

# 2<sup>nd</sup> European Seagrass Restoration Workshop

8th-10th April 2025



## A NEW EUROPEAN MAP FOR INTERTIDAL SEAGRASS USING DRONE & SATELLITE REMOTE SENSING





# Introduction

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Drones and satellites are increasingly used for seagrass mapping but paradoxically, seagrass distribution in Europe is not clearly established

Drones: now affordable tools

Free Satellite data: Sentinel 2 accessible worldwide

Machine learning approaches have improved classification accuracies

However: crucial **to characterize optical fingerprint of seagrass** and select the appropriate sensor



# Remote sensing and seagrass restoration

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Satellites: baseline information for future monitoring and looking back at seagrass trends through time

Build up solid scientific knowledge to determine the restoration needs

Drones: complementary very high-resolution data for real-time monitoring of restoration

Comparable sensors can be used on drones and satellites using similar algorithms and processing work-flow

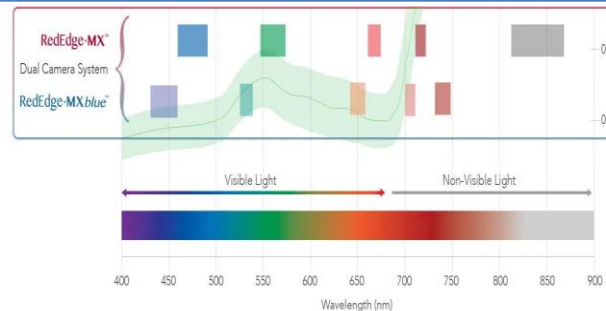
# Spectral reflectance up-scaling



Field  
spectroradiometry

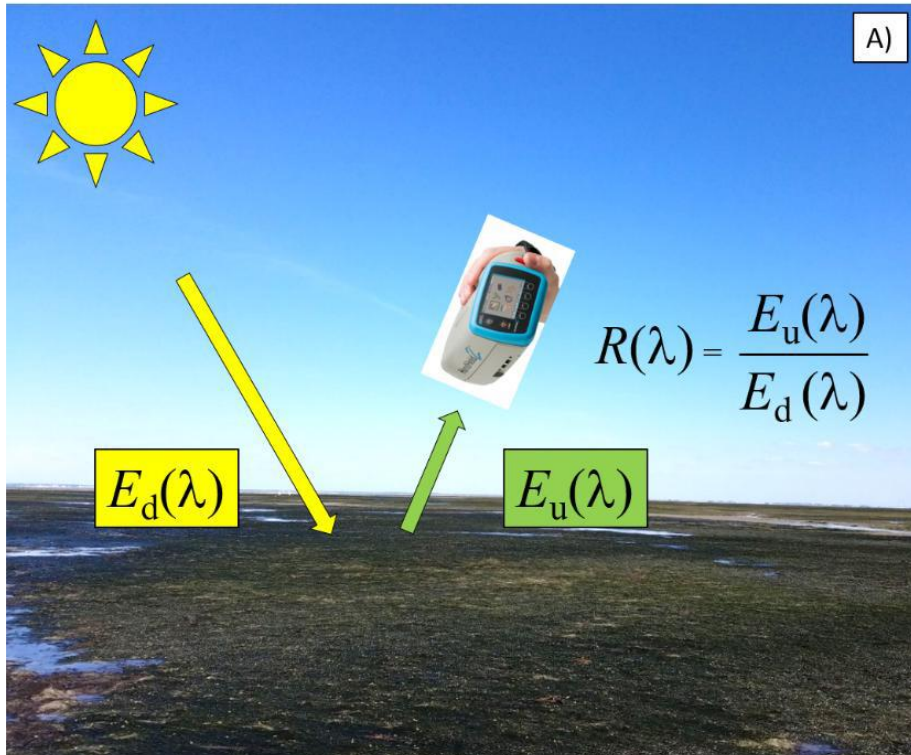


Drone with  
multispectral sensor

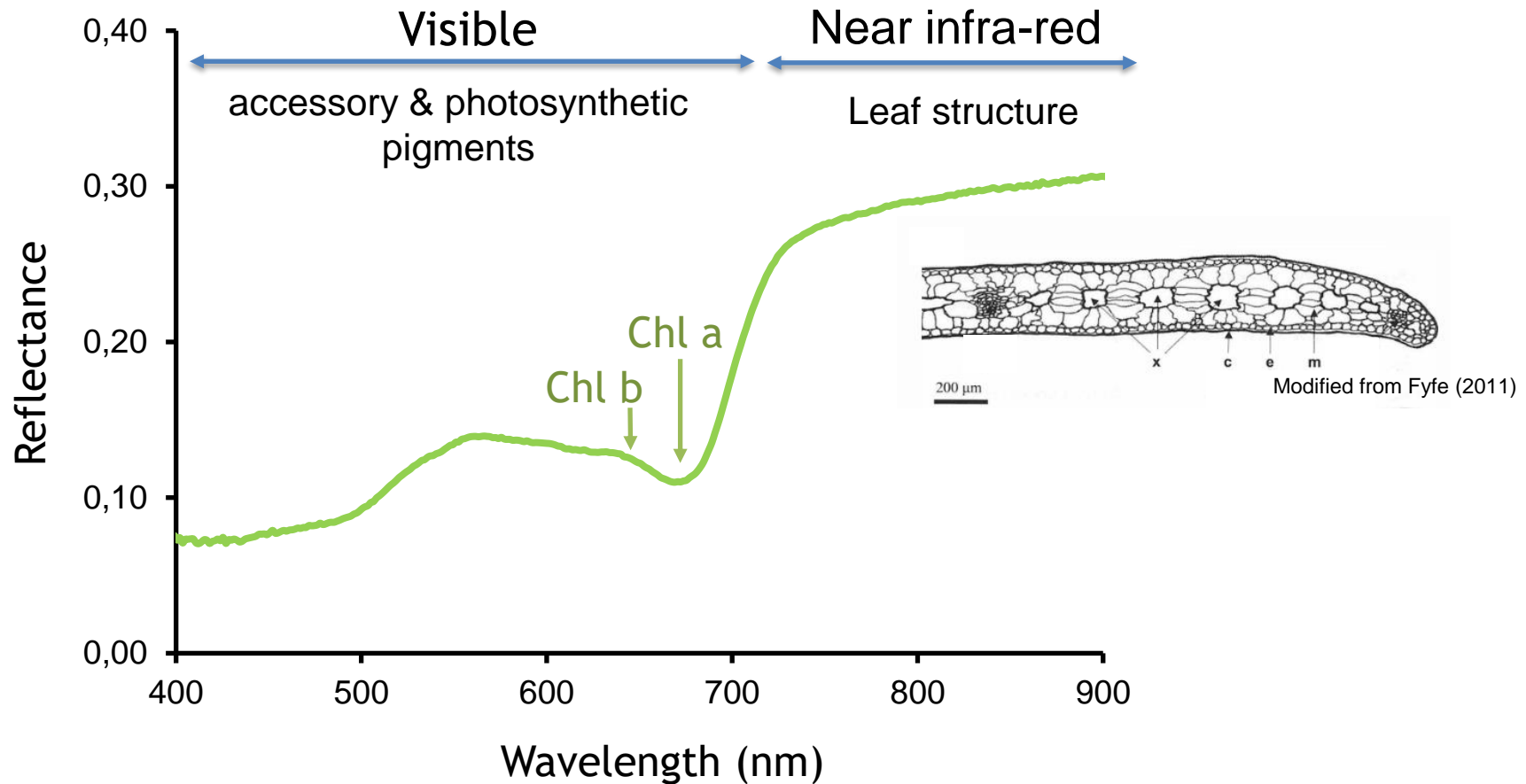


Sentinel 2 Satellite  
MSI multispectral sensor

# Spectral reflectance $R(\lambda)$



# Spectral reflectance (*Zostera noltei*)







Contents lists available at [ScienceDirect](#)

## Remote Sensing of Environment

journal homepage: [www.elsevier.com/locate/rse](http://www.elsevier.com/locate/rse)



### Multi- and hyperspectral classification of soft-bottom intertidal vegetation using a spectral library for coastal biodiversity remote sensing

Bede Ffinian Rowe Davies<sup>a,\*</sup>, Pierre Gernez<sup>a</sup>, Andréa Geraud<sup>a</sup>, Simon Oiry<sup>a</sup>, Philippe Rosa<sup>a</sup>, Maria Laura Zoffoli<sup>b</sup>, Laurent Barillé<sup>a</sup>



# Spectral resolution

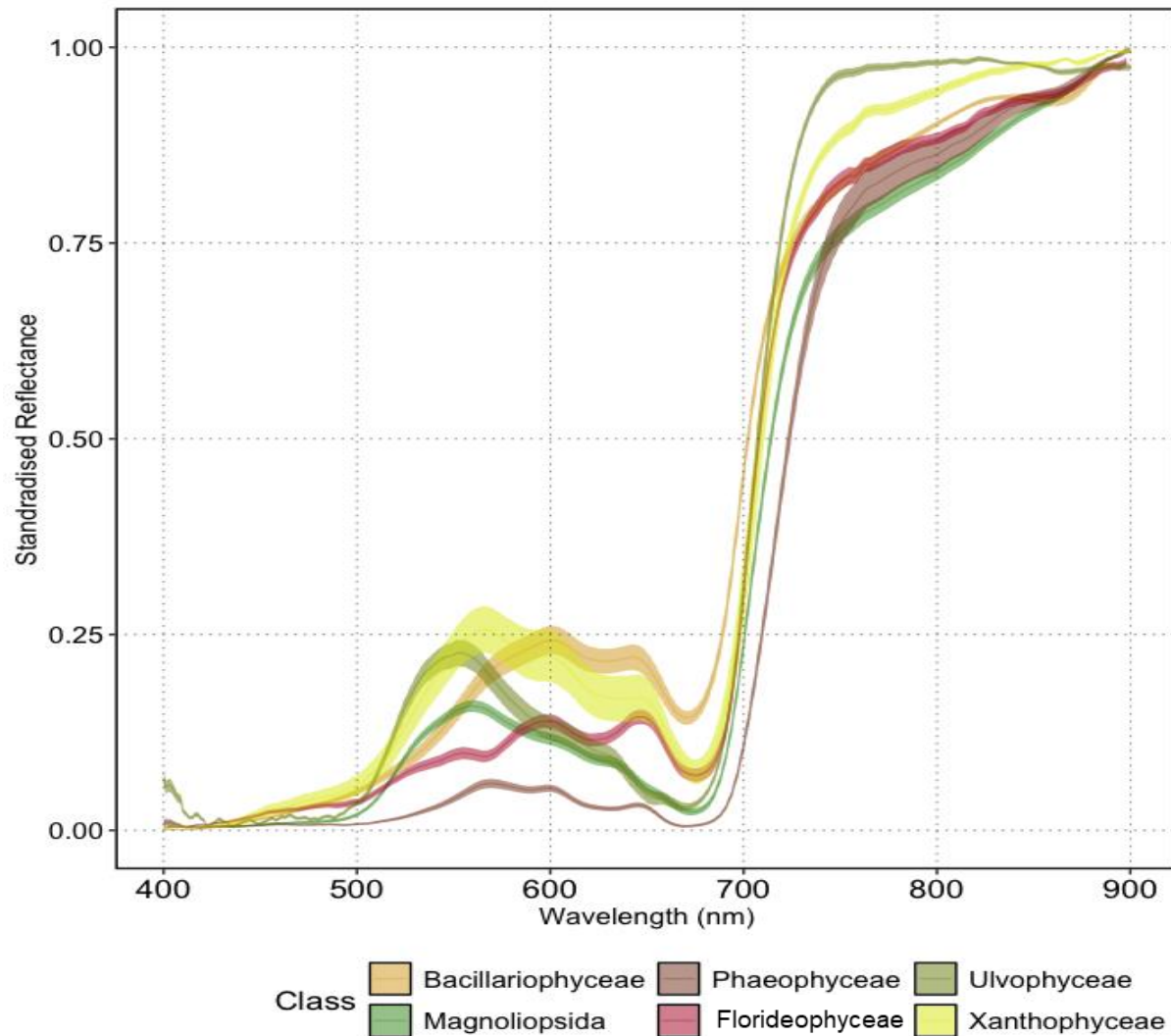
Multispectral sensors have a low number of large spectral bands

Hyperspectral sensors have a high number of narrow spectral bands

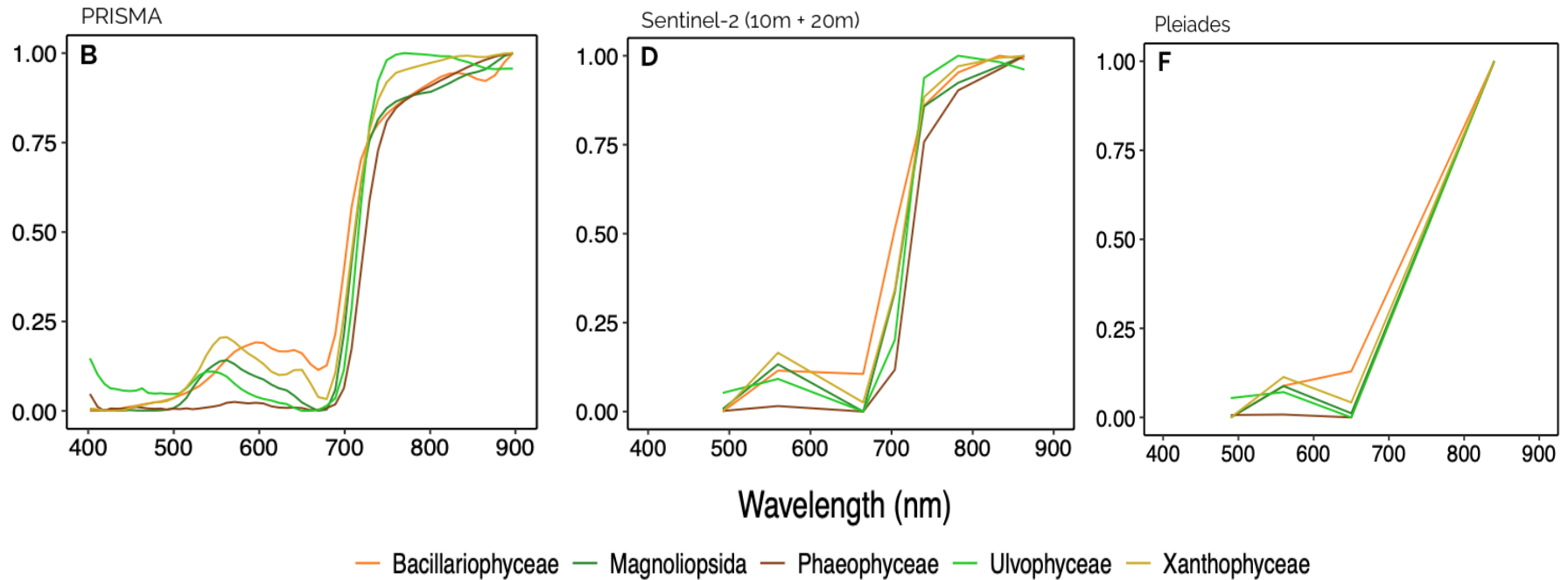
Satellite	Sensor	Number of bands	Spatial resolution
Pleïades	Multispectral	4	2 m
Sentinel-2	Multispectral	12	10 m (resampled)
PRISMA	Hyperspectral	66	30 m



# Spectral biodiversity



# Spectral resolution

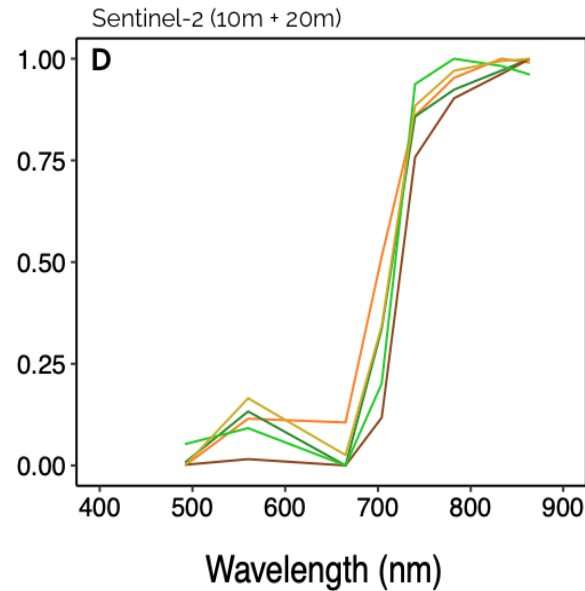


# Multispectral resolution @ 10 bands

Matrix 300 DJI



MicaSense Dual Sensor








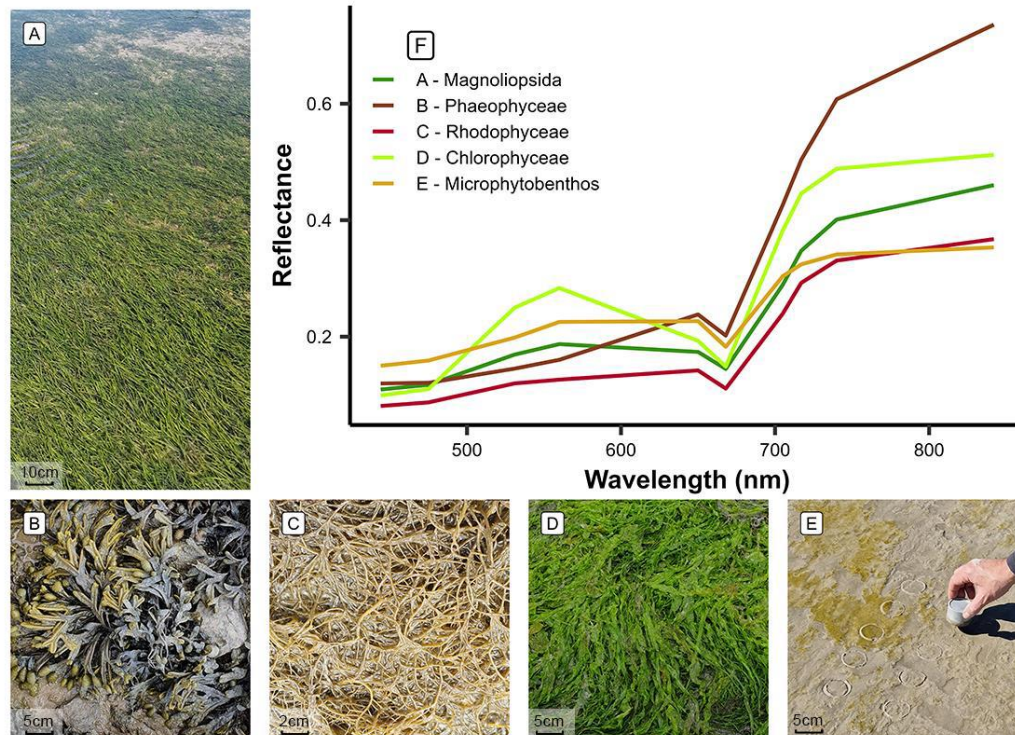
— Bacillariophyceae — Magnoliopsida — Phaeophyceae — Ulvophyceae — Xanthophyceae



Article

# Discriminating Seagrasses from Green Macroalgae in European Intertidal Areas Using High-Resolution Multispectral Drone Imagery

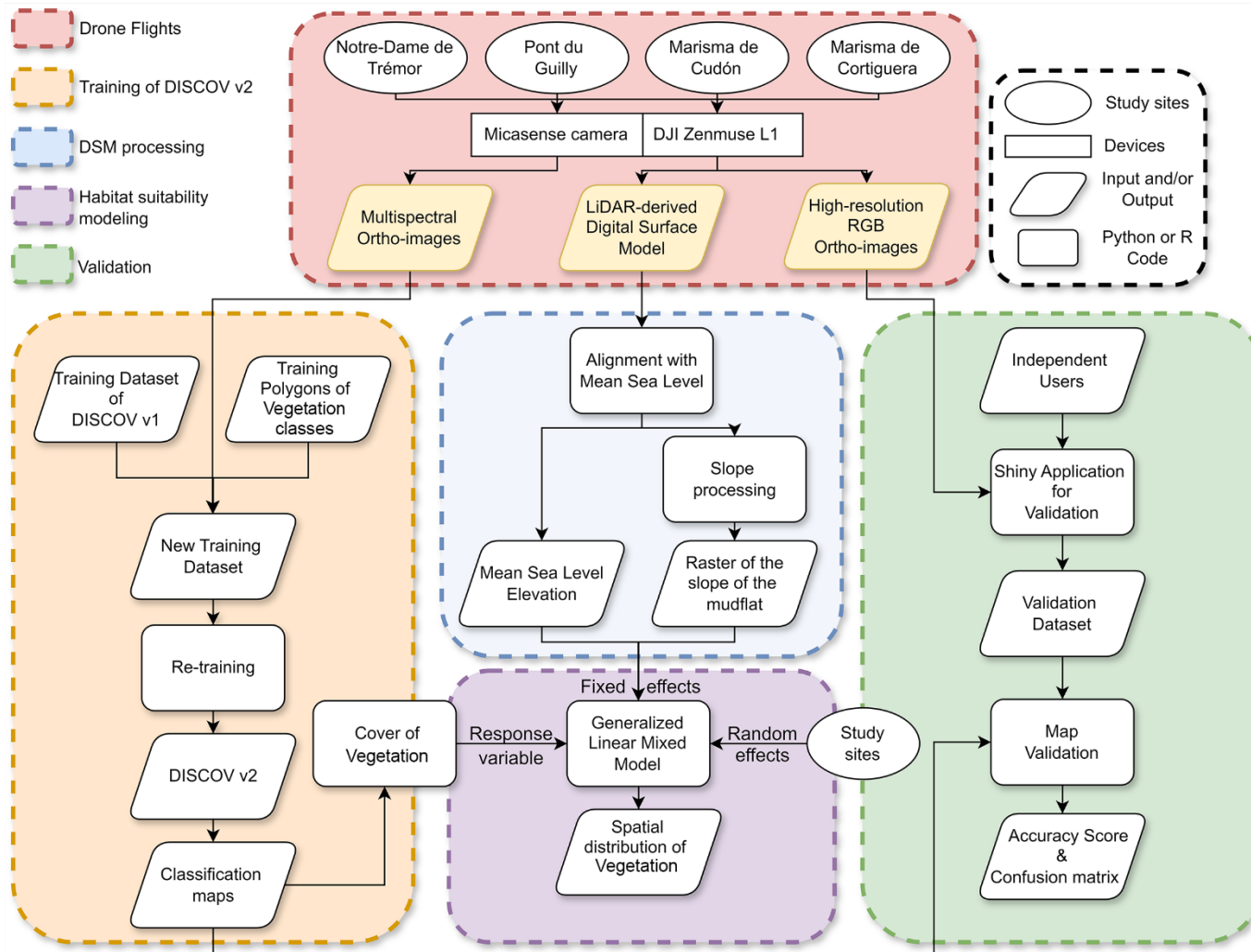
Simon Oiry <sup>1</sup>, Bede Ffinian Rowe Davies <sup>1</sup>, Ana I. Sousa <sup>2</sup>, Philippe Rosa <sup>1</sup>, Maria Laura Zoffoli <sup>3</sup>, Guillaume Brunier <sup>4</sup>, Pierre Gernez <sup>1</sup> and Laurent Barillé <sup>1,\*</sup>



Spatial resolution

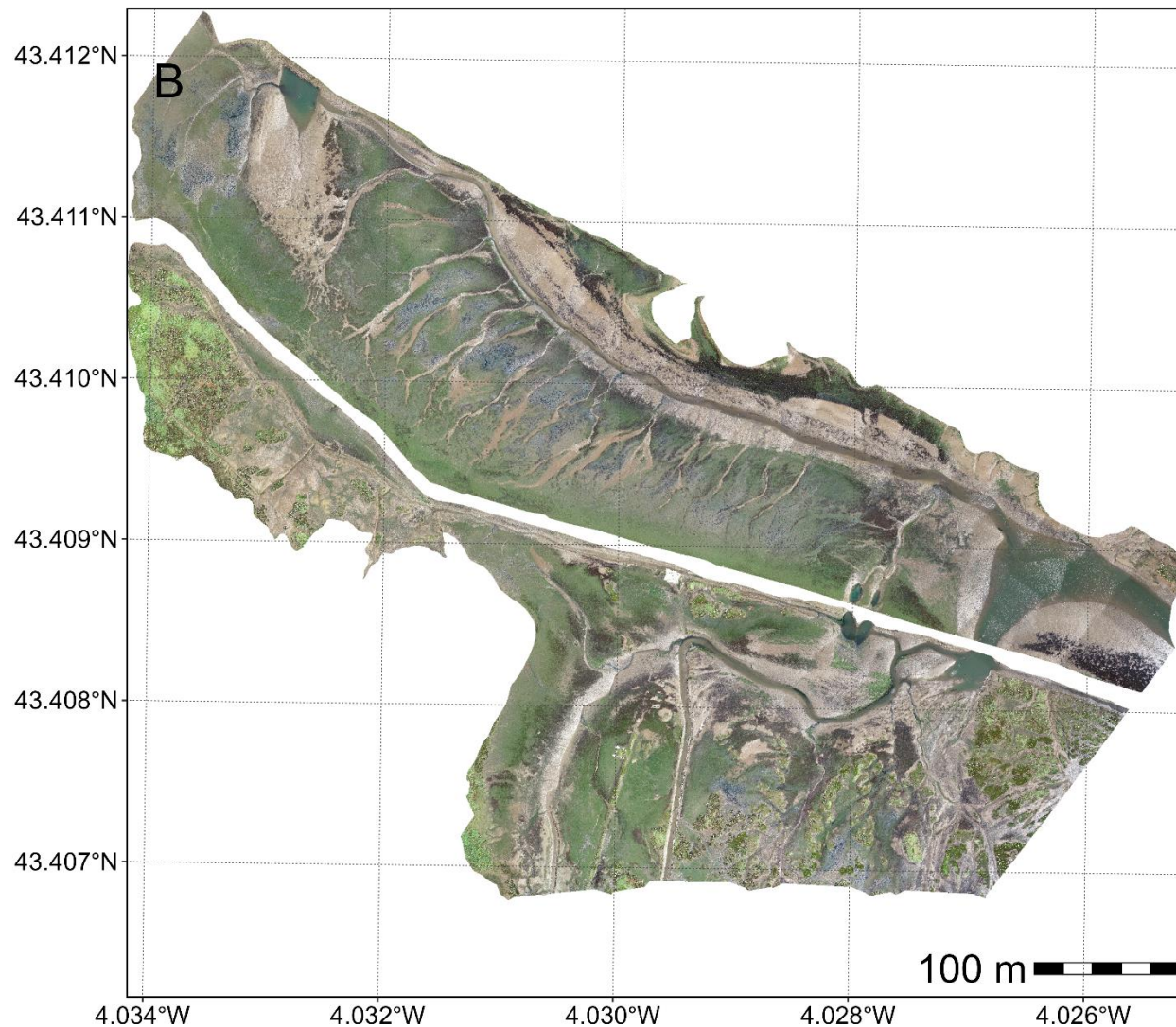
12 m pixel size 8 mm  
120 m pixel size 8 cm

# A drone-based Machine Learning algorithm





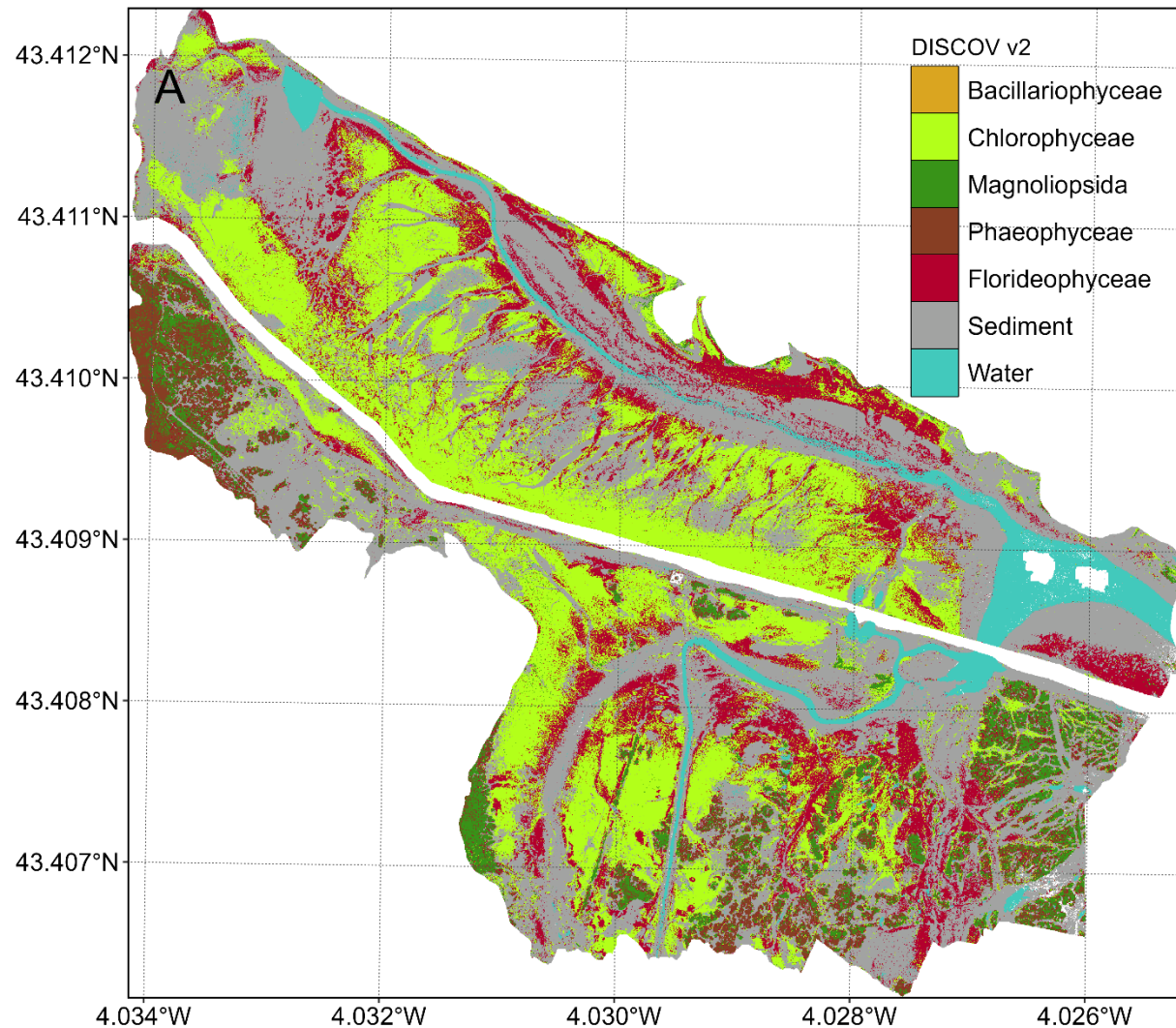
# Map of soft-bottom vegetation Saja estuary



RGB image



# Map of soft-bottom vegetation Saja estuary



10 bands  
multispectral

# DISCOV algorithm for drone



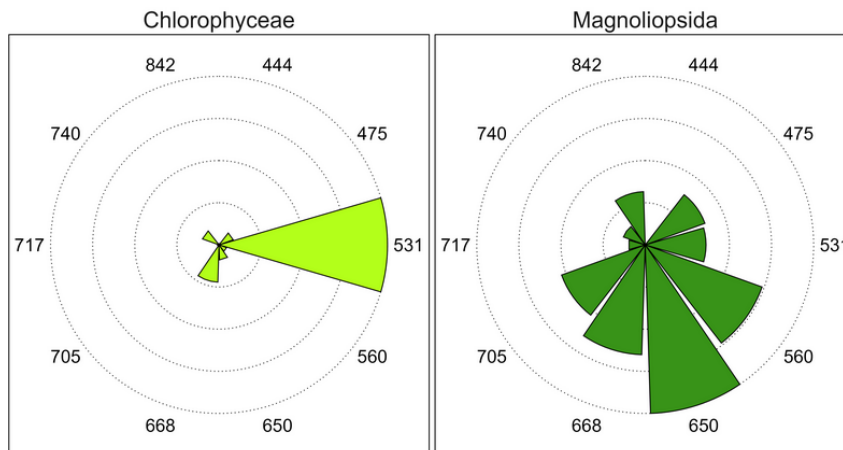
Drone Intertidal Substrate Classification Of Vegetation

Neural network classifier built on ~10 different sites

Overall accuracy 94%

Ca. 500,000 pixels of validation

Operational tool for high-resolution restoration monitoring



Wavelengths Importance of the Neural Network Classifier Oiry *et al.* (2024)

<https://oirysimon.com/discov/>



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## You want to participate to the validation of the Future version of DISCOV ?

[Click here](#)

On this page

[Input and Output of the model](#)

[How to use DISCOV 1.0 on your data ?](#)

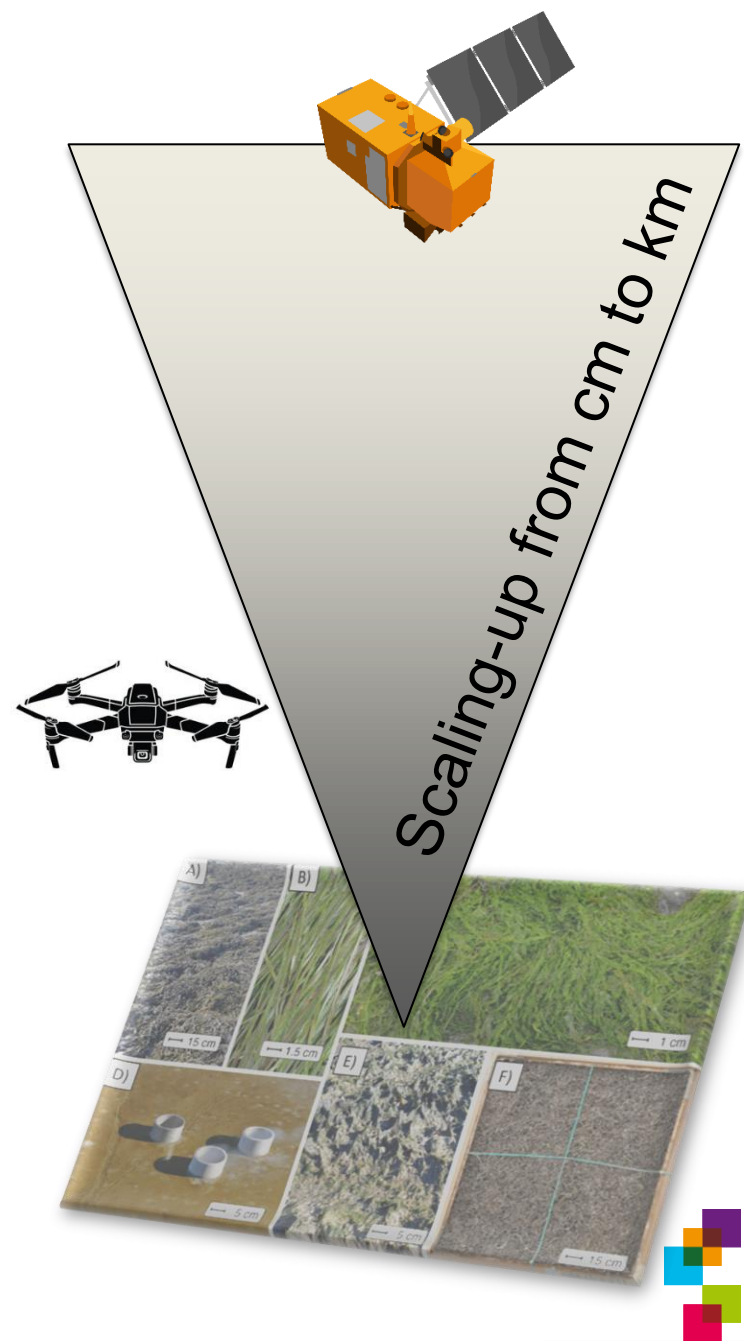


### DISCOV: The Intertidal Drone Classification Model for Micasense

The Drone Intertidal Substrats Classification Of Vegetation (DISCOV) is a Neural Network classification model trained on a Micasense RedEdge-MX Dual multispectral drone camera.

# From drones to satellites

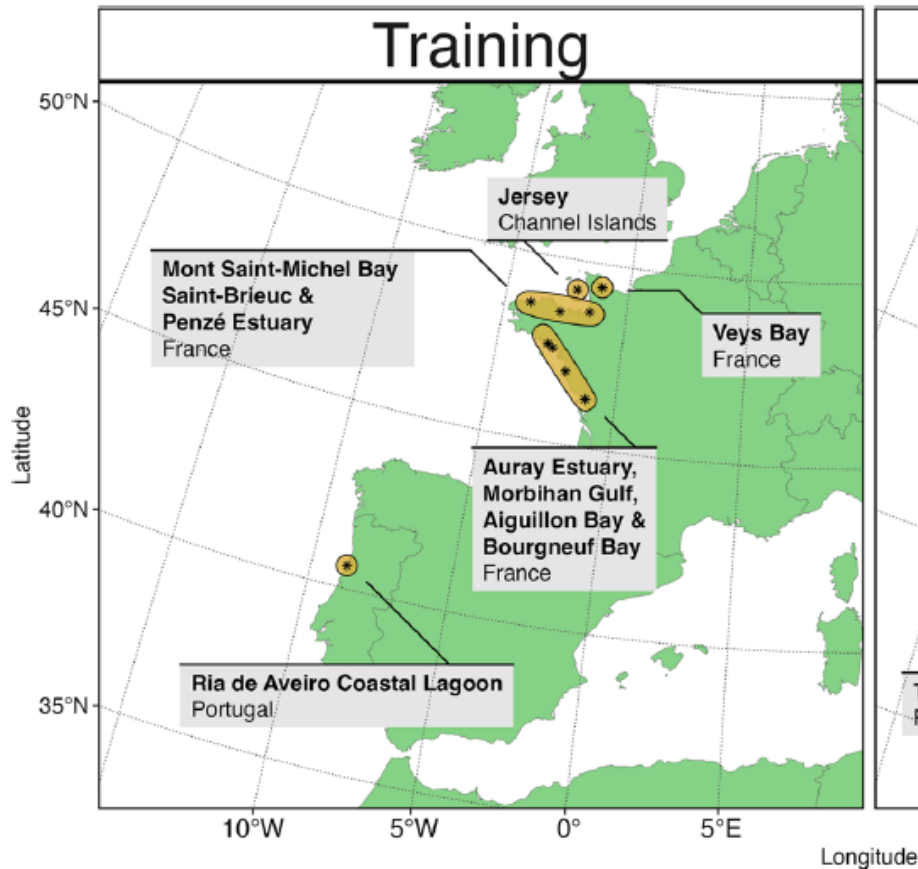
- 1) Drone: very high spatial resolution ( $< 1\text{ cm}$ )  
→ accurate identification of taxonomic class
- 2) Resample drone images at  $10\text{ m}$  spatial resolution
- 3) Train a deep learning, neural network using thousands of labelled satellite pixels
- 4) Validate satellite-derived seagrass class
- 5) Apply model to study seagrass distribution & phenology at regional, national and continental scale



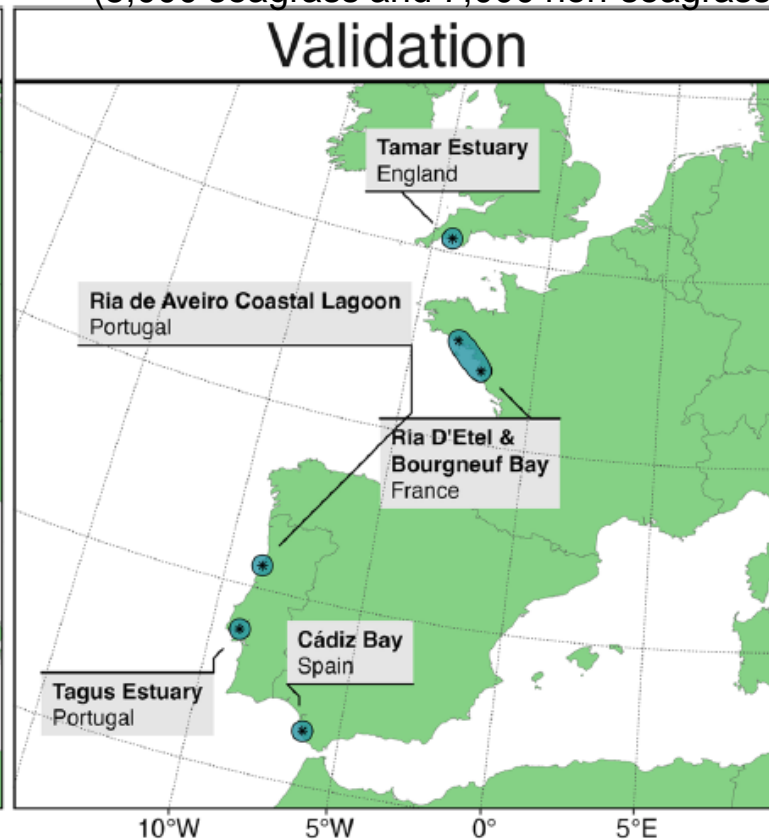
# Model training and validation



**~374,000 labelled pixels**



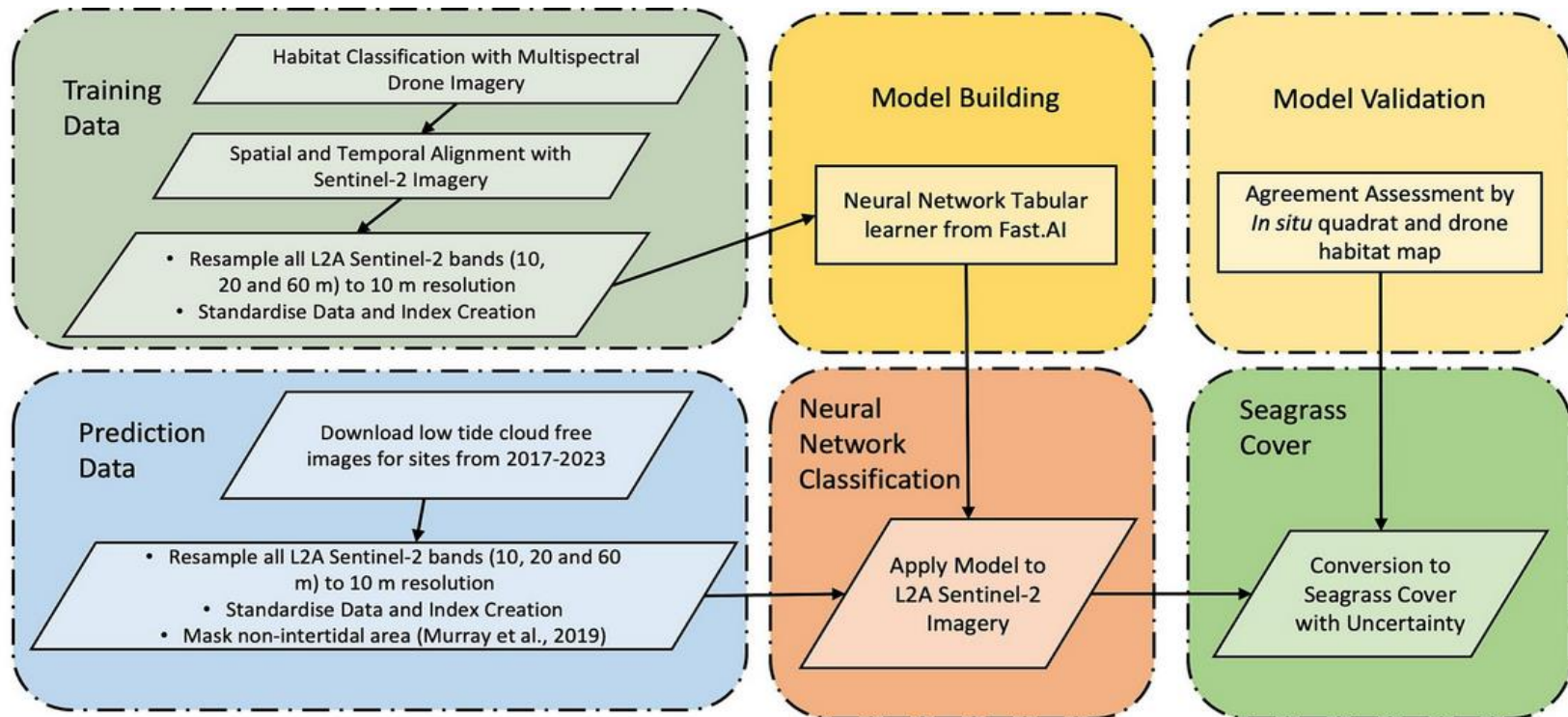
**~12,000 pixels**  
(5,000 seagrass and 7,000 non-seagrass)





# Neural network for intertidal seagrass classification with Sentinel-2

Intertidal **C**lassification of **E**urope:  
Categorising **R**eflectance of **E**merged **A**reas of **M**arine vegetation with **S**entinel-2



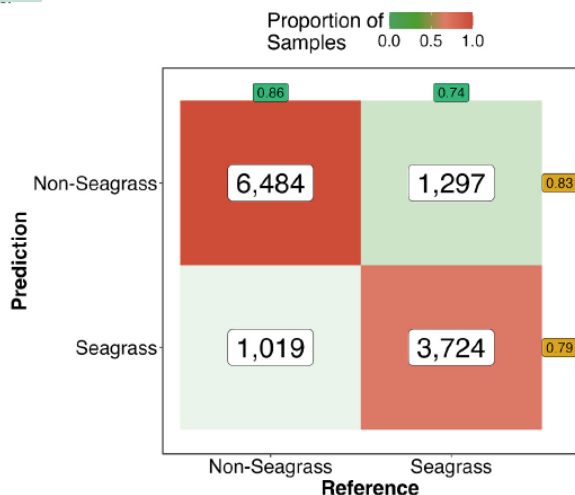


# ICE CREAMS model

## Intertidal Classification of Europe: Categorising Reflectance of Emerged Areas of Marine vegetation with Sentinel-2



Davies et al. (2024a,b)



communications earth & environment

Article



<https://doi.org/10.1038/s43247-024-01543-z>

### A sentinel watching over inter-tidal seagrass phenology across Western Europe and North Africa

Check for updates

Bede Ffianian Rowe Davies<sup>a,\*</sup>, Simon Oiry<sup>a</sup>, Philippe Rosa<sup>a</sup>, Maria Laura Zoffoli<sup>b</sup>, Ana I. Sousa<sup>c</sup>, Oliver R. Thomas<sup>d</sup>, Dan A. Smale<sup>e</sup>, Melanie C. Austen<sup>d</sup>, Lauren Biemann<sup>d</sup>, Martin J. Attrill<sup>d,4</sup>, Alejandro Roman<sup>f</sup>, Gabriel Navarro<sup>f</sup>, Anne-Laure Barillé<sup>g</sup>, Nicolas Harin<sup>h</sup>, Daniel Clewley<sup>a</sup>, Victor Martinez-Vicente<sup>h</sup>, Pierre Gernez<sup>a</sup> & Laurent Barillé<sup>a</sup>

Remote Sensing of Environment 312 (2024) 114340



Contents lists available at ScienceDirect  
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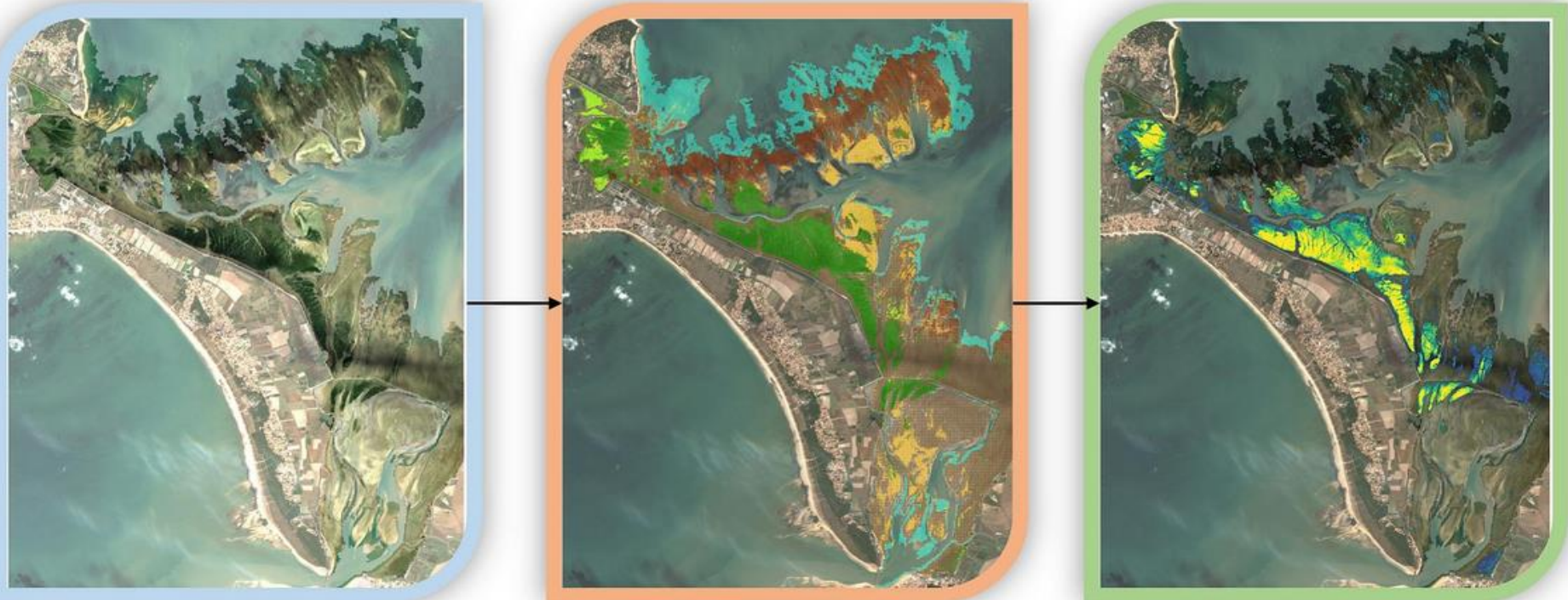


Intertidal seagrass extent from Sentinel-2 time-series show distinct trajectories in Western Europe

Bede Ffianian Rowe Davies<sup>a,\*</sup>, Simon Oiry<sup>a</sup>, Philippe Rosa<sup>a</sup>, Maria Laura Zoffoli<sup>b</sup>, Ana I. Sousa<sup>c</sup>, Oliver R. Thomas<sup>d</sup>, Dan A. Smale<sup>e</sup>, Melanie C. Austen<sup>d</sup>, Lauren Biemann<sup>d</sup>, Martin J. Attrill<sup>d,4</sup>, Alejandro Roman<sup>f</sup>, Gabriel Navarro<sup>f</sup>, Anne-Laure Barillé<sup>g</sup>, Nicolas Harin<sup>h</sup>, Daniel Clewley<sup>a</sup>, Victor Martinez-Vicente<sup>h</sup>, Pierre Gernez<sup>a</sup>, Laurent Barillé<sup>a</sup>

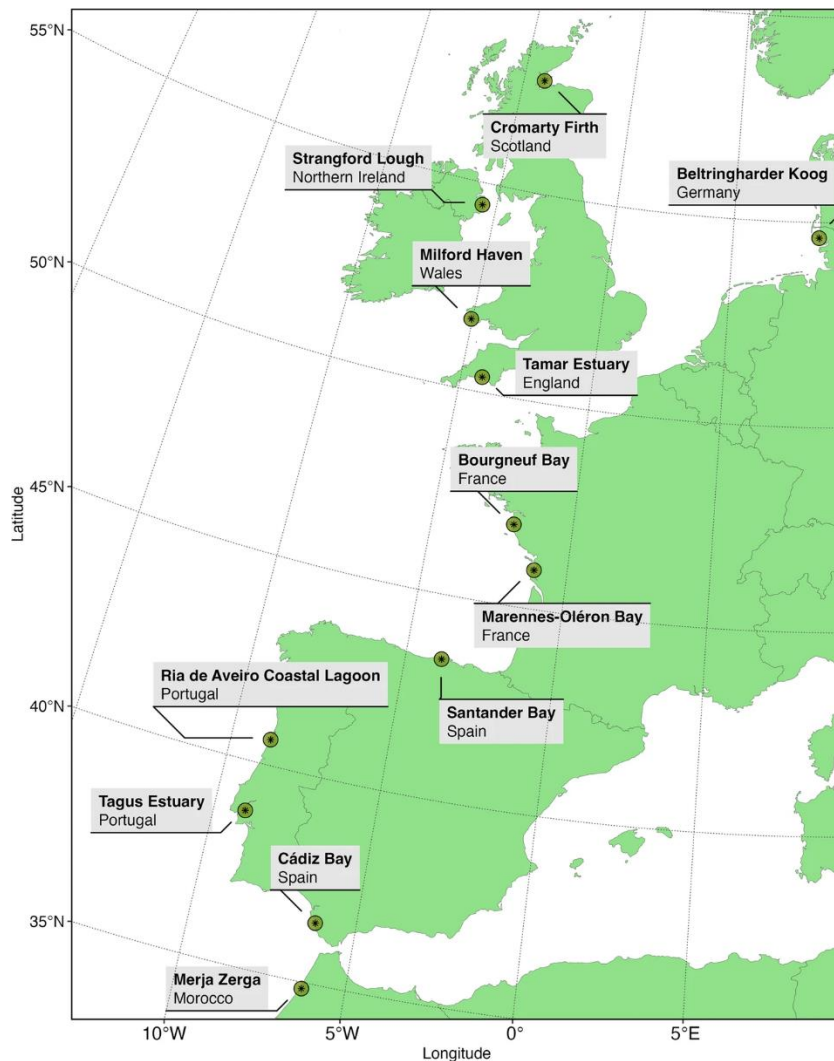
# Performance metrics

**Seagrass classification**  
**82% accuracy**

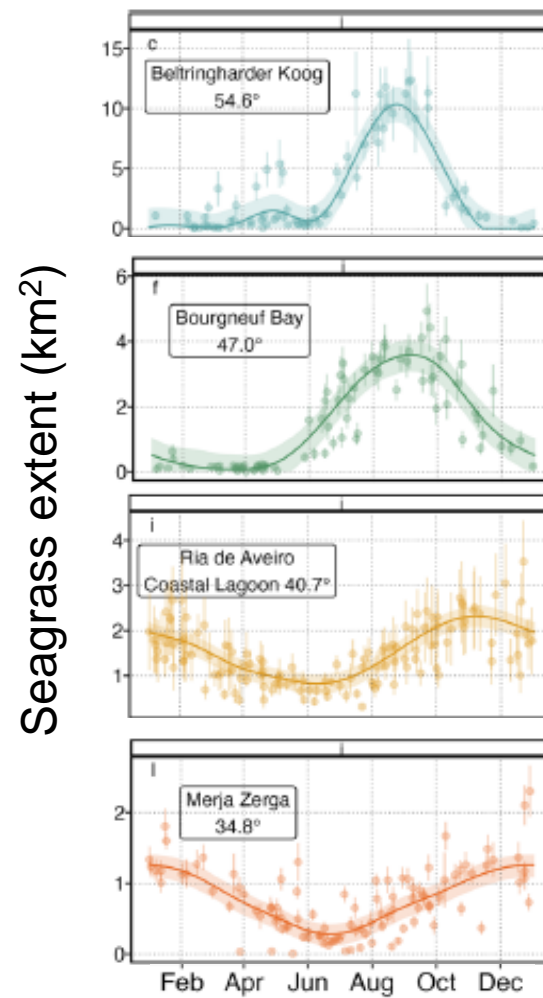


**Seagrass cover estimation**  
**19% RMSD**

# Intertidal seagrass phenology observed by Sentinel-2



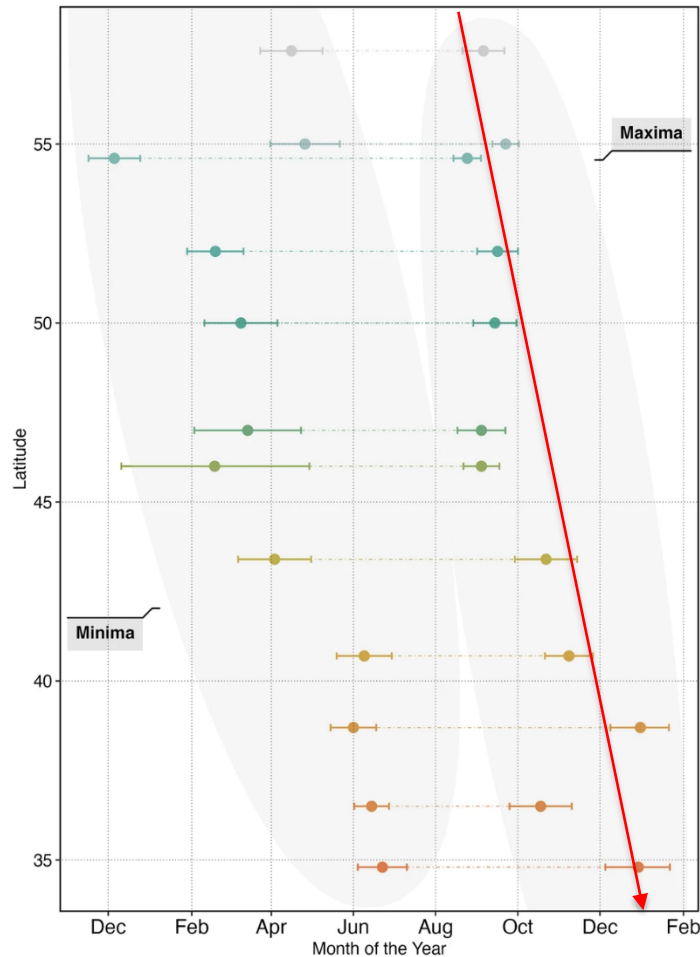
Composite year (2017-2023)



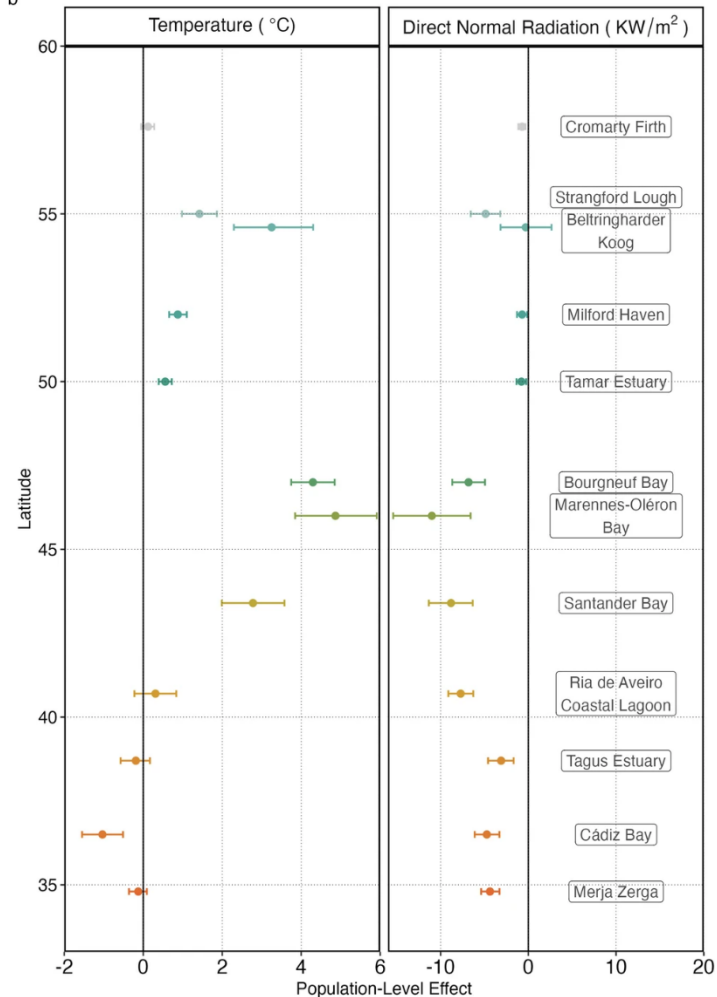
Month of the year

# Latitudinal shift in month of maximal extent

a From late summer at 57°N...



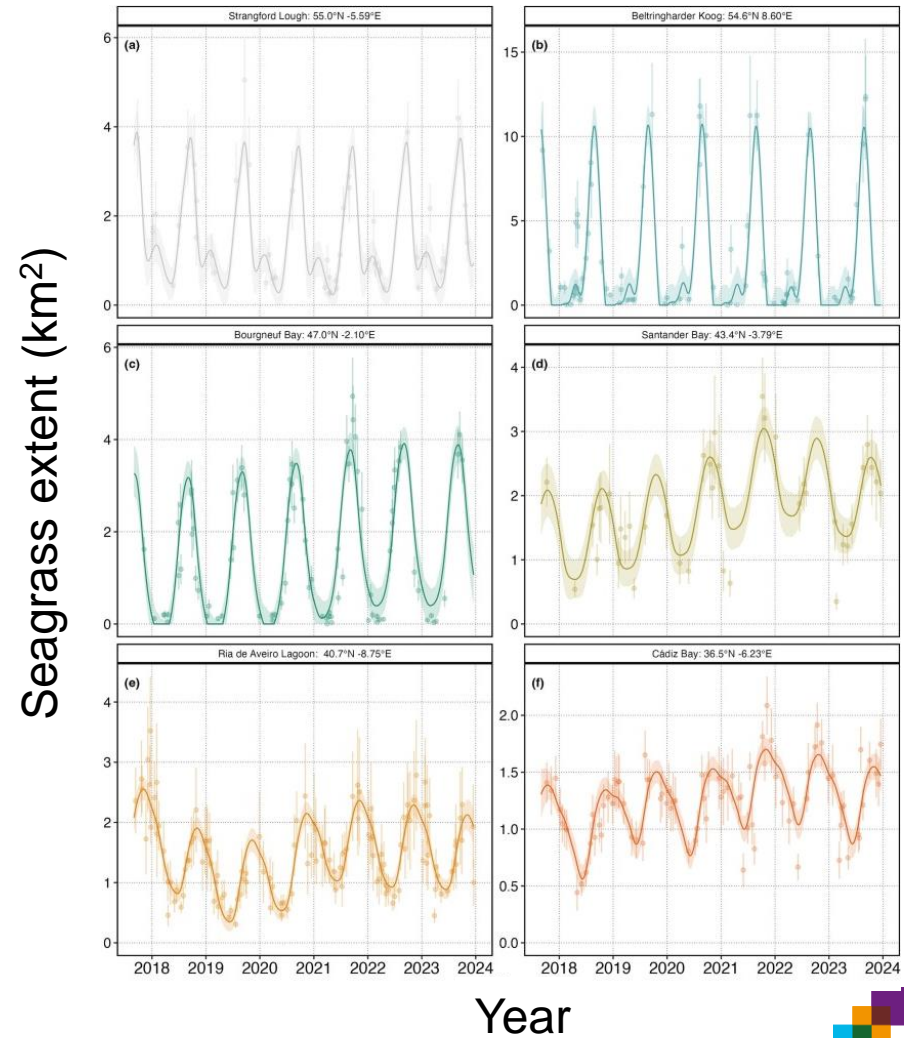
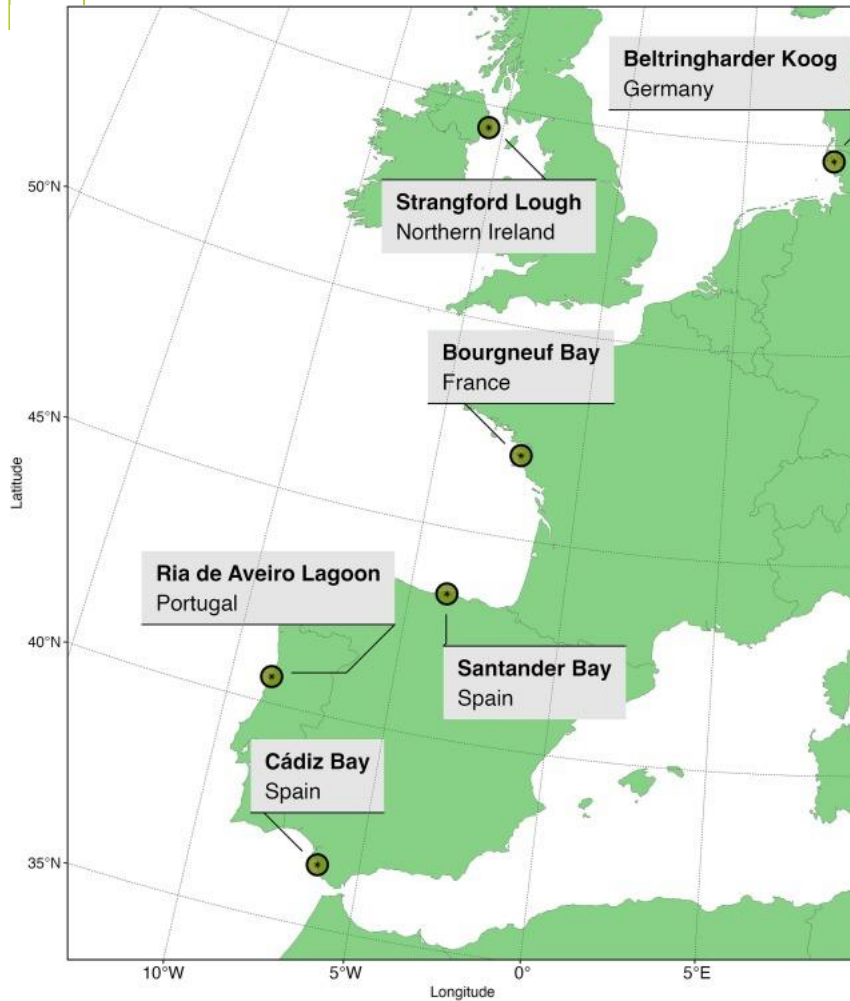
b



... to mid winter at 35°N



# Intertidal seagrass trajectory from 2018 – 2024



Site-specific, but overall stable or with increasing trend (good news)

# Preliminary conclusions



- ✓ Intertidal seagrass can accurately be classified by Sentinel-2 satellite using ICE CREAMS model
- ✓ Methods provide an up-to-date intertidal seagrass assessment tool
- ✓ Latitudinal shift in phenology from Northern to Southern Europe (Atlantic)
- ✓ Intertidal seagrass meadow inter-annual variation is site specific



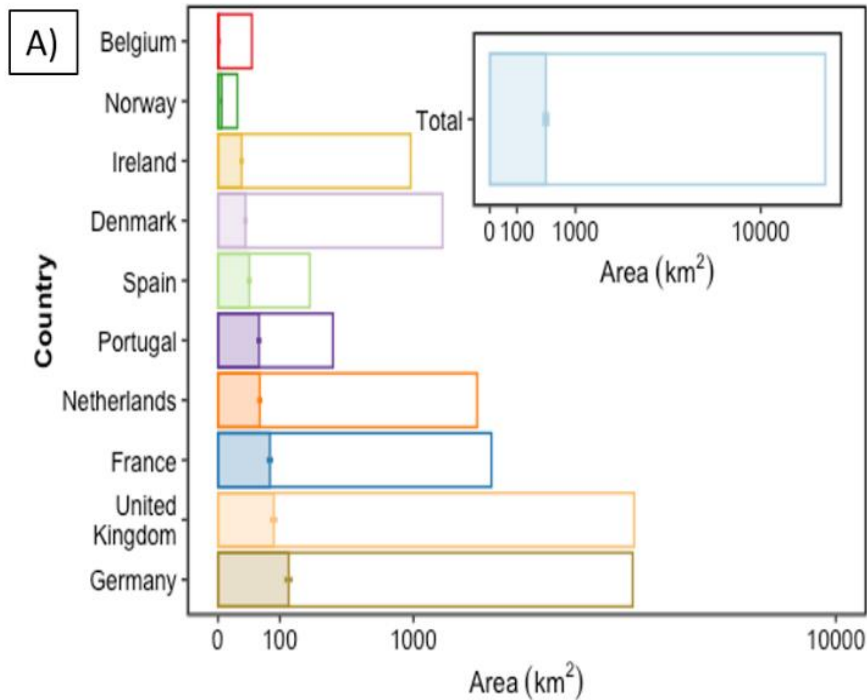
# Preliminary conclusions



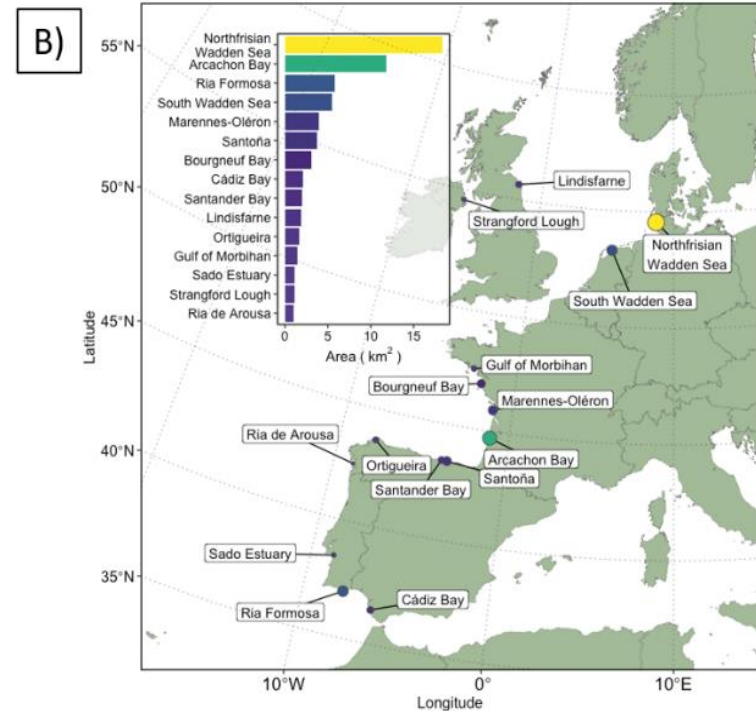
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  - ✓ Methods provide an up-to-date intertidal seagrass assessment tool
  - ✓ Latitudinal shift in phenology from Northern to Southern Europe (Atlantic)
  - ✓ Intertidal seagrass meadow inter-annual variation is site specific
  - x Applied “only” to 12 intertidal meadows
- Next step: continental scale intertidal seagrass mapping (RS workshop!)

# First Map of European Intertidal Seagrass

**Seagrass extent relative to whole intertidal zone**



**The top 15 intertidal seagrass sites**

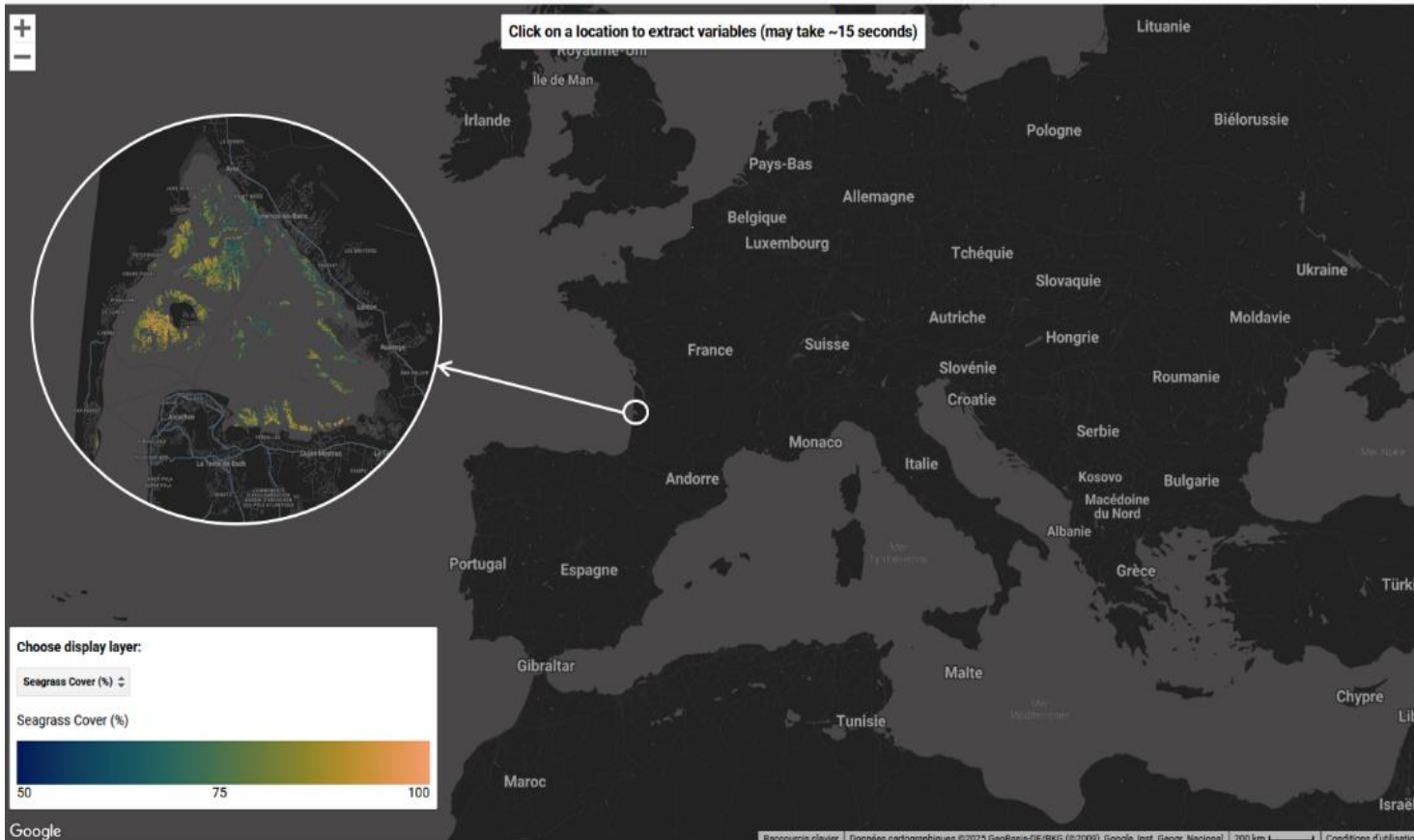


*Intertidal seagrass meadow: only 3% of intertidal zone in Europe...*

**THERE IS ROOM FOR RESTORATION !!**

# Open access interactive map

*Work in progress...coming soon... stay tuned*



## European Intertidal Seagrass Explorer

This app visualizes the European Intertidal Seagrass cover created from 5 harmonised Sentinel-2 composites of the Intertidal area, where vegetation was maximised. The Intertidal Classification of Europe: Categorising Reflectance of Emerged Areas of Marine vegetation using Sentinel-2 (ICE CREAMS) model was used to classify these 5 composites (Davies et al 2024 a, b). A mode prediction was used, where pixels were selected if seagrass was predicted at least 3 times. Seagrass Cover (%) was then calculated from the NDVI (Zoffoli et al., 2020) and plotted alongside a range of other layers that can be inspected: the Prediction Uncertainty, Ratio of Cover to uncertainty, the Day of the Year and the Year. Raw Seagrass Cover was filtered and only pixels with Uncertainty less than 20% plotted. The data layers: Seagrass Cover (%), Predicted Uncertainty (%), Day of the Year, Year and Raw Seagrass Cover (%) can be switched from the legend panel, and inspected by clicking on a specific pixel (values will be displayed below but note they may take around 15 seconds to load).

### Data Source:

[Intertidal Seagrass Phenology with ICE CREAMS](#)

[Intertidal Seagrass Trends with ICE CREAMS](#)

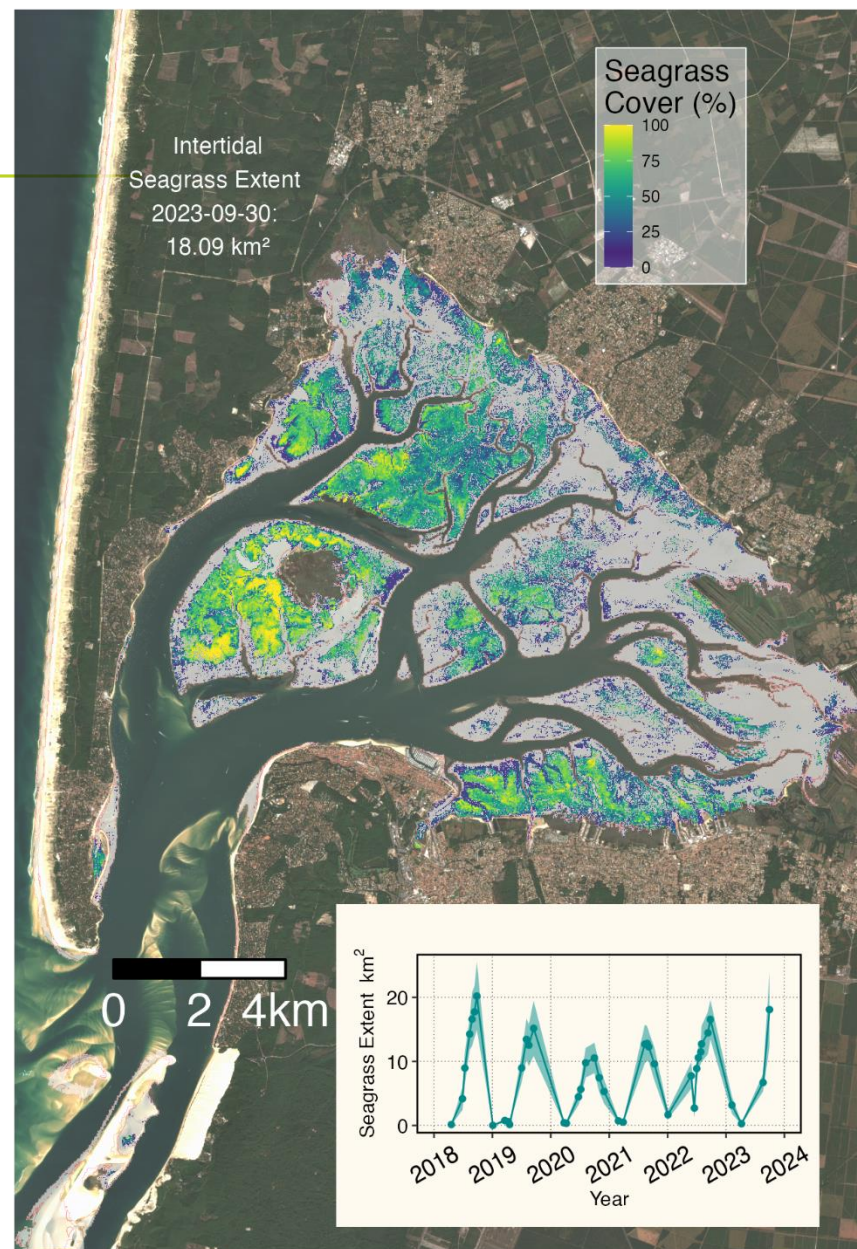
### Created by:

[Bede Ffinian Rowe Davies](#)



# and in Arcachon?

Preliminary results were obtained just in time for the:



# Thank you!



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Gernez



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