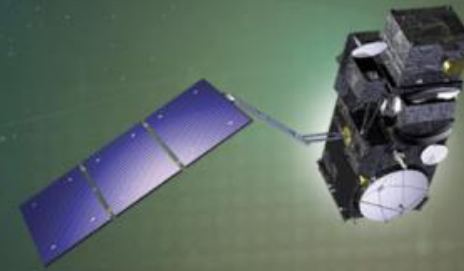




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## Atmospheric corrections in view of diverse optical water types

Martin Hieronymi<sup>1</sup>, Shun Bi<sup>1</sup>, Eike M. Schütt<sup>1,2</sup>, Daniel Behr<sup>1</sup>, Dagmar Müller<sup>3</sup>,

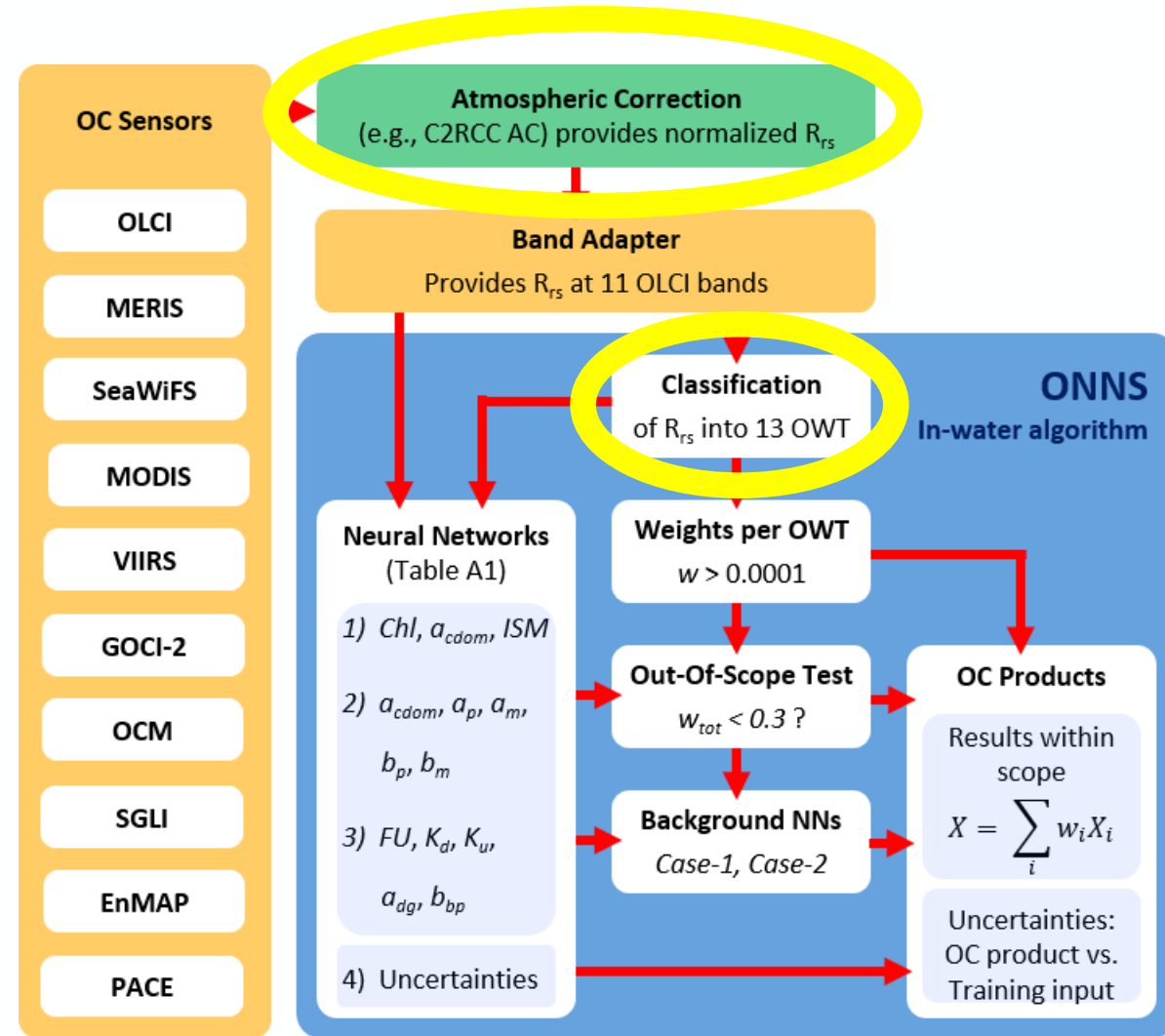
Kerstin Stelzer<sup>3</sup>, Carsten Brockmann<sup>3</sup>, Carole Lebreton<sup>3</sup>, François Steinmetz<sup>4</sup> & Quinten Vanhellemont<sup>5</sup>

1) Helmholtz-Zentrum Hereon, Germany, 2) Kiel University, Germany, 3) Brockmann Consult, Germany, 4) HYGEOS, France, 5) Royal Belgian Institute of Natural Sciences, Belgium



## Algorithm Developments at Hereon

- OLCI Neural Network Swarm (ONNS)
- Ocean Colour algorithm for the aquatic continuum Land-Coast-Ocean
- Utilization of Fuzzy Logic-based Optical Water Type classification
- OWT-specialized Neural Networks
- Delivers diverse IOPs, concentrations, light field & uncertainties

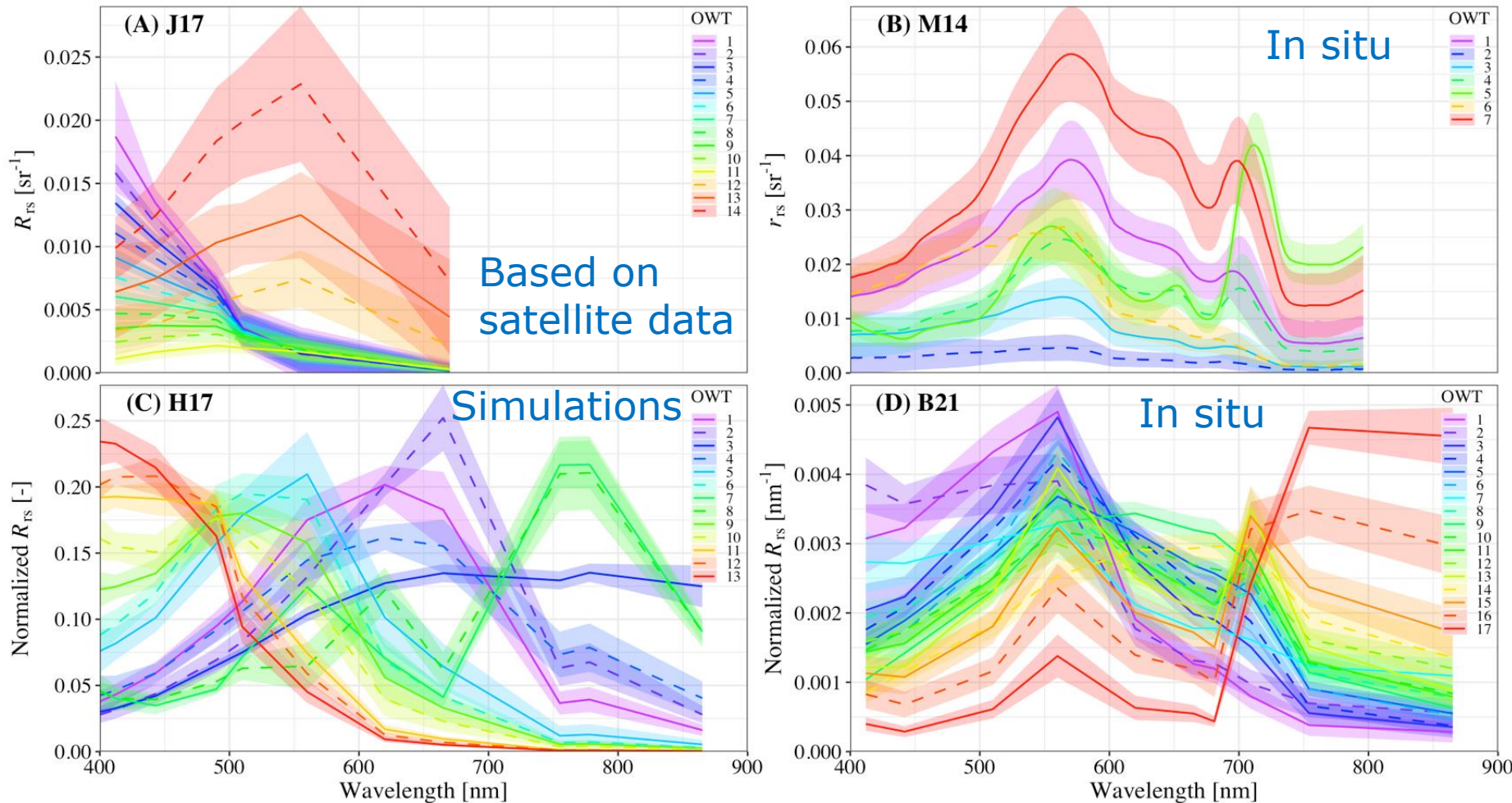


Hieronymi, M., Müller, D., & Doerffer, R. (2017). The OLCI Neural Network Swarm (ONNS): a bio-geo-optical algorithm for open ocean and coastal waters. *Frontiers in Marine Science*

Hieronymi, M. (2019). Spectral band adaptation of ocean color sensors for applicability of the multi-water biogeo-optical algorithm ONNS. *Optics Express*



## Optical Water Type Classification



Diverse OLCI-usable OWT frameworks for ocean and inland waters available for selecting of optimal algorithms and blending of results (beyond Case-1 & -2)

Jackson et al. 2017  
 Moore et al. 2014  
 Hieronimi et al. 2017  
 Bi et al. 2021



## Requirements to Atmospheric Correction

- Provide results for the entire spectrum
  - For OLCI usually 16 (out of 21) bands from 400 to 1020 nm
- Cover all colours
  - Blue (oligotrophic) ocean, green (hyper-eutrophic) lakes, red tides, etc.
- Cover all magnitudes
  - Dark (high CDOM) to bright (high NAP)
- Provide realistic spectral shapes of Rrs that are requested by OWT frameworks
  - No available atmospheric correction methods can meet these requirements adequately
  - Rrs can be well classifiable in OWT framework, but is actually obviously wrong



## New Atmospheric Correction for OLCI developed at Hereon

### Atmospheric Correction for Optical Water Types → A40

- Further-development of C2RCC
- Ensemble of “globally valid” Neural Networks → enables uncertainty estimate
- Optimization on spectral shape of Rrs → well OWT classifiability with ONNS framework
- Designed for inland, coastal and oceanic waters
- Consideration of phytoplankton diversity
- Reduction of spatial and spectral noise (e.g. South Atlantic Anomaly)
- Improved cloud flagging
- By-product whitecap fraction, mask for floating staff, ...



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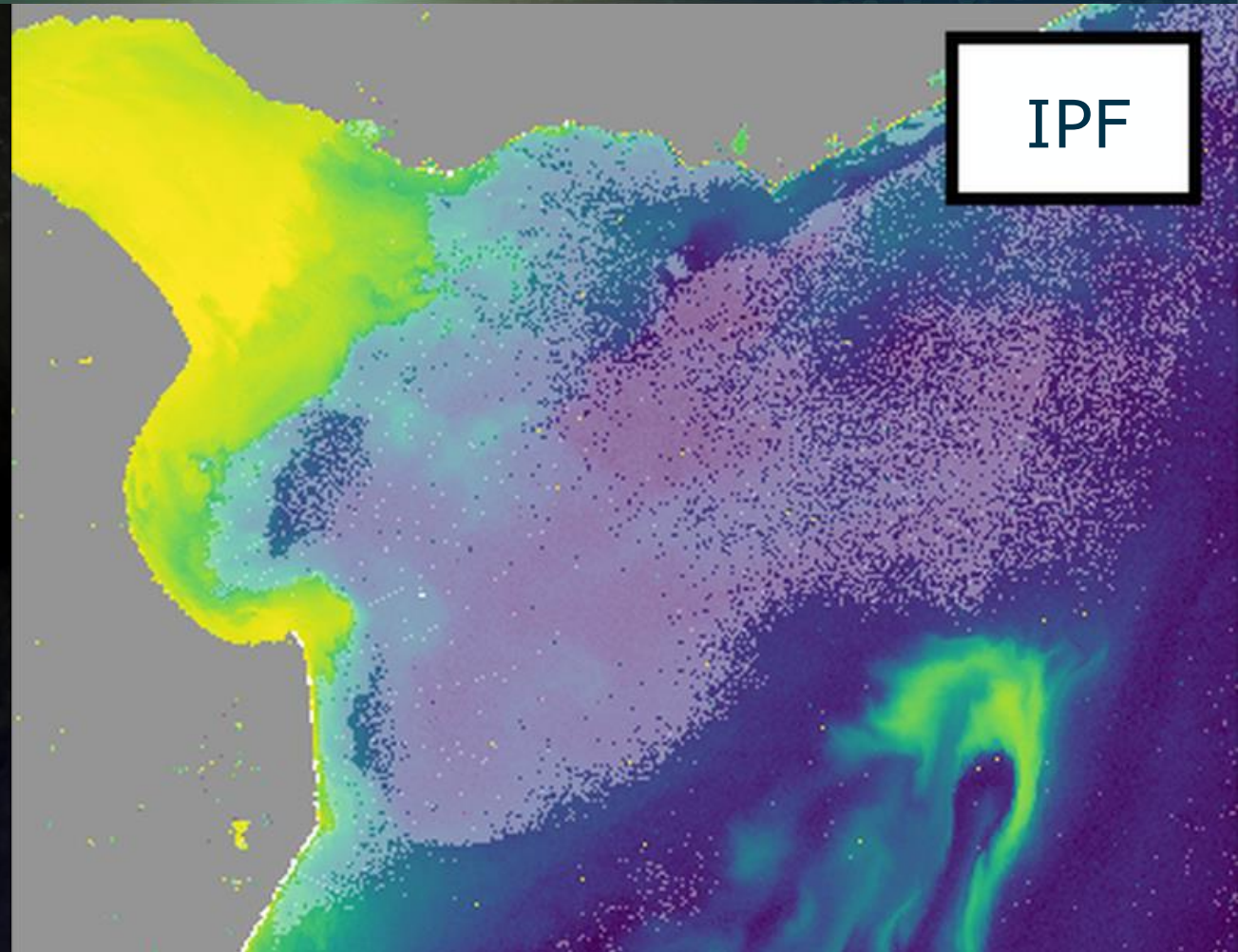
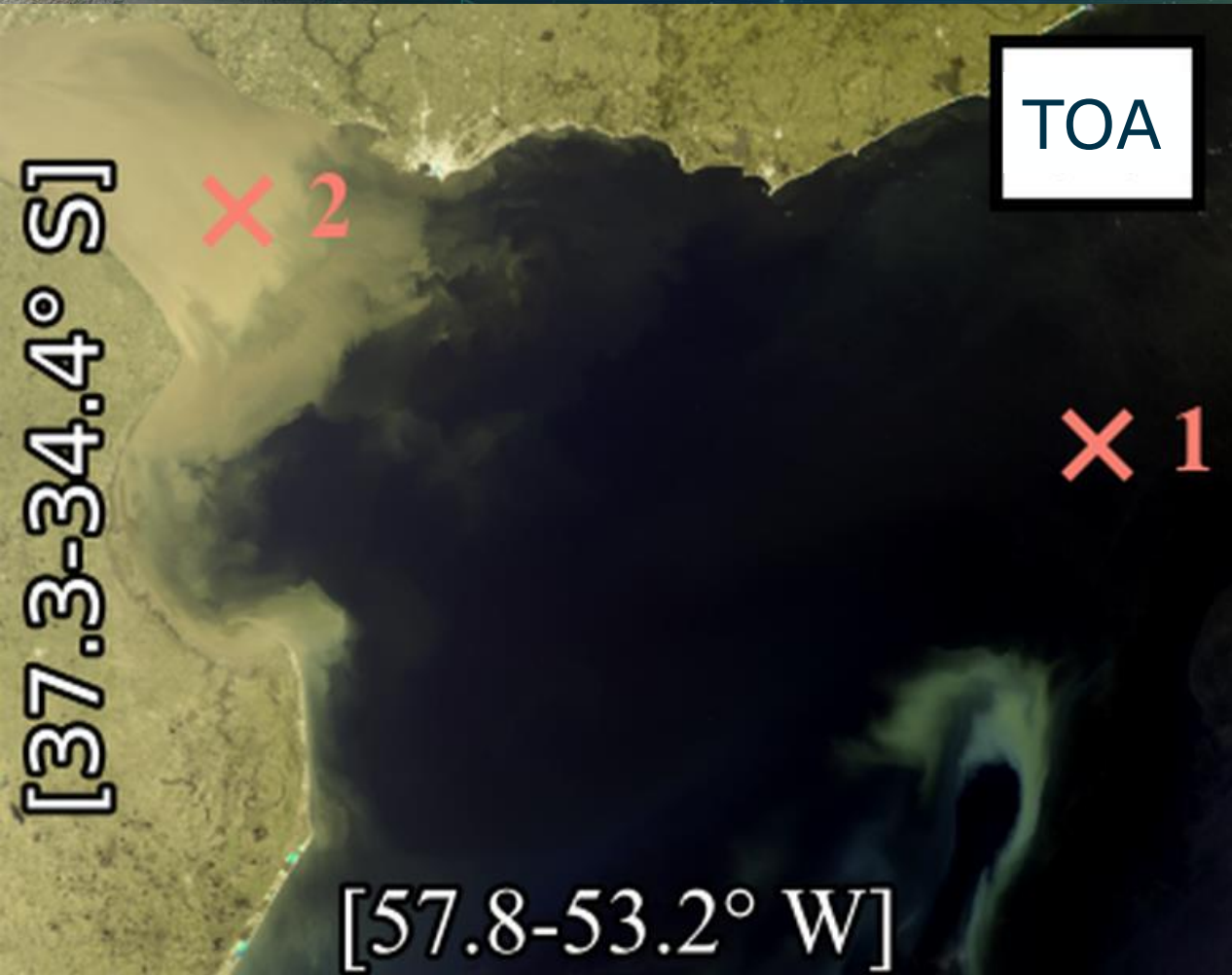
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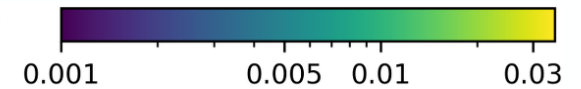


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Rio de la Plata, Atlantic Ocean Rrs < 0 in grey transparent

Rrs 560 nm [sr<sup>-1</sup>]





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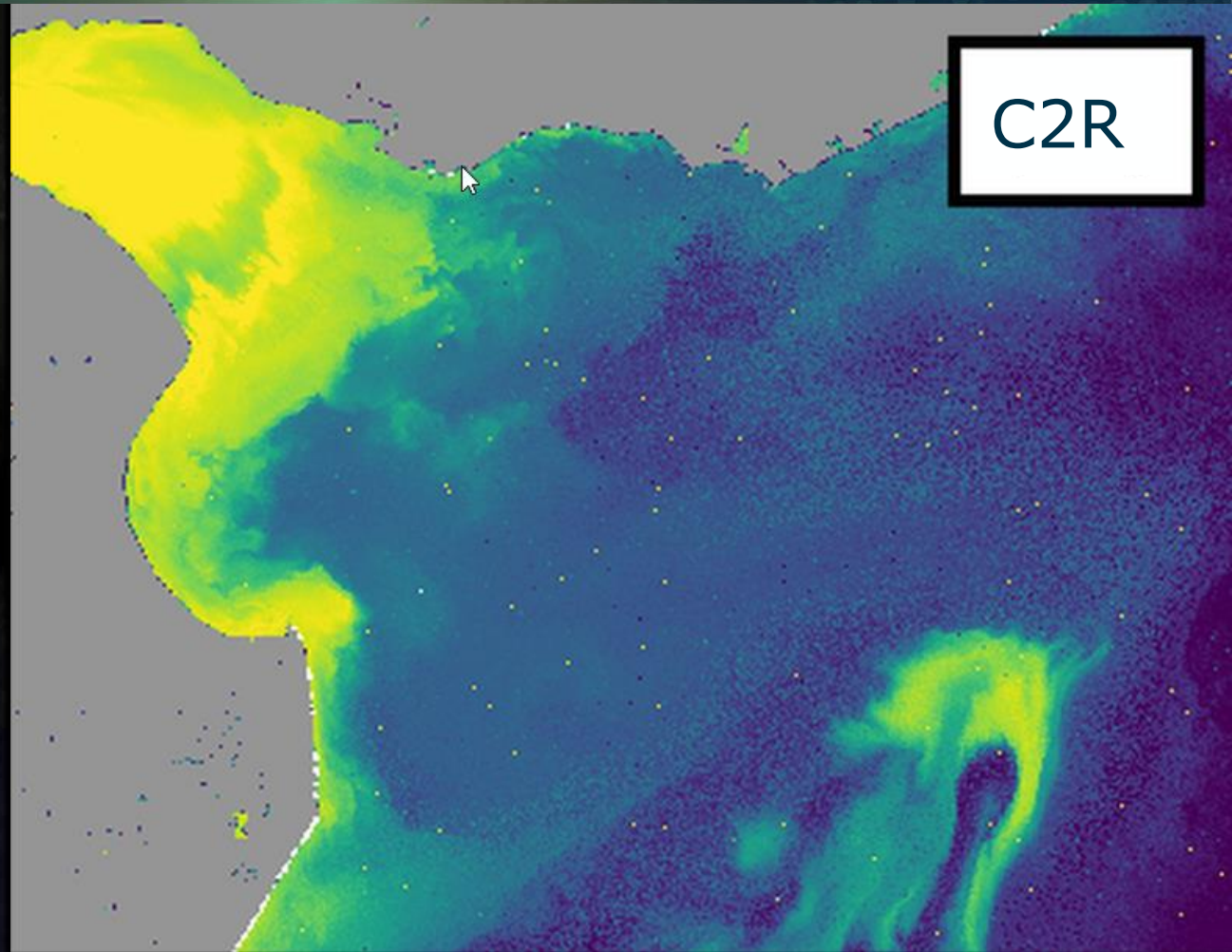
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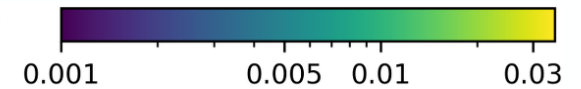


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Rio de la Plata, South Atlantic Ocean

Rrs 560 nm  
[sr<sup>-1</sup>]



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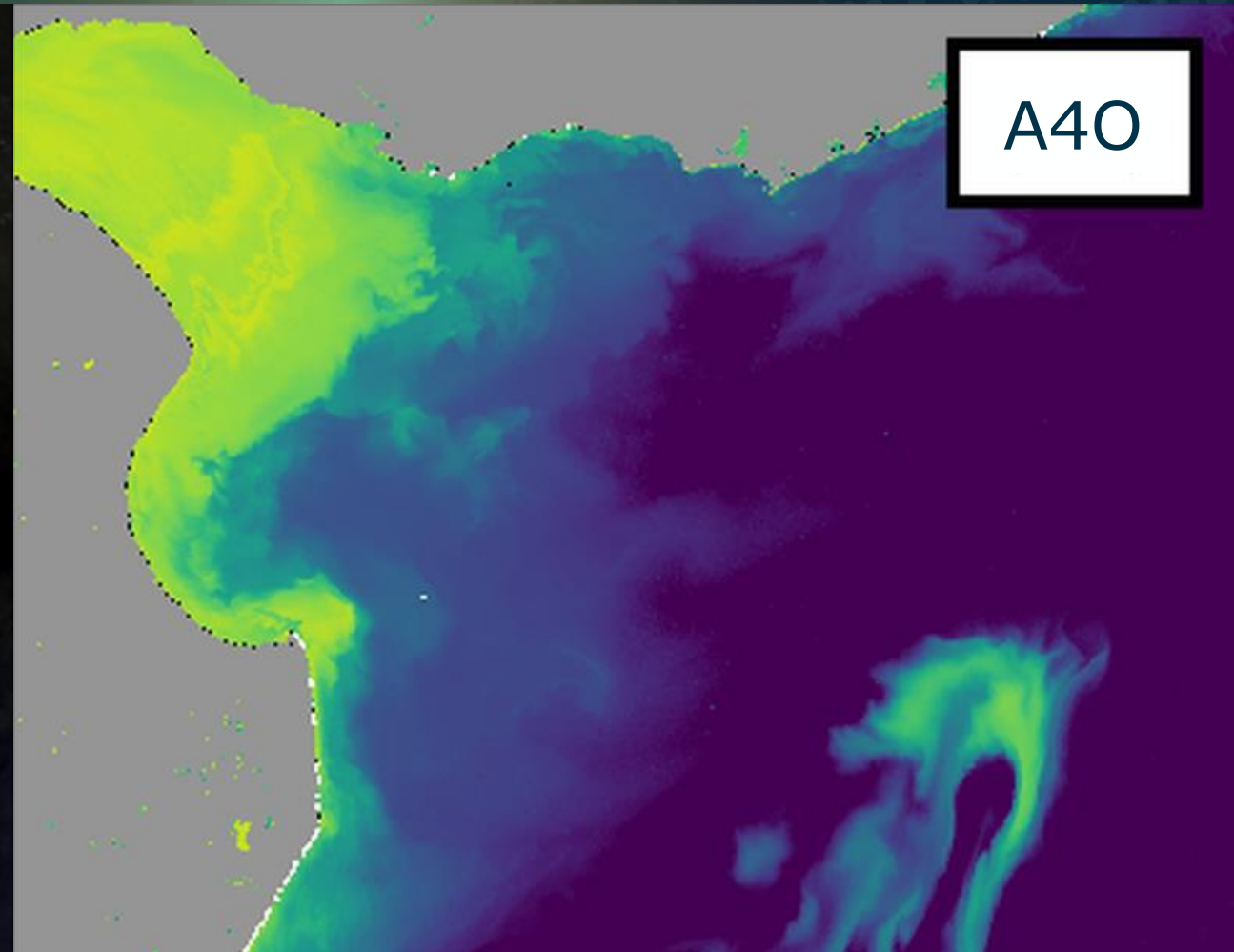
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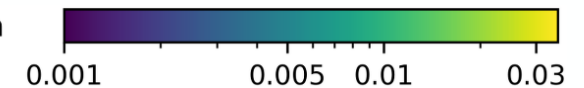


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Rio de la Plata, South Atlantic Ocean

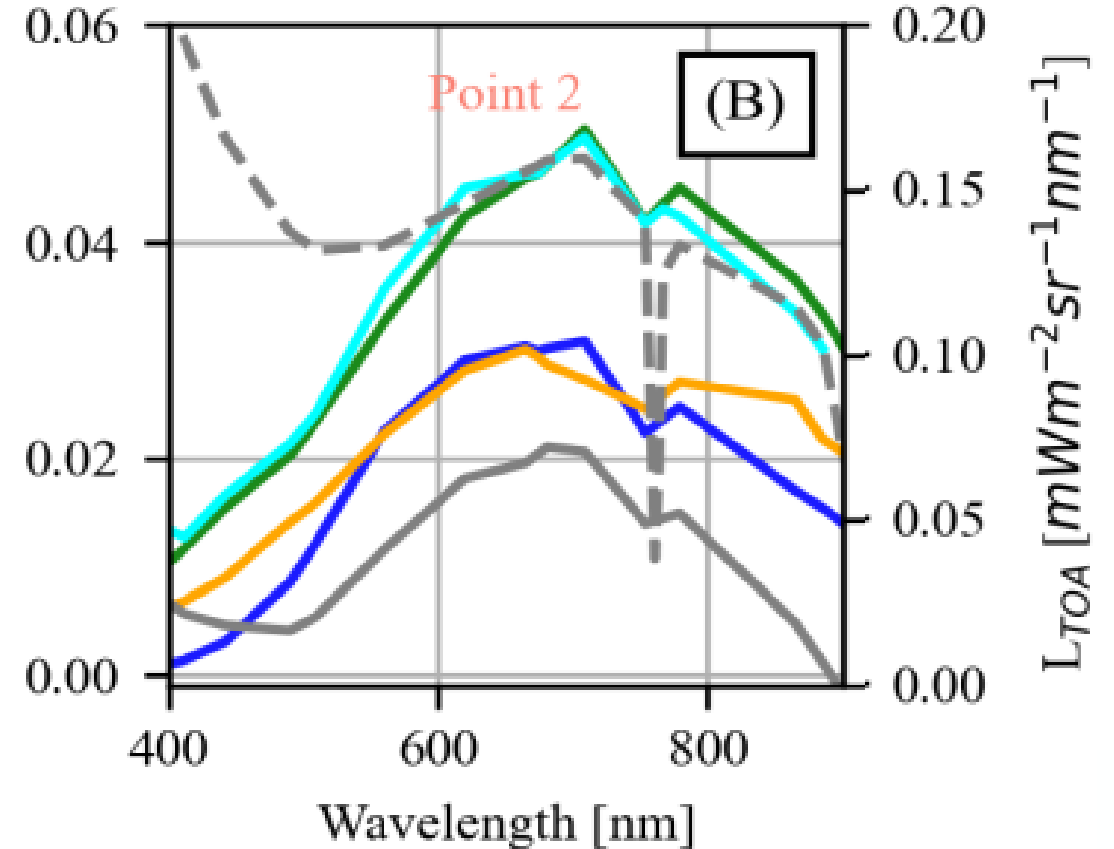
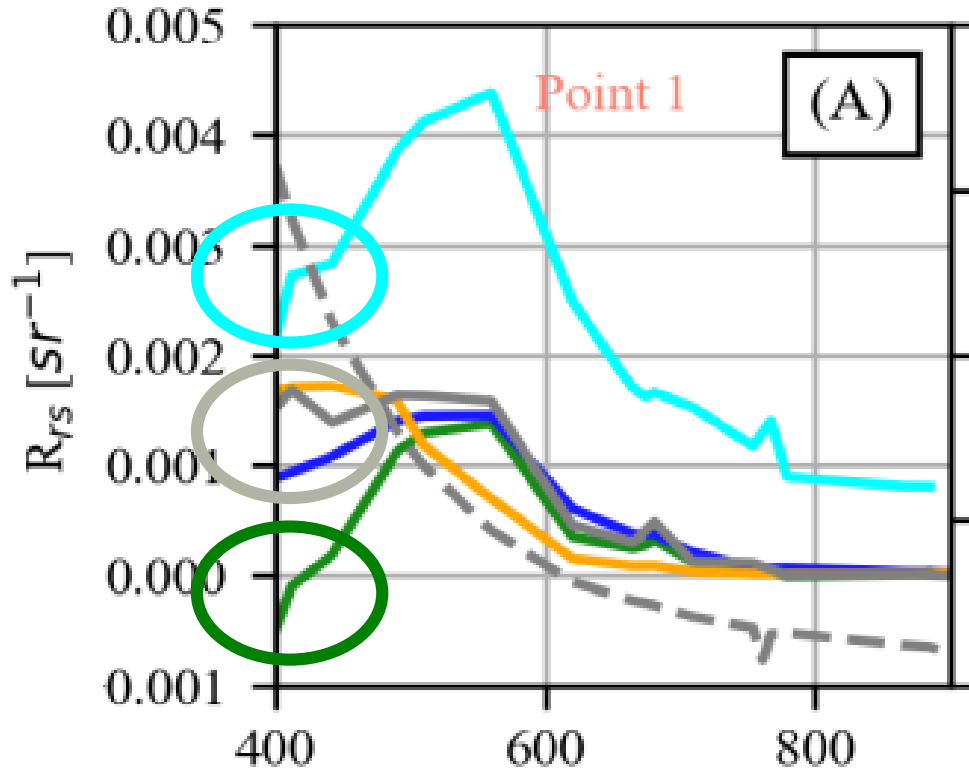
Rrs 560 nm  
[sr<sup>-1</sup>]





## Dark Ocean (Shelf) & Bright Waters

IPF Rrs shape reasonable



IPF Rrs at blue bands problematic for OWT

A40

L2 BAC: IPF

L2 AAC: C2RCC

POLYMER

DSF-Acolite

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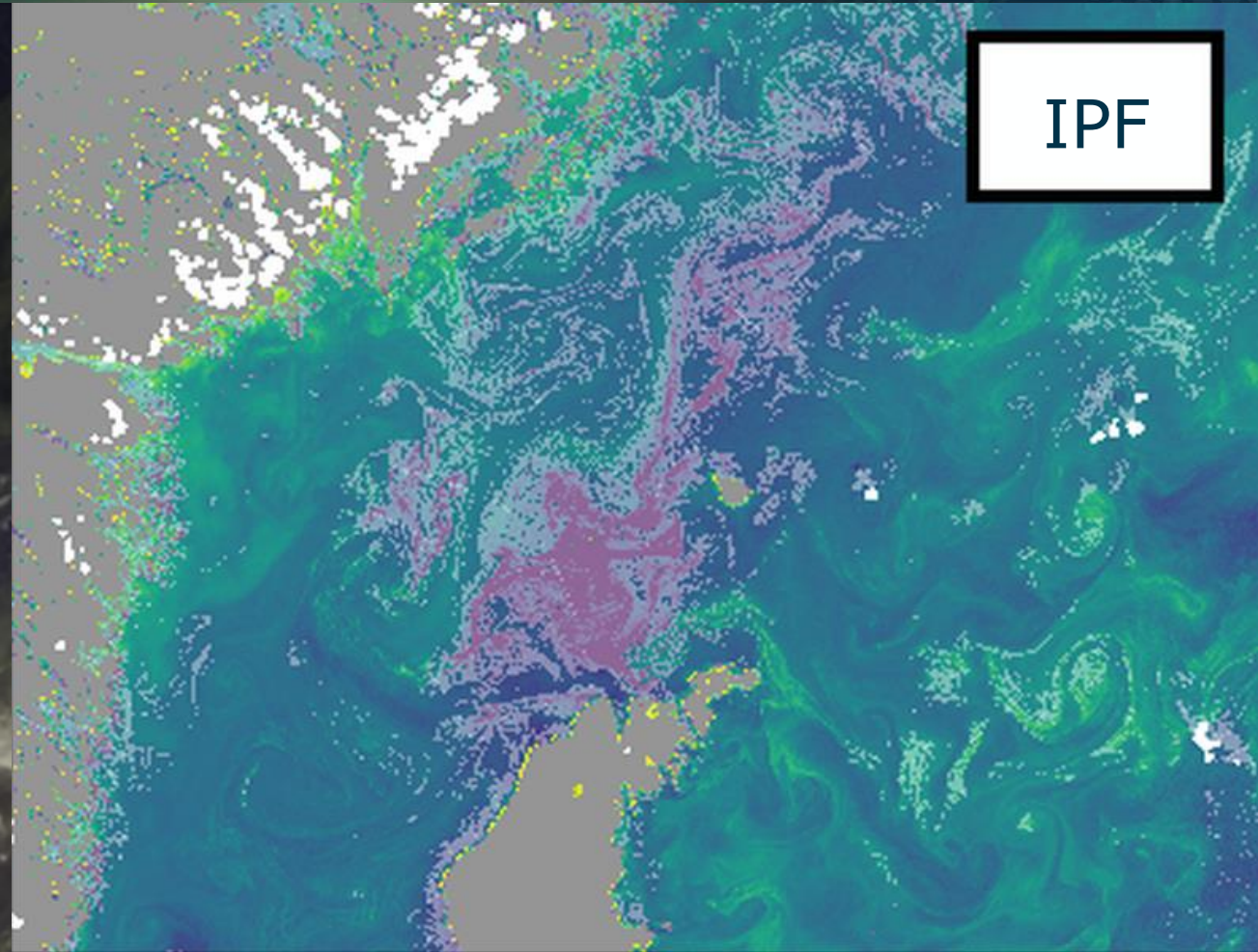
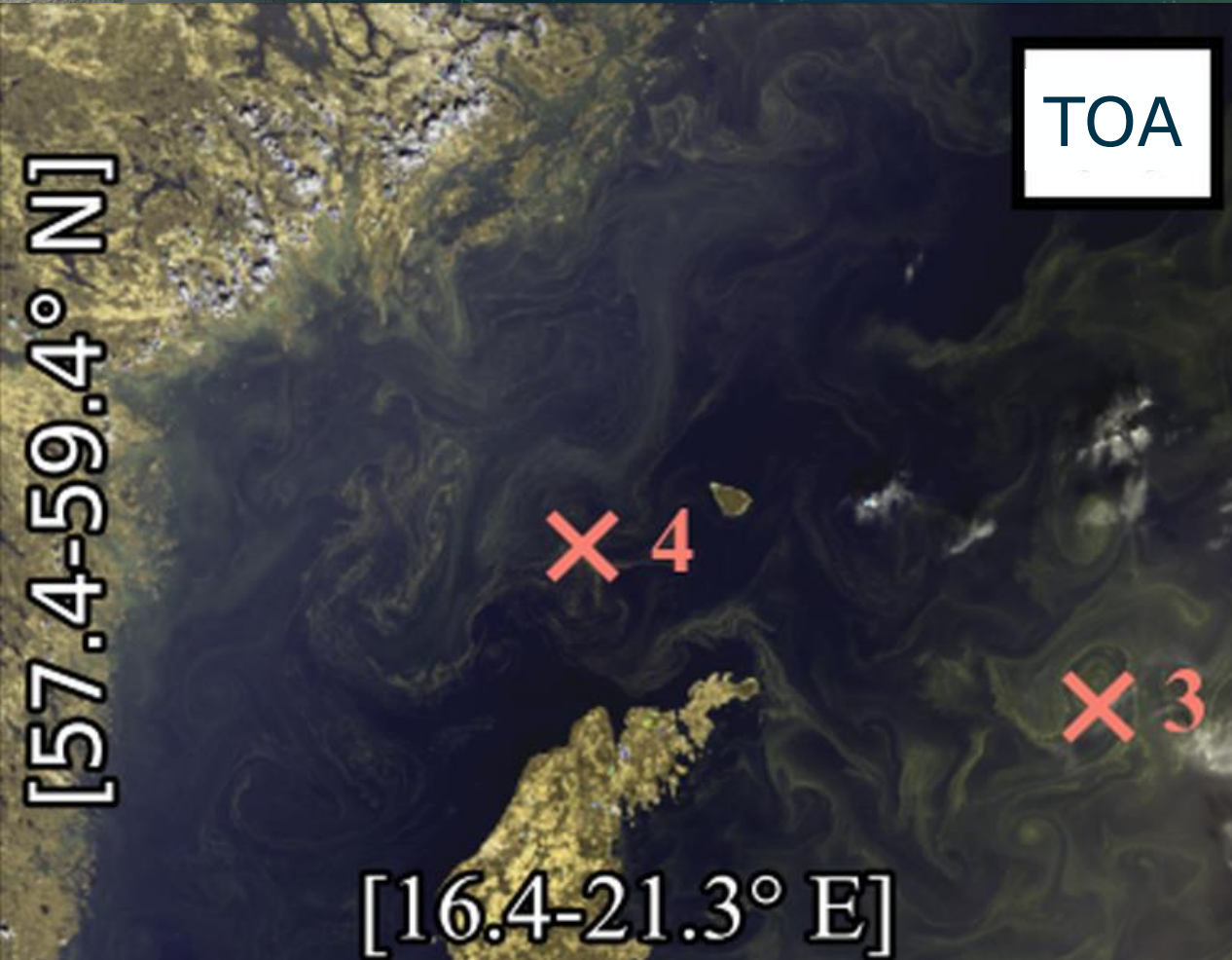
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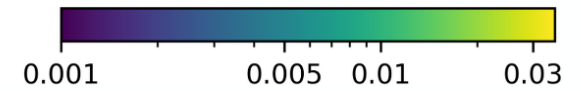


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Baltic Sea, Gotland Basin – Cyanobacterial Bloom

Rrs 560 nm  
[sr<sup>-1</sup>]





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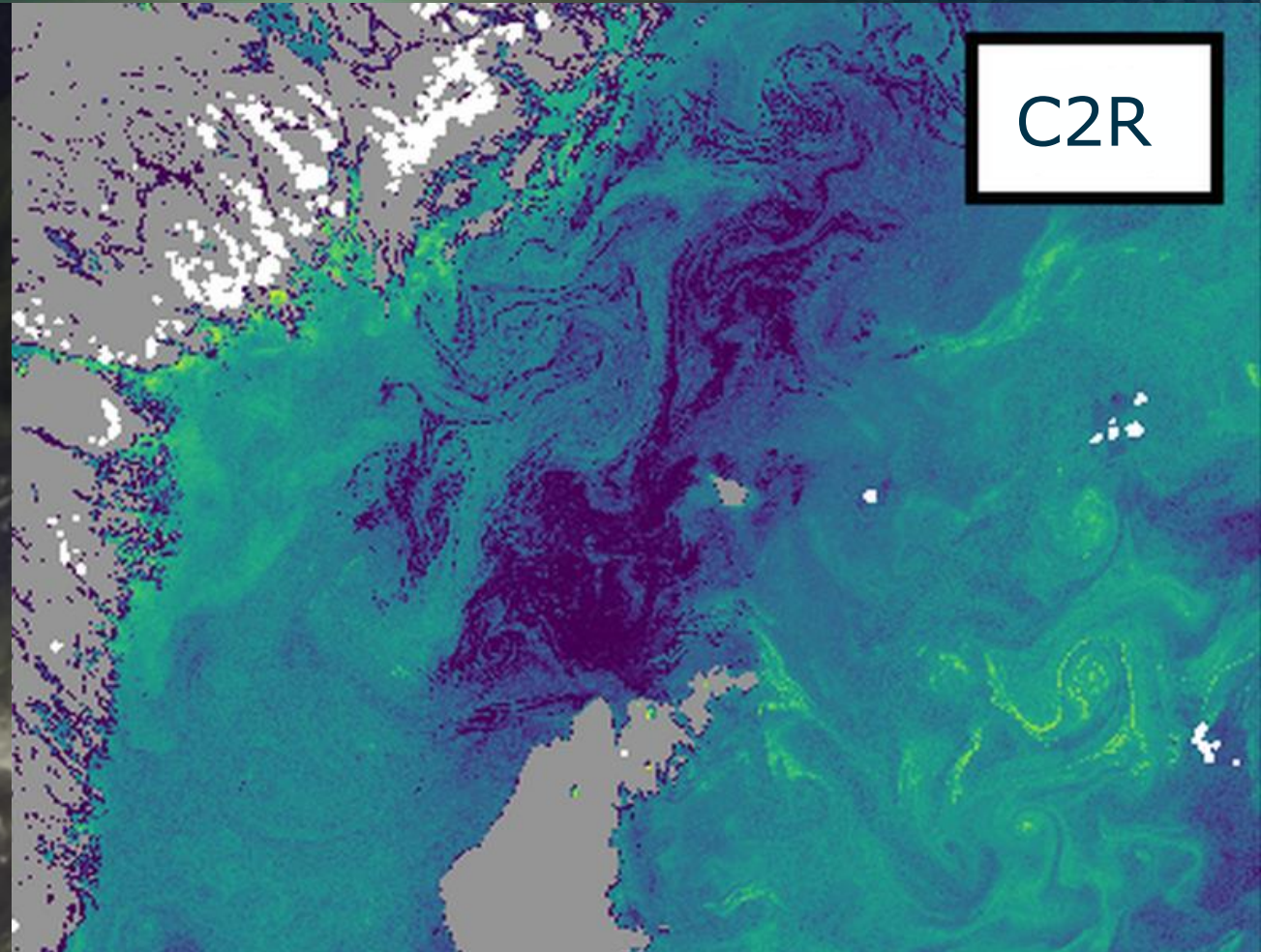
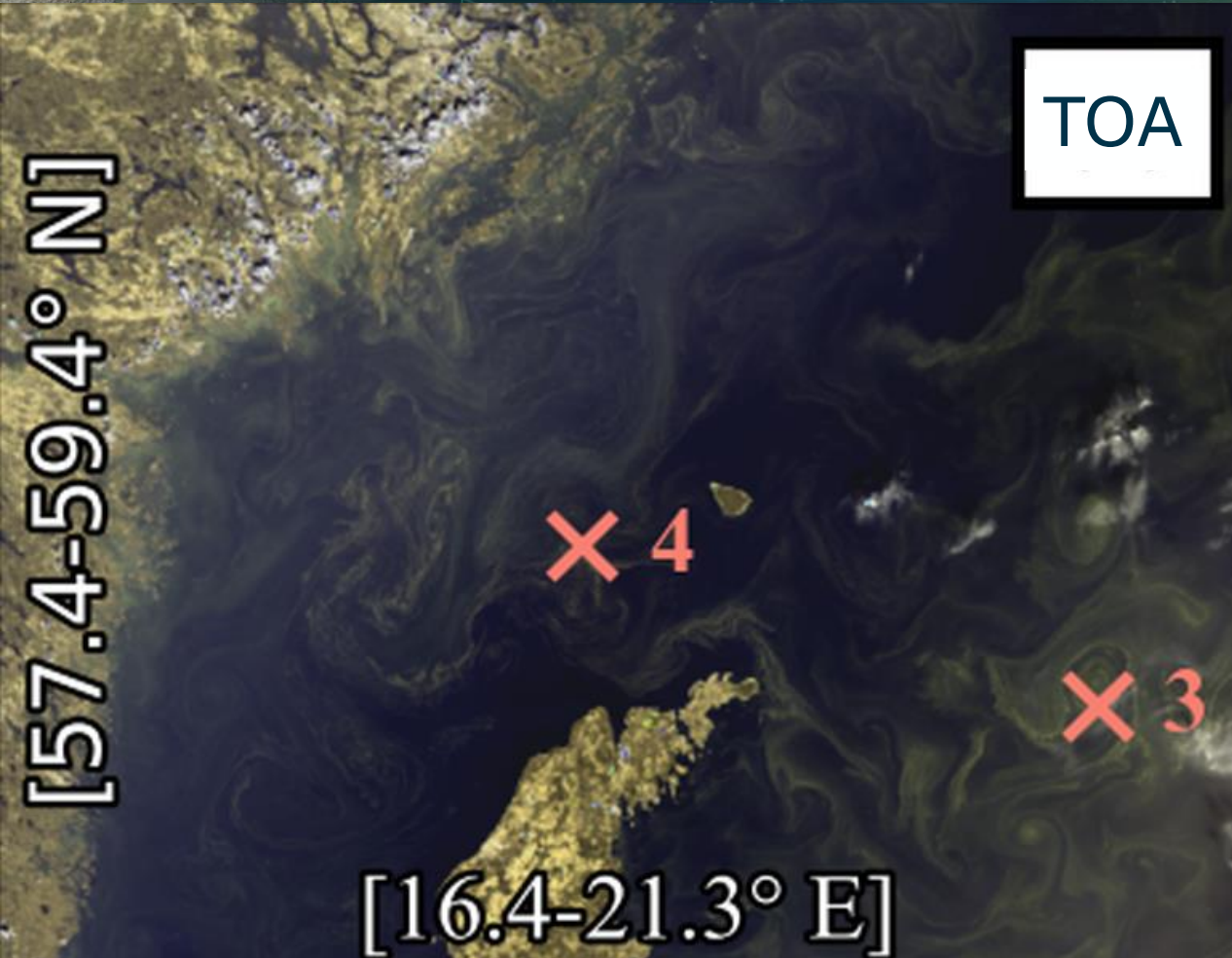
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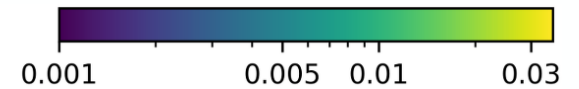


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Baltic Sea, Gotland Basin – Cyanobacterial Bloom

Rrs 560 nm  
[sr<sup>-1</sup>]





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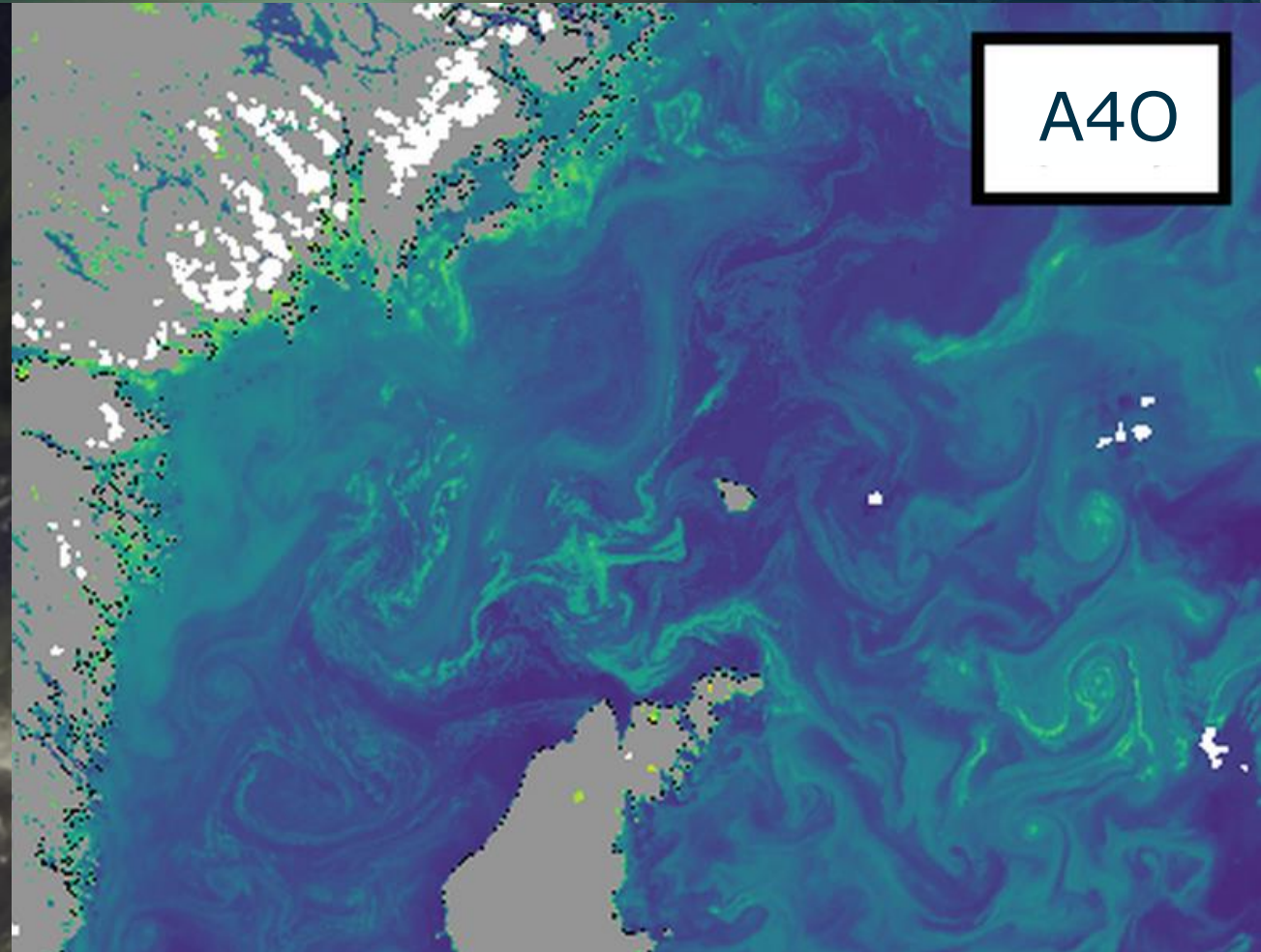
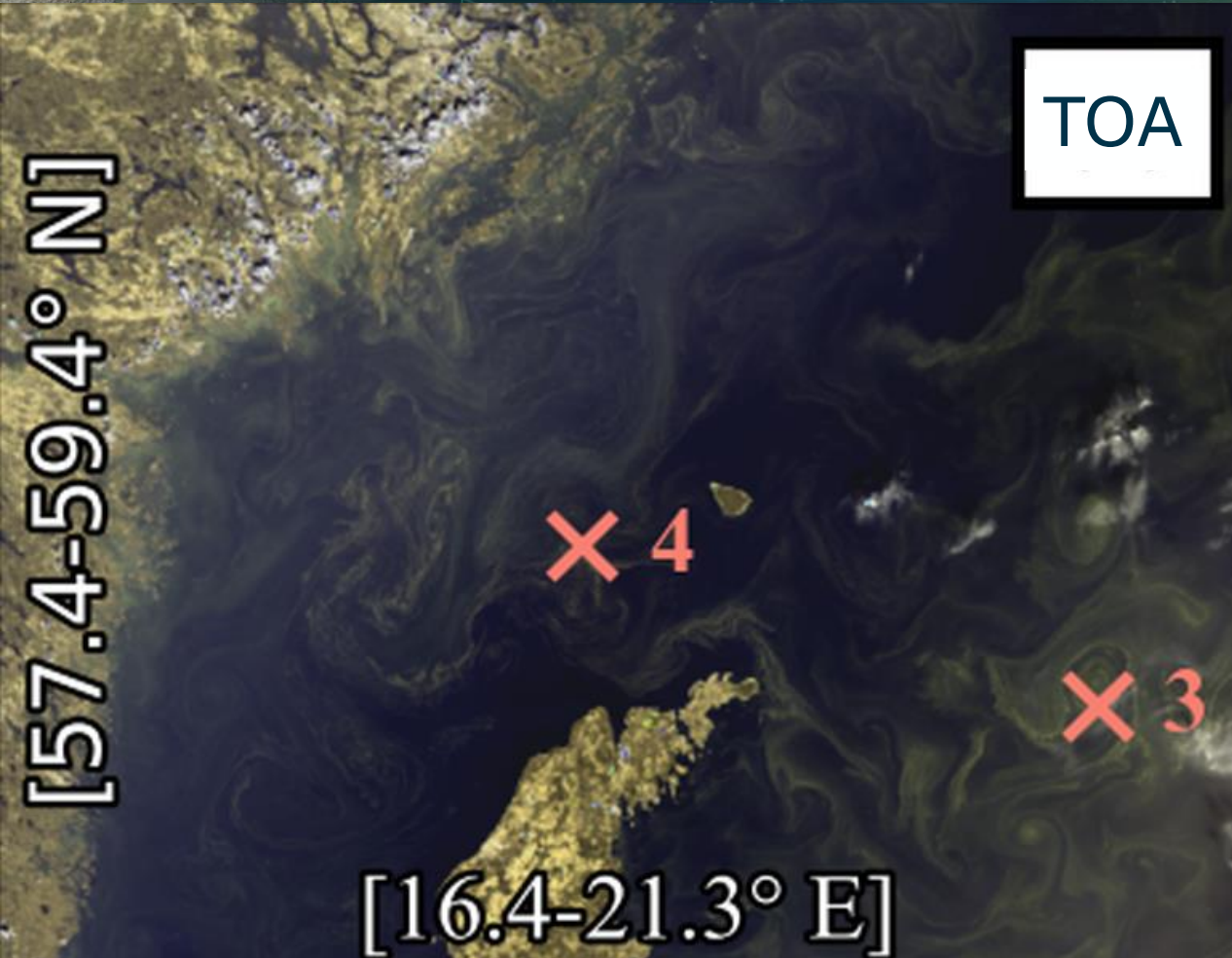
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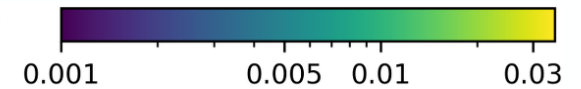


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Baltic Sea, Gotland Basin – Cyanobacterial Bloom

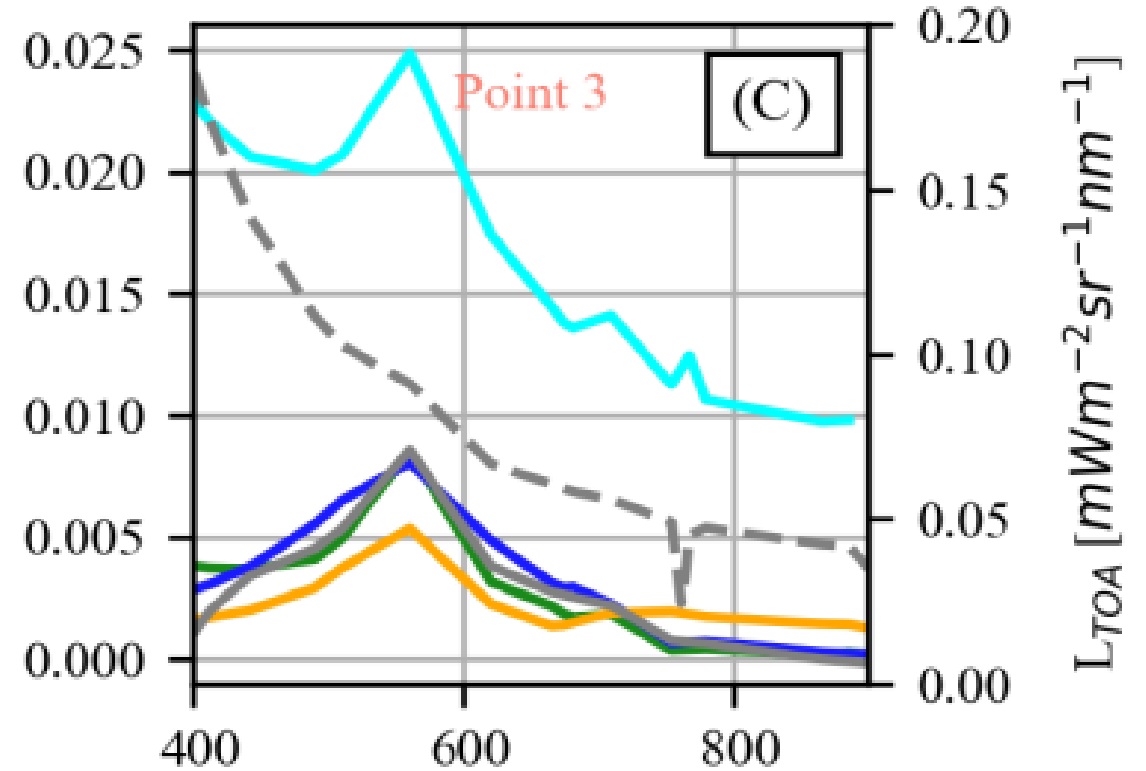
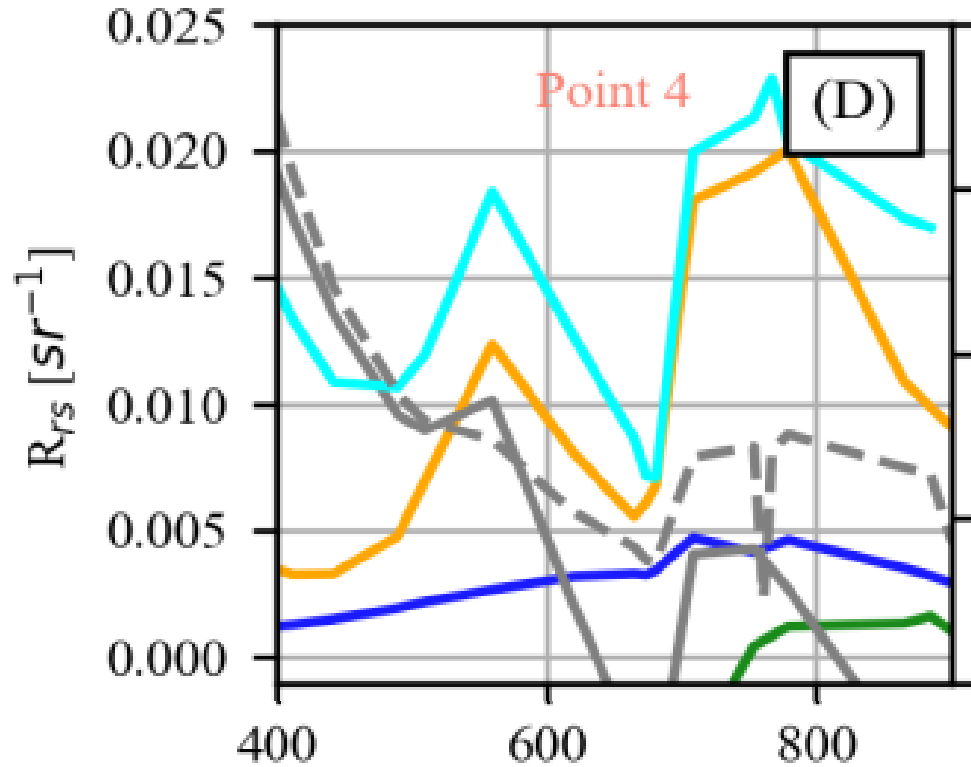
Rrs 560 nm  
[sr<sup>-1</sup>]





## Cyanobacterial Blooms

IPF Rrs shape reasonable, but too high in blue



A40 delivers typical spectrum "High NAP" → "high Chl\_NN" Wavelength [nm]

A40

L2 BAC: IPF

L2 AAC: C2RCC

POLYMER

DSF-Acolite

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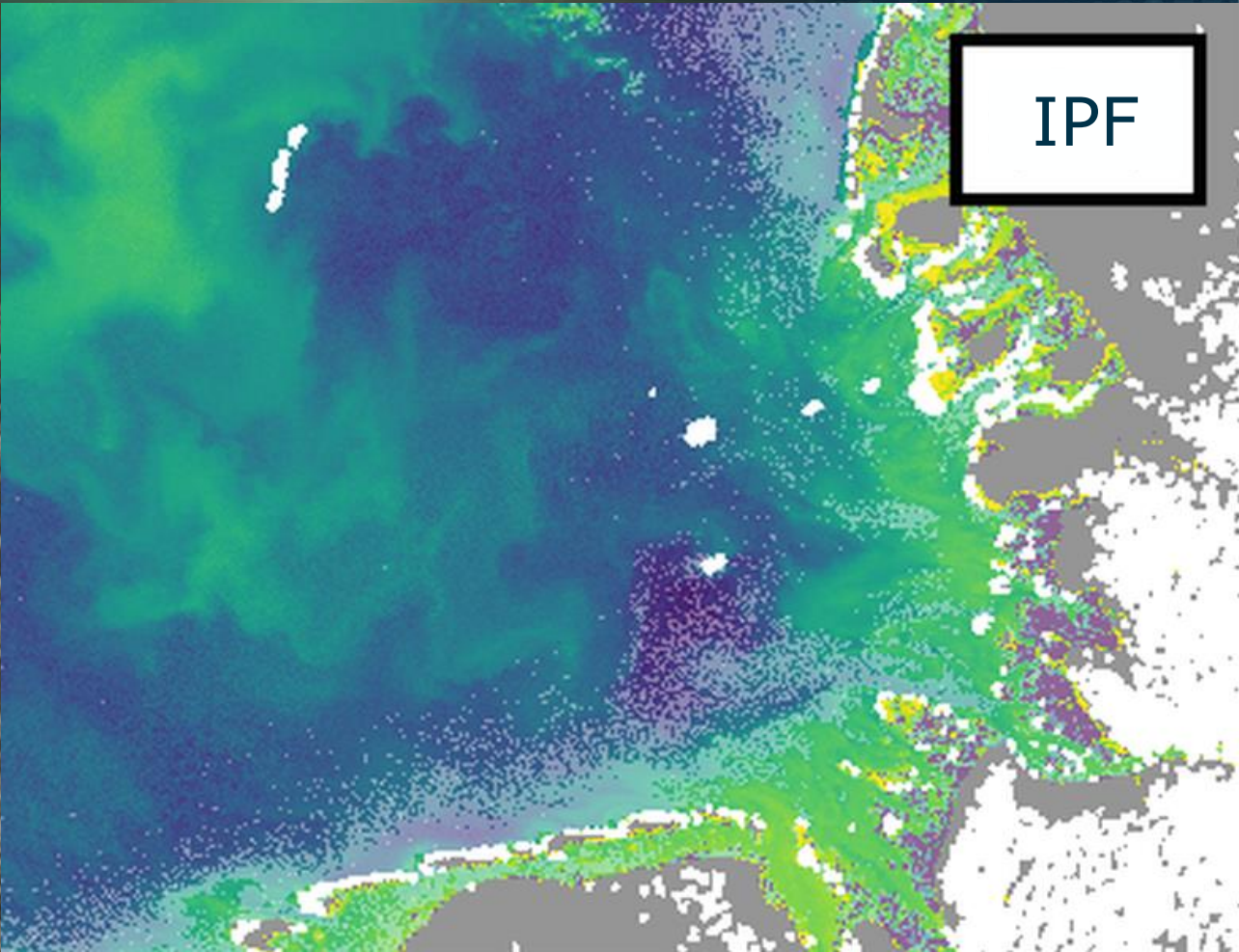
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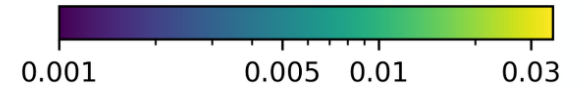


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North Sea, German Bight

Rrs 560 nm  
[sr<sup>-1</sup>]





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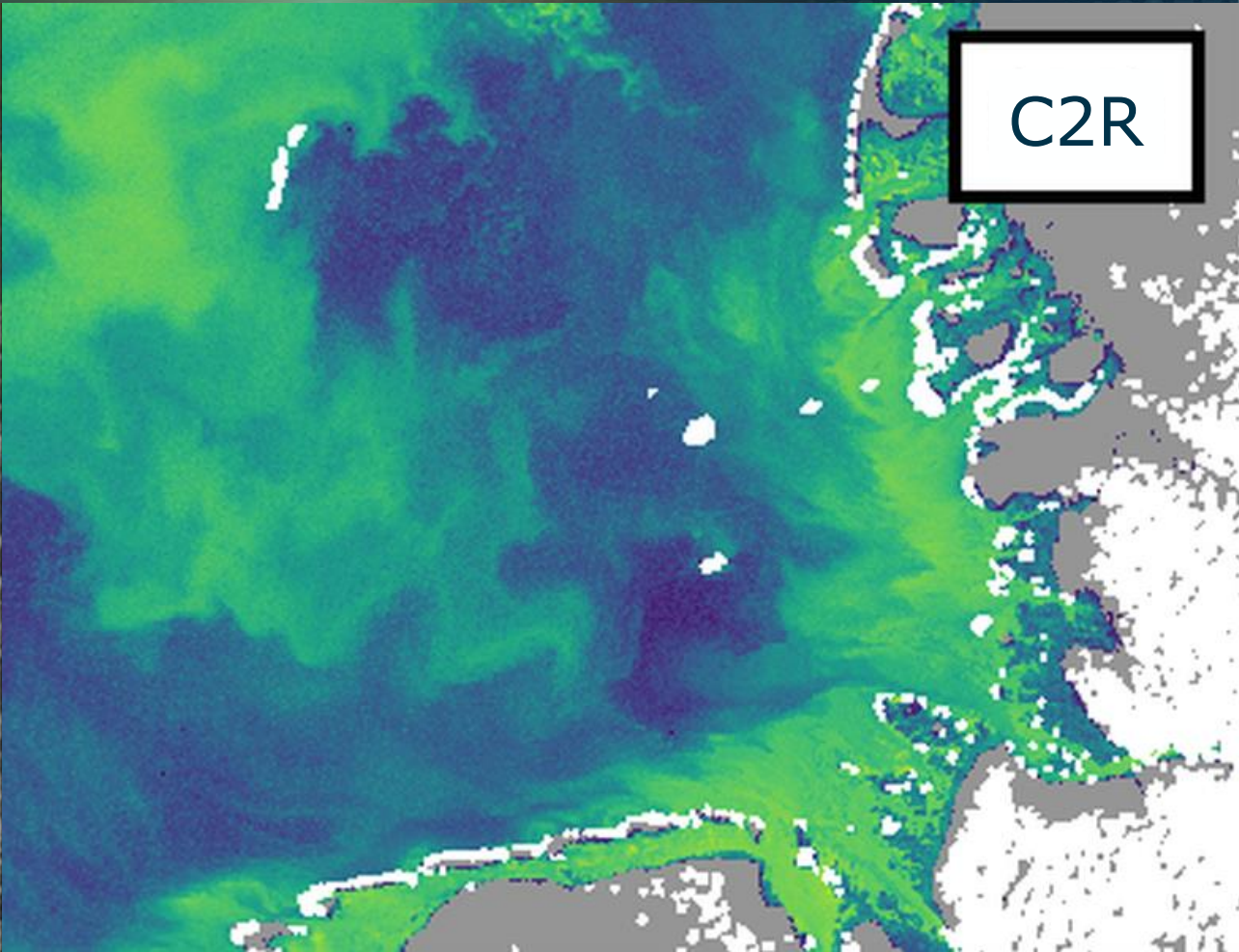
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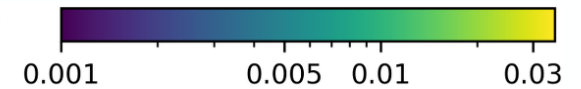


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North Sea, German Bight

Rrs 560 nm  
[sr<sup>-1</sup>]





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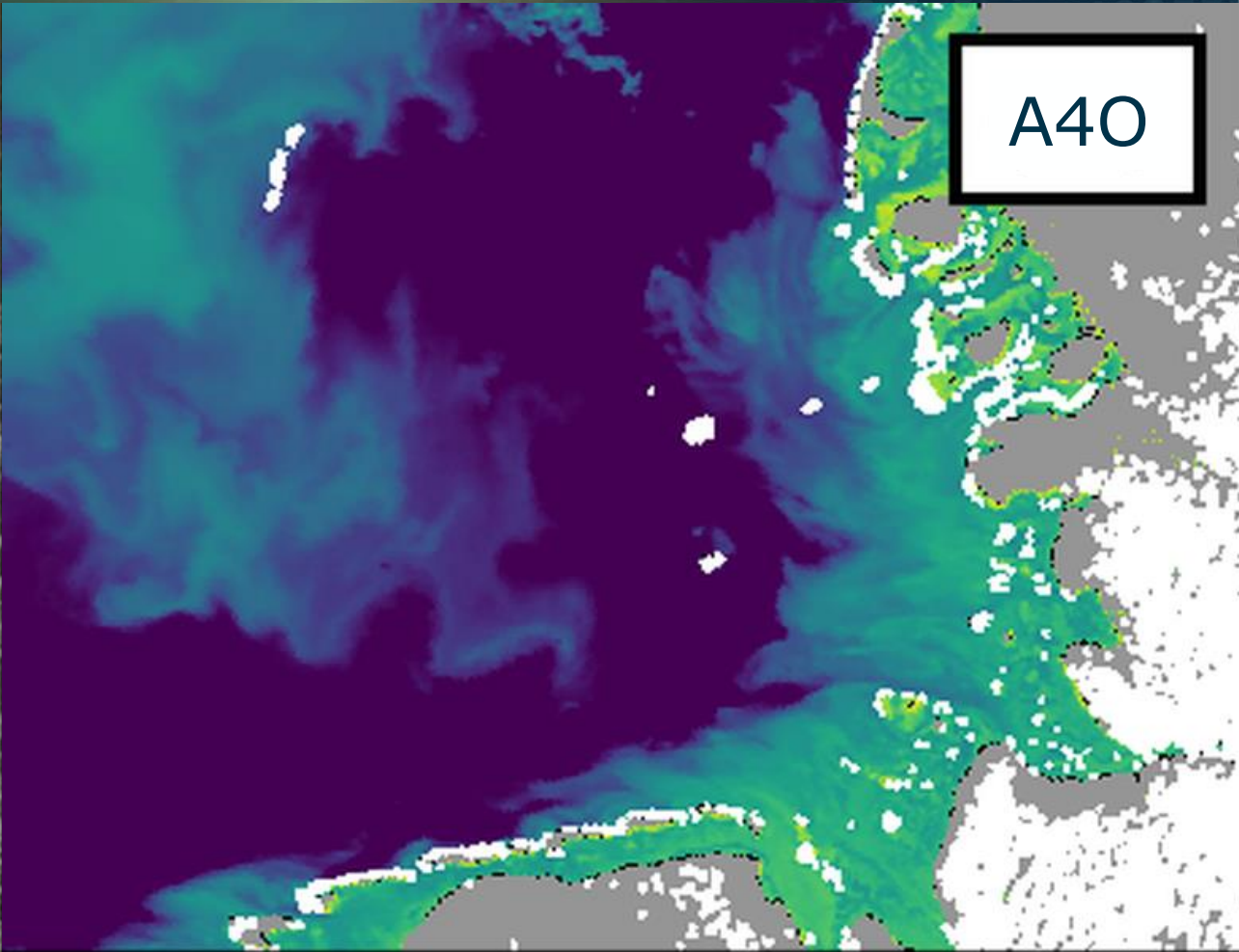
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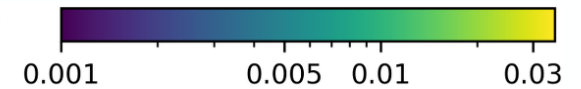


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North Sea, German Bight

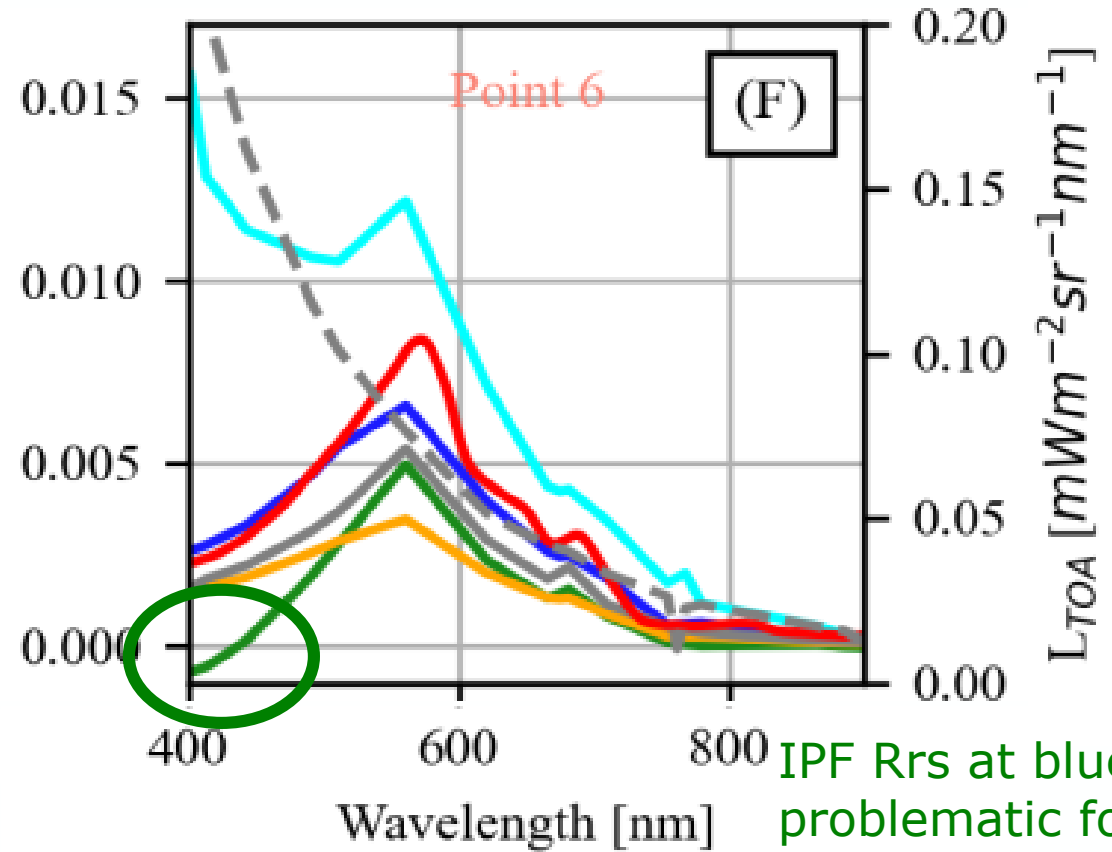
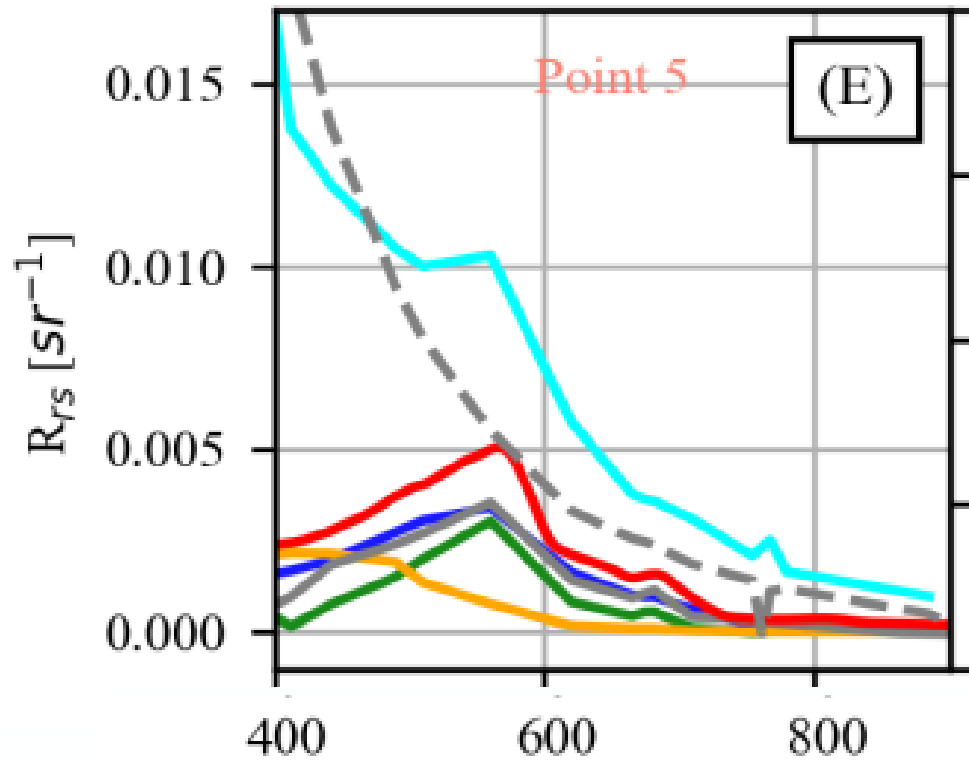
Rrs 560 nm  
[sr<sup>-1</sup>]





## Cyanobacterial Blooms

C2R matches relatively good (optimized here)



A40 problematic in transition zone with haze

IPF Rrs at blue bands problematic for OWT

A40

L2 BAC: IPF

L2 AAC: C2RCC

POLYMER

DSF-Acolite

Hereon in situ

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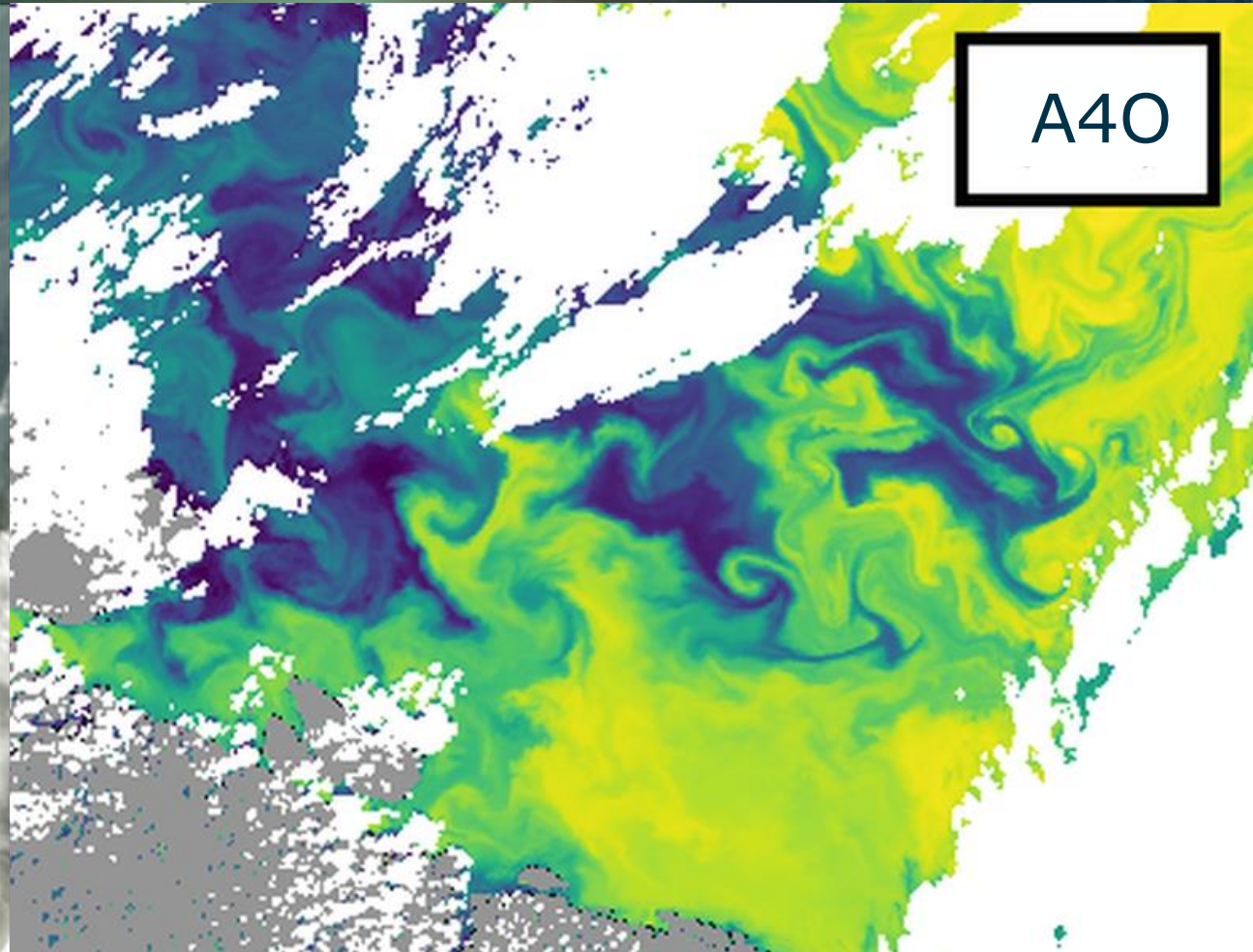
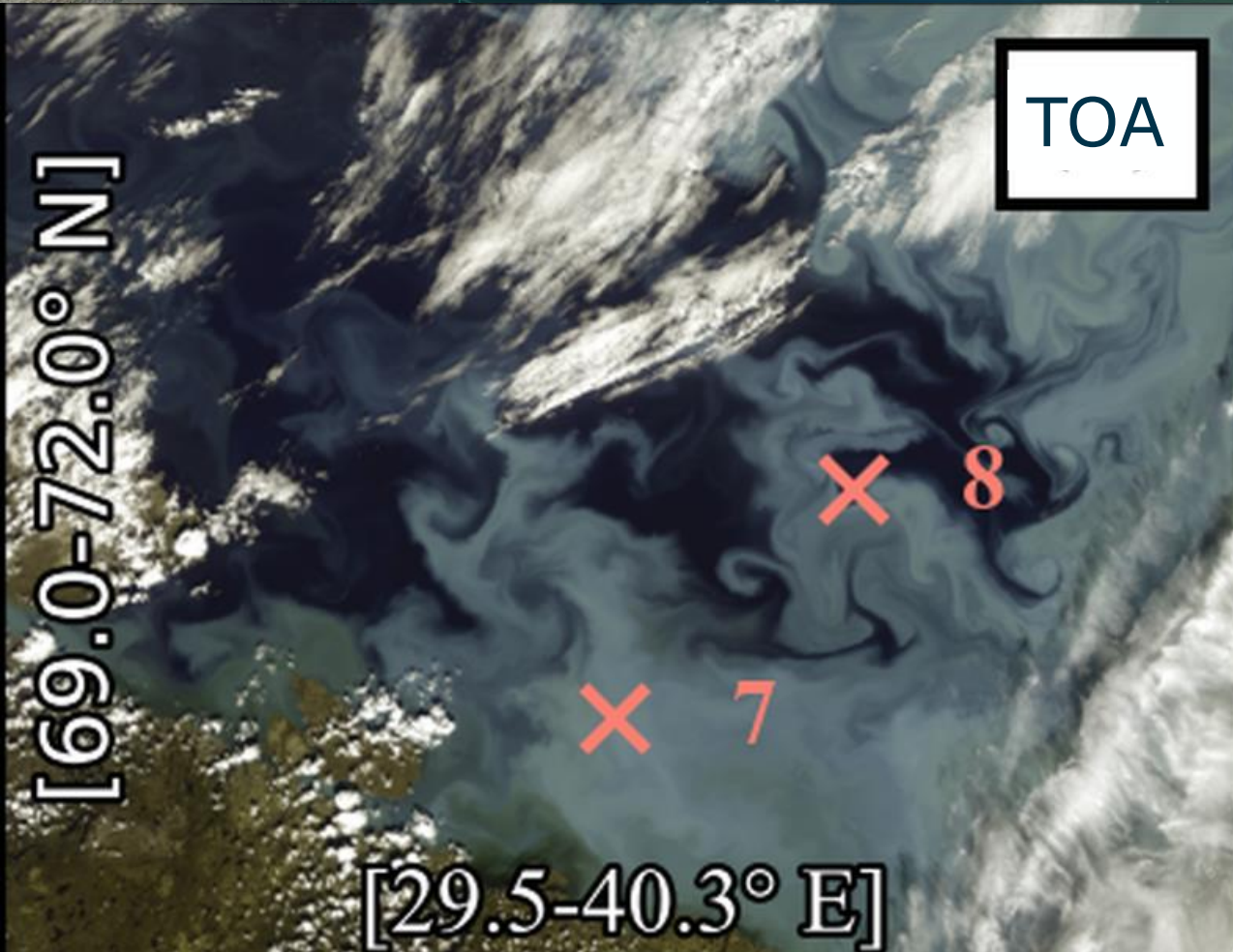
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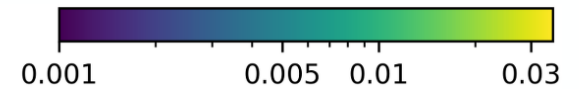


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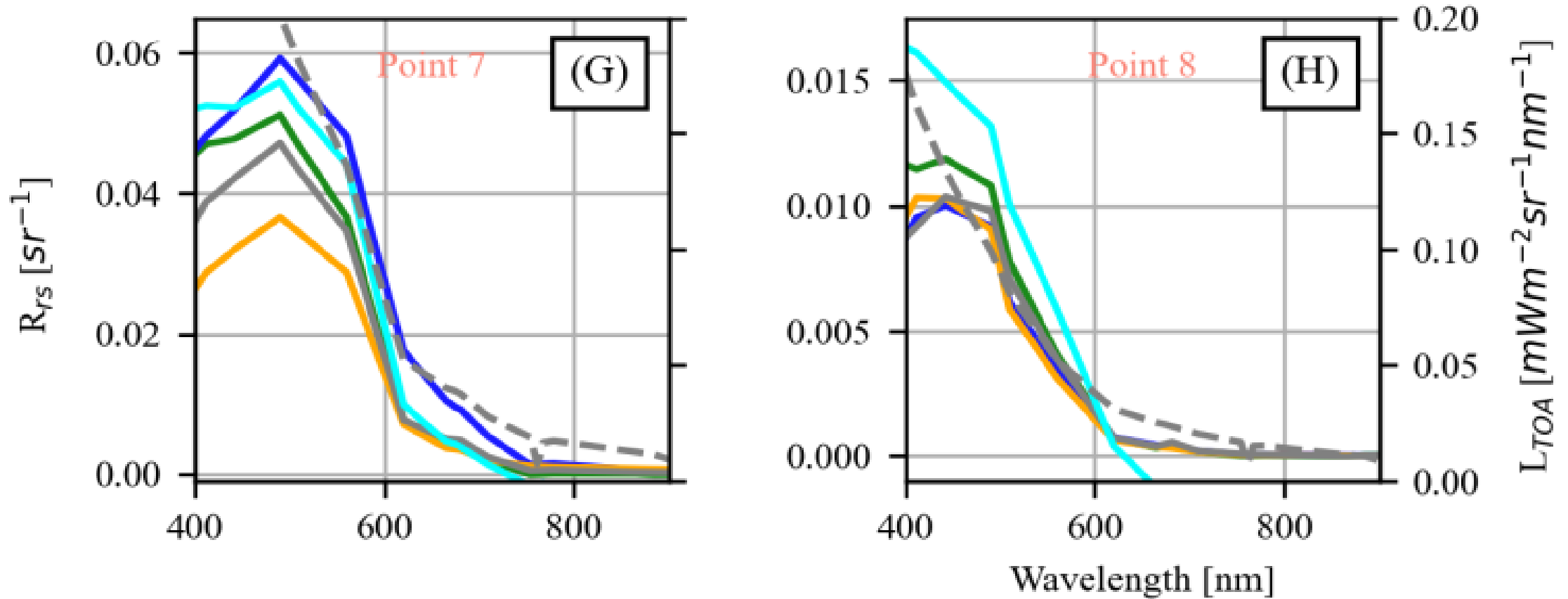
Barents Sea – Coccolithophores Bloom

Rrs 560 nm  
[sr<sup>-1</sup>]





## Coccolithophores Blooms



A40

L2 BAC: IPF

L2 AAC: C2RCC

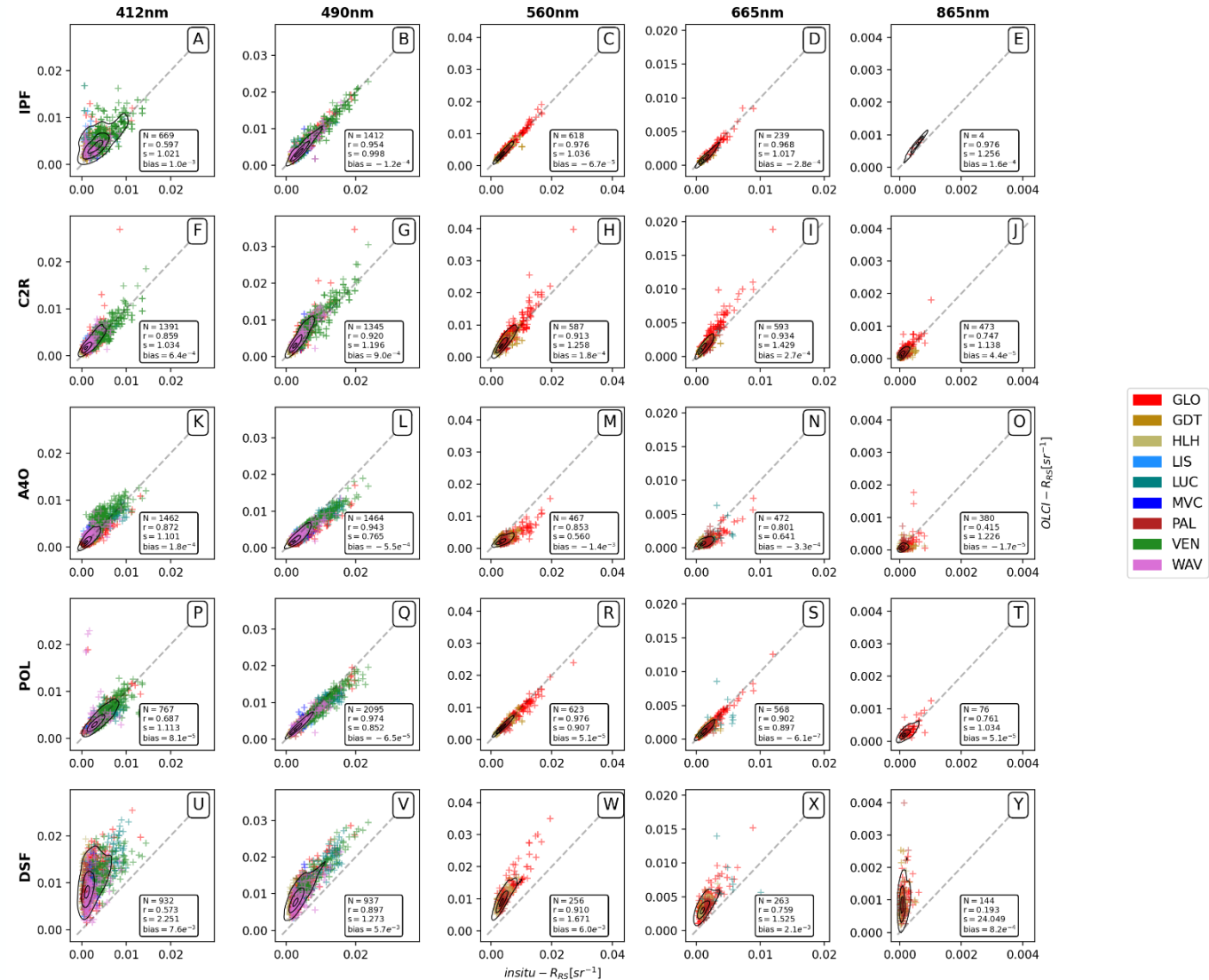
POLYMER

DSF-Acolite



## Comparison with Aeronet-OC

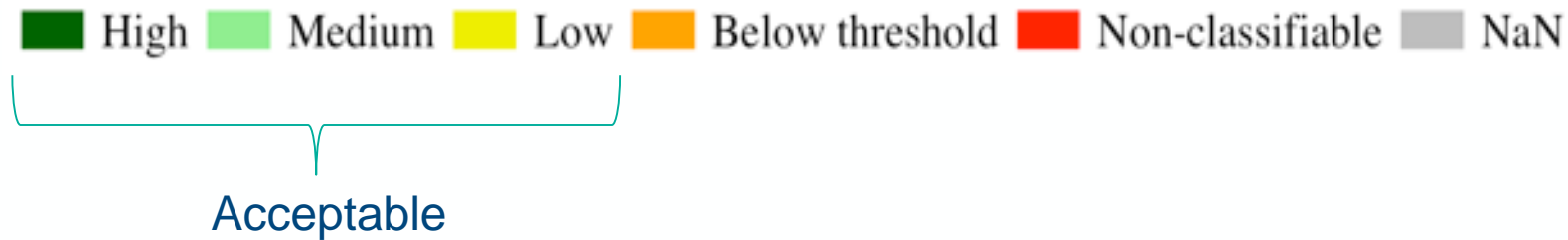
- Mostly moderately turbid waters
- First comparison with A4O and DSF (designed for turbid waters)
- Massive flagging of IPF leads to fewer match-ups, but good performance
- Application of SVC gains to C2R improves metrics
- POL performs generally best





## OWT Classifiability

- 10 OLCI test scenes with high optical diversity
- OWT total memberships usually between threshold 0.0001 and 1 (can be >1)



- Rrs can be well classifiable in OWT framework, but actually wrong, e.g. high-NAP-shape in algae bloom
- Some OWT frameworks have narrow variance → small discontinuity leads to low memberships
- Negative Rrs problematic

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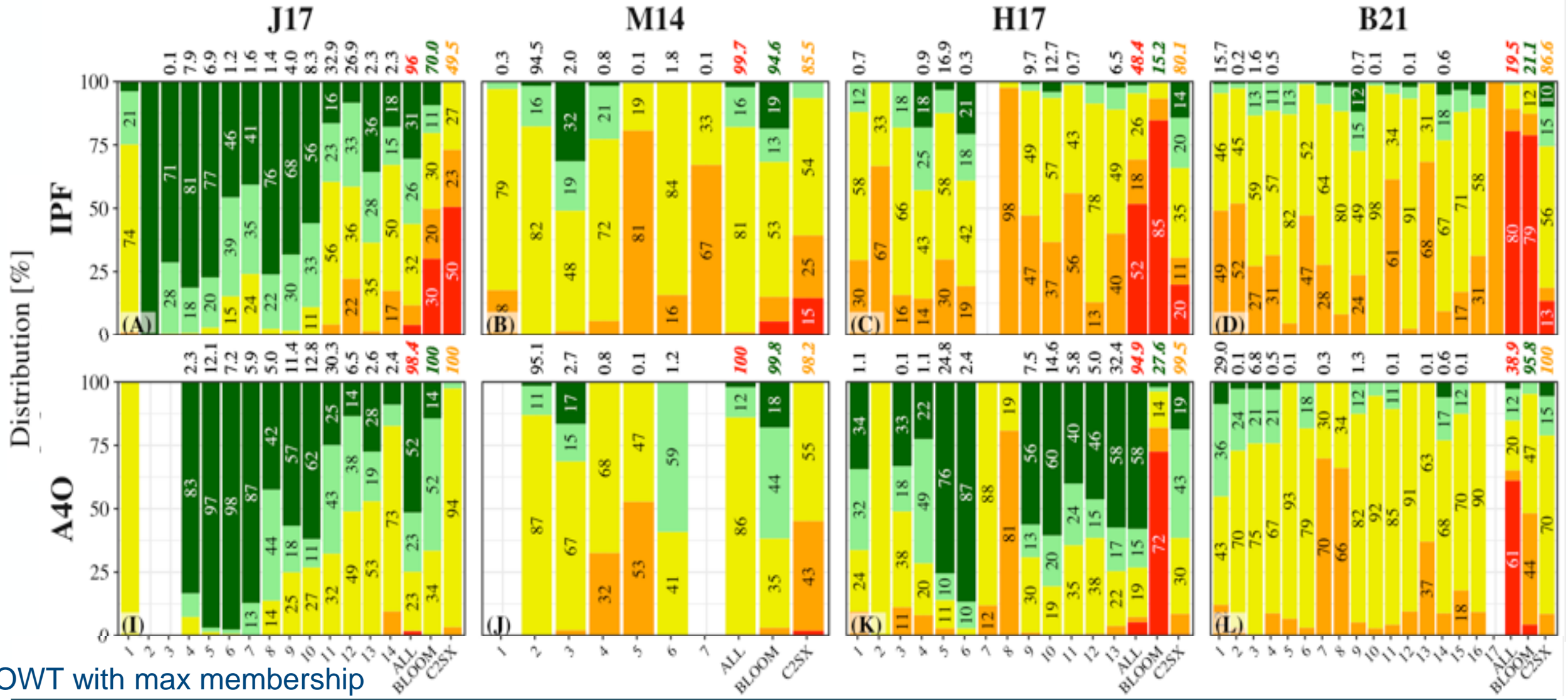


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## OWT Classifiability

- IPF → results for Case-1 waters classifiable with J17 & M14
  - but not well with H17 & B21 → narrow variance of OWT frameworks
  - Some Rrs shapes not delivered → less suitable for productive waters
- A4O → provides high optical diversity and generally expected Rrs shapes (but partly low memberships)
  - Some OWT classes not well captured, e.g. J17 oligotrophic & B21 hyper-eutrophic waters
- C2R → delivers useful spectra for J17 and H17
  - Out-of-scope solution often classifiable, but obviously wrong, e.g. high-NAP-shape in algae bloom
- POL → optimal for J17 (which was based on POL), but not useful for B21 and only low memberships for H17
- DSF → developed for scattering waters, otherwise problematic blue bands
  - but advantages for inland waters (as defined in M14 & B21, but not H17)



## Conclusions

- New algorithms available for bridging optical Oceanography and Limnology
- Novel atmospheric correction A4O designed for “all” natural waters
  - Special emphasis of A4O: absorbing (dark) waters, scattering (bright) waters & phytoplankton diversity (cyanobacteria, coccolithophores)
- Ocean Colour products very sensitive to atmospheric correction → scope of AC must be considered
- OWT frameworks must be revised to cover all natural shapes and encounter for uncertainties of AC
- Negative reflectances provided by IPF, POL & DSF must be worked on
- Future (hyperspectral) AC must cover larger optical diversity

**THANK YOU!**

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