

# Comparison of traditional microscopy and digitalized images analysis to identify and delineate pelagic fish egg spatial distribution



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## Study the winter distribution of spawning areas in the Channel and southern North Sea

### Problems:

- High number of samples is needed
- Identification criteria are limited (size, pigmentation, oil globules, need to match with the species fished)
- Lack of experts, time consuming
- Sample archiving (formalin toxicity issue, need storage space)

### Objectives:

- Digitalization of samples with the ZooScan integrated system
- Building a classification model for automatic identification of fish egg species
- Compare maps of spawning areas obtained with ZooScan identifications and microscope identifications by taxonomist

# Study area - Annual IBTS survey



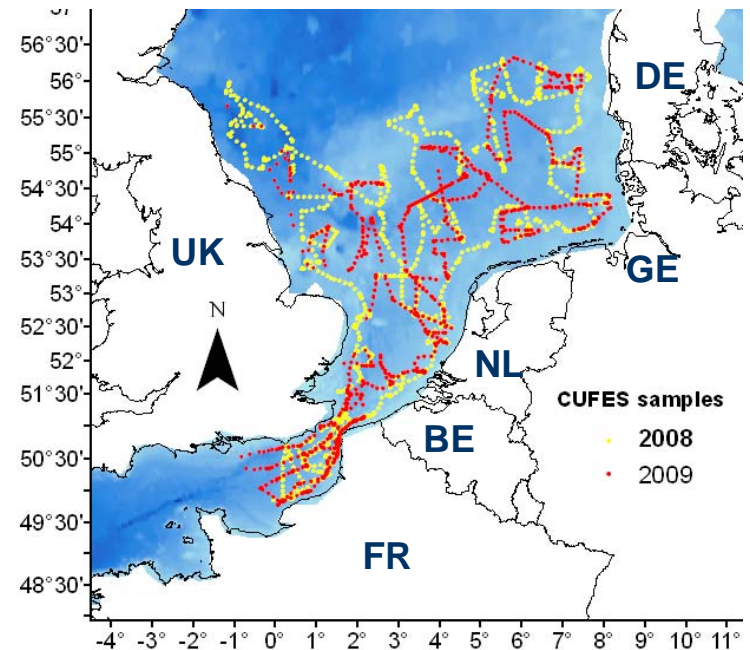
## International Bottom Trawl Survey

- fish abundance & distribution
- recruitment indices

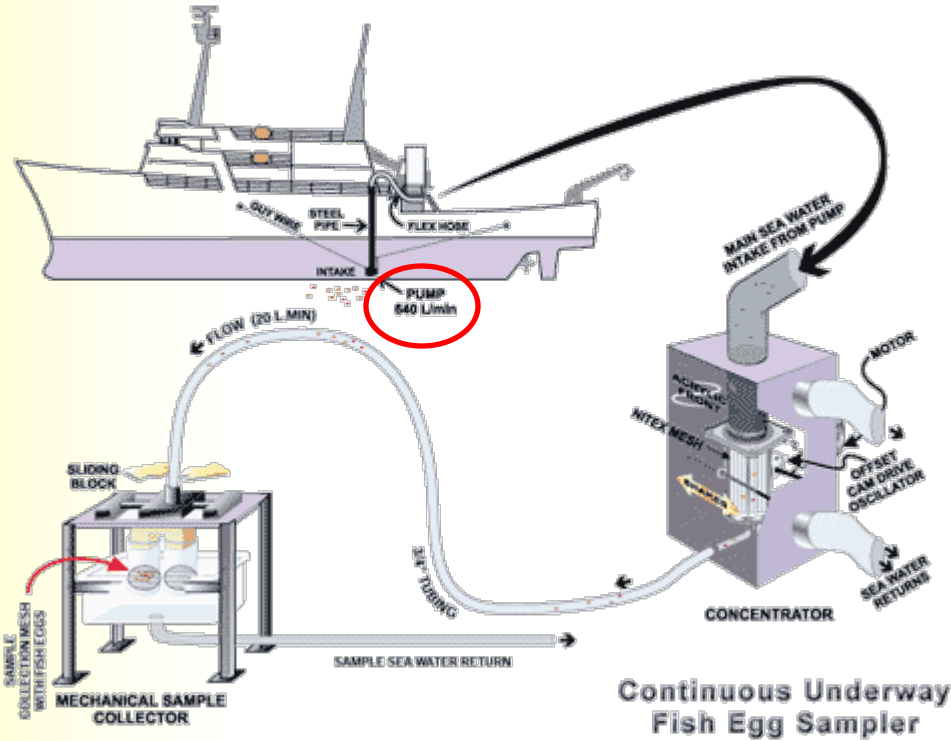
**IBTS 2008 & 2009**

**Eastern Channel & Southern North Sea**

**15 January – 15 February**



# Continuous Underway Fish Egg Sampler (CUFES)

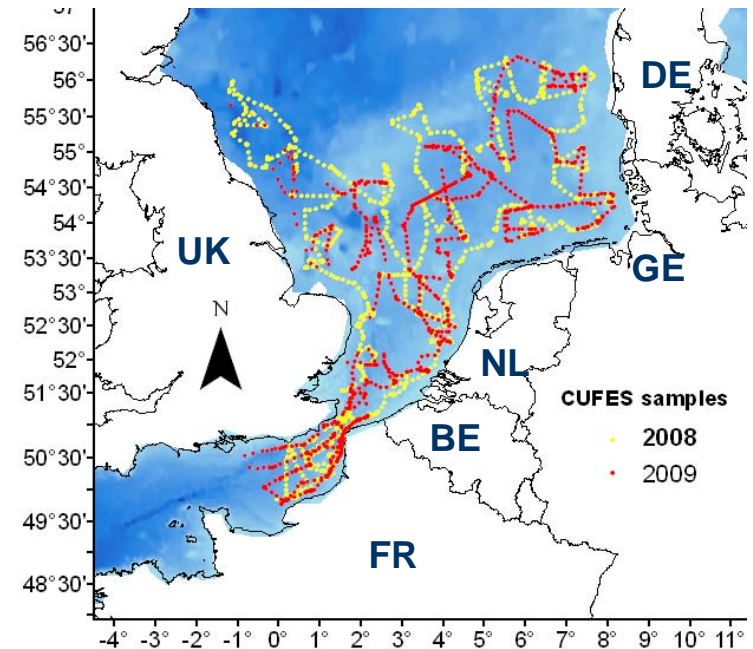


**CUFES:** a pumping device to collect pelagic eggs of fish from a moving vessel

- water pumped at 5 m depth
- collector mesh size: 500  $\mu\text{m}$

The CUFES operated continuously during the survey :

- sequential sampling interval: 30 min
- >1000 samples collected

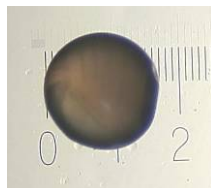


# Sample identification

	CUFES 2008	CUFES 2009
<b>Microscope</b>	1 048 samples	1 103 samples
<b>Image analysis (ZooScan)</b>	1/3 analyzed	All analyzed
<b>DNA analysis</b>	1/3 analyzed	



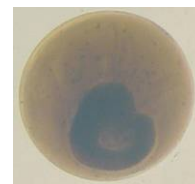
## Morphological criteria for microscope identification



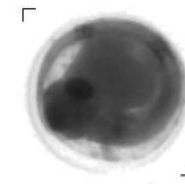
Egg size



Oil globule



Stage



Pigmentation



# Sample processing with ZooScan

<http://www.zooscan.com>

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**Image acquisition**



**Image process  
&  
Feature extraction**



**Learning set building**



**Validation** of classifier  
performances on an  
**independent Test set**

**CUFES sample**



# Sample processing with ZooScan

<http://www.zooscan.com>

lfremer

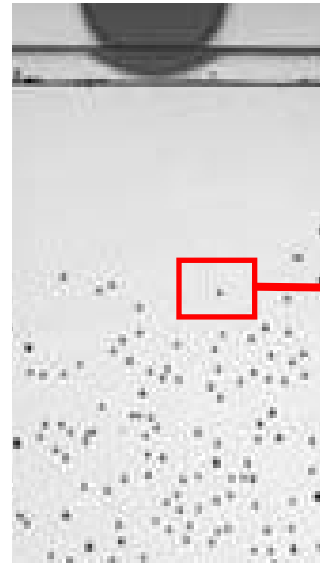


Image acquisition

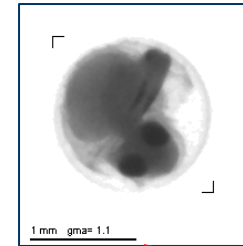
Image process  
&  
Feature extraction

Learning set building

Validation of classifier  
performances on an  
independent Test set



vignette



Text file

Item	Label	Area	StdDev	Perim.	Major	Minor	...	Ident
59	cufes100_1	11073	62.72	398.37	120.50	117.00	..	11_Sole_stA
61	cufes100_1	14940	50.00	474.01	142.27	133.70	..	10_Cod_stA
221	cufes1000_1	26692	42.48	638.62	186.02	182.70	...	13_Plaiice_stA
227	cufes1000_1	25269	58.75	622.52	181.32	177.44	...	13_Plaiice_stB
172	cufes1000_1	12542	57.18	554.42	127.54	125.21	...	11_Sole_stA
163	cufes1000_1	12345	61.71	655.23	129.13	121.72	...	10_Cod_stA
182	cufes1000_1	12671	63.48	629.09	127.80	126.24	...	10_Cod_stB
192	cufes1000_1	11281	62.57	611.54	121.67	118.05	...	10_Cod_stB
167	cufes1000_1	10879	55.38	559.21	119.25	116.16	...	09_Whiting_stA
106	cufes1000_1	5979	47.02	314.33	87.68	86.82	...	01_Dab_stB
116	cufes1000_1	5112	42.56	281.46	82.21	79.18	...	06_Rockling_stA

# Sample processing with ZooScan

<http://www.zooscan.com>

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Image acquisition



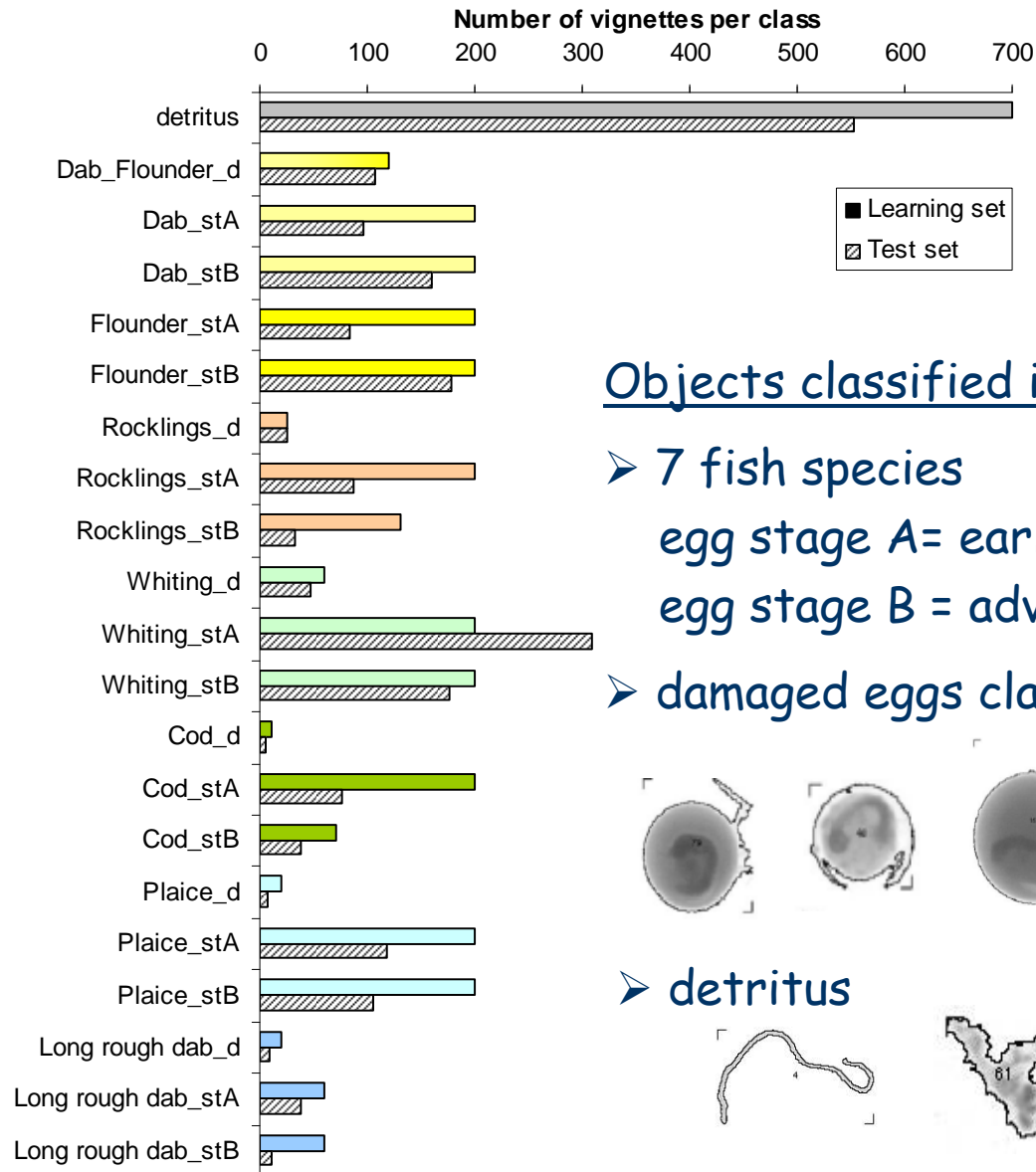
Image process  
&  
Feature extraction



Learning set building

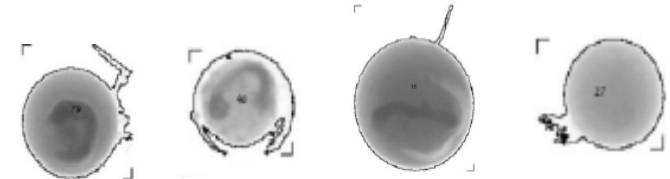


Validation of classifier  
performances on an  
independent Test set

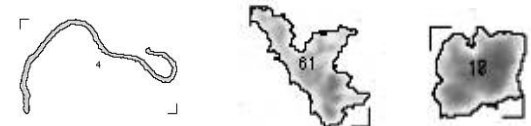


Objects classified into groups:

- 7 fish species  
egg stage A= early stages  
egg stage B = advanced stages
- damaged eggs classes



➤ detritus

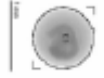
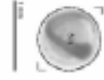




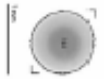
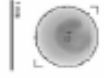
# The 7 species selected

Stage B

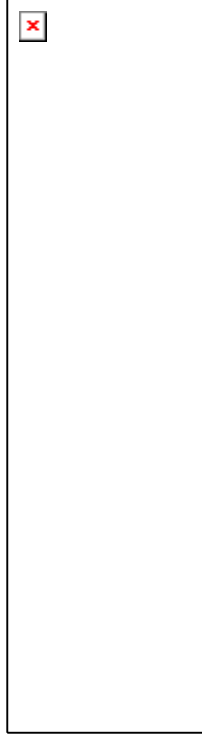
Stage A



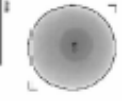
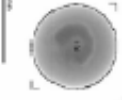
Dab



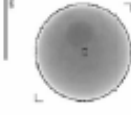
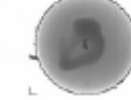
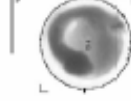
Flounder



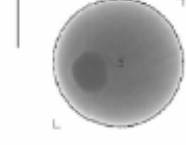
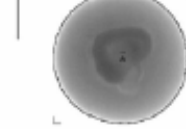
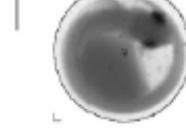
Rocklings



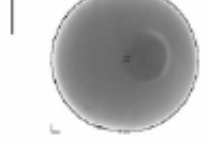
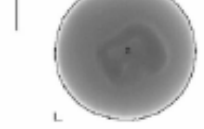
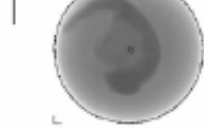
Whiting



Cod

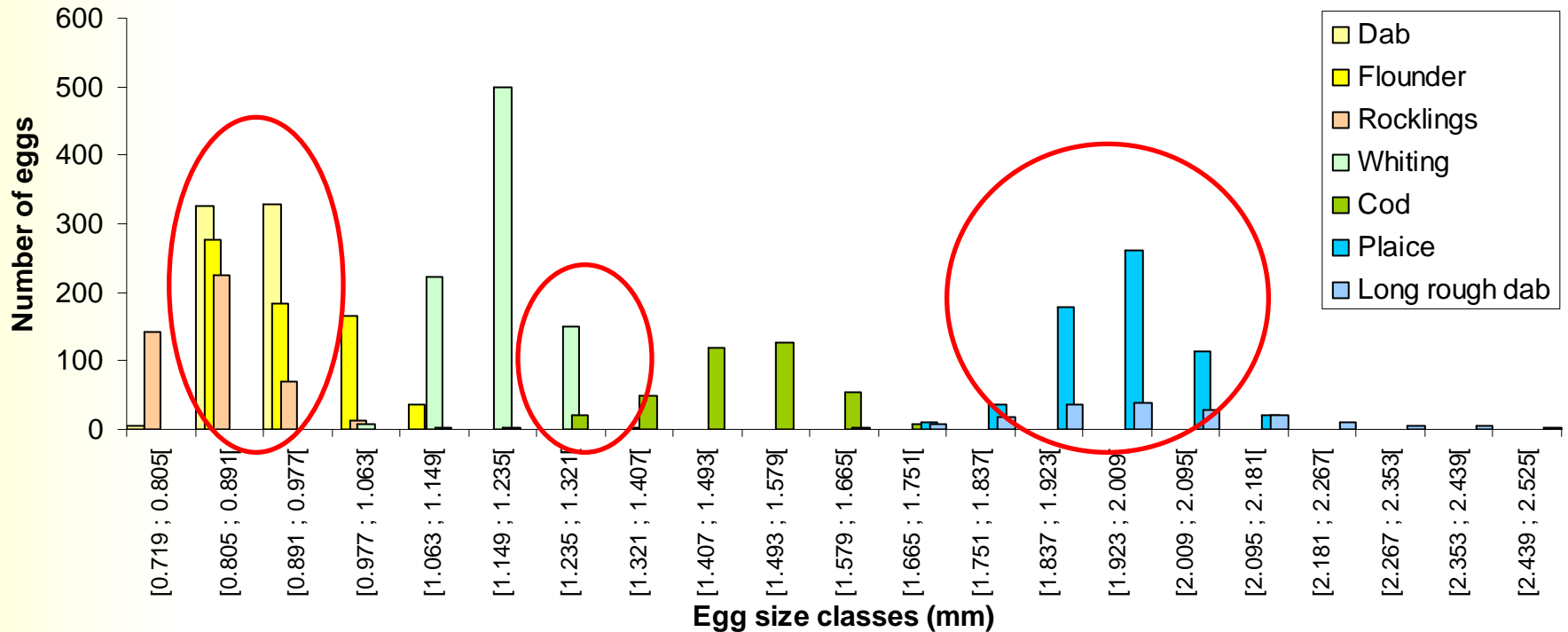


Plaice



Long rough dab

# Size classes analyses of fish egg species



**Egg size => confusion risk for 3 species groups**

- dab, flounder and rocklings
- cod and whiting
- plaice and long rough dab

# Sample processing with ZooScan

<http://www.zooscan.com>

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Image acquisition



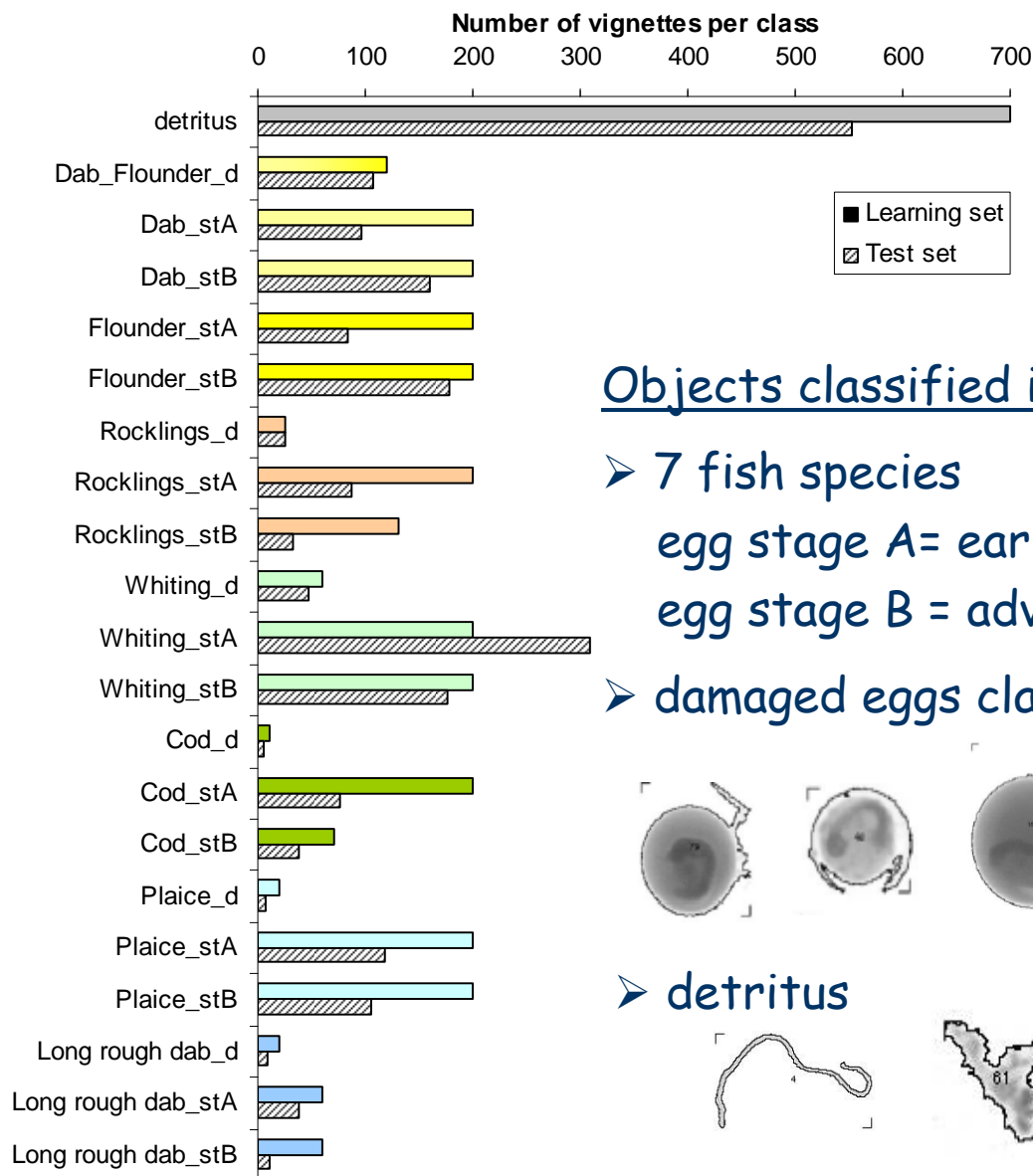
Image process  
&  
Feature extraction



Learning set building

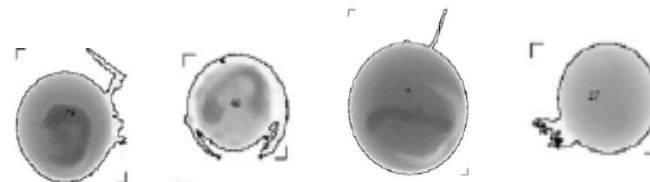


Validation of classifier  
performances on an  
independent Test set

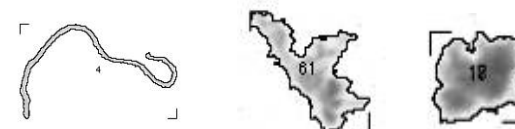


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➤ detritus



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Image acquisition



Image process & Feature extraction



Learning set building

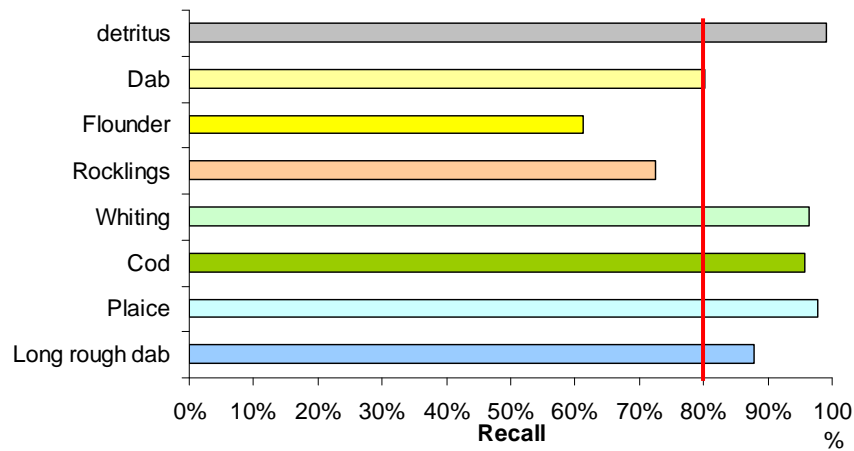


Validation of classifier performances on an independent Test set

Error rate = 0.13

Confusion matrix

	Detritus	Dab & Flounder_d	Dab	Flounder	Rockling_d	Rockling	Whiting_d	Whiting	Cod_d	Cod	Plaice_d	Plaice	Long rough dab_d	Long rough dab	Total in test set	Recall	Contamination
Detritus	547	2	0	0	3	0	0	0	0	0	0	0	0	0	552	0.99	0.01
Dab & Flounder_d	6	82	4	11	1	3	1	0	0	0	0	0	0	0	108	0.76	0.25
Dab	0	0	206	35	0	16	0	0	0	0	0	0	0	0	257	0.80	0.32
Flounder	0	4	80	161	0	16	0	2	0	0	0	0	0	0	263	0.61	0.30
Rockling_d	0	15	0	0	4	6	0	0	0	0	0	0	0	0	25	0.16	0.56
Rockling	0	1	15	16	1	87	0	0	0	0	0	0	0	0	120	0.73	0.32
Whiting_d	0	5	0	0	0	0	38	3	0	1	0	0	0	0	47	0.81	0.12
Whiting	0	0	0	8	0	0	4	468	0	5	0	0	0	0	485	0.96	0.02
Cod_d	0	0	0	0	0	0	0	0	2	0	2	0	1	0	5	0.40	0.00
Cod	0	0	0	0	0	0	0	3	0	109	0	2	0	0	114	0.96	0.08
Plaice_d	0	0	0	0	0	0	0	0	0	0	5	2	0	0	7	0.71	0.44
Plaice	0	0	0	0	0	0	0	0	0	2	2	219	0	1	224	0.98	0.04
Long rough dab_d	0	0	0	0	0	0	0	0	0	0	0	0	7	2	9	0.78	0.13
Long rough dab	0	0	0	0	0	0	0	0	0	1	0	5	0	43	49	0.88	0.07
Total in prediction set	553	109	305	231	9	128	43	476	2	118	9	228	8	46	2265		



# Sample processing with ZooScan

<http://www.zooscan.com>

Ifremer



Image acquisition



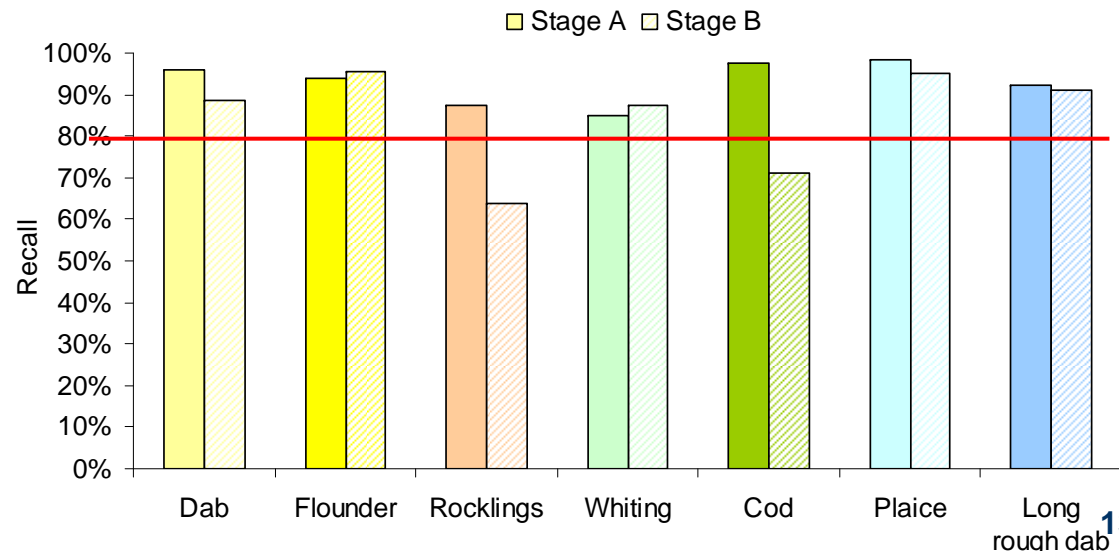
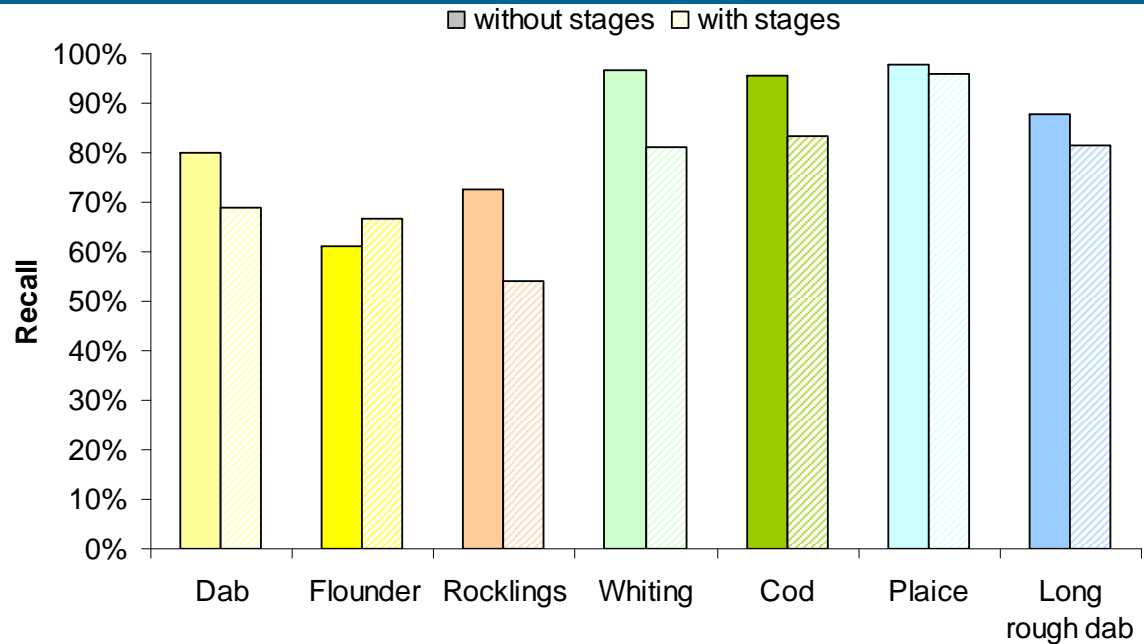
Image process  
&  
Feature extraction



Learning set building



Validation of classifier  
performances on an  
independent Test set



# Geostatistics: abundance data mapping

**Principle:** spatial auto-correlation described by the variogram

## Station information

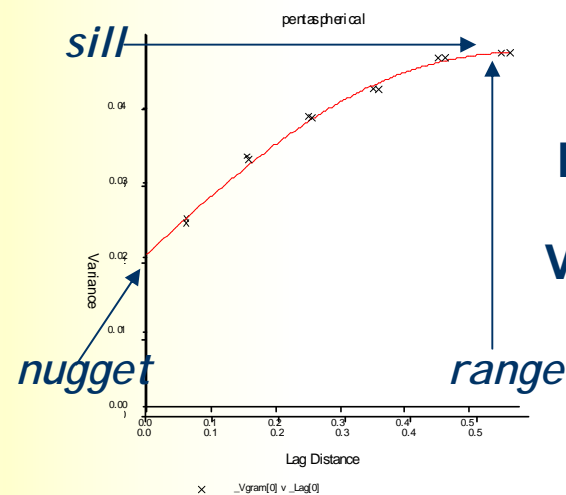
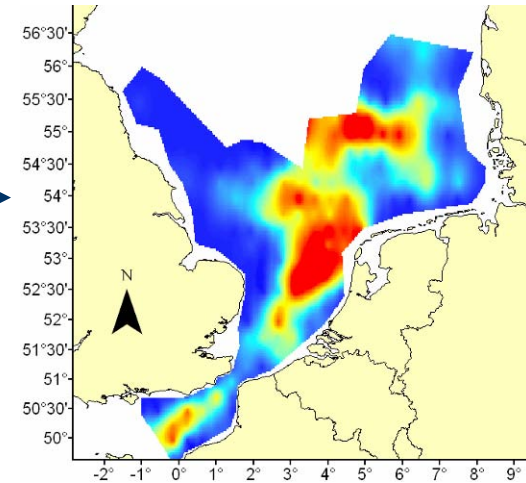
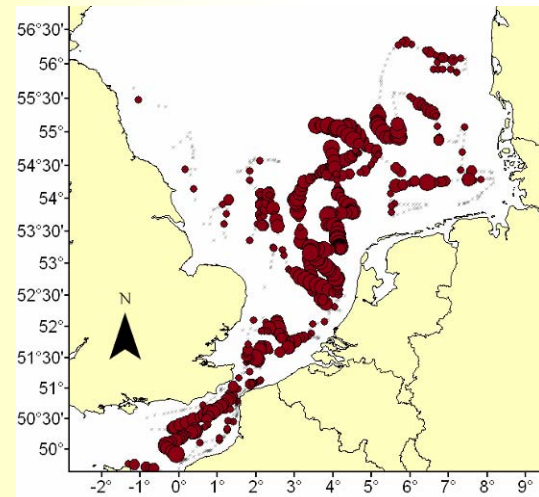
- Position
- Abundances

## Experimental variogram

It describes how the abundance  
**Variogram model Adjustment**  
varies as the function of the distance

## Kriging

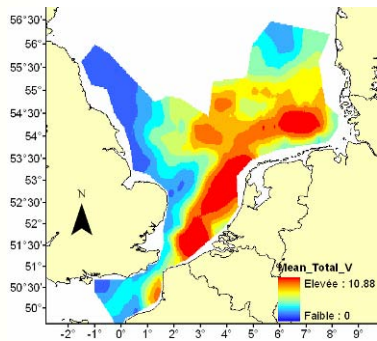
## Interpolated spatial distribution



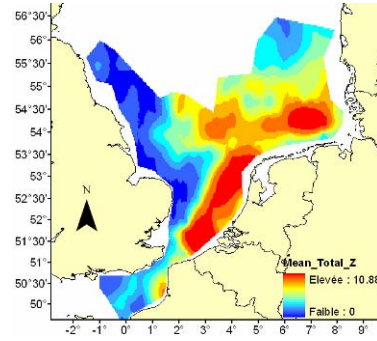


# Eggs distribution mapping (2009)

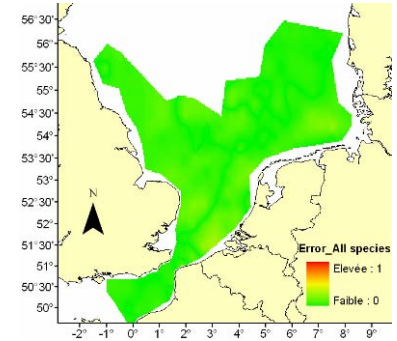
Microscope



Zooscan



Zonal relative error



$$\text{Zonal relative error} = \frac{|N_{\mu} - N_z|}{N_{\mu\max}}$$

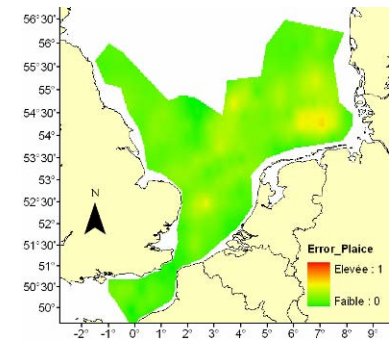
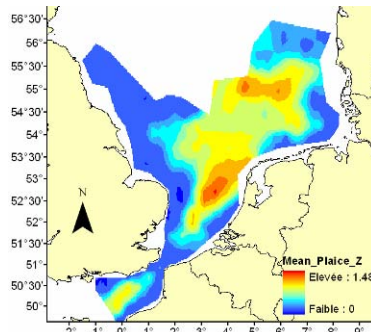
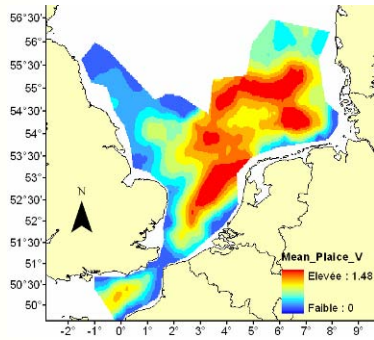
# Eggs distribution mapping (2009)

## Microscope

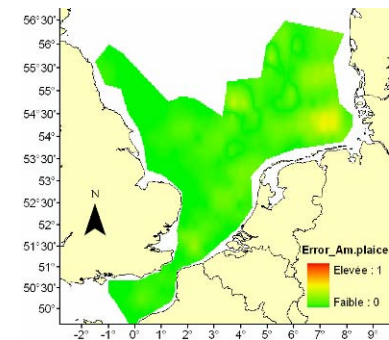
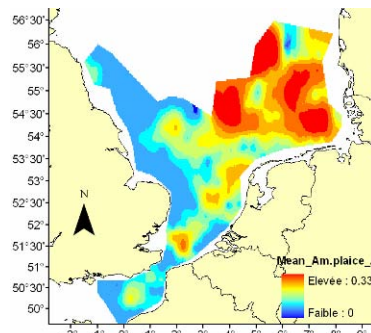
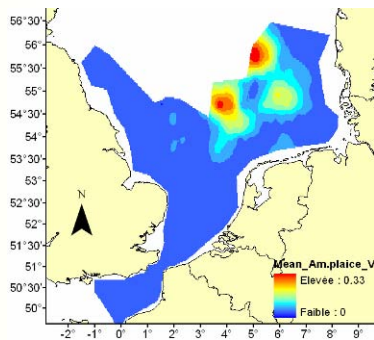
## Zooscan

## Zonal relative error

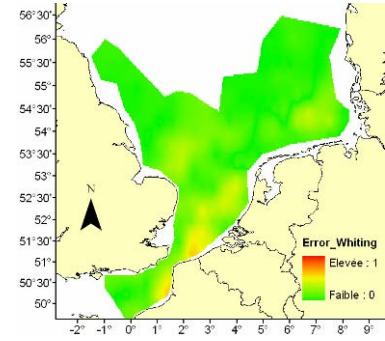
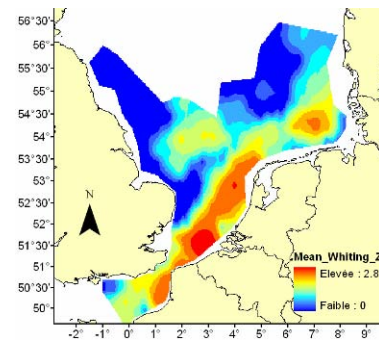
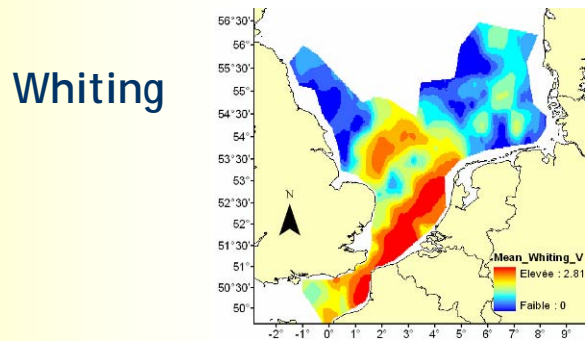
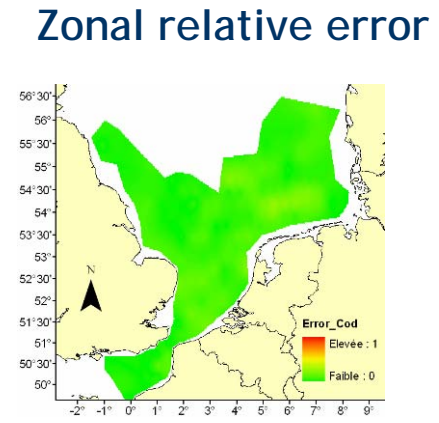
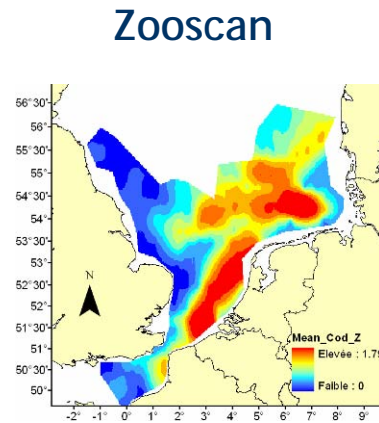
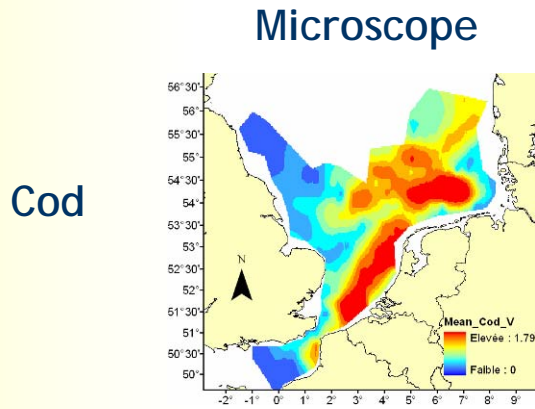
Plaice



Long rough dab



# Eggs distribution mapping (2009)



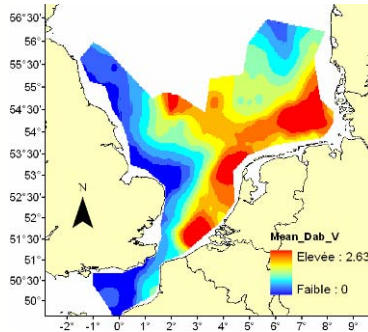
## DNA analysis on standards identified by microscope

98% of standard cod eggs were correctly identified but only 71% of standard whiting eggs were, the remaining (29%) being of cod eggs.

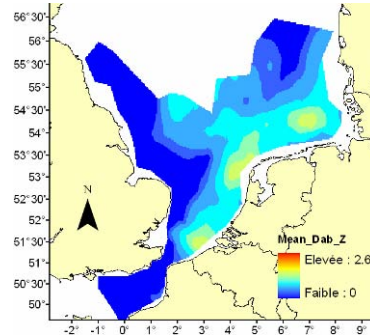
# Eggs distribution mapping (2009)

Dab

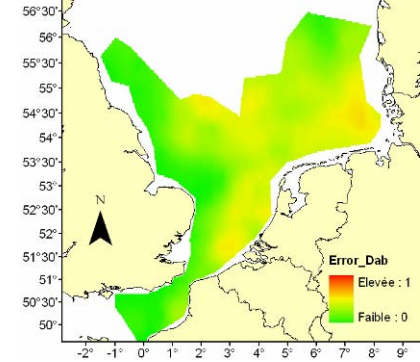
Microscope



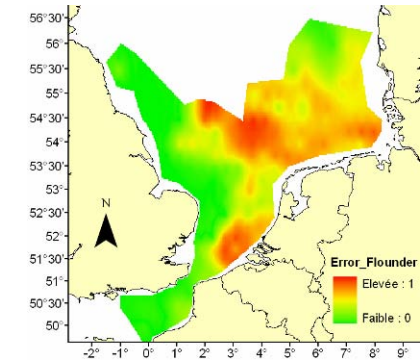
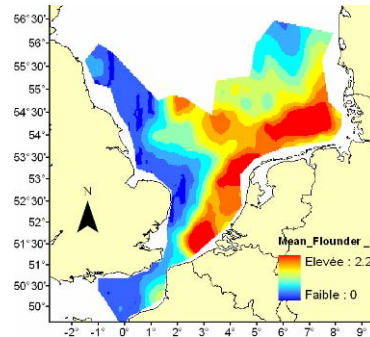
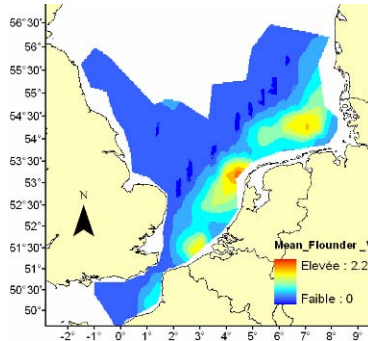
Zooscan



Zonal relative error

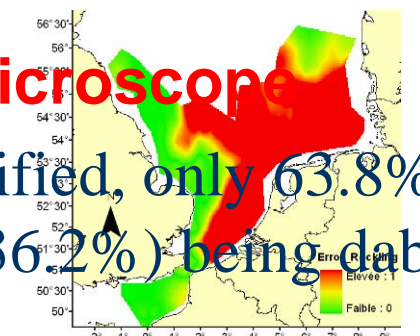
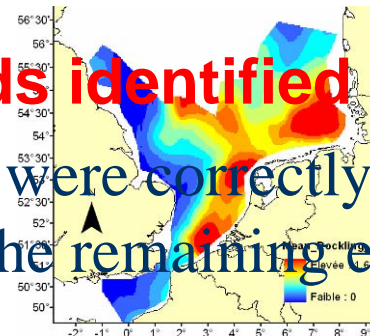
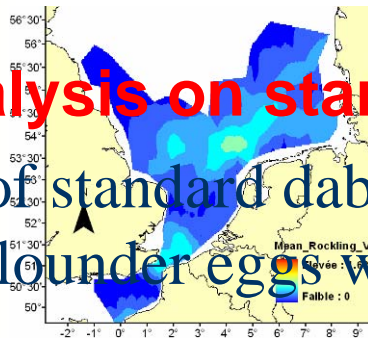


Flounder



**DNA analysis on standards identified by microscope**

If 99.5% of standard dab eggs were correctly identified, only 63.8% of flounder eggs were, the remaining eggs (36.2%) being dab eggs.





# Conclusions

- With the ZooScan useful size spectra and biomass estimate of eggs may be rapidly obtained for ecological oriented studies.
- Patterns of distribution were similar for Plaice, Long rough dab, Cod and Whiting with microscope and ZooScan identifications
- A confusion exist between some species belonging to the same size range as for Dab and Flounder
- The presence of oil globules (Rocklings) does not help the ZooScan identifications
- ZooScan allows archiving of digital images of samples, to facilitate permanent records when conservation of the physical samples is not possible.

## ➤ Improve our learning set by

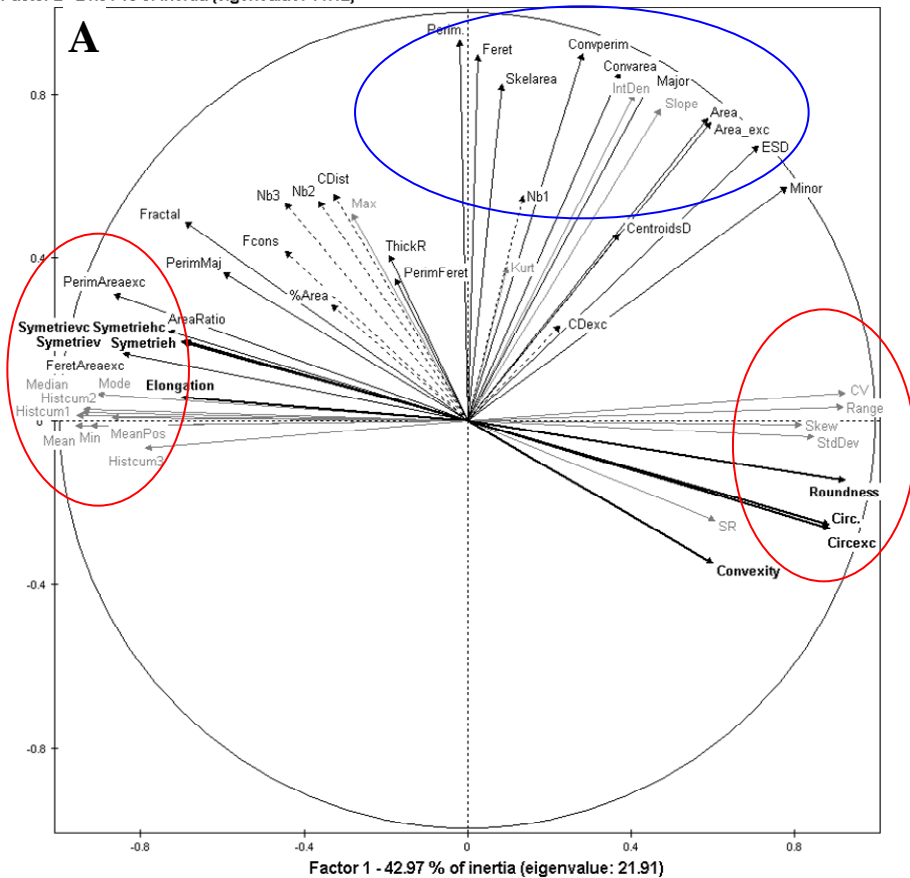
- Increasing number of items in classes that are under-represented (rocklings, cod and long rough dab)
- obtaining eggs directly from fish spawns under experimental and aquaculture conditions to avoid misidentification



# Perspectives to improve ZooScan identification performances

➤ PCA analysis showed that among the 51 parameters some were highly correlated and redundant, resulting in an over fitted classifier, more sensitive to noise in the data

Factor 2 - 21.81 % of inertia (eigenvalue: 11.12)



Applying a method of selection of variables, on the learning set would probably increase the performance of the classifier and thus leading to a better recognition of fish egg species.

A photograph taken from the deck of a ship, looking forward. The sea is very rough, with large, white-capped waves crashing against the ship's hull. A prominent white metal mast structure with a ladder and various rigging is visible in the center. The ship's deck is white with railings. The text "Thank you for your attention" is overlaid in a bold, blue font across the middle of the image.

**Thank you for your attention**