

27-29 May 2024 



imdis

International conference on Marine Data  
and Information Systems

# Fish detection and classification at OBSEA

*Oriol Prat, Pol Baños, Enoc Martínez i Joaquin del Río*



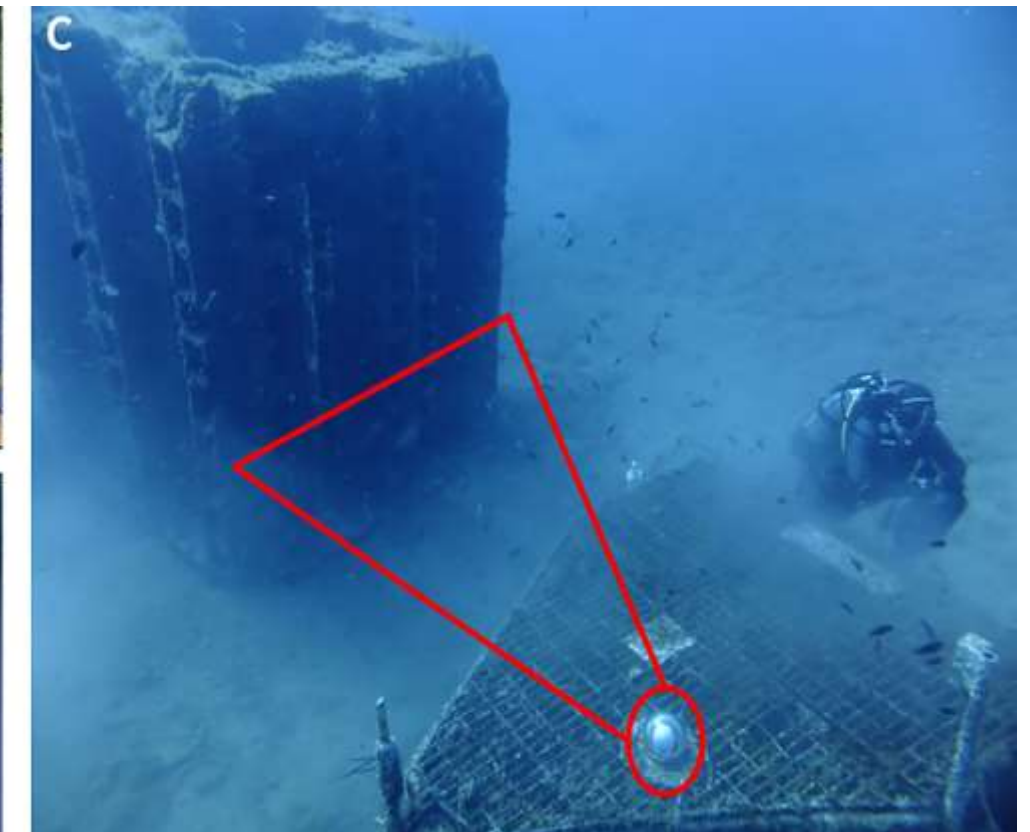


# OBSEA Seafloor Observatory

- Underwater cabled observatory
- Located at NW Mediterranean Sea
- Shallow waters (20 m depth)



- Multiparametric data
- Image archive since 2011
  - Fish abundance & behaviour studies





# Introduction

## iImagine project objectives

Use case at OBSEA observatory (UC3)

- Publish real-time biodiversity
- Ecosystem Monitoring using underwater images

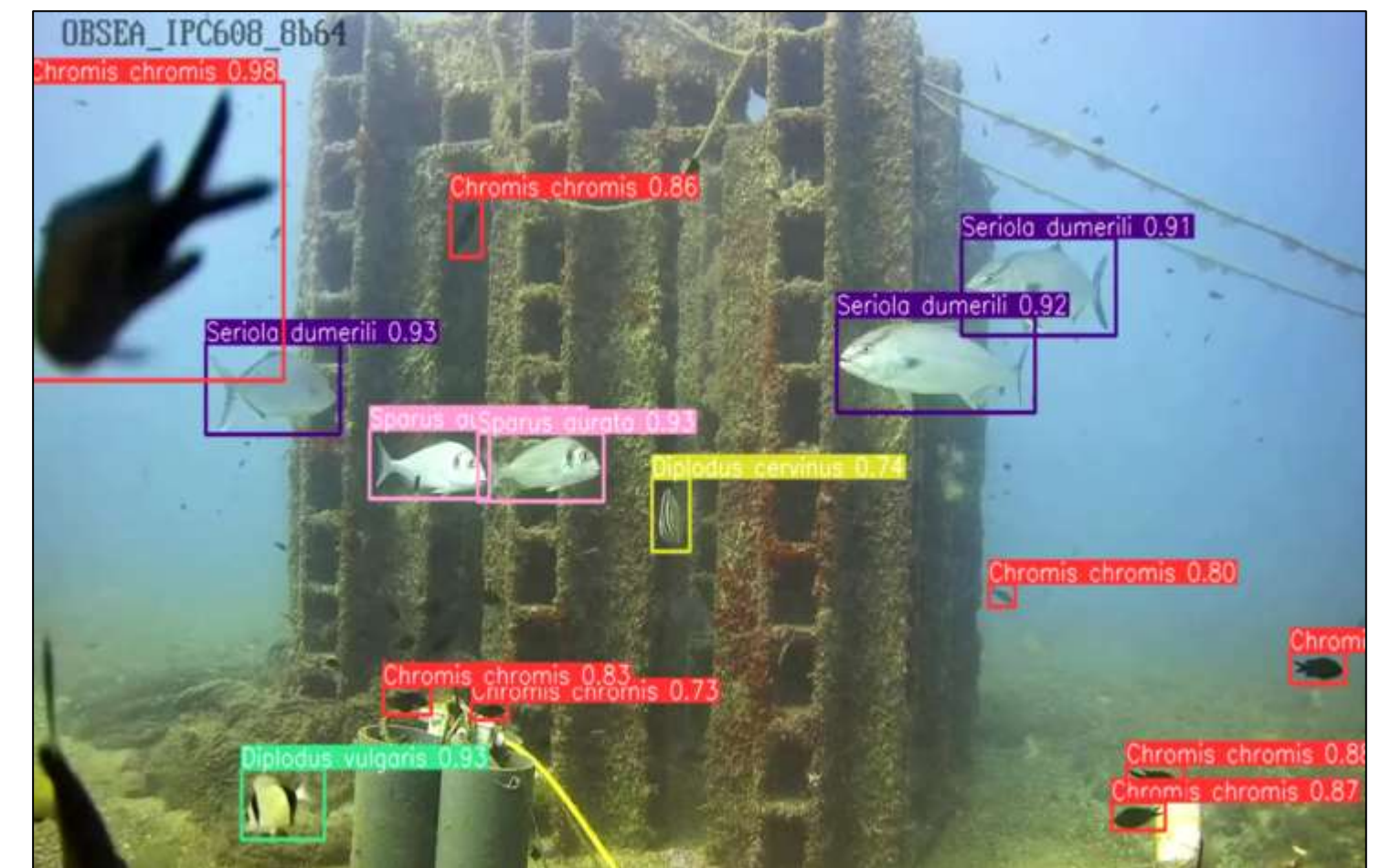
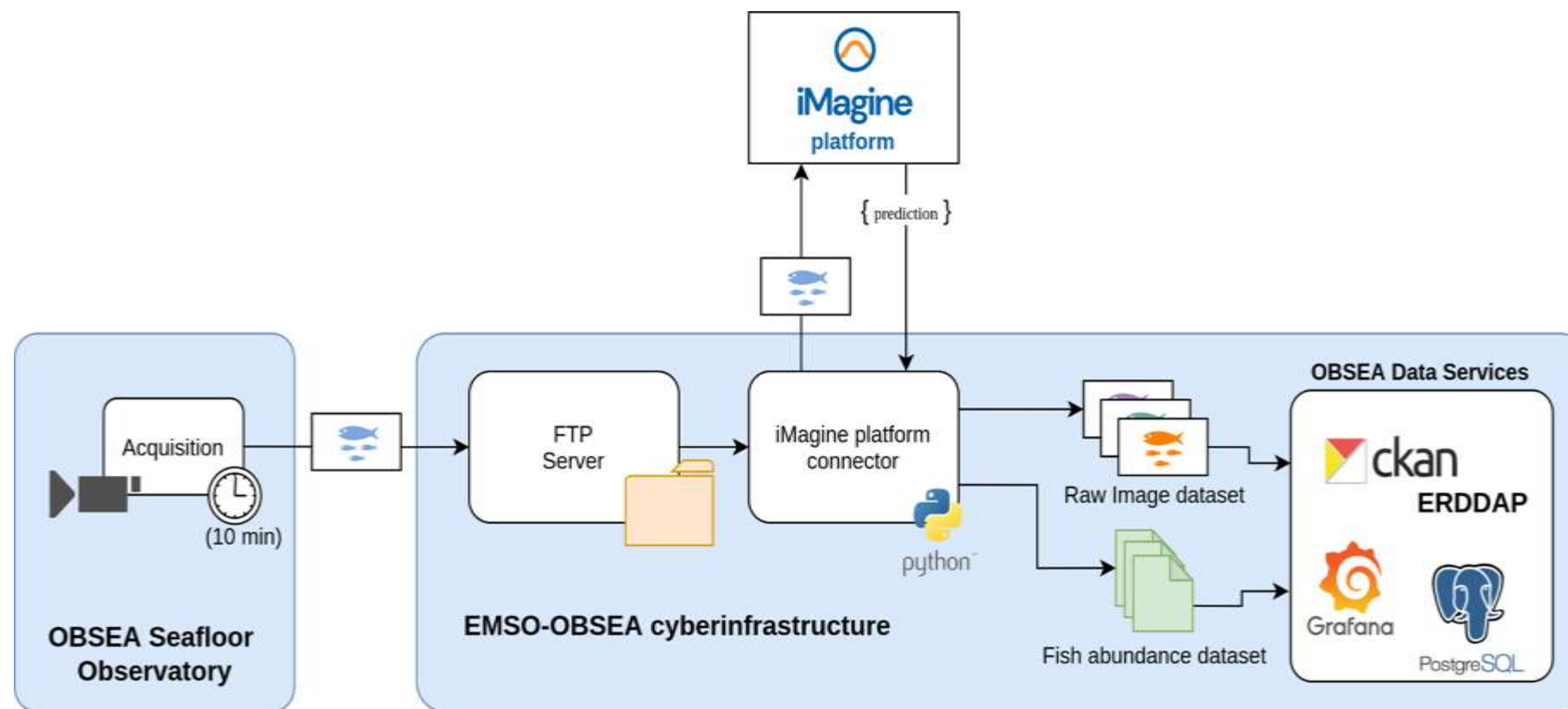
## Target users

Marine scientists

Data managers

## AI Model

YOLO v8/9



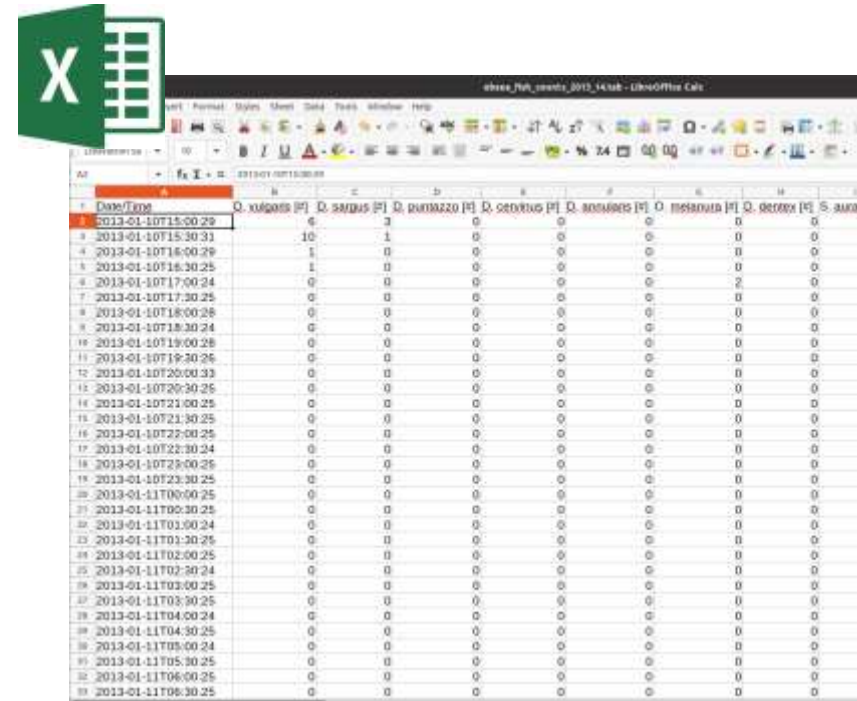
# Traditional Ecological Monitoring

## 1. Underwater pictures



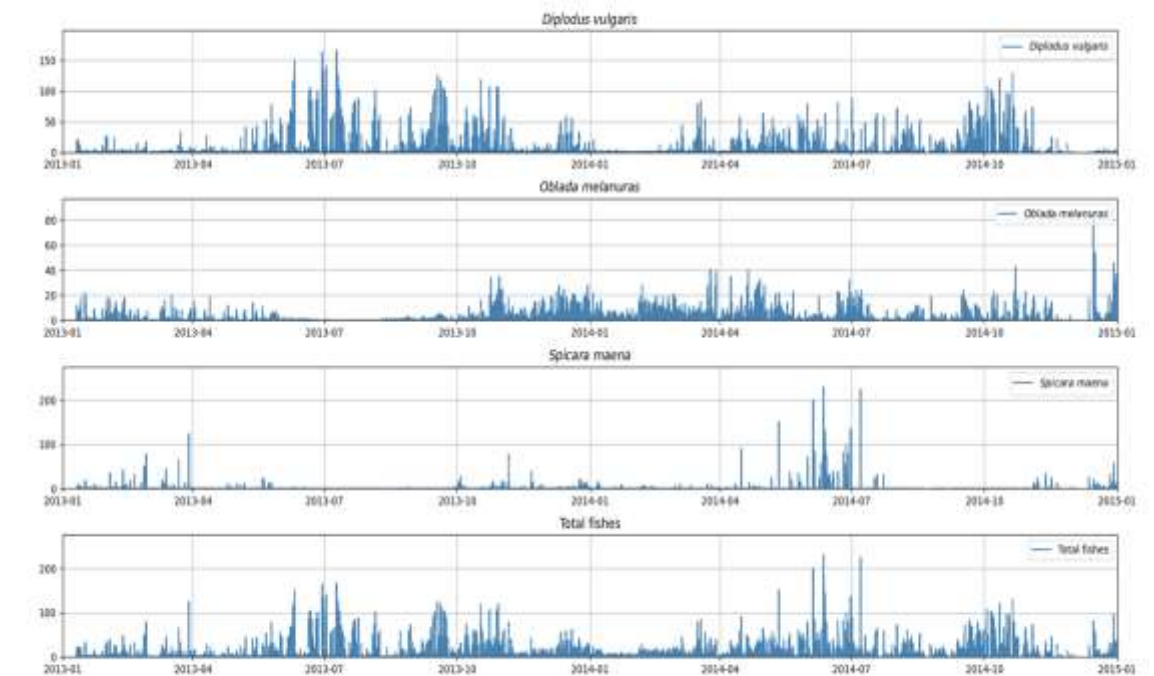
## 2. Manual fish counts

## 3. Spreadsheet with counts



Date/Time	O. vulgaris [P]	O. auratus [P]	O. parvifasciatus [P]	O. serotinus [P]	O. annularis [P]	O. melanurus [P]	O. detreux [P]	S. auratus [P]
2013-01-10T15:00:29	6	3	0	0	0	0	0	0
2013-01-10T15:30:31	10	1	0	0	0	0	0	0
2013-01-10T16:00:29	1	0	0	0	0	0	0	0
2013-01-10T16:30:25	1	0	0	0	0	0	0	0
2013-01-10T17:00:24	0	0	0	0	0	2	0	0
2013-01-10T17:30:25	0	0	0	0	0	0	0	0
2013-01-10T18:00:28	0	0	0	0	0	0	0	0
2013-01-10T18:30:24	0	0	0	0	0	0	0	0
2013-01-10T19:00:28	0	0	0	0	0	0	0	0
2013-01-10T19:30:26	0	0	0	0	0	0	0	0
2013-01-10T20:00:33	0	0	0	0	0	0	0	0
2013-01-10T20:30:25	0	0	0	0	0	0	0	0
2013-01-10T21:00:25	0	0	0	0	0	0	0	0
2013-01-10T21:30:25	0	0	0	0	0	0	0	0
2013-01-10T22:00:25	0	0	0	0	0	0	0	0
2013-01-10T22:30:24	0	0	0	0	0	0	0	0
2013-01-10T23:00:25	0	0	0	0	0	0	0	0
2013-01-10T23:30:25	0	0	0	0	0	0	0	0
2013-01-11T00:00:25	0	0	0	0	0	0	0	0
2013-01-11T00:30:25	0	0	0	0	0	0	0	0
2013-01-11T01:00:24	0	0	0	0	0	0	0	0
2013-01-11T01:30:25	0	0	0	0	0	0	0	0
2013-01-11T02:00:25	0	0	0	0	0	0	0	0
2013-01-11T02:30:24	0	0	0	0	0	0	0	0
2013-01-11T03:00:25	0	0	0	0	0	0	0	0
2013-01-11T03:30:25	0	0	0	0	0	0	0	0
2013-01-11T04:00:24	0	0	0	0	0	0	0	0
2013-01-11T04:30:25	0	0	0	0	0	0	0	0
2013-01-11T05:00:24	0	0	0	0	0	0	0	0
2013-01-11T05:30:25	0	0	0	0	0	0	0	0
2013-01-11T06:00:25	0	0	0	0	0	0	0	0
2013-01-11T06:30:25	0	0	0	0	0	0	0	0

## 4. Abundance time-series



Extremely time-consuming!!

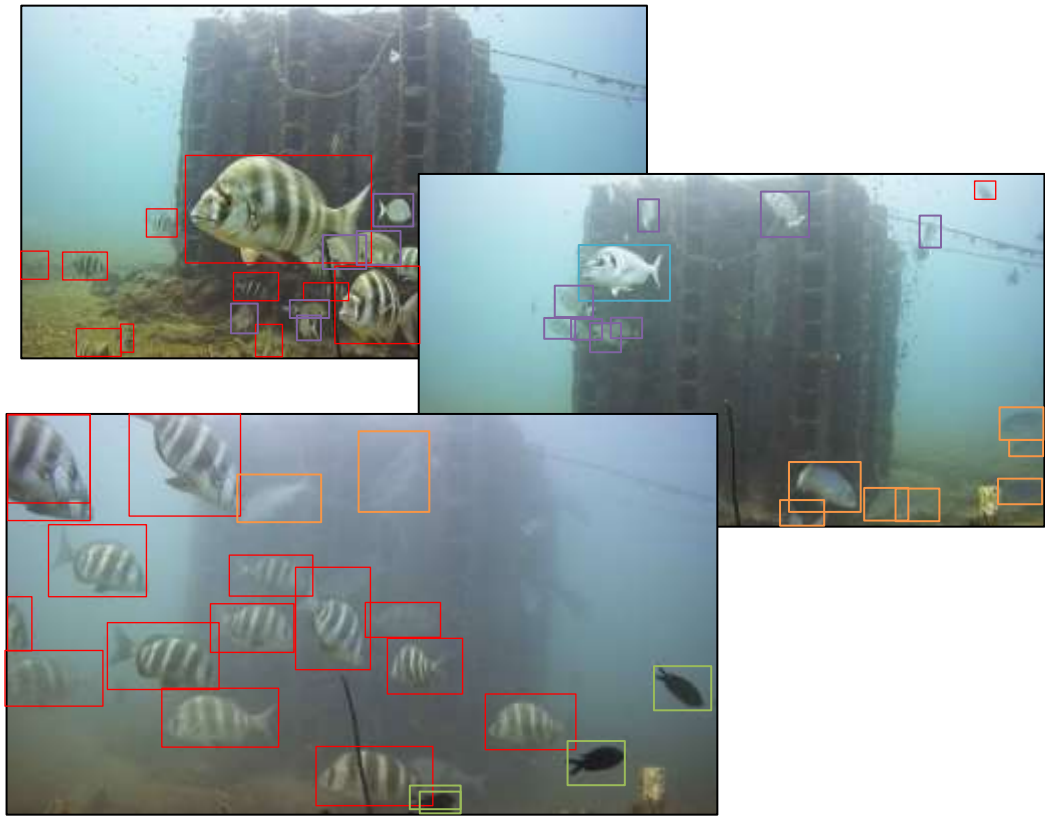
Not reproducible

Expertise in biology

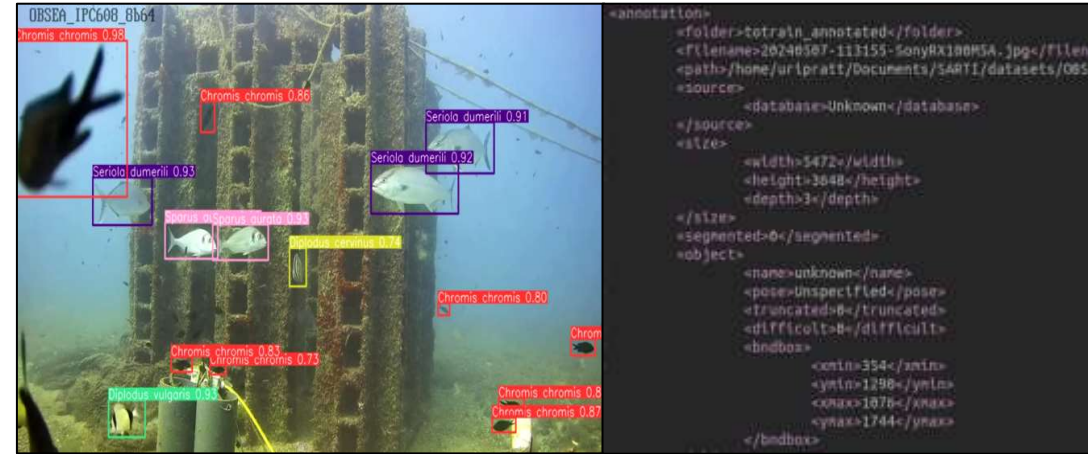


# AI-based Ecological Monitoring

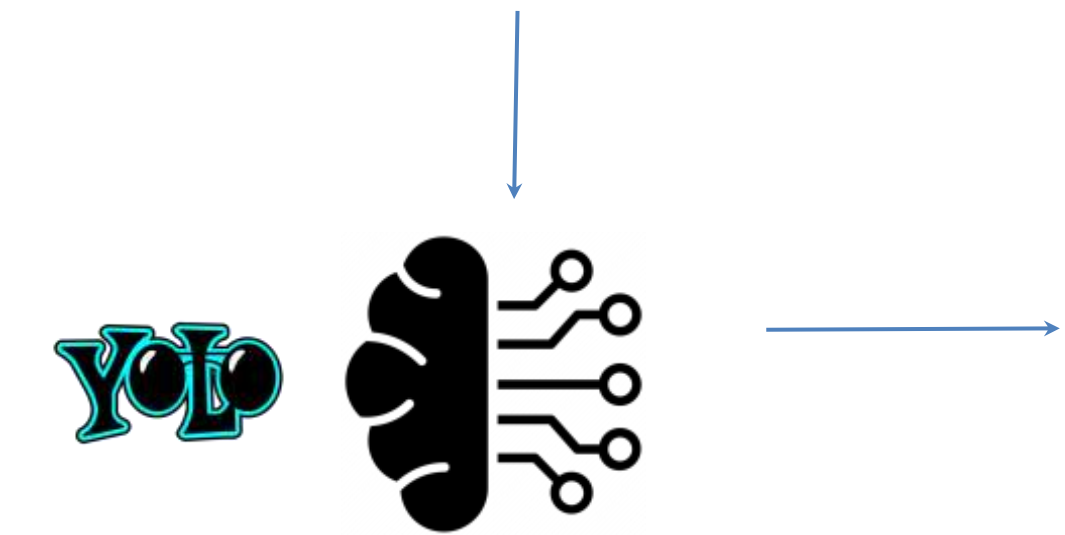
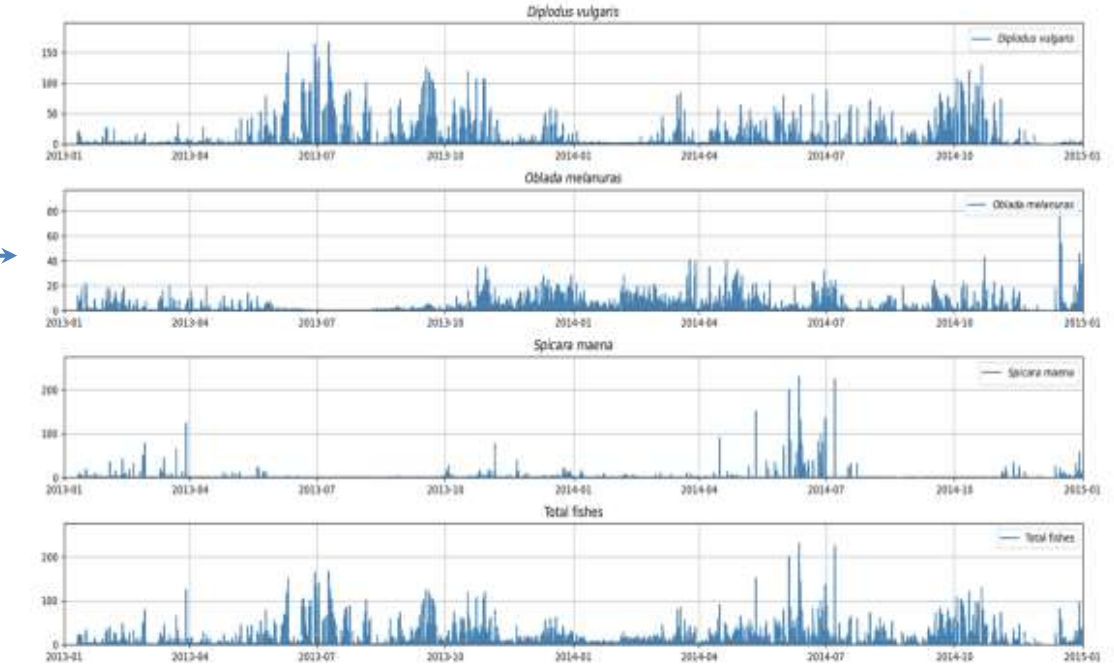
## 1. Label underwater pictures



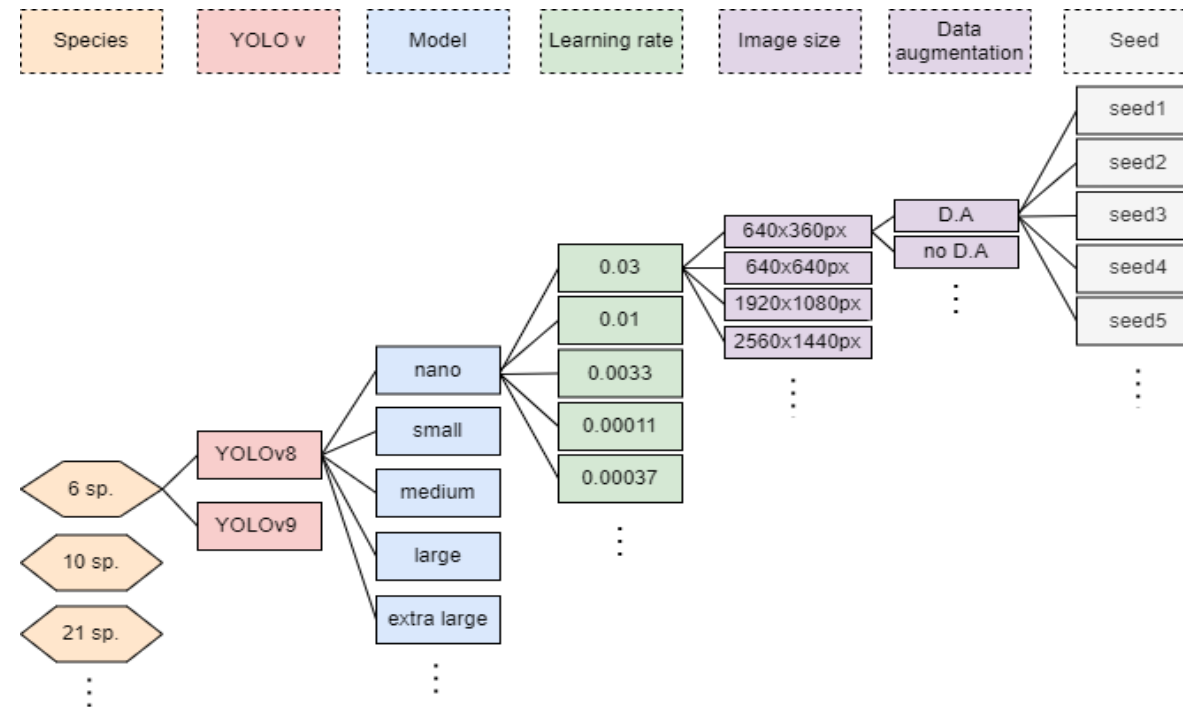
## 4. Store predictions



## 5. Abundance time-series



## 2. AI model (object detection)



## 3. Train and Detect

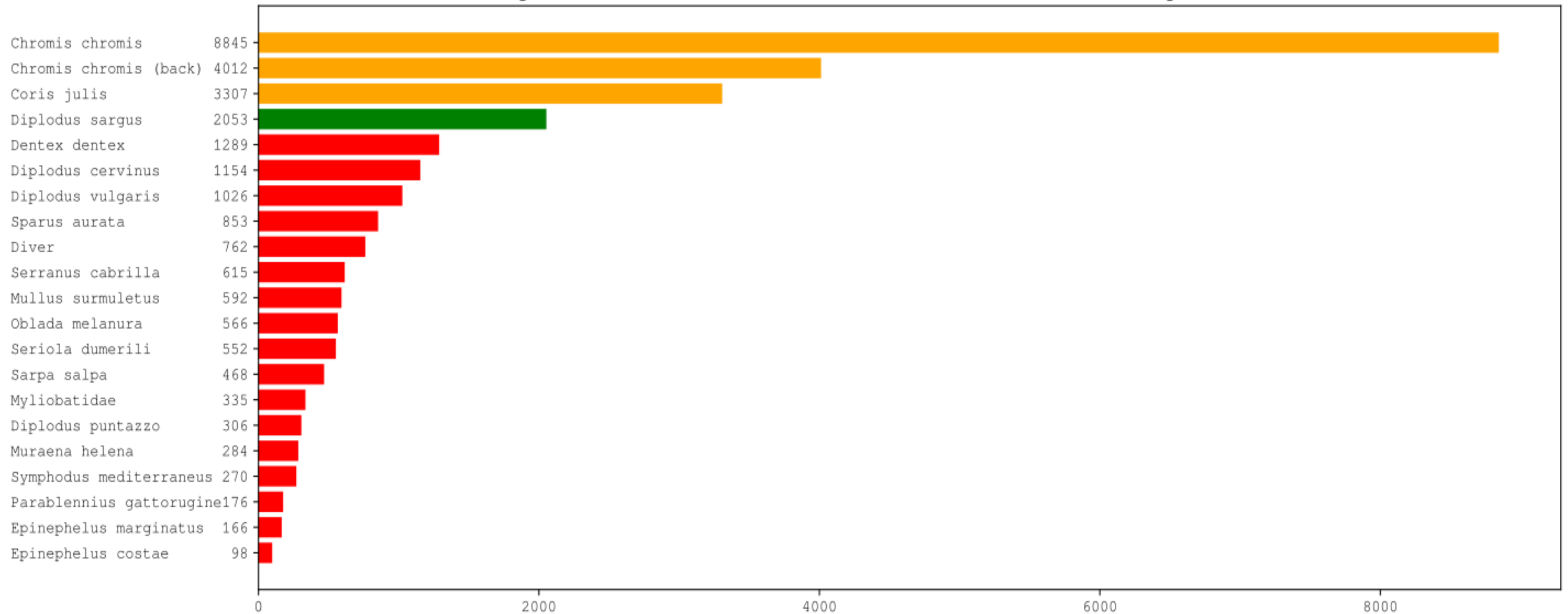
*Let scientist do science, not count fish!*

50k img analyzed { scientist = 1 year  
AI-model = 12 h

# Semi-automatic labelling

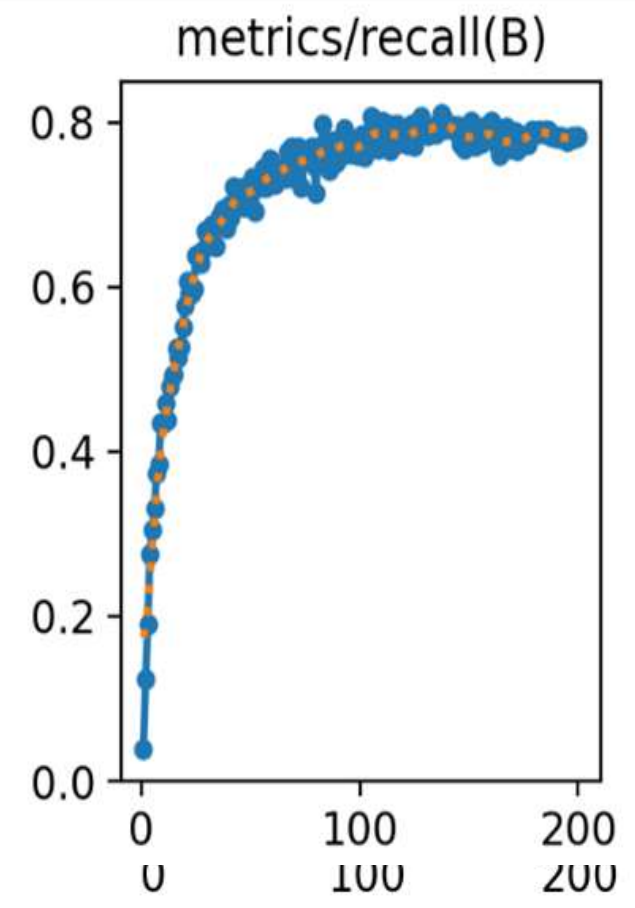
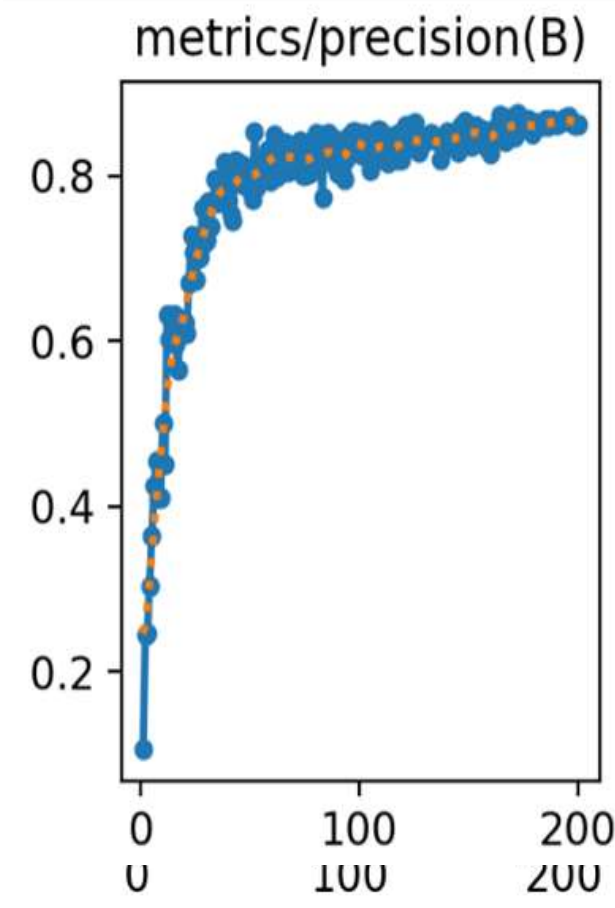
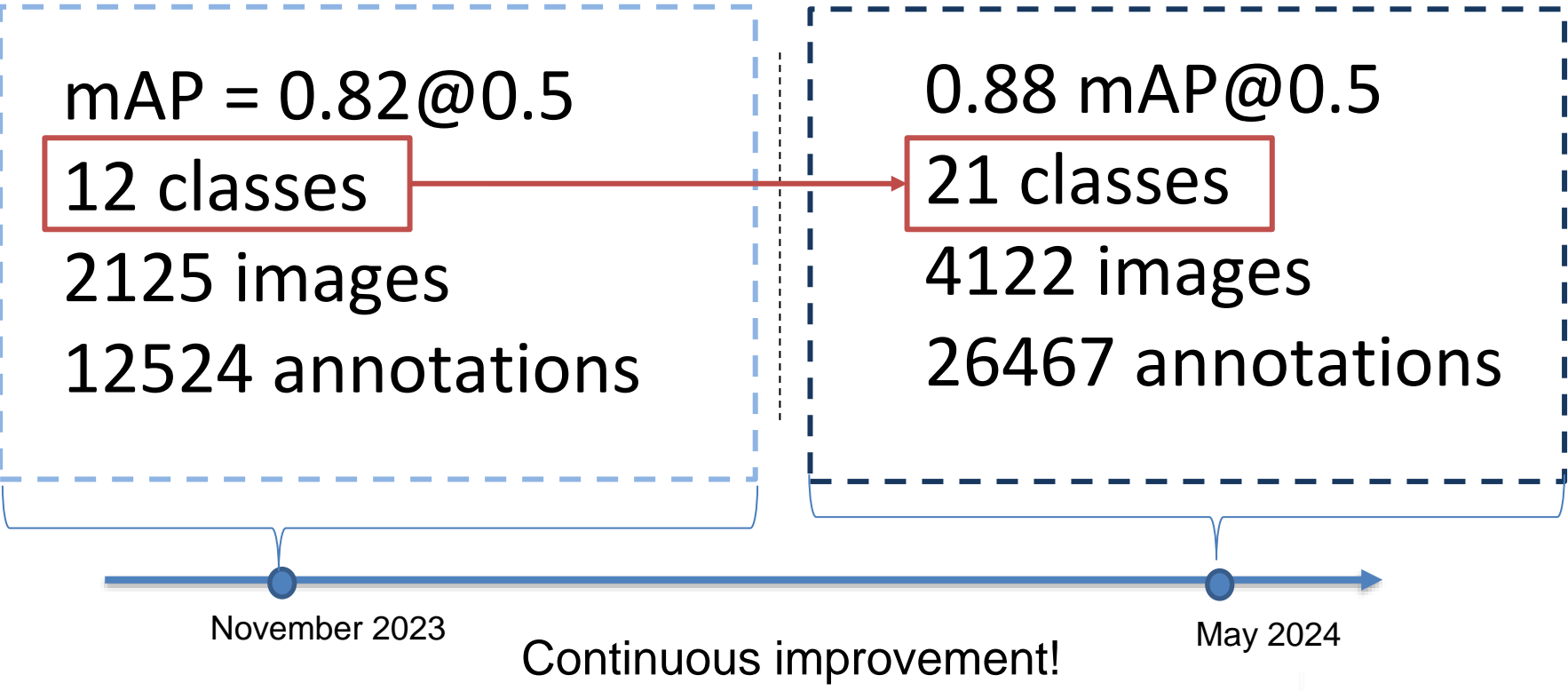
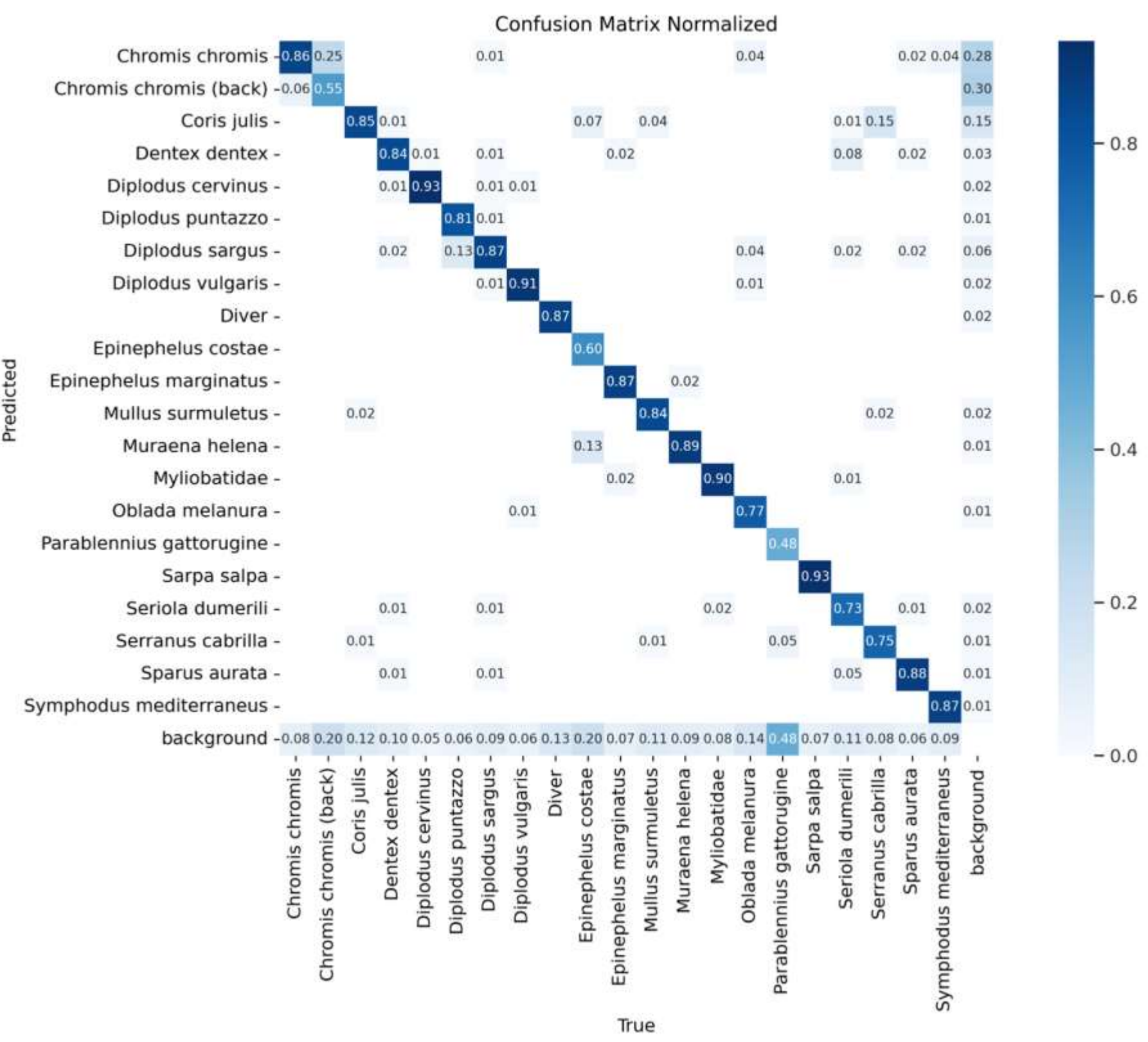
## Dataset Health Check

Total images = 4331 - Total annotations = 27729 - Average annotation = 6.4





# Progress to date...

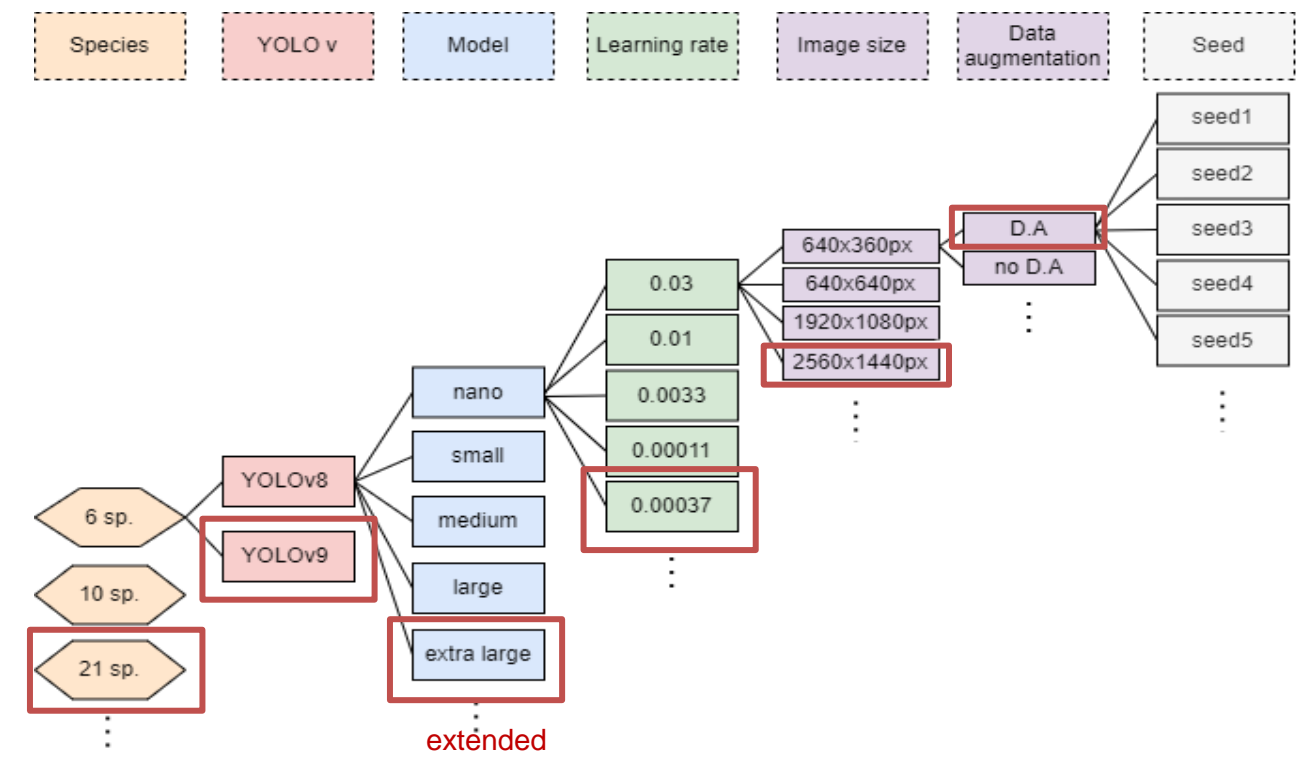


# Progress to date...

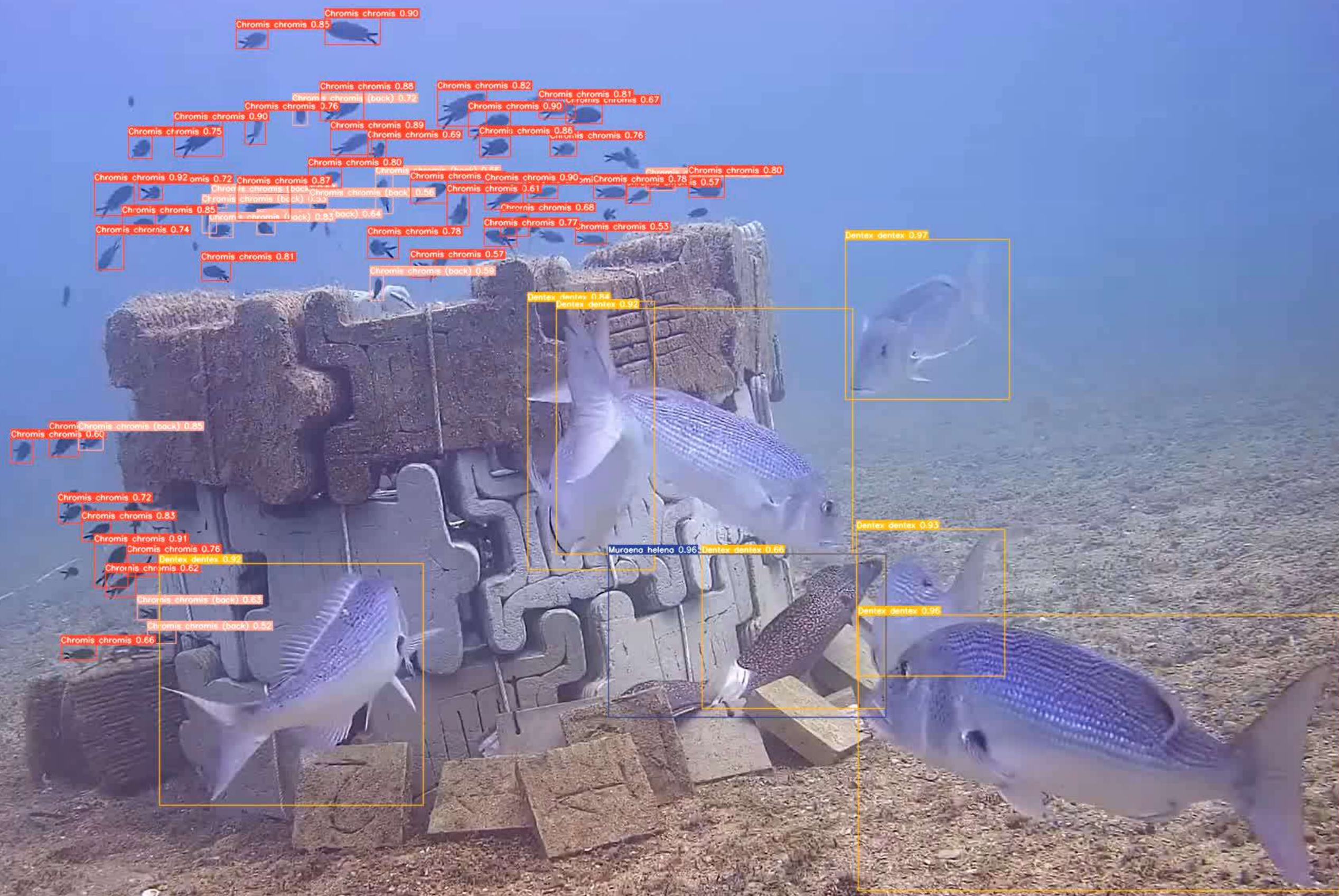
- Dataset Preparation 80% ✓
- Model training ✓
  - YOLOv8 multiple configurations
  - MLflow integration (also ClearML)



- Training dataset published on Zenodo ✓
  - [DOI: 10.5281/zenodo.11195949](https://doi.org/10.5281/zenodo.11195949)
- Real time streaming on YouTube ✓
  - <https://www.youtube.com/watch?v=byrGnGMAHGI>



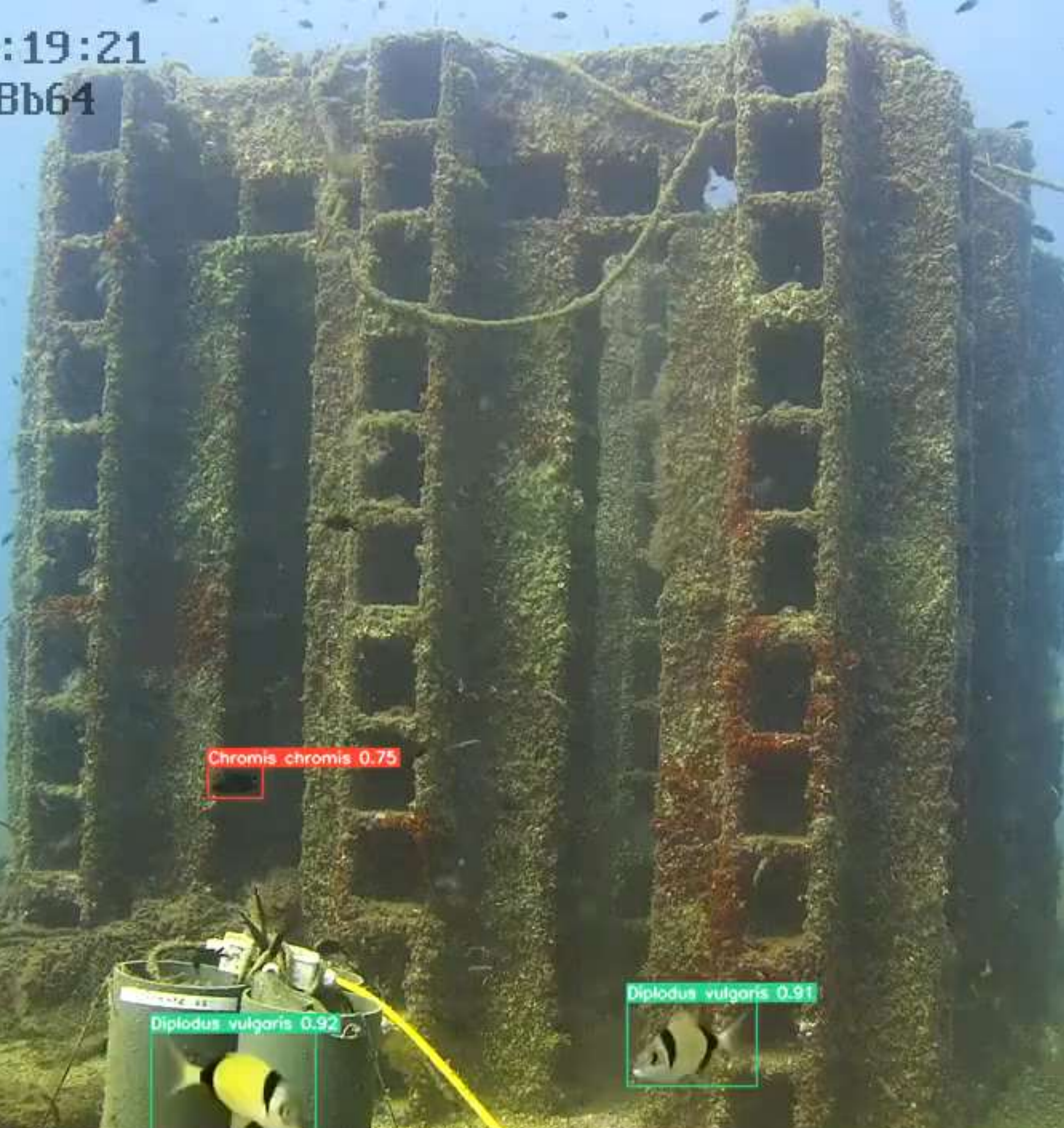






08-29-2023 09:19:21

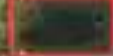
OBSEA\_IPC608\_8b64



Diplodus sorgus 0.90



Chromis chromis 0.75



Chromis chromis 0.88



Chromis chromis 0.88



Diplodus vulgaris 0.92

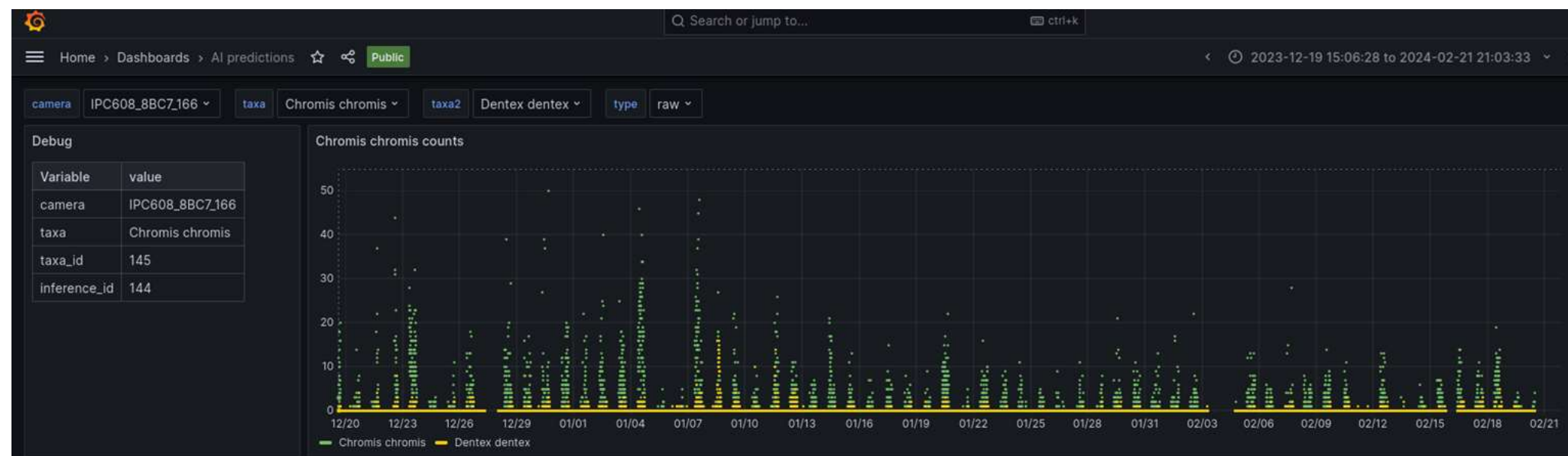


Diplodus vulgaris 0.91

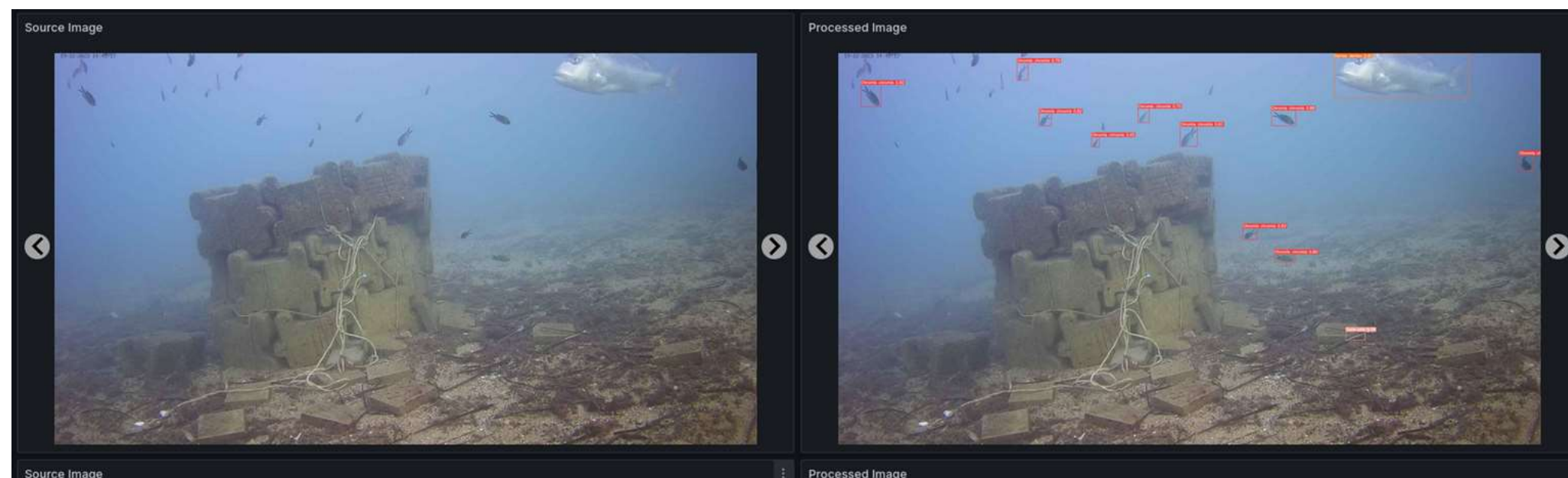




# Next steps



- Move to production
- Alarm system with key species
- Try oriented bounding box



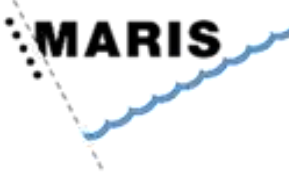
- Scientific exploitation:
  - Predator-prey interactions
  - Ecological models
  - Correlation with environmental data

27-29 May 2024 



imdis

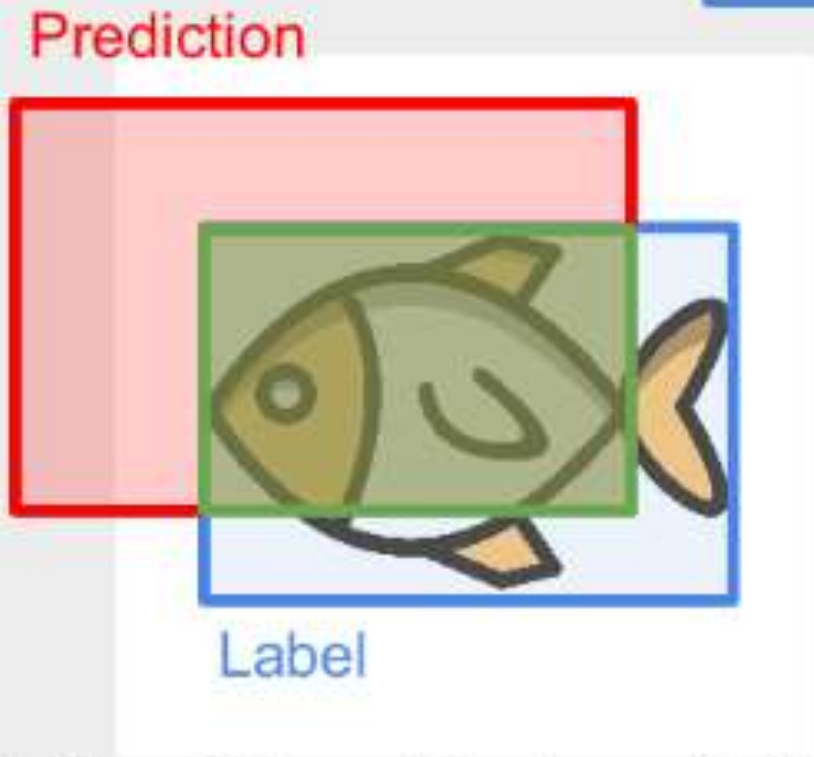
# International conference on **M**arine **D**ata and **I**nformation **S**ystems





# *IoU, Precision and Recall*

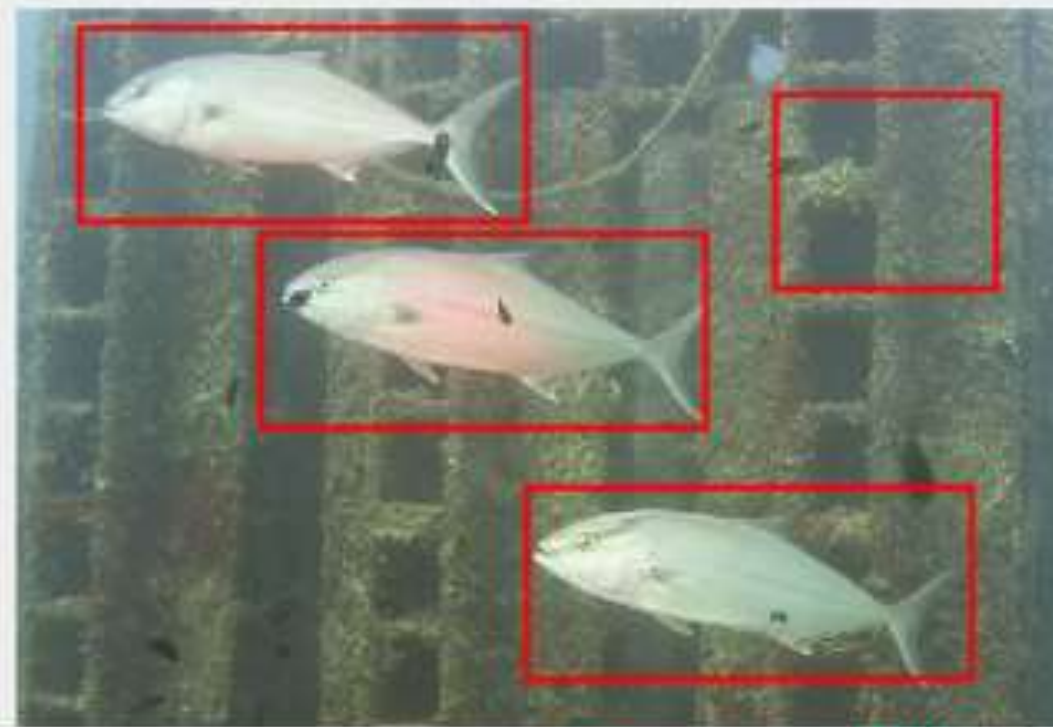
$$\text{IoU} = \frac{\text{intersection}}{\text{union}} = \frac{\text{green box}}{\text{red and blue boxes}}$$



**IoU** < 0.5 → Bad prediction  
**IoU** > 0.5 → Good prediction  
(0.5 adjustable threshold)

$$\text{Precision} = \frac{\text{TP}}{\text{TP} + \text{FP}}$$

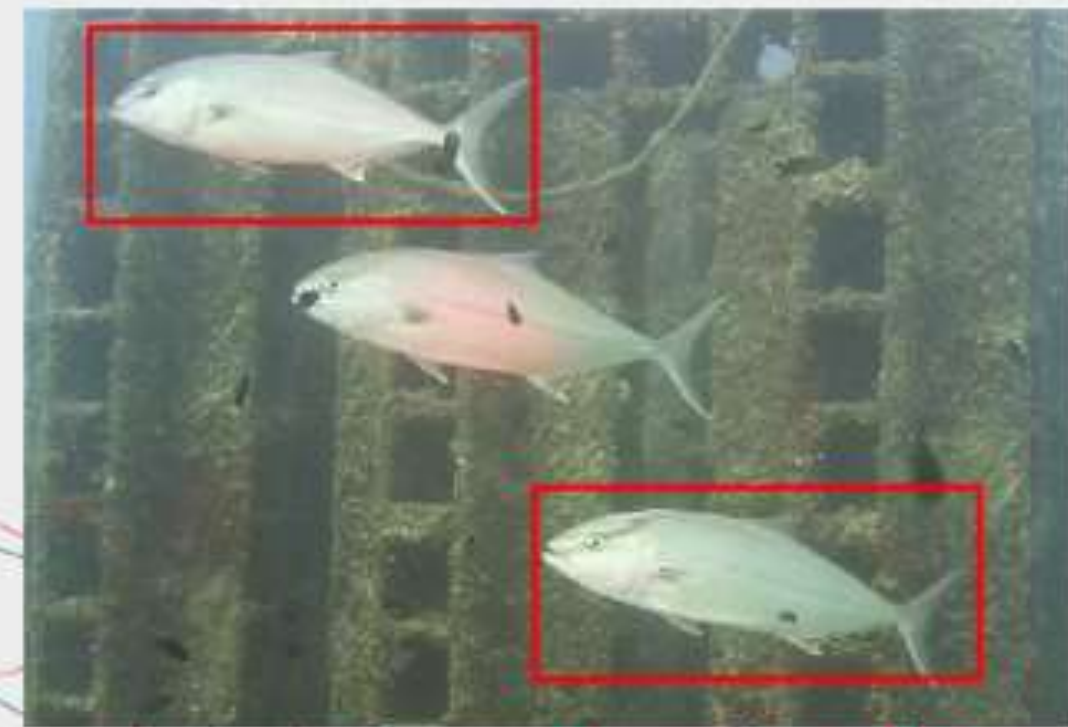
TP: True Positives  
FP: False Positives



Precision: 75%  
Recall: 100%

$$\text{Recall} = \frac{\text{TP}}{\text{TP} + \text{FN}}$$

TP: True Positives  
FN: False Negatives



Precision: 100%  
Recall: 66.6%

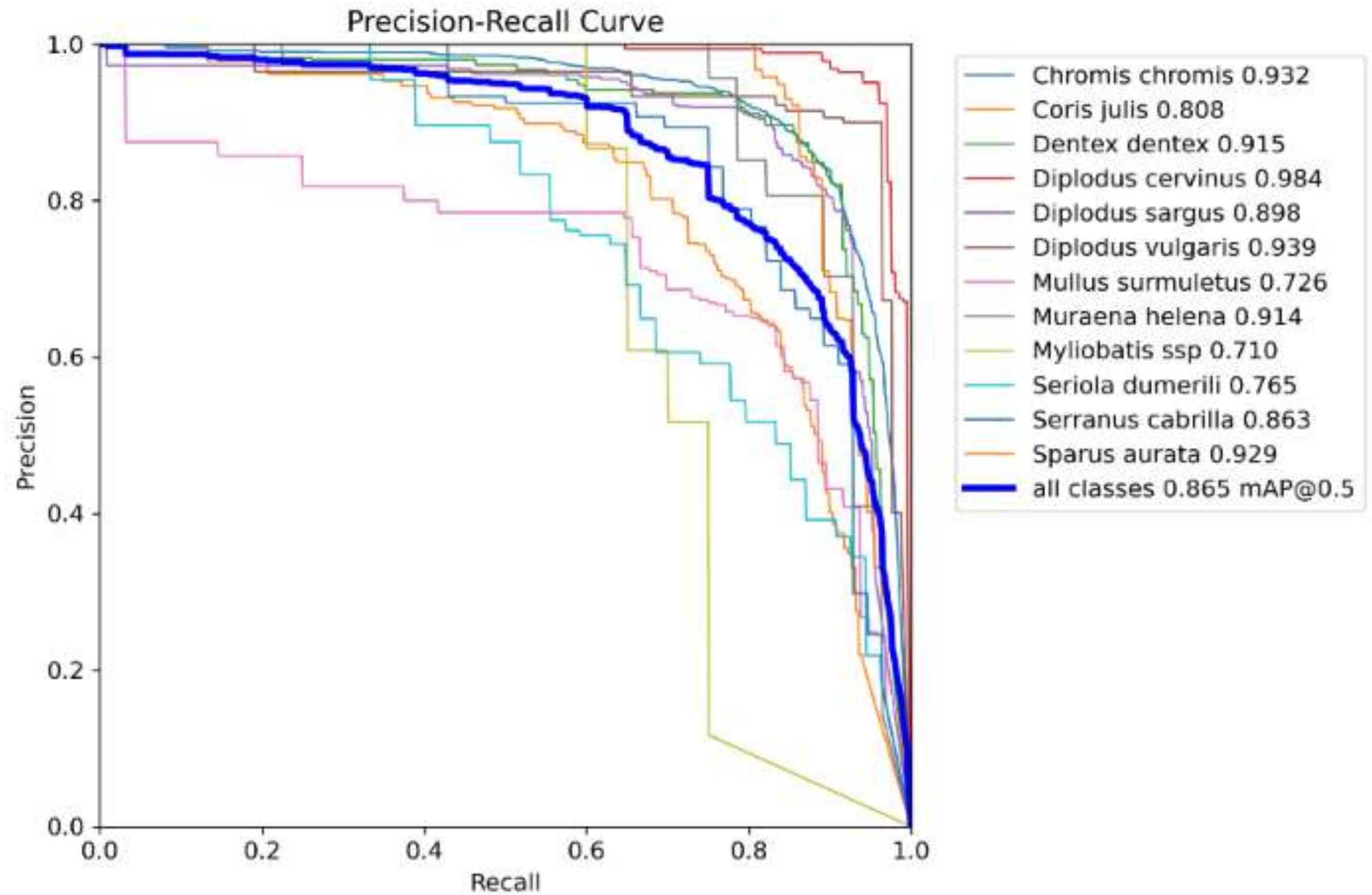
## Average Precision and mAP

### Average precision

- Area under the PR curve
- Calculated for each class

### Mean Average Precision (mAP)

- Mean of all APs
- Usually set at IoU=0.5
  - mAP@0.5
- de-facto standard metric!







- **image size**

- Higher the better...
- ...but slower
- Useful for small fish



- **Epochs**

- Higher the better...
- ...up to a point



- **Batch size**

- Higher the better....
- ...if you have the resources!



- **More training data!**

