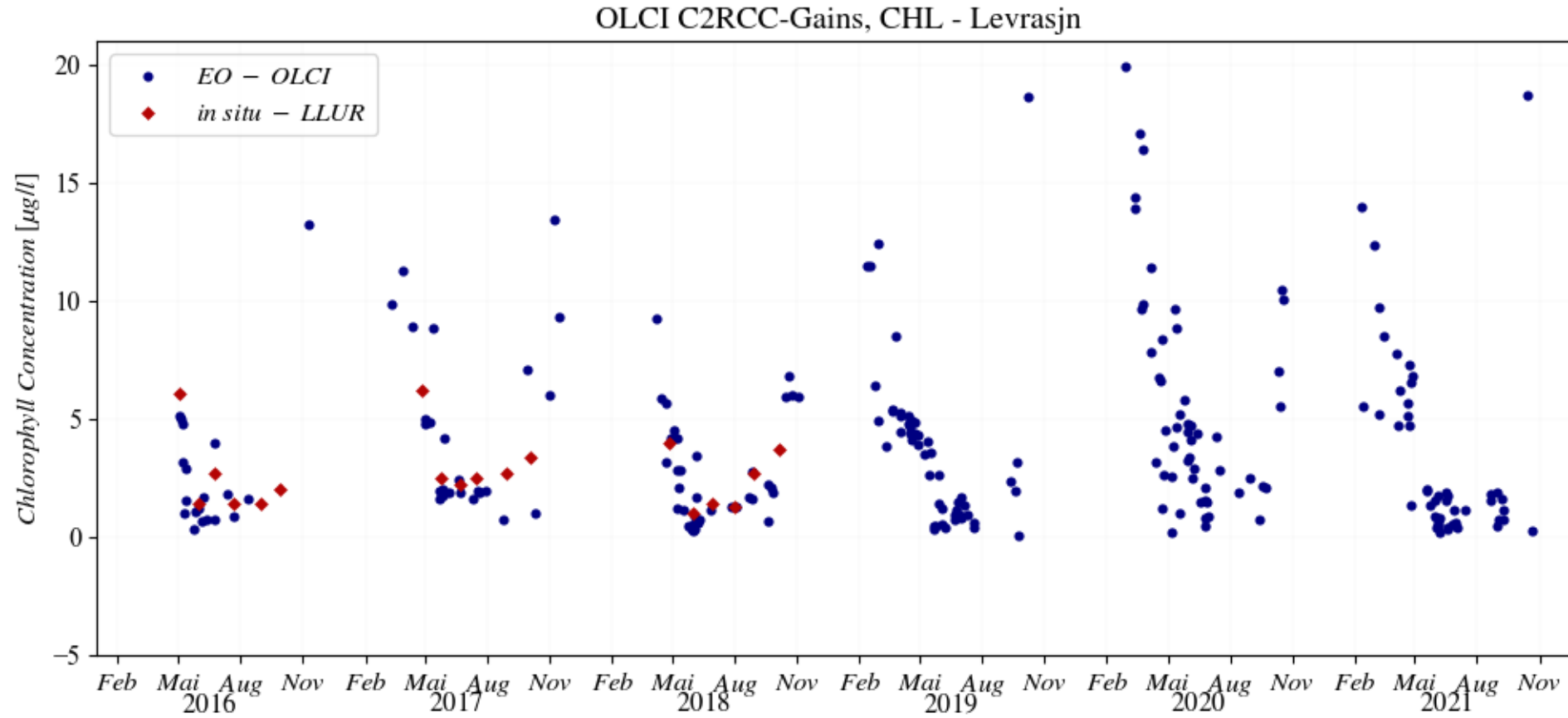




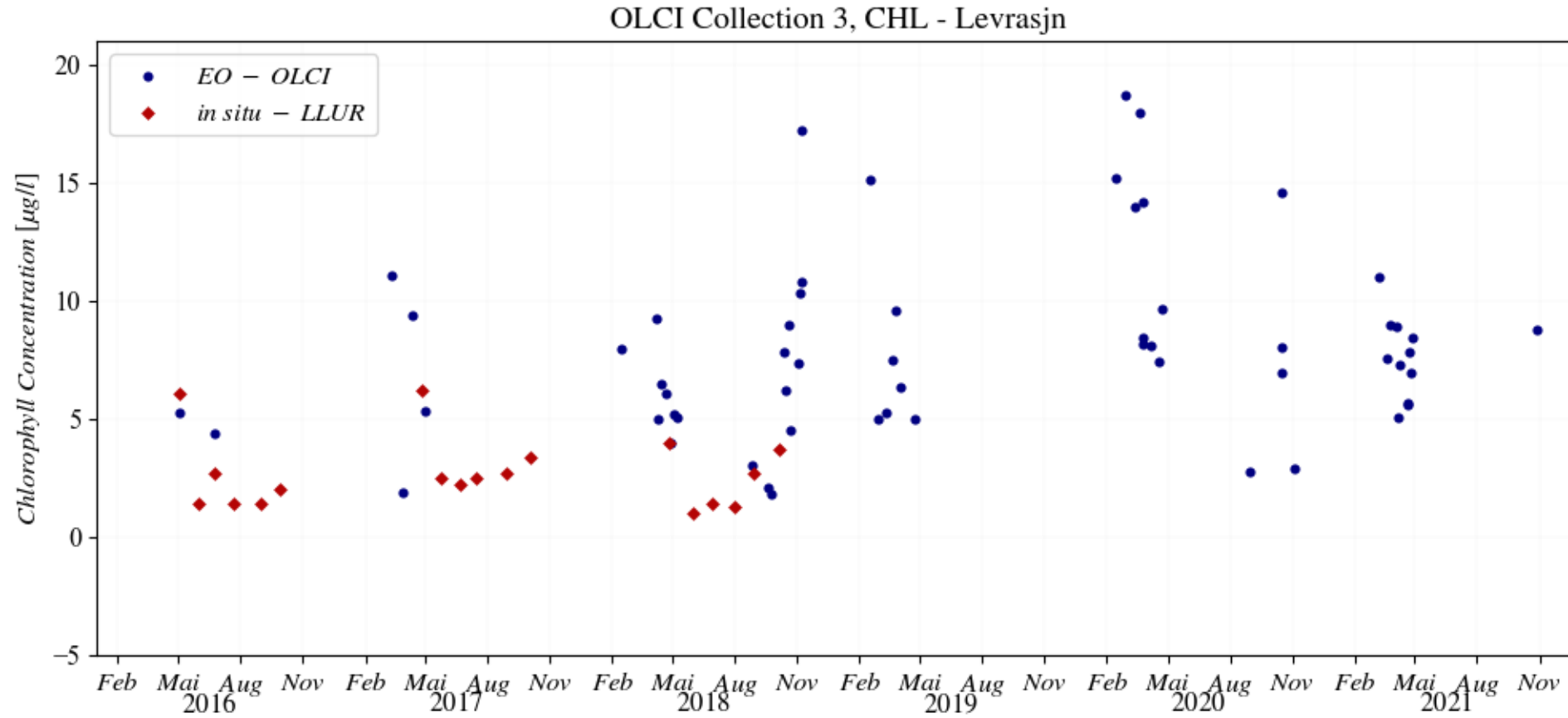
## Timeseries Comparisons – CHL\_NN Collection 3



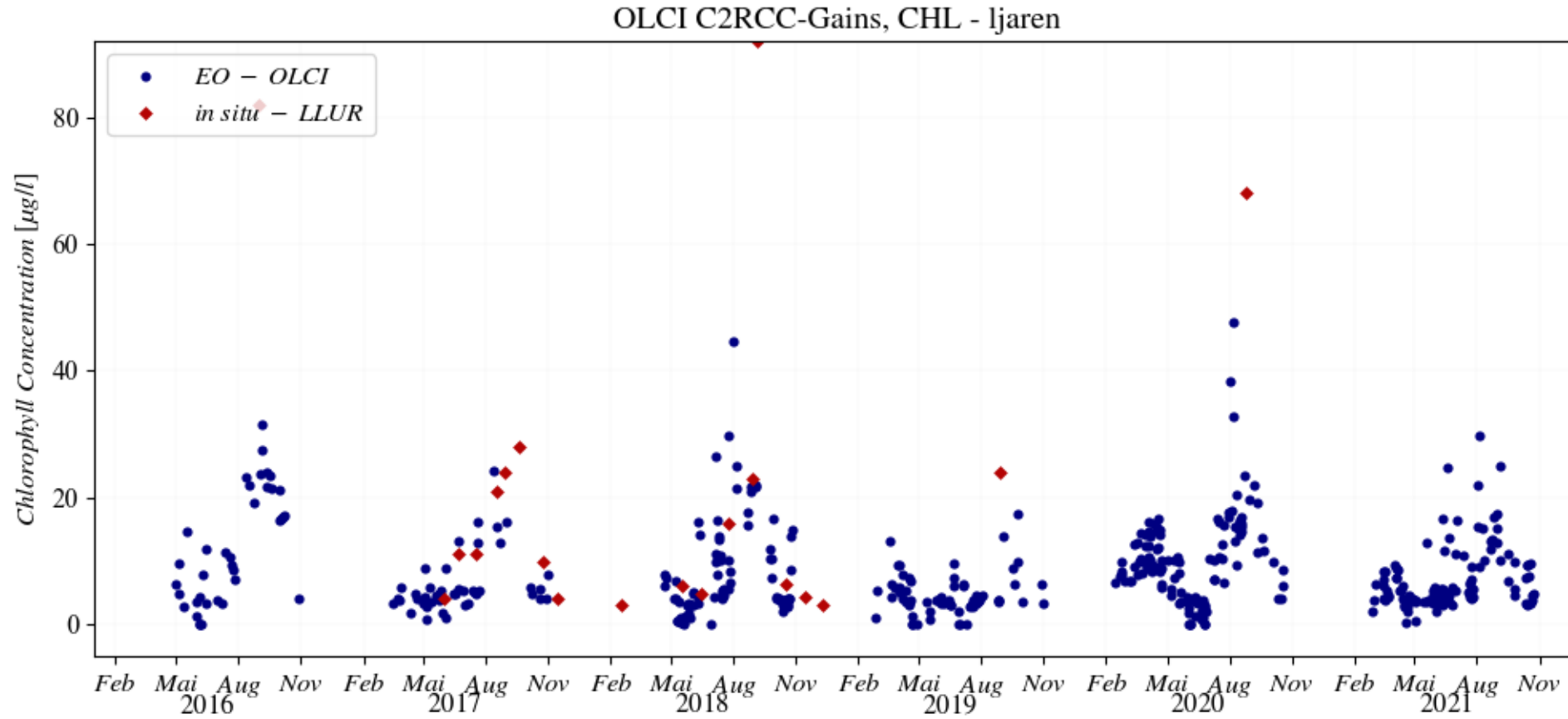
## Timeseries Comparisons – C2RCC gains



## Timeseries Comparisons – CHL\_NN Collection 3

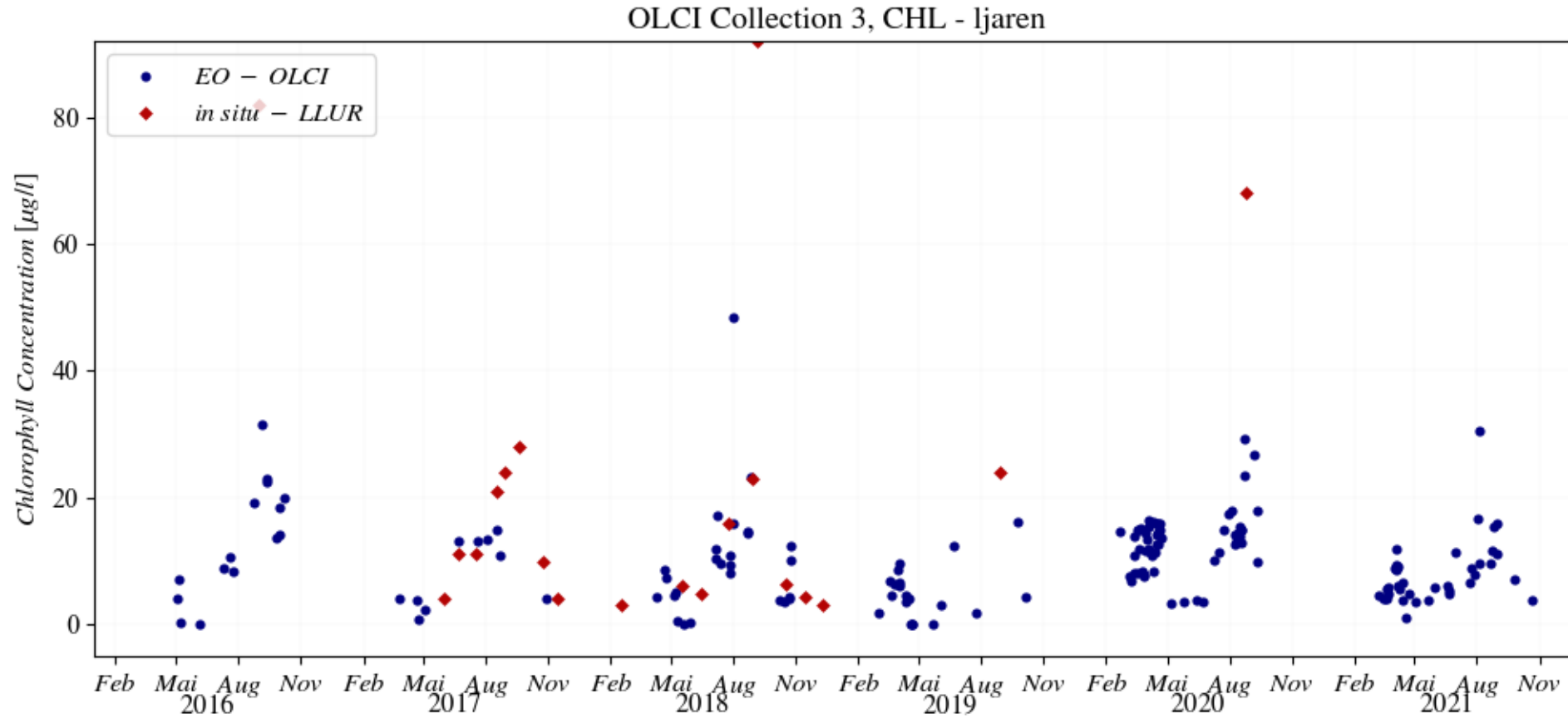


## Timeseries Comparisons – C2RCC gains

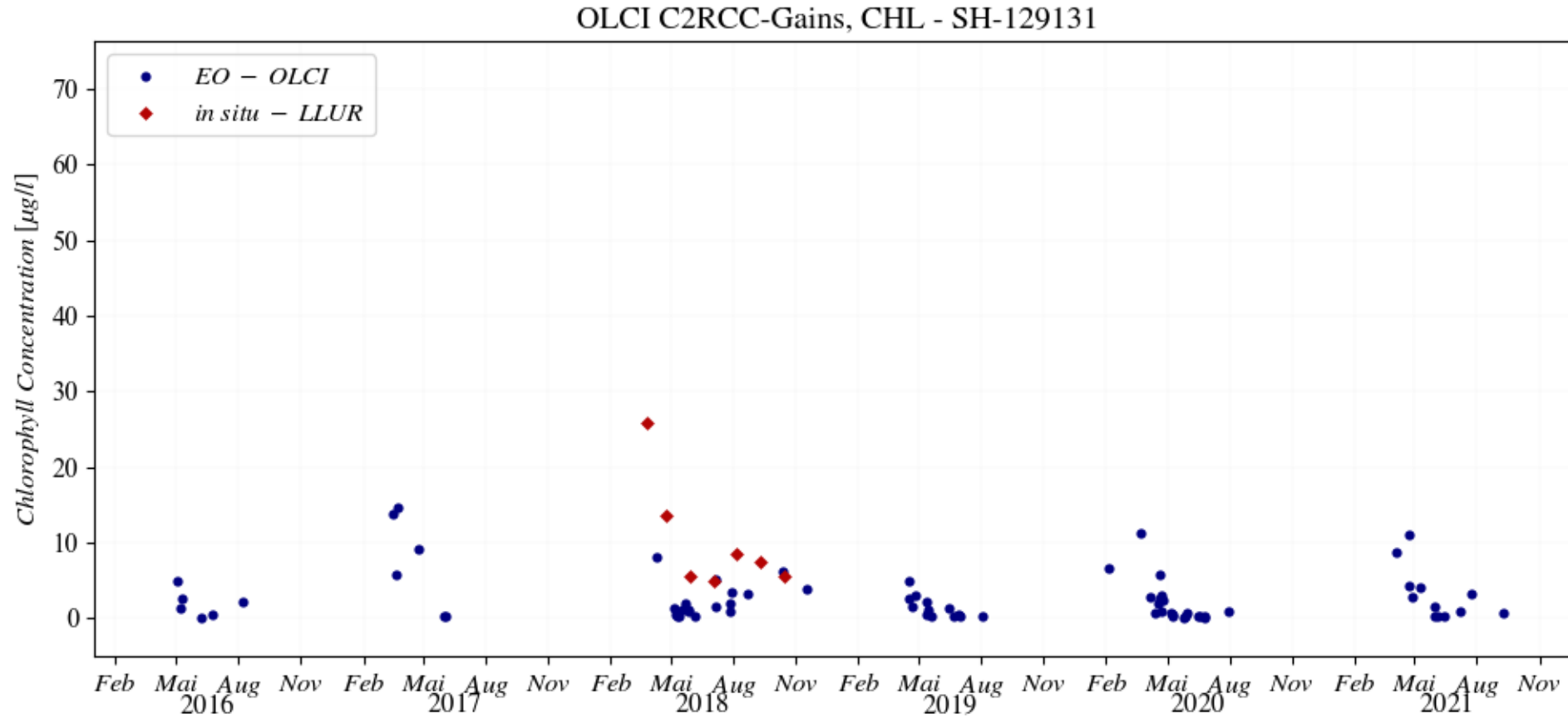




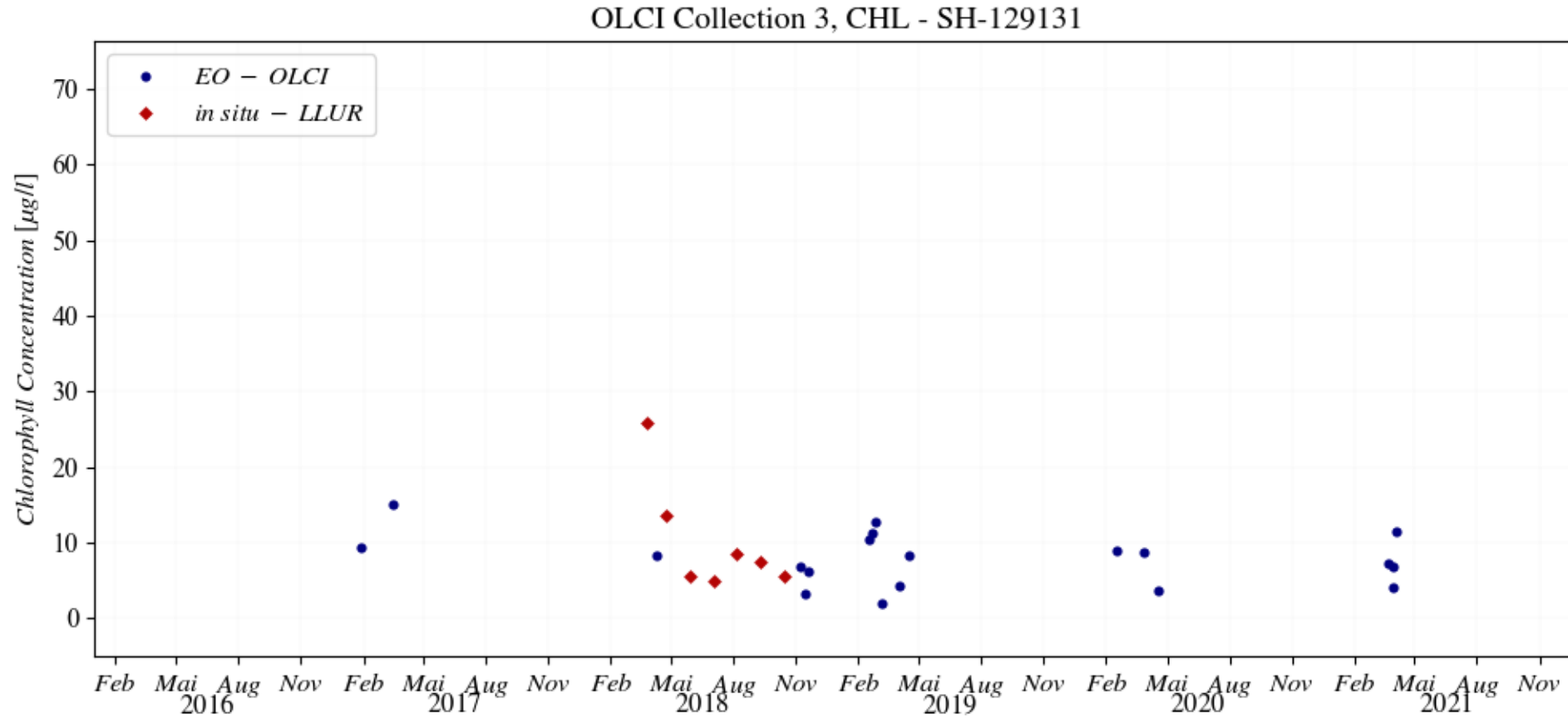
## Timeseries Comparisons – CHL\_NN Collection 3



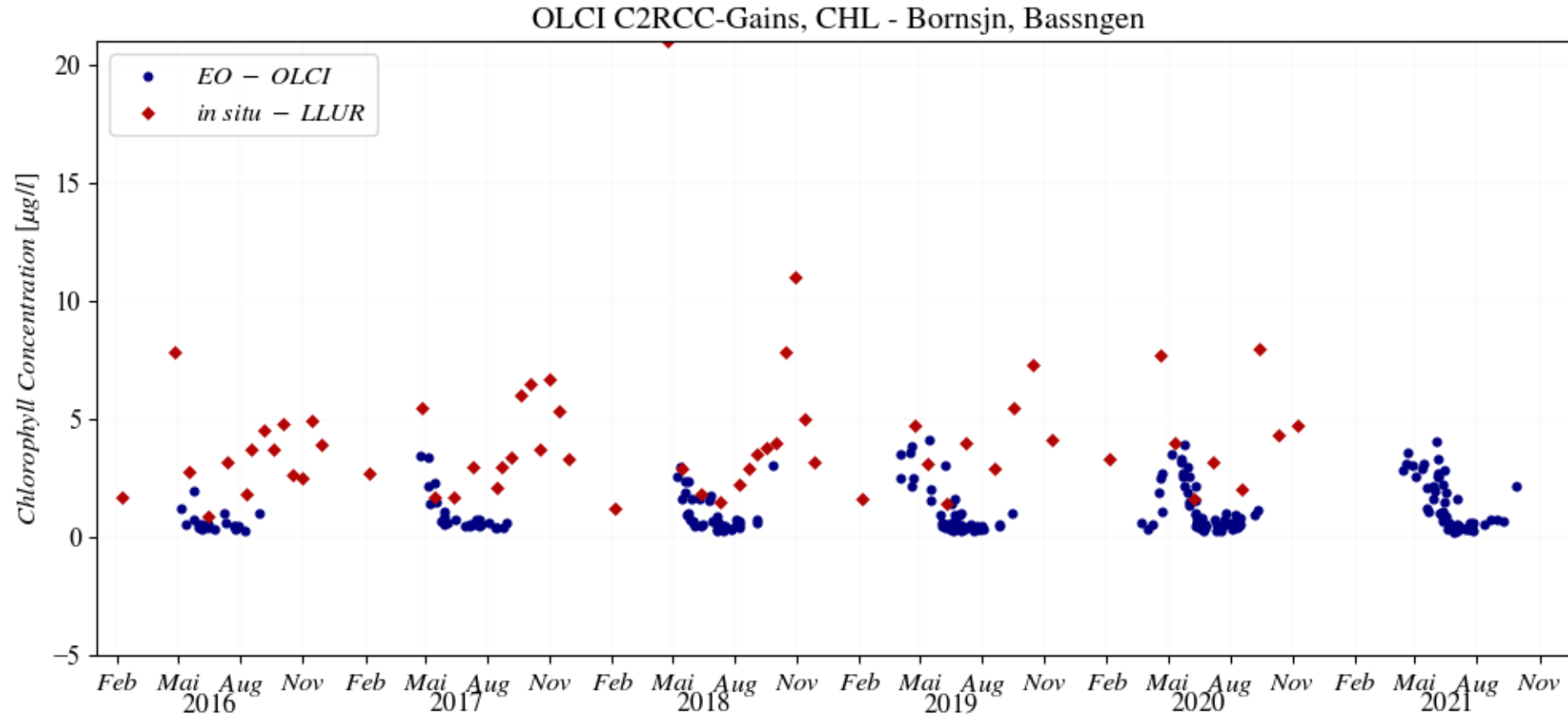
## Timeseries Comparisons – C2RCC gains



## Timeseries Comparisons – CHL\_NN Collection 3



## Timeseries Comparisons – C2RCC gains

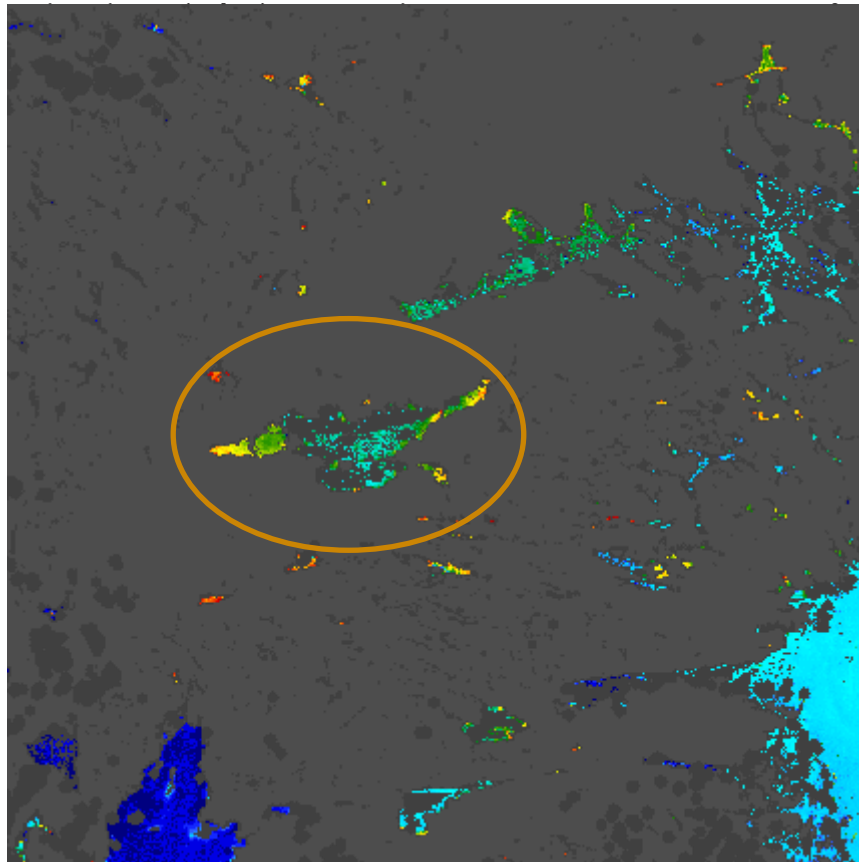




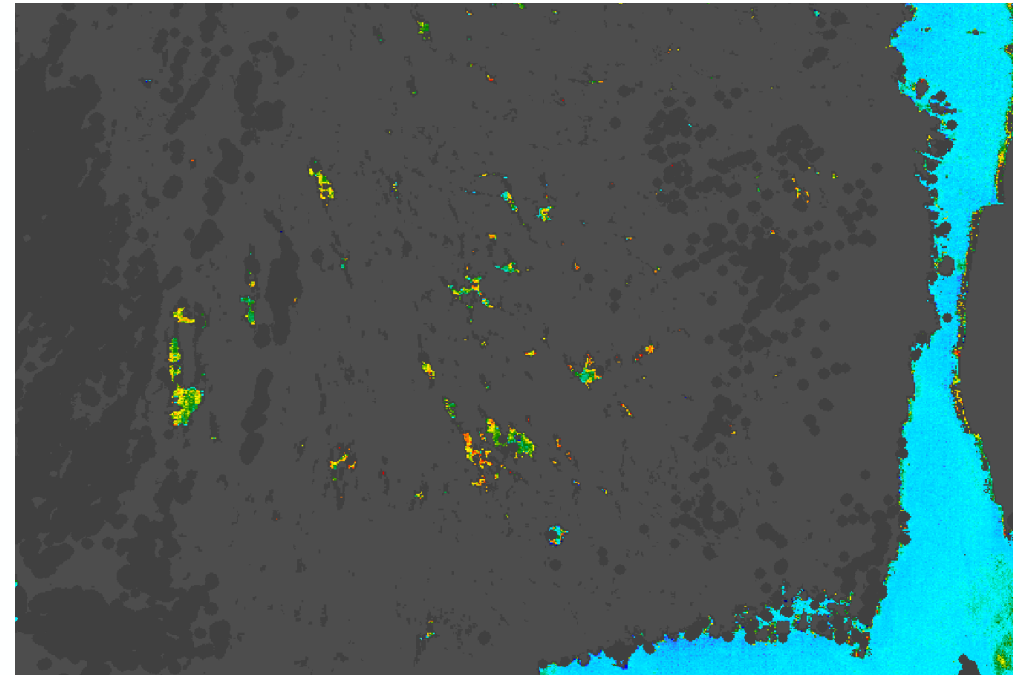
19.08.2020



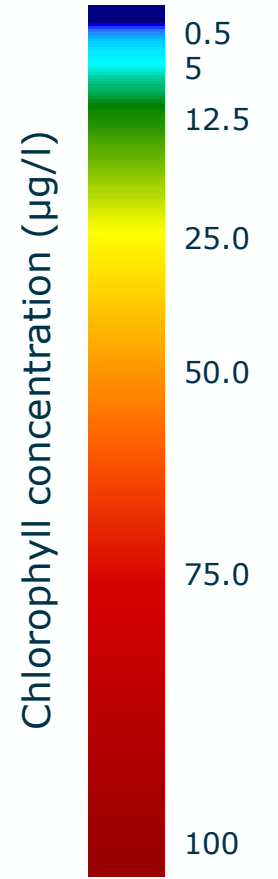
22.09.2022



19.08.2020



22.09.2022



Chlorophyll concentration ( $\mu\text{g/l}$ )

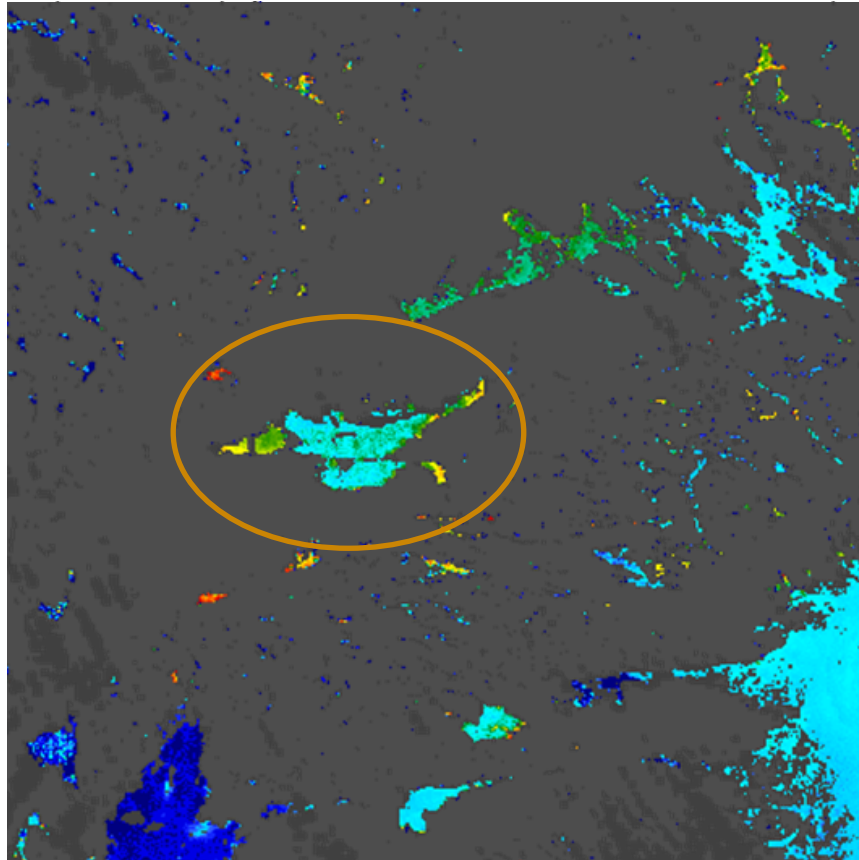
# CHL C2RCC gains



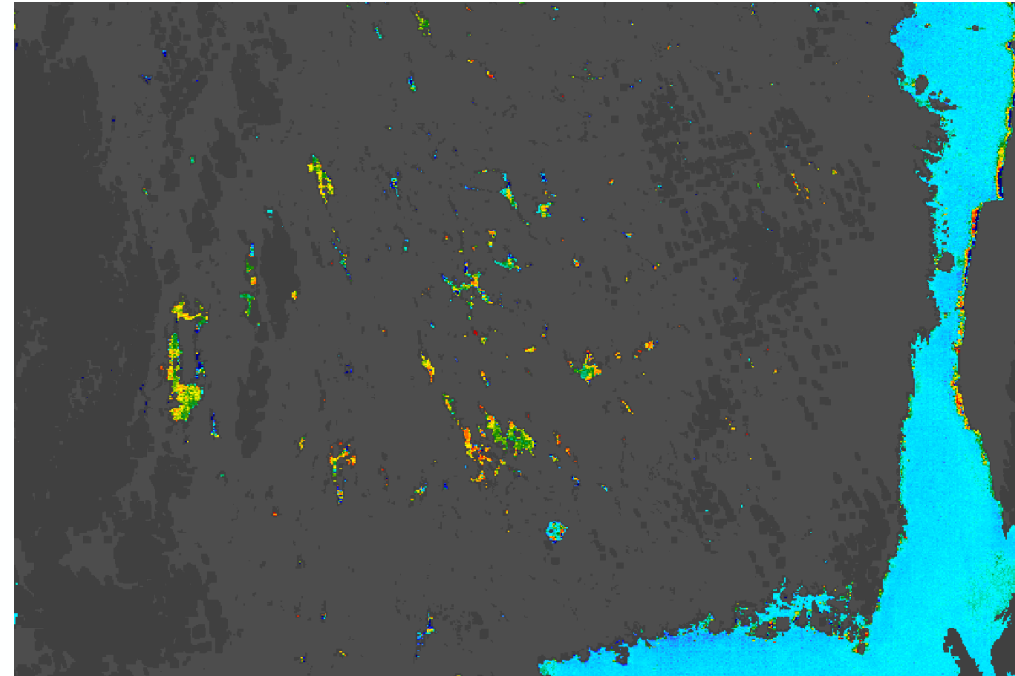
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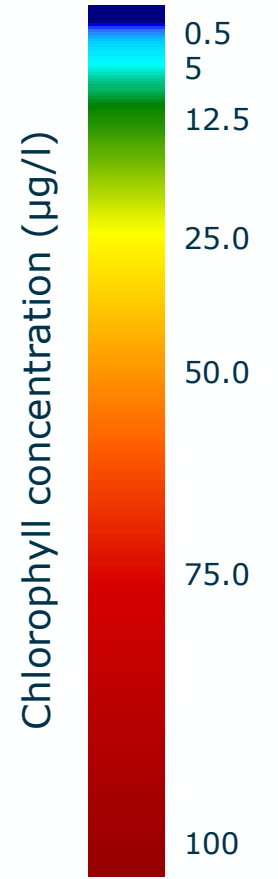
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19.08.2020

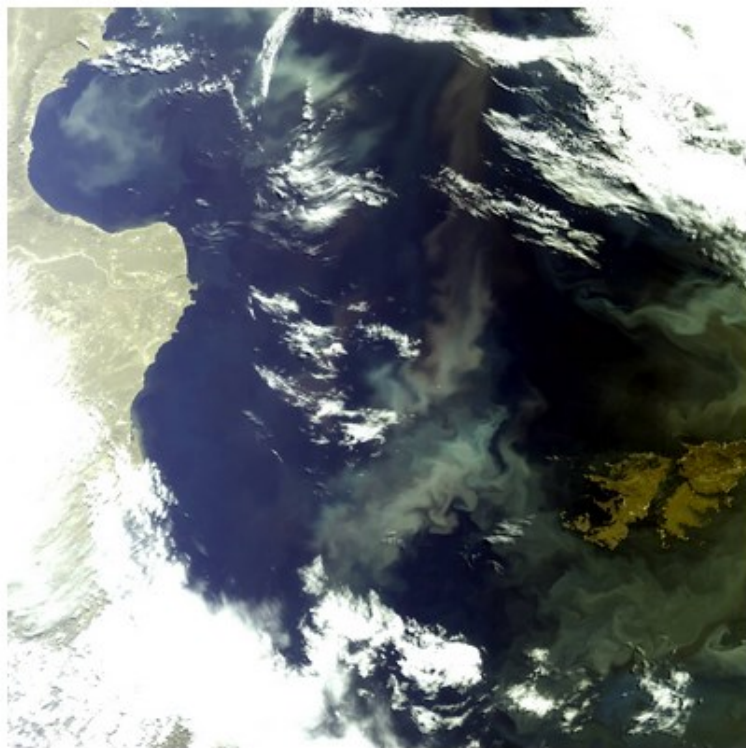


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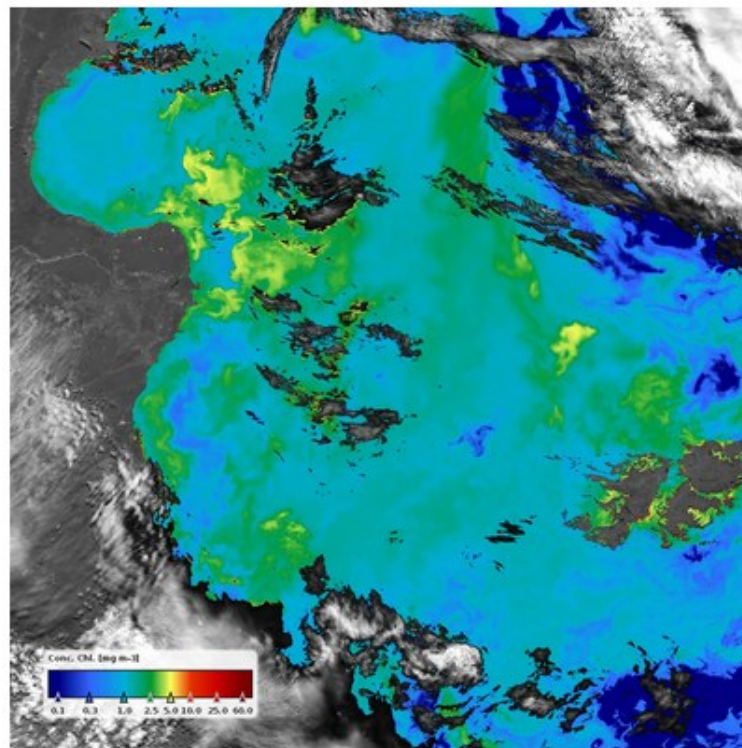


# C2RCC Community Project

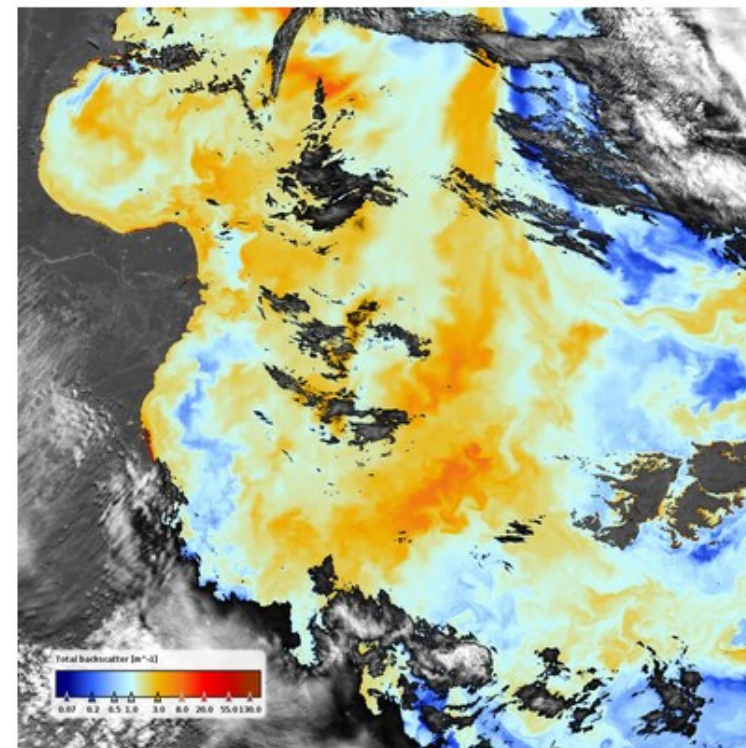
Atmospheric correction and in-water processing of optical earth observation data



Atmospheric correction and retrieval of water constituents from optical satellite imagery acquired by a variety of sensors



Available for all relevant optical satellite imagery.



Open source code, plug-in to the SNAP toolbox and maintained by the Water Colour Community.





## C2RCC Community Project – <https://c2rcc.org>

Operator freely available through SNAP toolbox - Source code freely available on Github

Since 2022 water colour community is entrusted (completely) with C2RCC as a Community Project:

- models that link optical with biogeochemical parameters (assess and use optical properties of both gases and water constituents)
- optical water type classification (OWT)
- phytoplankton diversity
- training datasets derived by RT modelling (well referenced to IOPs)
- trained neural nets (AC, AAN, forward and inversion for water constituents, uncertainties...)
- applicability to new sensors

Commitment to support the Community Project from Brockmann Consult, M. Hieronimi and R. Röttgers (HEREON),  
Petra Philipson (Brockmann Geomatics) and K. Sorensen (Ocean Optics)

Join us and get involved : [hello@c2rcc.org](mailto:hello@c2rcc.org)





## Conclusions

CHL\_NN Coll3 clearly improves for lakes and coastal waters

High chlorophyll concentrations underestimated by CHL\_NN (often Cyanobacteria blooms)

Flagging is key – no news but good to point out again

Not only match-ups are telling the story - Users are interested in temporal evolution of their lakes, thus time series analyses are very important for validation and user acceptance