









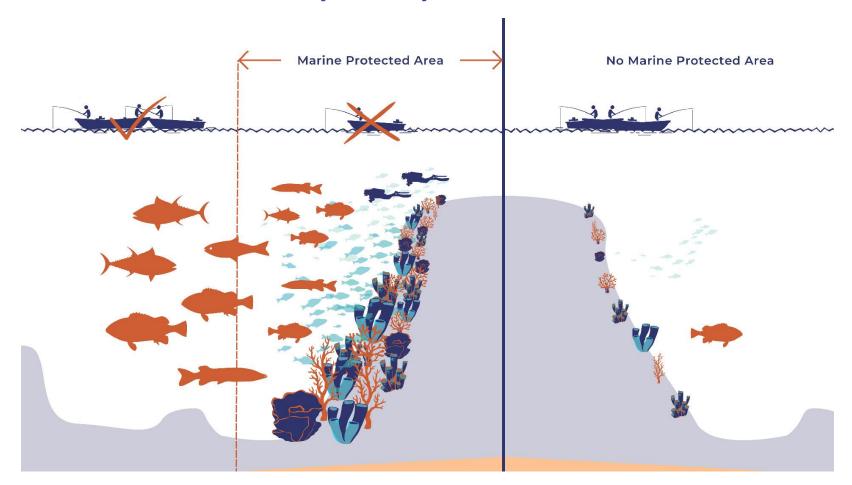
Al in marine sciences:

Detection and classification of marine vessels with underwater acoustic data

Decrop Wout, Parcerisas Clea, Schall Elena, Debusschere Elisabeth & Deneudt Klaas

Introduction

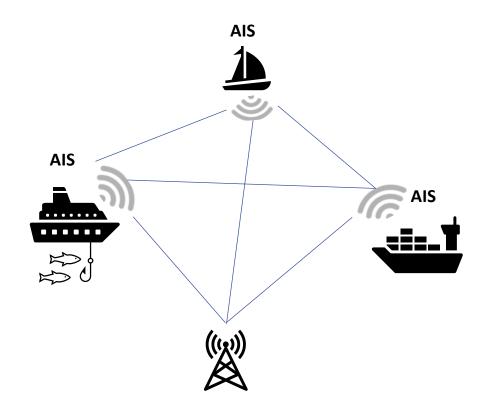
Marine Protected Areas (MPA's)





Automatic Identification System (AIS)

Monitoring shipping activity



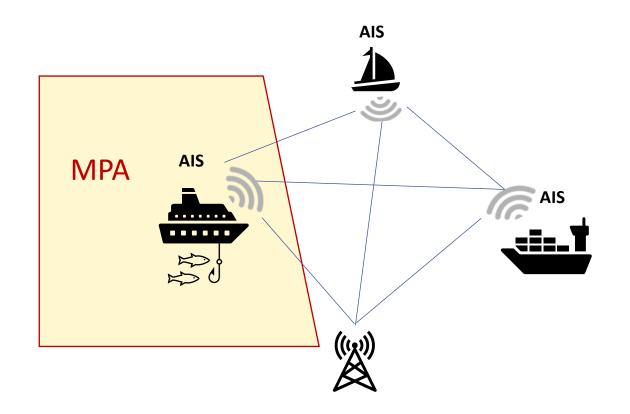
Automatic Identification System (AIS)

Long	Lat	Time	Ship_type	Activity	
2.1912	51.3837	04/02/22	Cargo	underway	
2.4912	51.6529	04/02/22	Recreation	Anchored	
2.2107	51.6264	04/02/22	Cargo	Moored	



Automatic Identification System (AIS)

Monitoring shipping activity - MPA's and other regions

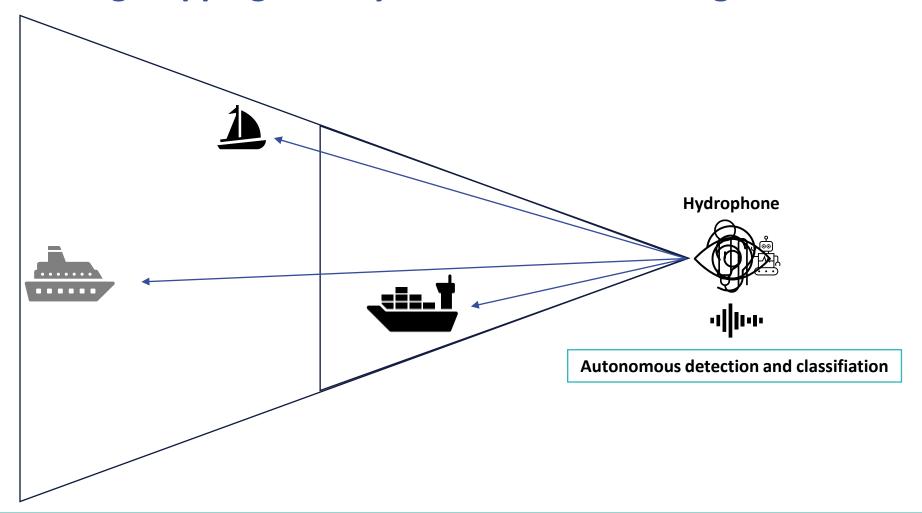


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Xisdial monitoring

Monitoring shipping activity - MPA's and other regions







Creating the database

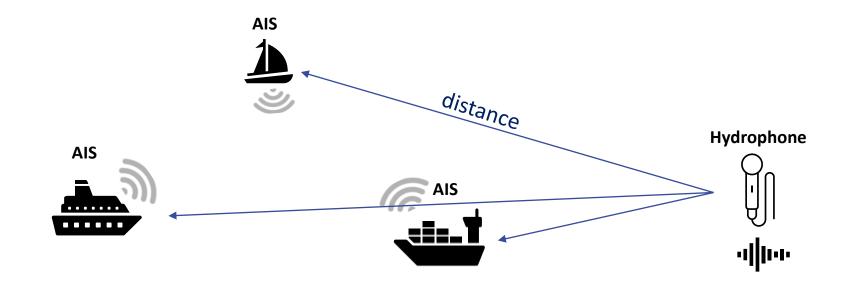




Two stations with hydrophone recordings on mooring close to traffic lanes in 2022.



Creating the database





AIS data:

Coordinates
Timestamp
vessel information





Hydrophone recordings

Coordinates Timestamp recording

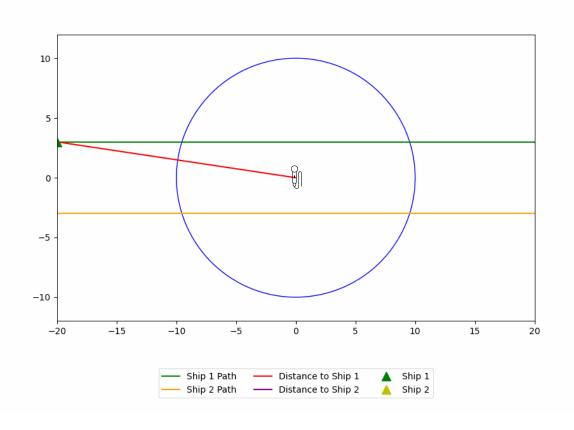


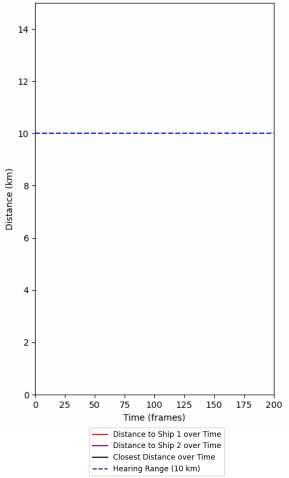




Vessel detection

Creating the database

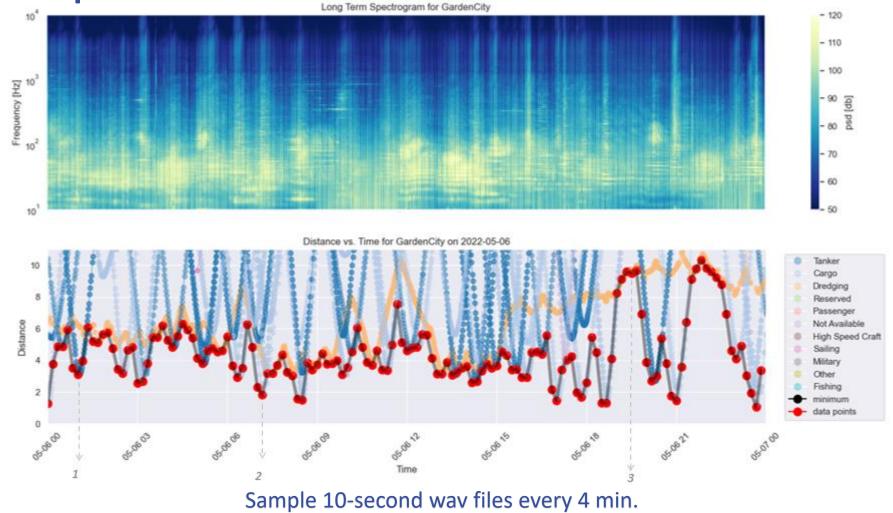






The power spectral density is in function of the distance

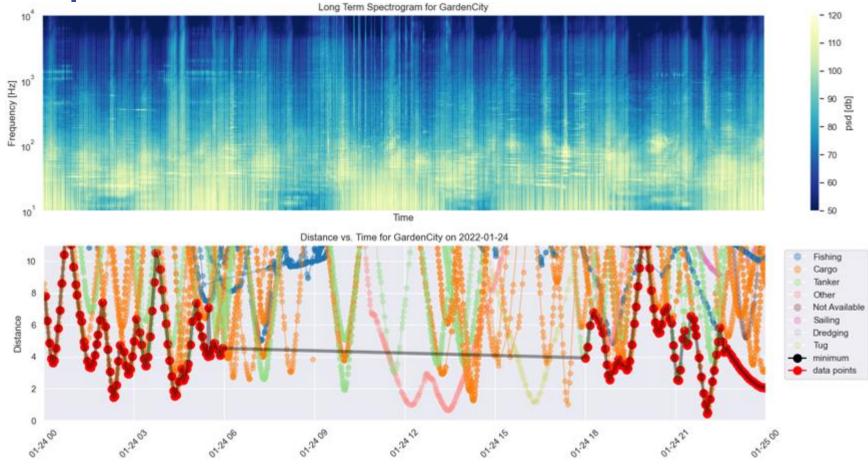
Data exploration





Filtering out some faulty data

Data exploration







How features (spectrograms) are created

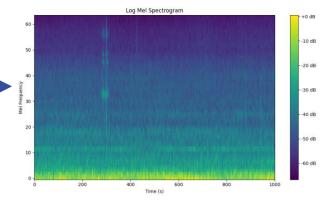
Data exploration



Feature extractor

10 sec wav file

Variable	Value
Frequency range	0-14Khz
Sample rate	48 Khz
fft_window_size	1024
Hop length	480
Mel bins	64
window_function	Hann
Log mel	dB

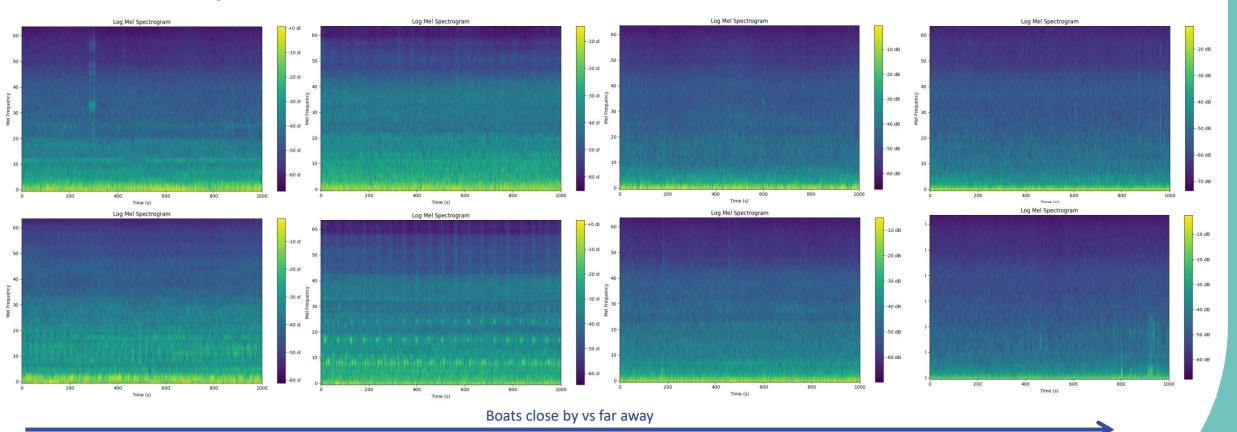


Log mel spectrogram



Comparing Spectrograms

Data exploration

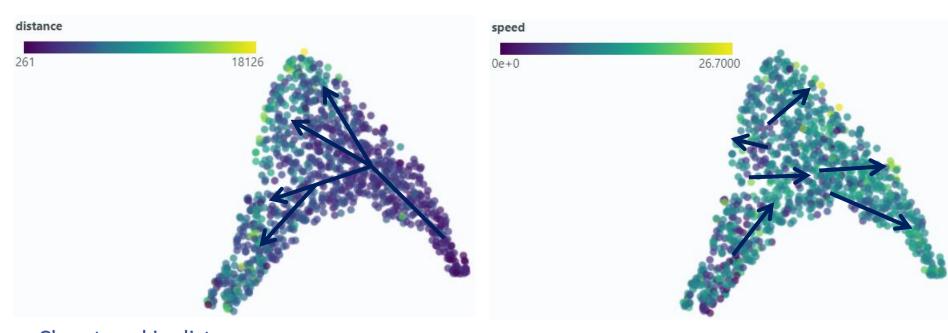


Conclusion: spectrograms give information about distance, possibly even activity



Exploring the embeddings

Data exploration



Clear trend in distance

Less clear trend in speed

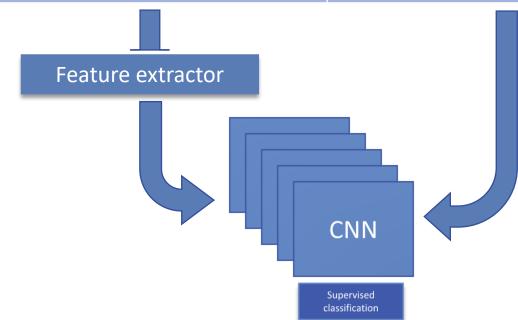
Conclusion: information about distance possible, the speed is more tricky.



Model architecture

Building the model

audio	Ship distance to recorder (AIS)
व ।	2-3 km
व ।	1-2 km
व ।	10+ km



Supervised audio classification

CLAP model pre-trained on bioacoustics by David Robinson



Data architecture

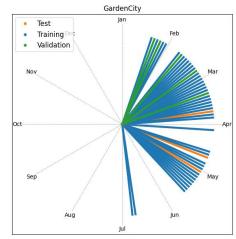
Building the model

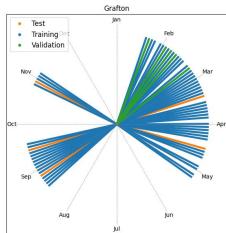
Data architecture:

- Data filter
- Train/val/test: 81%/8%/11% (18915/1815/2558)
 - val/test: data sampled from full days from different deployments where the data seemed balanced (boats far away and close)
 - Train: remaining days

Model architecture:

- Epochs: 10
- Early stop through validation set
- Adam optimizer

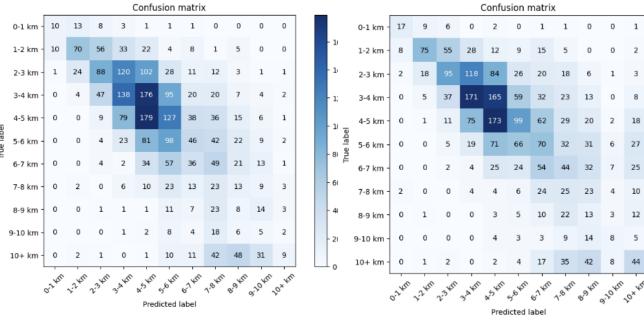






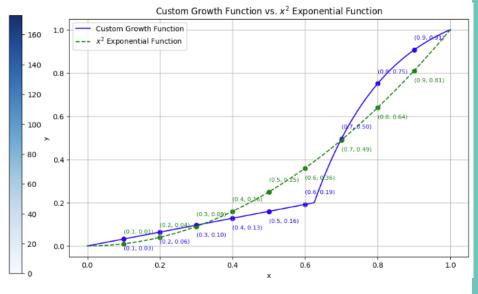
Confusion matrix and RMSE

Results



	0-1 km -	17	9	6	0	2	0	1	1	0	0	1
- 10	1-2 km -	8	75	55	28	12	9	15	5	0	0	2
- 1	2-3 km -	2	18	95	118	84	26	20	18	6	1	3
- 1:	3-4 km -	0	5	37	171	165	59	32	23	13	0	8
- 1(-	4-5 km -	0	1	11	75	173		62	29	20	2	18
- 1(- 8(- 8(5-6 km -	0	0	5	19	71	66	70	32	31	6	27
S F	6-7 km -	0	0	2	4	25	24	54	44	32	7	25
- 60	7-8 km -	2	0	0	4	4	6	24	25	23	4	10
- 44	8-9 km -	0	1	0	0	3	5	10	22	13	3	12
- 20	9-10 km -	0	0	0	0	4	3	3	9	14	8	5
	10+ km -	0	1	2	0	2	4	17	35	42	8	44
		0.7 km	2:2 km	2:3km	3.4 KM	A.S. KM	5.6 km	6.7 km	7.8 km	8.9 Km	3.20 km	Jo _× _{Ftu}
		Predicted label										

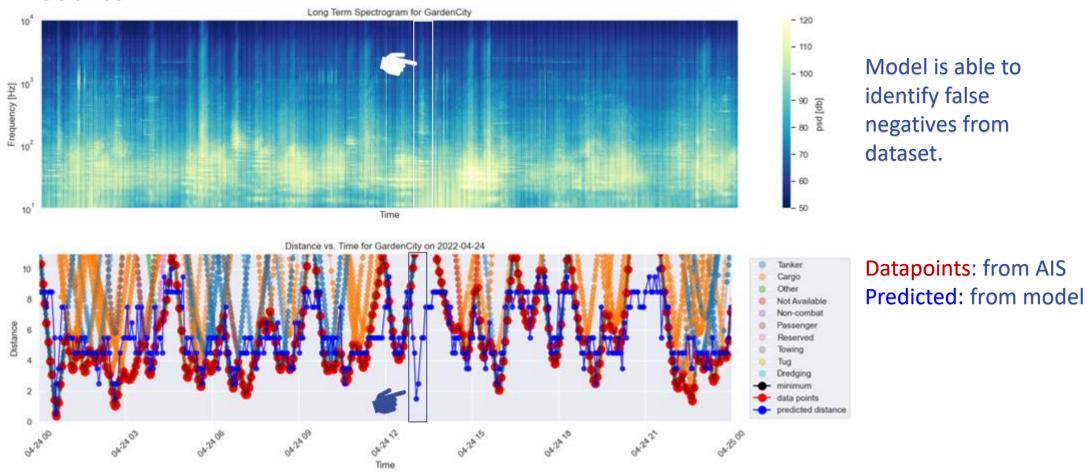
	Costum Loss function	X^2 loss function				
MSE	3.34 km	4.07 km				
RMSE	1.82 km	2.01 km				





Predictions plotted on database

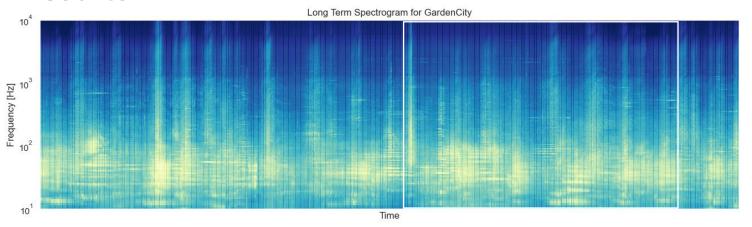
Results

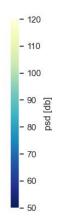




Predictions plotted on database

Results

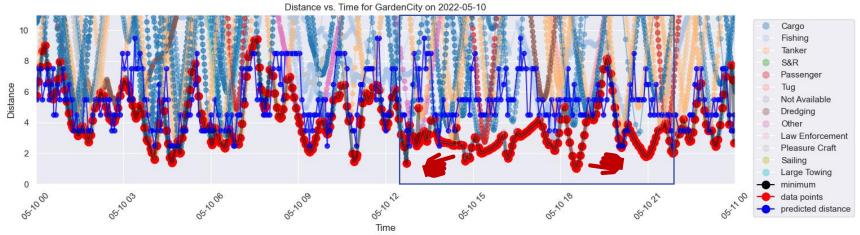




Model only detects vessels that are making noise.

If silent → next vessel

- Drifting
- Quiet engine

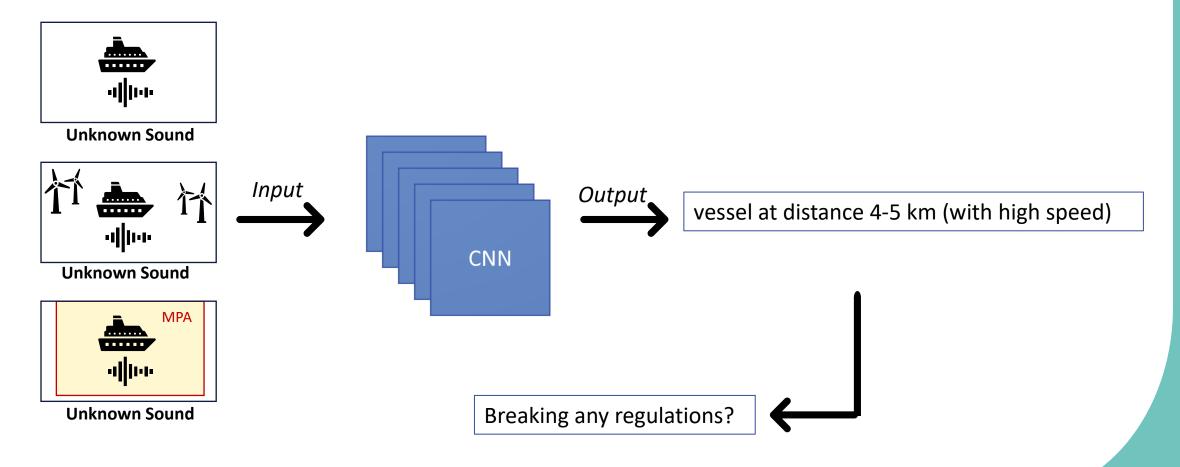


Datapoints: from AIS
Predicted: from model



Future goal

Model interference: action on live data





Next steps

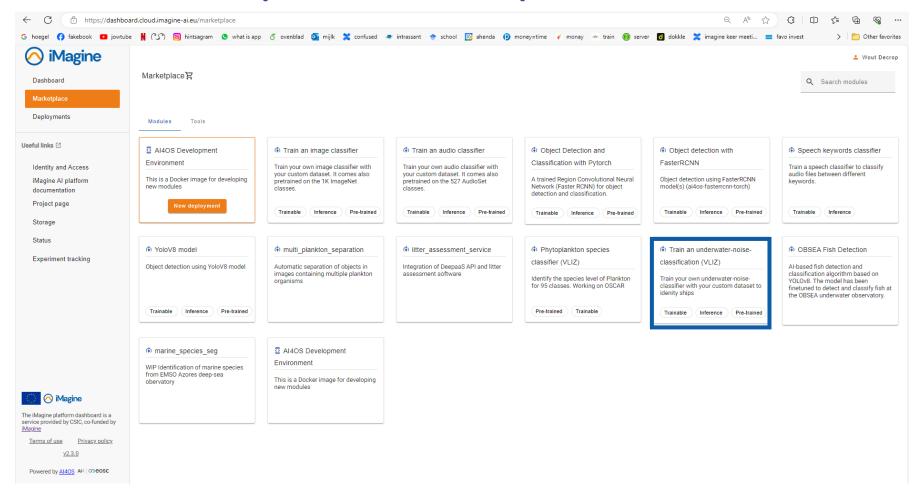
- 1. Incorperate speed in to the model
- 2. Change some parameters:
 - Adaptation of creation of the log mel spectrogram?
 - Play with different outputs (classification vs regression)
- 3. Apply on different datasets?



Imagine Project



Soon available (model + dataset)















The team:

Clea Parcerisas

Elena Schall

Elisabeth Debusschere

Klaas Deneudt

The MOC and acoustics team ChatGPT

Thank you!
Any questions?

wout.decrop@vliz.be

