

### living planet symposium BONN 23-27 May 2022

TAKING THE PULSE OF OUR PLANET FROM SPACE

EUMETSAT CECMWF

# Monitoring dissolved oxygen near aquaculture sites using satellite data and machine learning

A. Chatziantoniou, O. Stavrakidis-Zachou, N. Papandroulakis, K. Topouzelis

23/05/2022

ESA UNCLASSIFIED – For ESA Official Use Only

#### 

### Introduction



Satellite sensors are able to detect parameters which affect the optical properties of water at specific wavelengths (e.g. chl-a)

- Unlikely to record the concentration of dissolved oxygen directly from satellite sensors
- Estimation indirectly as a result of its correlation with other parameters





Figure 1: Drone image from Agrilia, Lesvos (N. Aegean Sea)





### Study site





Figure 2: The study site is located in north Aegean Sea, near the coastline of the Greek Lesvos Island.

- Capacity: 180T/year
- Temperature: 14°C to 24°C
- Salinity: 39 psu
- Avg. depth: 50m.





- Satellite Level 4 multi-platform observations
- Daily chl-a and sst
- 358 entries for one-year (2021)

#### automatic download from CMEMS





Mediterranean Sea Monthly And Daily Interpolated Surface Chlorophyll Conce... OCEANCOLOUR\_MED\_CHL\_L4\_NRT\_OBSERVATIO... CHL () From To

Present

0.3 km x 0.3 km Observation

2016-04-25

L4

\*OCEANCOLOUR\_MED\_CHL\_L4\_NRT\_OBSERVATIONS\_009\_041 \*MEDSEA\_ANALYSIS\_FORECAST\_BIO\_006\_014-TDS \*SST\_MED\_SST\_L4\_NRT\_OBSERVATIONS\_010\_004 \*MEDSEA\_ANALYSIS\_FORECAST\_PHY\_006\_013-TDS

- In situ measurements (Oxy Guard)
- Daily DO and sst
- 365 entries for one-year (2021)

Date	SST	DO
1/1/2021	16,0	7,4
2/1/2021	16,0	7,4
3/1/2021	16,0	7,5
4/1/2021	16,0	7,6
5/1/2021	17,0	7,6
6/1/2021	17,0	7,7
7/1/2021	17,0	7,8
8/1/2021	17,0	7,8
9/1/2021	17,0	7,8
10/1/2021	17,0	7,8
11/1/2021	17,0	7,8
12/1/2021	16,0	7,4
13/1/2021	16,0	7,4
14/1/2021	16,0	7,5
15/1/2021	16,0	7,4
16/1/2021	16,0	7,5
17/1/2021	16,0	7,4

### Methodology





- **Input**: CMEMS and field measures
- Create data frame with chl-a, sst, do
- Train SVR (Support Vector Regression) model
- Validate results
- **<u>Output</u>**: DO maps, timeseries and correlation

### **Results (1/3): Model Performance**





### Results (2/3): Temporal Variability







**Dissolved oxygen**: 7-7.8 mg/l Highest: winter-spring

**DO Saturation** > 85% Highest: summer

### **Results (2/3): Temporal Variability**





#### 

8

### **Results (3/3): Spatial Distribution**





*Figure 3:* Sea surface temperature and chlorophyll-a maps derived from CMEMS data



*Figure 4:* Dissolved oxygen map estimated as a result of its correlation with temperature and chl-a.

### Conclusions



The **purpose** of this study was to develop a methodology for the <u>estimation of dissolved oxygen</u> in coastal aquaculture facilities, based on daily **CMEMS data** and **machine learning techniques**.

An *automated procedure* was developed for extracting the estimated **dissolved oxygen values** that can be used for creating maps and further analysis.

Our preliminary results show a promising approach for estimating DO at aquaculture sites, which paves the way for the development of real-time monitoring systems for aquaculture.

- Correlation between DO, SST and chl-a
  - High precision and accuracy
  - Detection of sudden drops/shifts
  - Spatial scale better representation

### **Future steps: Precision aquaculture**



11



Explore more data sources (Sentinel-2, Sentinel-3 and UAV)

- Expand dataset to other regions
- Examine the correlation with more parameters
- Create an automated service to predict and alert



## Thank you for your attention!

Andromachi Chatziantoniou | achatz@marine.aegean.gr



OPERATIONAL PROGRAMME

COMPETITIVENESS

ENTREPRENEURSHIP INNOVATION

### Acknowledgments

This research work has been co-financed by the European Union and Greek national funds through the Operational Program Competitiveness, Entrepreneurship and Innovation, under the call RESEARCH – CREATE – INNOVATE (project code: **T2EDK-02687**)



#### **DEPARTMENT OF MARINE SCIENCES**