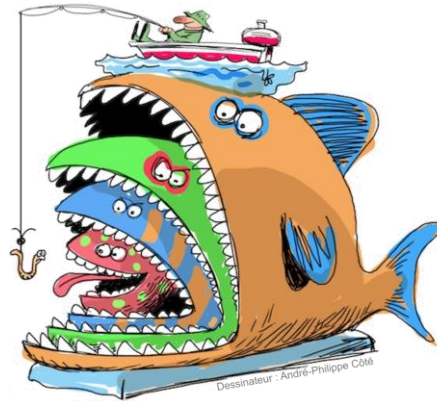


Fonctionnement trophique de l'écosystème mer Celtique : impact de la pêche et scénarios de gestion écosystémique



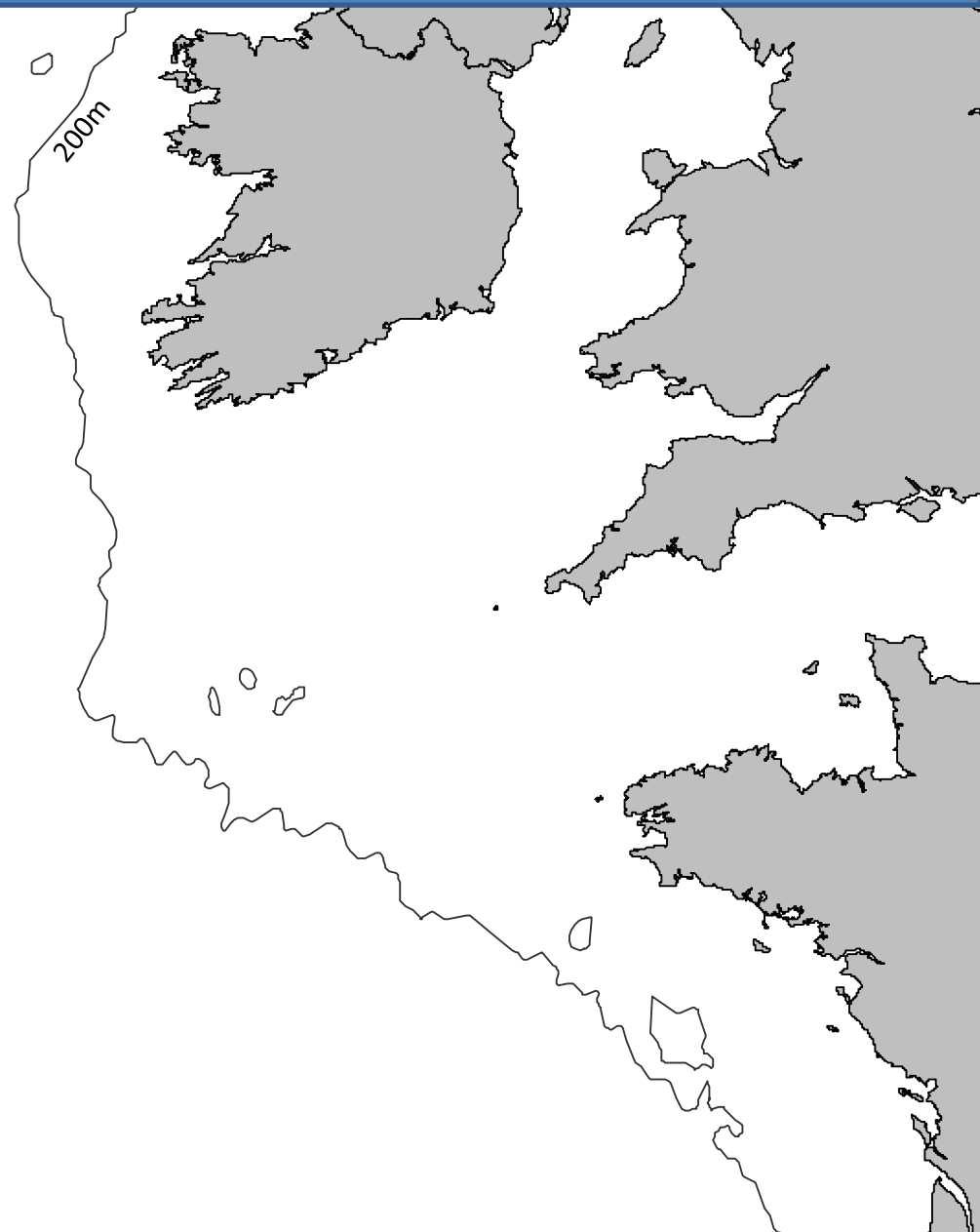
Pierre-Yves Hervann

CONTEXTE



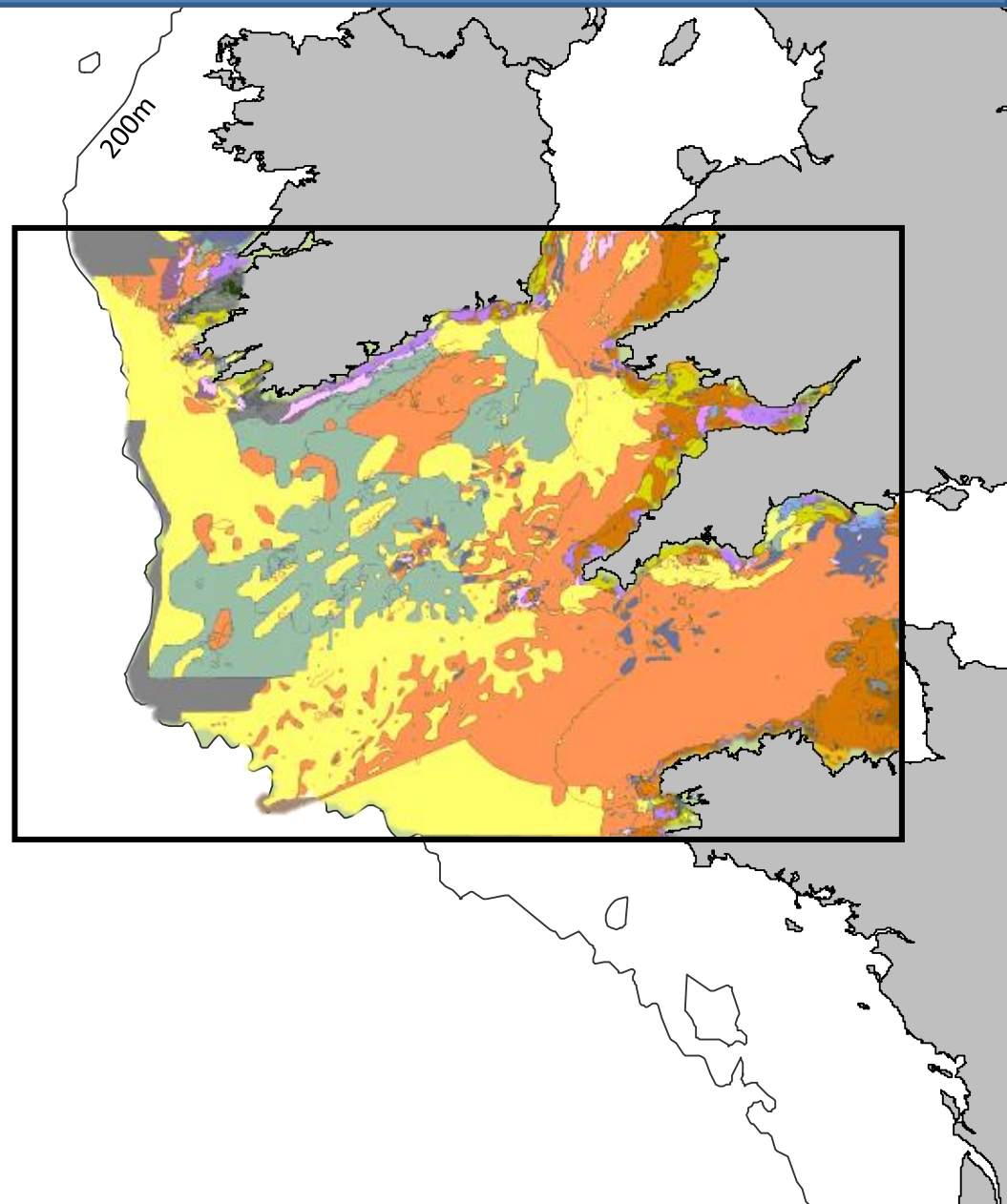
A CASE STUDY: THE CELTIC SEA

- North-West European ecosystem



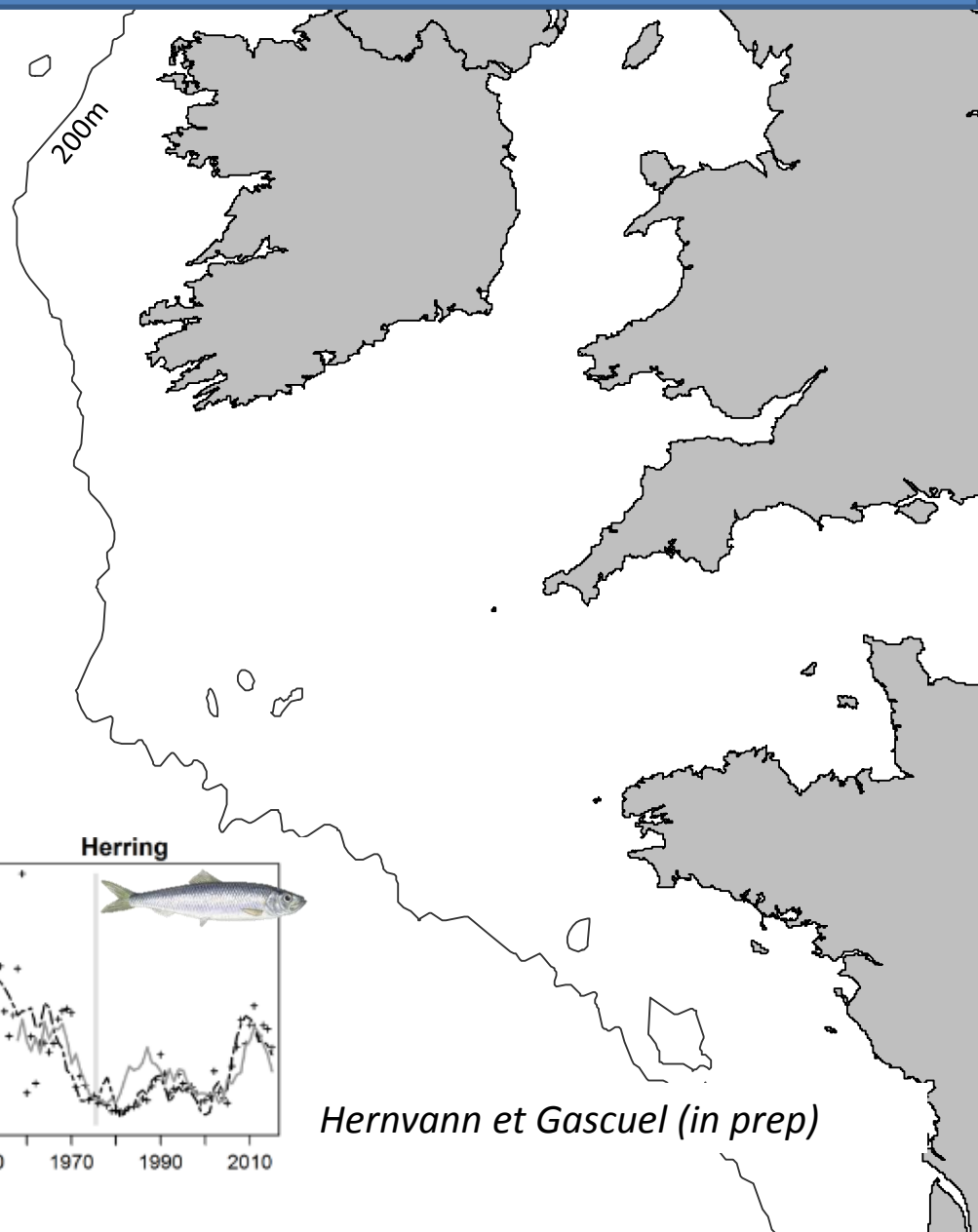
A CASE STUDY: THE CELTIC SEA

- North-West European ecosystem
- Great variety of habitats
→ diversity of species

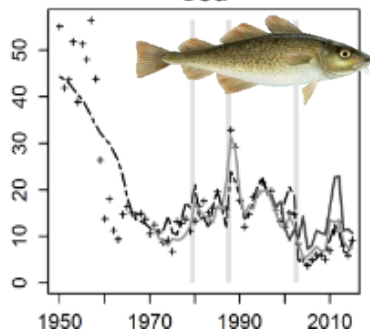


A CASE STUDY: THE CELTIC SEA

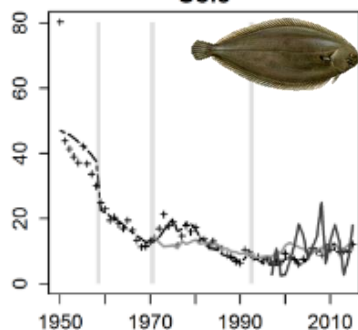
- North-West European ecosystem
- Great variety of habitats
→ diversity of species
- Intensive fishing since the XXth century and particularly after 1950
→ 75% reduction of main target species biomass in 1980



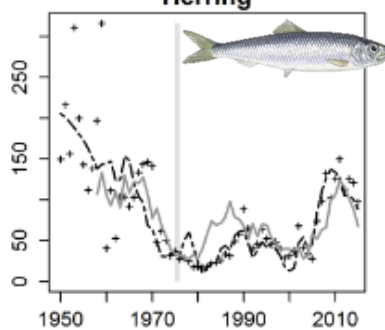
Cod



Sole



Herring



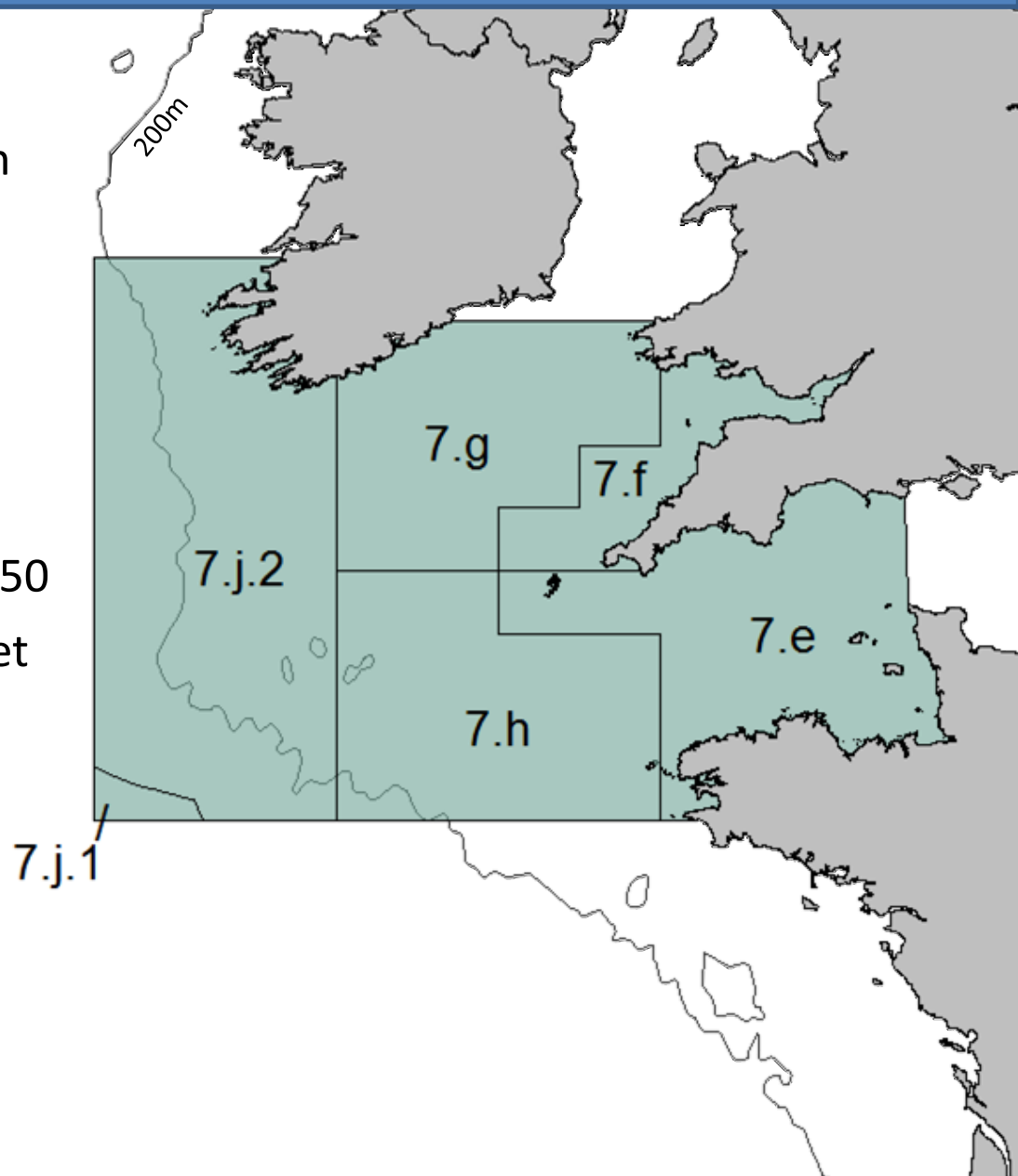
Hervann et Gascuel (in prep)

A CASE STUDY: THE CELTIC SEA

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→ diversity of species
- Intensive fishing since the XXth century and particularly after 1950
→ 75% reduction of main target species biomass in 1980
- Strategic area for European fishing fleets

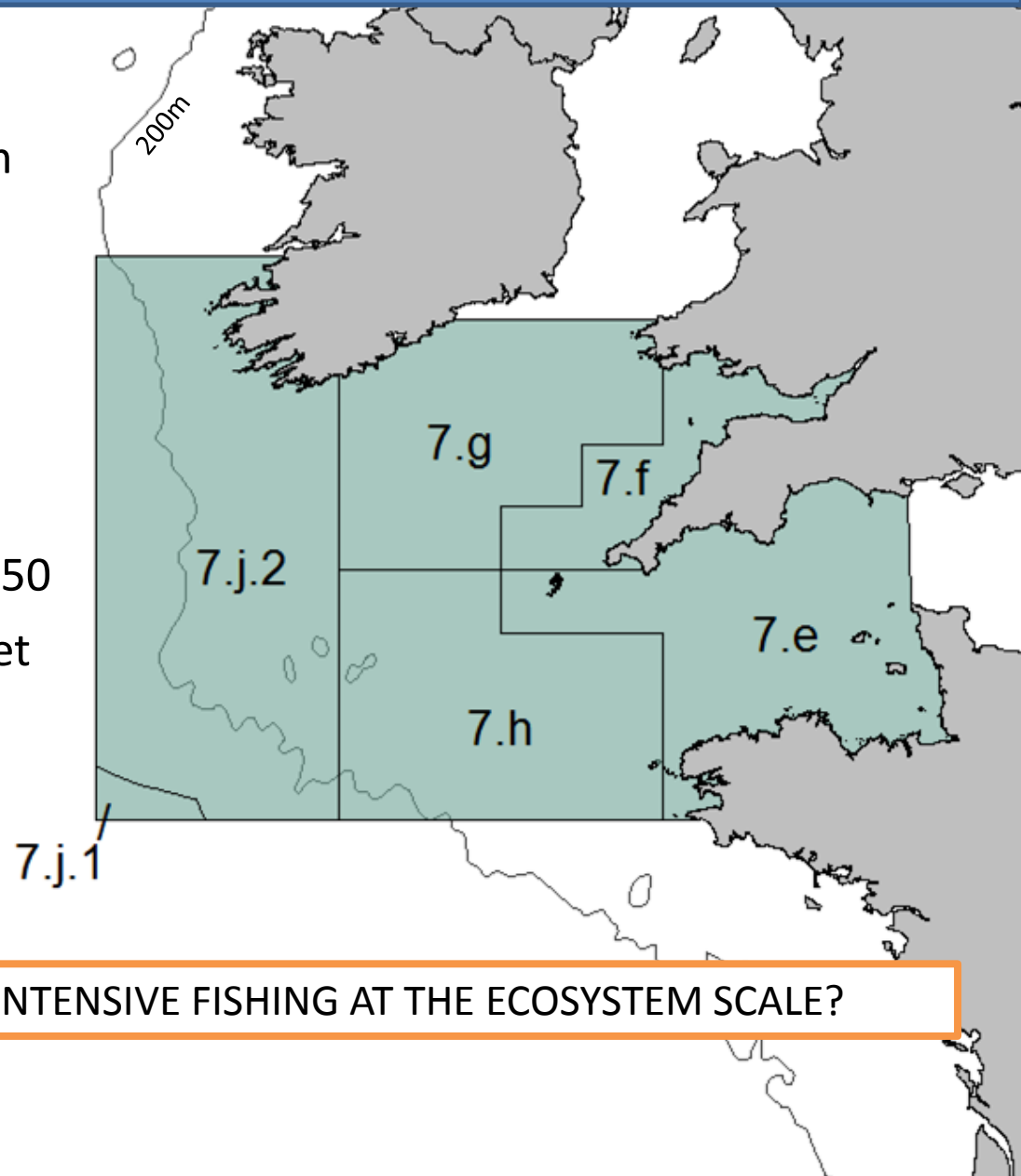
 +  +  +  = 340,000 t

13.5% French catch in FAO27



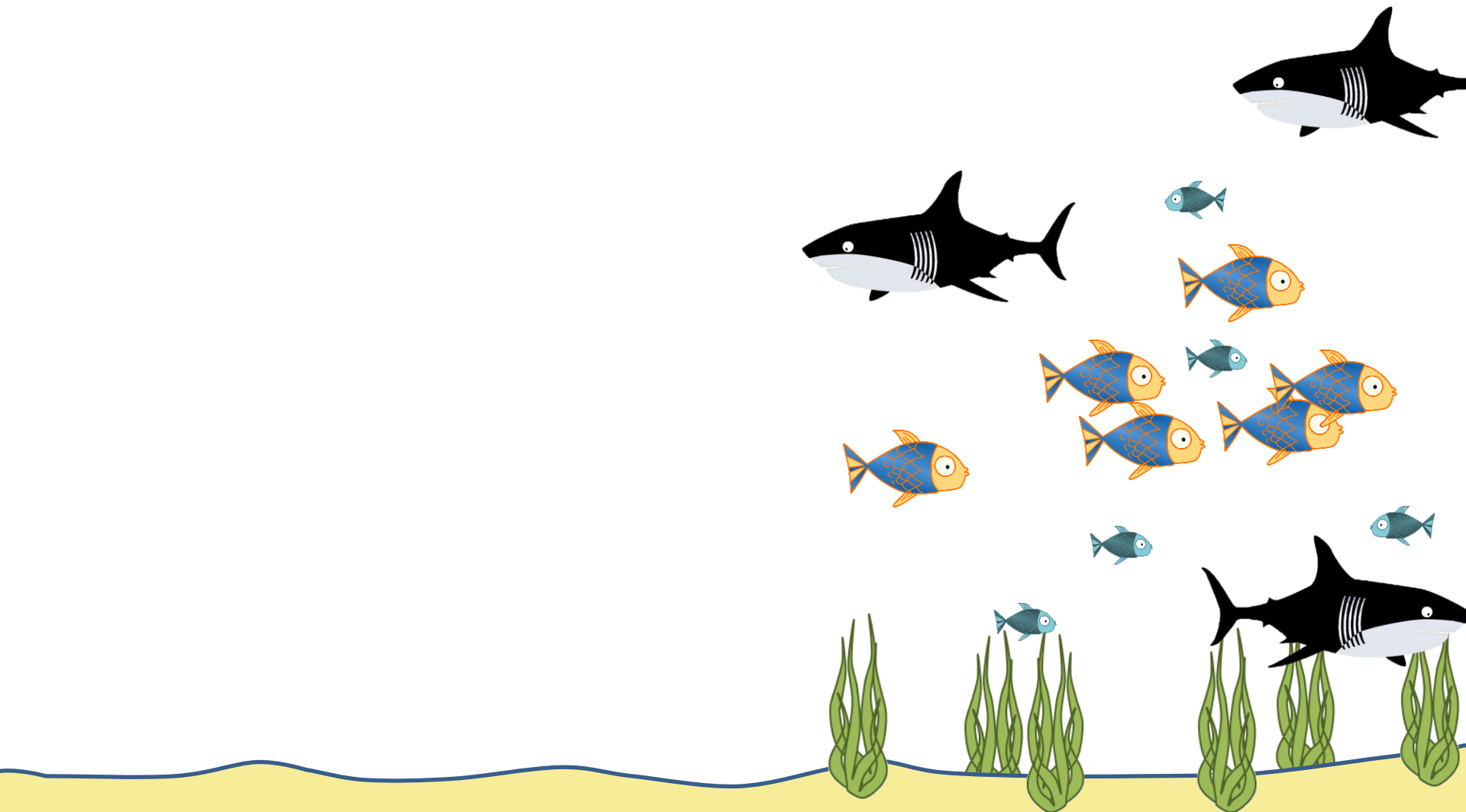
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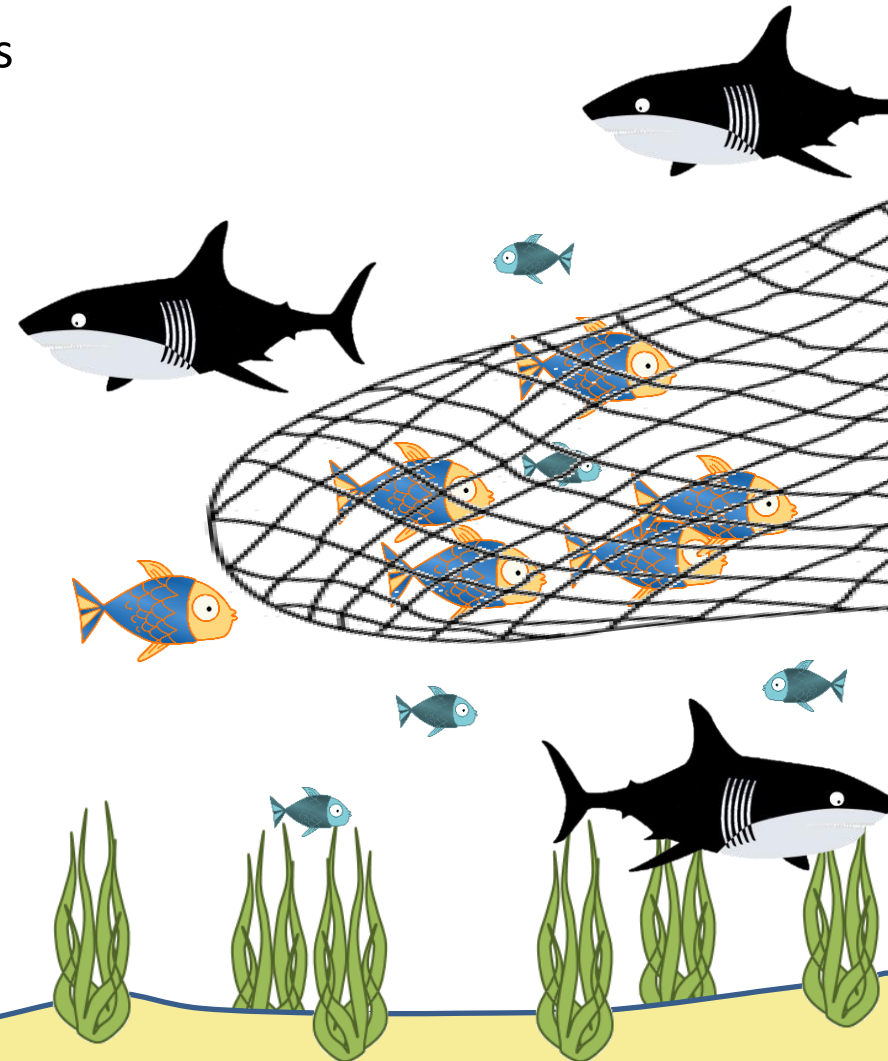
WHAT IS THE IMPACT OF SUCH INTENSIVE FISHING AT THE ECOSYSTEM SCALE?

FISHING IMPACT ON ECOSYSTEMS – The trophic side



FISHING IMPACT ON ECOSYSTEMS

- Biomass reduction of exploited stocks



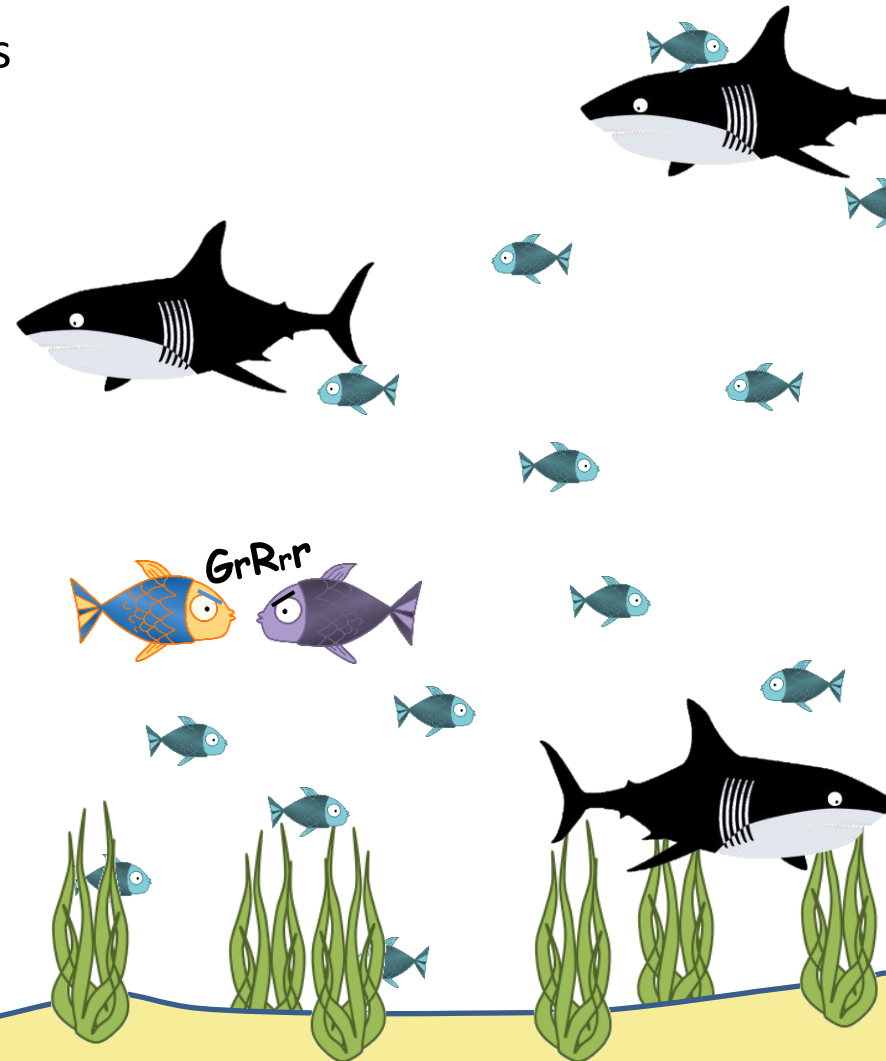
FISHING IMPACT ON ECOSYSTEMS – The trophic side

- Biomass reduction of exploited stocks
- Changes of species composition

Predators

Preys

Competitors



FISHING IMPACT ON ECOSYSTEMS – A TROPHIC VIEW

- Biomass reduction of exploited stocks
- Changes of species composition



**MOVE TOWARD AN ECOSYSTEM-BASED FISHERIES
MANAGEMENT**

Predators

Preys

Competitors

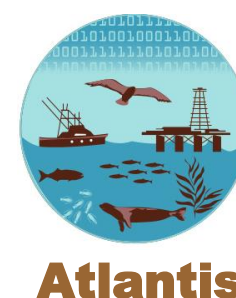


ABOUT ECOSYSTEM MODELLING

- Need of an ecosystem-based fisheries management (Pikitch et al., 2014; Garcia et al., 2003 ...)

Scientific Community + Policy Makers (CFP)

- One tool to support an EBFM is ecosystem modeling, especially trophic modeling (Plaganyi, 2007)



etc.

PRE-EXISTING MODELS

Guénette & Gascuel (2009)

1

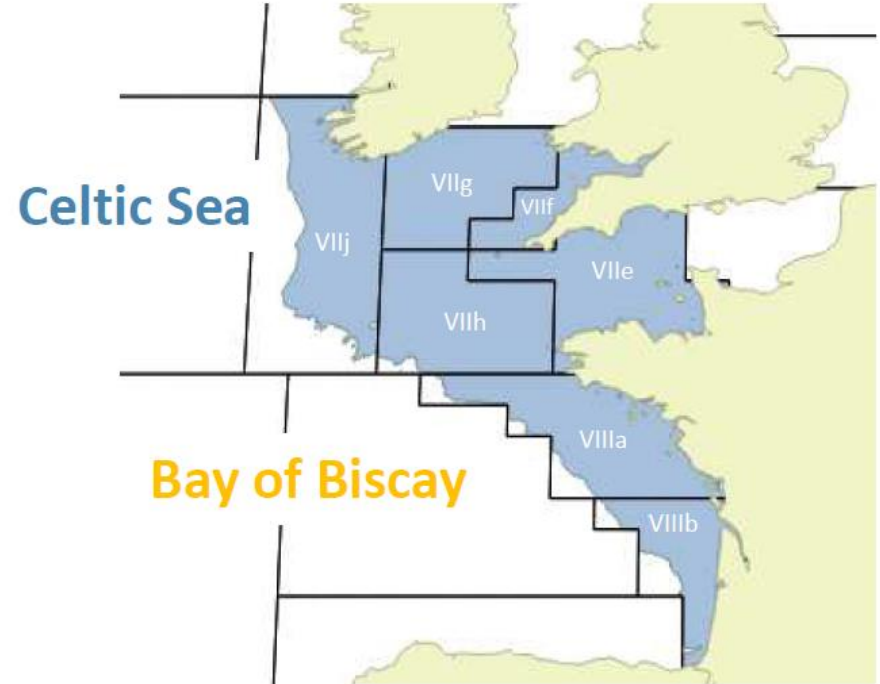


1980 - 2012



Bentorcha et al (2017)

2



+ EBFM designed
+ Actualisation



PRE-EXISTING MODELS

Guénette & Gascuel (2009)

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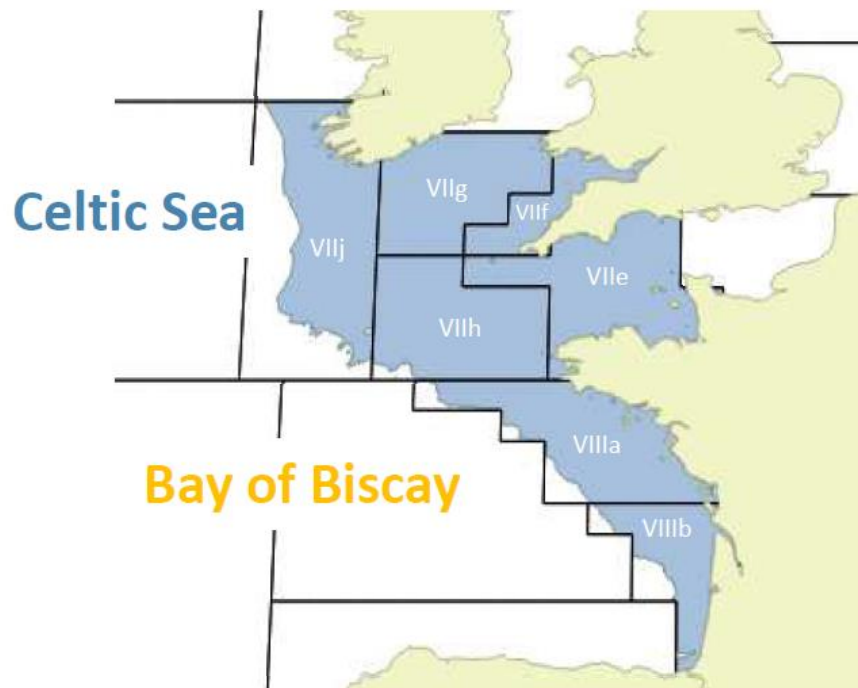


1980 - 2013



Bentorcha et al (2017)

2



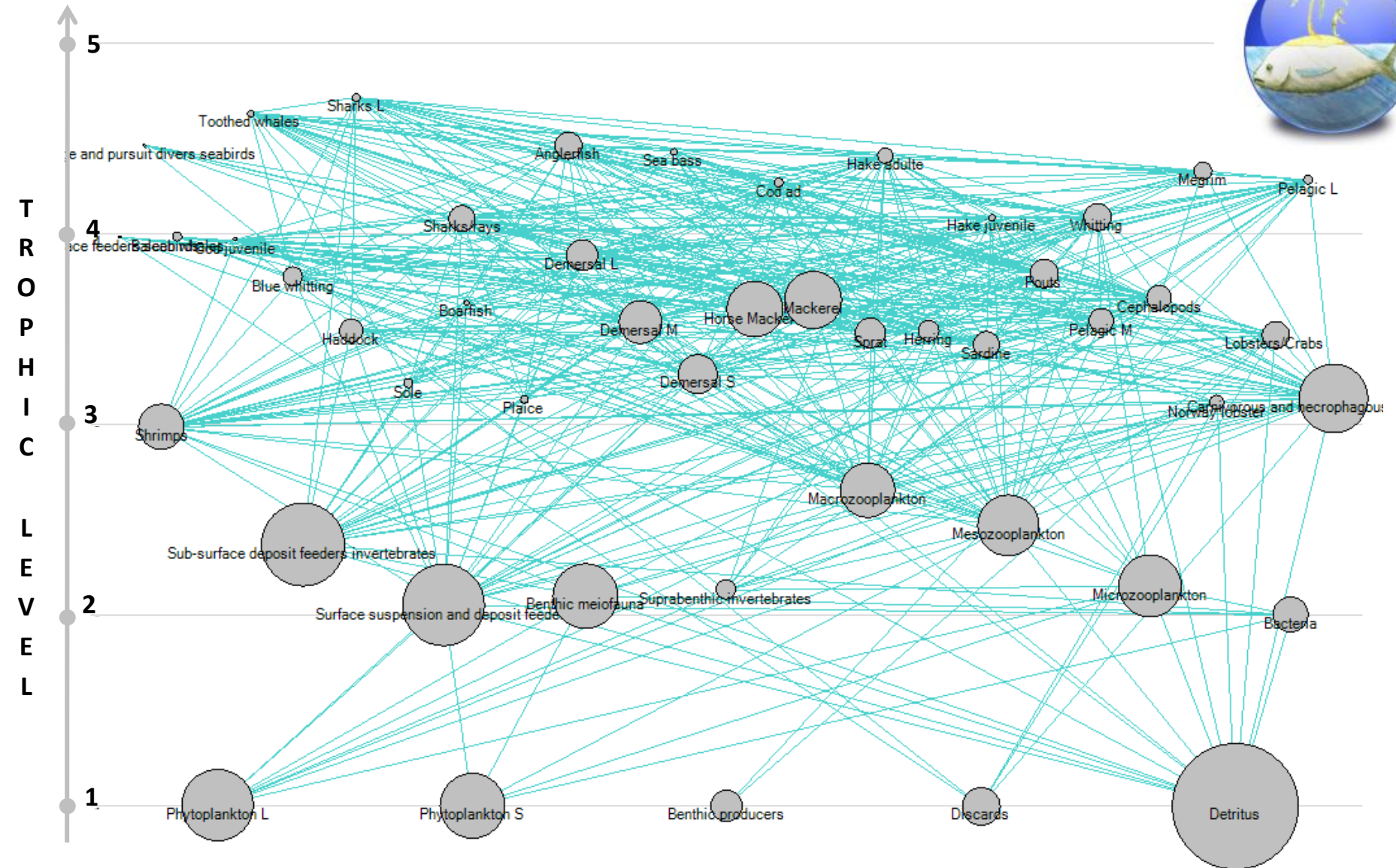
Moullec et al (2017)

3

+ EBFM designed
+ Actualisation



PRE-EXISTING MODELS – Celtic Sea model (Moulllec et al. 2015)



PRE-EXISTING MODELS

Guénette & Gascuel (2009)

1

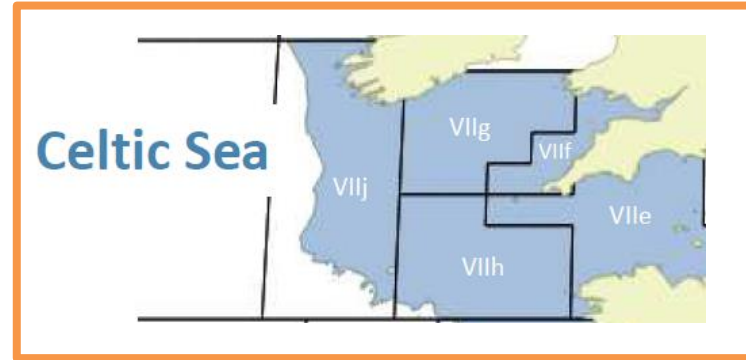


1980 - 2013



Bentorcha et al (2017)

2



Moullec et al (2017)

3



Me!

4



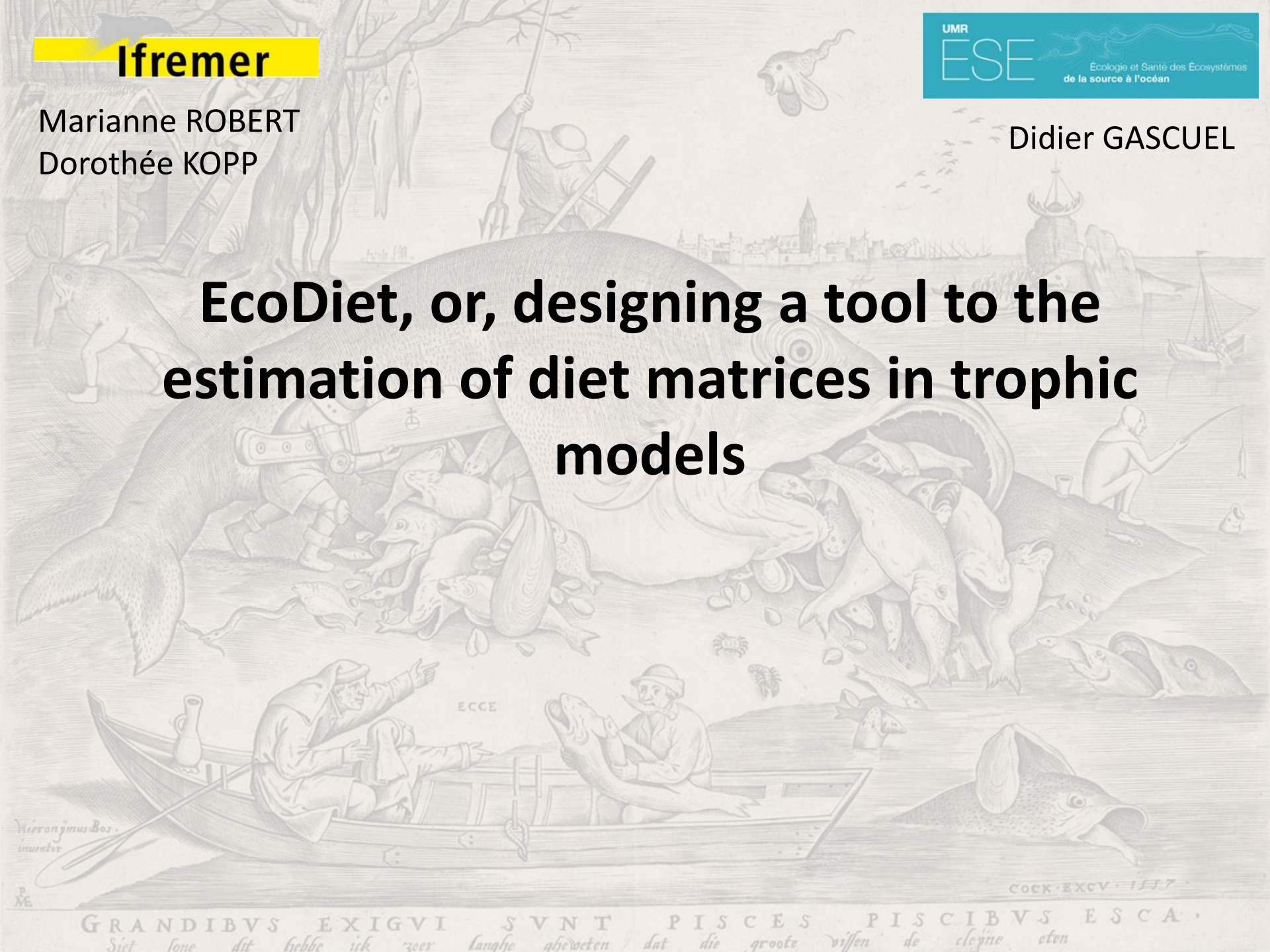
AU MENU

- What are the fisheries and environmental determinants of the Celtic Sea ecosystem dynamics?
What would be the impacts of various management measures and how can trophic models contribute to the identification of fisheries in order to minimize the impacts on ecosystems?
- In practical terms: Improve the predictive capacity of the Celtic model and Test realistic ecosystem-based fisheries management scenarios
- 3 main steps:
 - ① Develop a generic method to estimate diet matrices in Ecopath models and apply the method to the Celtic Sea
 - ② Spatialize the trophic model through Ecospace
 - ③ Test various fisheries management scenarios

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EcoDiet, or, designing a tool to the estimation of diet matrices in trophic models



GRANDIBVS EXIGVI SVNT PISCES PISCIBVS ESCA.
Siet sone dit hebbe ick zeer langhe ghedeten dat die groote vissen de cloyne eten

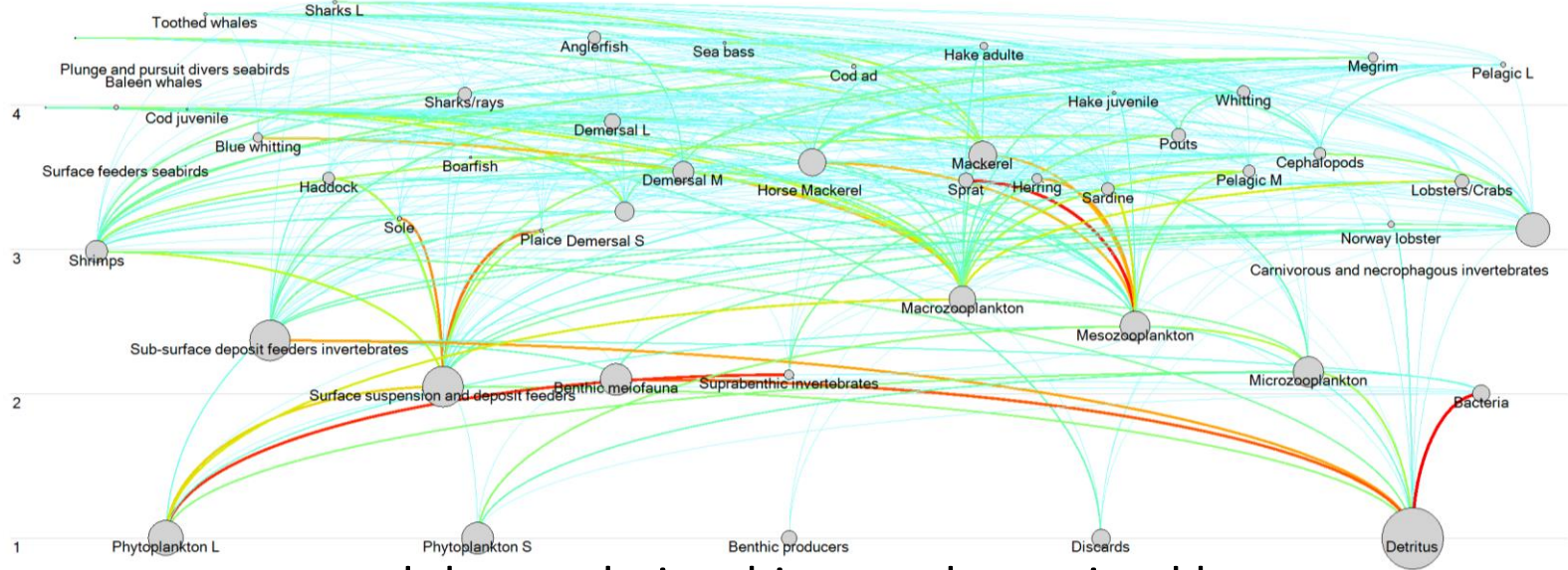
CONTEXTE

INTRO



THE DIET MATRIX

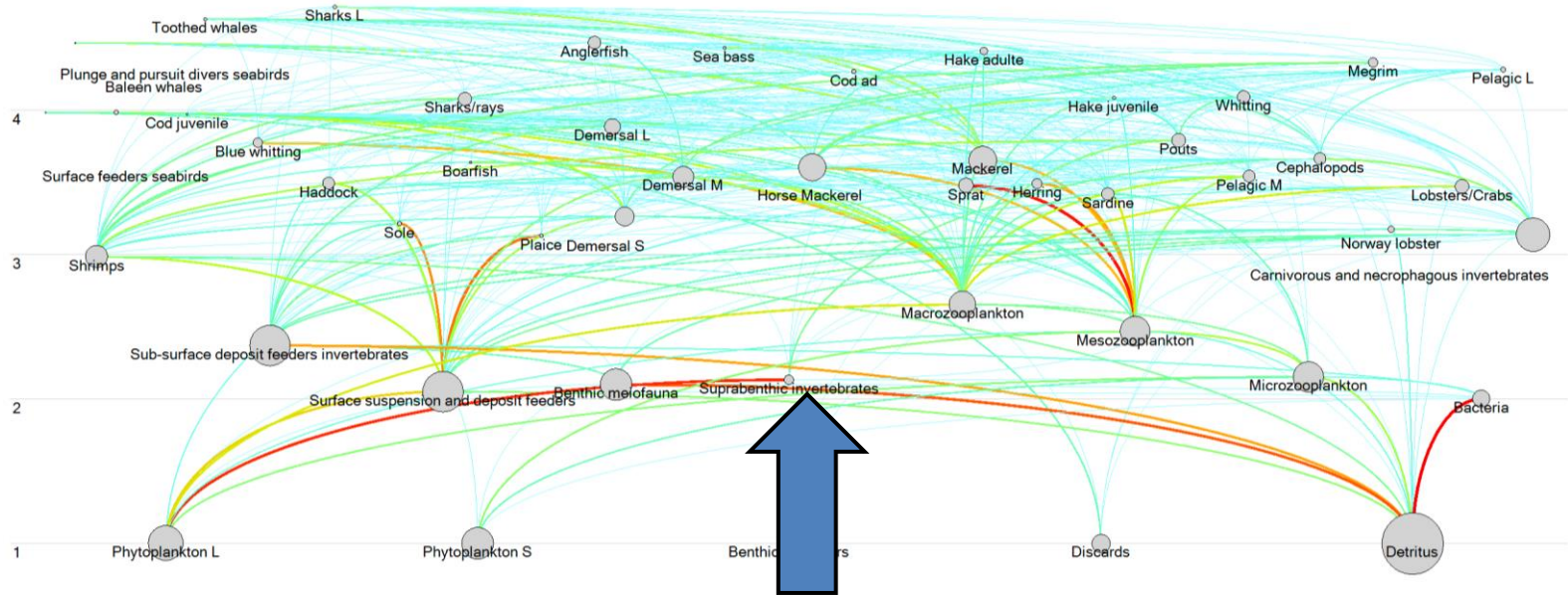
Species or trophic connected together through predator/prey relationships



...and these relationships are determined by...



THE DIET MATRIX



Prey \ predator	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21		
1 Plunge and pursuit divers seabirds																							
2 Surface feeders seabirds																							
3 Baleen whales																							
4 Toothed whales																							
5 Sharks L				0.00518	0.6137																		
6 Sharks/rays				0.00518	0.0301	0.000259	0.0287		0.0425														
7 Anglerfish				0.0300	0.0200	0.00501			0.0400													0.00484	
8 Sea bass					0.00206		0.00202																
9 Cod ad					0.00351	0.00701		0.00200															
10 Cod juvenile							0.00230	0.00100	0.000528	0.00500			0.00400	0.000096								0.00499	
11 Blue whiting					0.0665	0.00137	0.00829	0.0101	0.0323		0.0104	0.00876	0.0163		0.0173							0.00140	
12 Hake adulte					0.00324	0.0165	0.00204	0.0190				0.00292											
13 Hake juvenile					0.00405		0.000973	0.00810		0.00792		0.0201	0.0179									0.00173	
14 Haddock					0.00445	0.00100	0.00501		0.126	0.00300	0.000450	0.0705	0.00674		0.0200							0.00500	
15 Whiting						0.00411	0.00404	0.0302														0.0245	
16 Megrin						0.00822	0.00829	0.00403		0.000222		0.000598										0.00835	
17 Sole						0.00351	0.00100	0.00100	0.00500			0.00806										0.000870	
18 Scarfish								0.00100				0.00503										0.000870	
19 Plaice						0.000498		0.000907	0.000609	0.0180		0.0201										0.00245	
20 Demersal L						0.00608	0.00753	0.00518	0.0356	0.00462	0.00989		0.00379		0.0118	0.0129						0.0269	
21 Demersal M						0.0594	0.0190	0.0120	0.0701	0.171	0.0500	0.0200	0.0100	0.0161	0.00300	0.0500	0.0210	0.254				0.0858	
22 Demersal S						0.0869	0.115	0.0572	0.0805	0.2629	0.115	0.424	0.126	0.00478	0.0227	0.103	0.0150	0.230				0.115	
23 Horse Mackerel						0.187	0.150	0.0407	0.0569	0.00801	0.0670	0.00499	0.0400										
24 Mackerel						0.454	0.307	0.160	0.205	0.385	0.0110	0.00288	0.390	0.0500									
25 Sprat						0.0300	0.0154	0.00411	0.0167	0.00230	0.00369	0.00759		0.0252		0.0516	0.0813	0.0257					
26 Herring						0.0511	0.0300	0.0400	0.0190		0.00404	0.0143	0.01000	0.00200									
27 Sardine						0.119	0.118	0.0495	0.00398	0.00975	0.00101	0.0890	0.00921		0.0234	0.0227	0.0416	0.00578				0.00858	
28 Pout						0.0882	0.0100	0.00777	0.00504	0.00551	0.168	0.00708		0.0467	0.0278								
29 Pelagic L						0.01000	0.110	0.000529					0.00403										
30 Pelagic M						0.0831	0.0800	0.0483	0.0397	0.0103	0.00518		0.0341		0.000305	0.00676		0.0578				0.0116	
31 Cephalopods							0.0670	0.226	0.170	0.149	0.0310	0.0110	0.00646	0.00124		0.000359	0.0140	0.0347	0.0778			0.00407	
32 Norway lobster											0.0104	0.0345										0.00613	
33 Lobsters/ Crabs											0.0100	0.0103	0.0504	0.0262	0.0397							0.00613	
34 Shrimps											0.0501	0.272	0.0655	0.0366	0.212	0.1000	0.0971	0.0201	0.0758	0.0230	0.275	0.110	0.150
35 Carnivorous and necrophagous invertebrates											0.00701	0.0534	0.0300	0.121	0.0200	0.0171	0.0201	0.0278	0.00999	0.00115	0.0340	0.100	0.0123

...the DIET MATRIX !



THE DIET MATRIX

Predators (=consumers)



Preys (=sources)

Producers

Prey \ predator	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	
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23 Horse Mackerel	0.187	0.150			0.0407	0.0569	0.00801	0.0670	0.00499	0.0400		0.181	0.350																
24 Mackerel	0.454	0.307	0.160	0.205	0.365	0.0110	0.00288	0.390	0.0600			0.166				0.00900	0.0800												
25 Sprat		0.0300		0.0154	0.00411	0.0167	0.00230		0.00369	0.00759		0.0252			0.0516	0.0613	0.0257												
26 Herring	0.0511	0.0300	0.0400	0.0190		0.00404	0.0143	0.01000	0.00200			0.0302			0.00400										0.0259	0.0310		0.00	
27 Sardine	0.119	0.118		0.0495	0.00398	0.00975	0.00101	0.0890	0.00921			0.0234	0.0227	0.0416	0.00578						0.00858			0.0102	0.0110				
28 Pouts				0.0892	0.0100	0.00777	0.0504	0.00551	0.168		0.00708		0.0467	0.0278	0.231														
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35 Carnivor and necrophagous invertebrates					0.00701	0.0634	0.0300	0.121	0.0200		0.0171	0.0201	0.00758	0.00999	0.00115	0.0340					0.0123	0.0690	0.0450	0.0100				0.0	
36 Sub-surface deposit feeders invertebrates					0.0100		0.0101	0.0262	0.000073			0.0201	0.0197	0.140	0.0509		0.189	0.100	0.250		0.245	0.00900	0.0469	0.0102			0.0400	0.0	
37 Surface suspension and deposit feeders						0.106						0.0522			0.394	0.0289		0.701	0.100	0.750	0.0785	0.309	0.375	0.0307				0.0500	0.0
38 Benthic meiofauna																													
39 Suprabenthic invertebrates											0.00300	0.0199	0.0379															0.0200	
40 Macrozooplankton		0.0852	0.443	0.0180		0.0781	0.0560	0.0920	0.0530	0.203	0.587	0.134	0.230	0.0700	0.145			0.411		0.0880	0.335	0.0336	0.234	0.240	0.0500	0.184	0.210	0.0	
41 Mesozooplankton			0.154			0.0591		0.0280	0.0400	0.211	0.0701	0.0403	0.136	0.0530	0.0700			0.139		0.0490	0.0982	0.193	0.601	0.604	0.950	0.650	0.500	0.0	
42 Microzooplankton													0.0152		0.00462									0.0190		0.0960	0.200		
43 Bacteria																													
44 Phytoplankton L																													
45 Phytoplankton S																													
46 Benthic producers																													
47 Discards	0.0475	0.200													0.0500	0.0810													
48 Detritus					0.000664	0.00402																							
49 Import	0.000	0.000	0.000	0.0210	0.01000	0.000	0.191	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.0
50 Sum	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.000	1.0
51 (1 - Sum)	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.0



THE DIET MATRIX

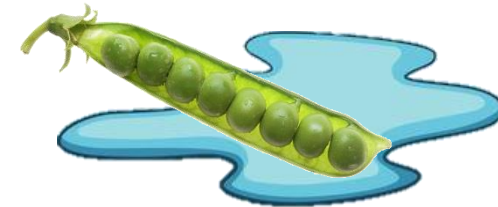


	Cod
Sharks/rays	0,04
Blue whiting	0,03
Sole	0,01
Plaice	0,02
Demersal M	0,05
Demersal S	0,12
Horse mack.	0,04
Mackerel	0,06
Sardine	0,01
Pouts	0,17
Cephalopods	0,01
Lobsters/Crabs	0,04
Shrimps	0,21
Carn/necro	0,02
SSDF	0,07
Macrozoo	0,05
Mesozoo	0,04
Sum	1,00

The « cod case »

« je mange ***% de bidule,
 ***% de truc,
 ***% de machin »

Unité =



THE DIET MATRIX

- Generally, diet matrix are based on information from the literature

THE DIET MATRIX

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- In the case of the current Celtic Sea model, it comes from



THE DIET MATRIX

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- In the case of the current Celtic Sea model, it comes from
 - Few local studies



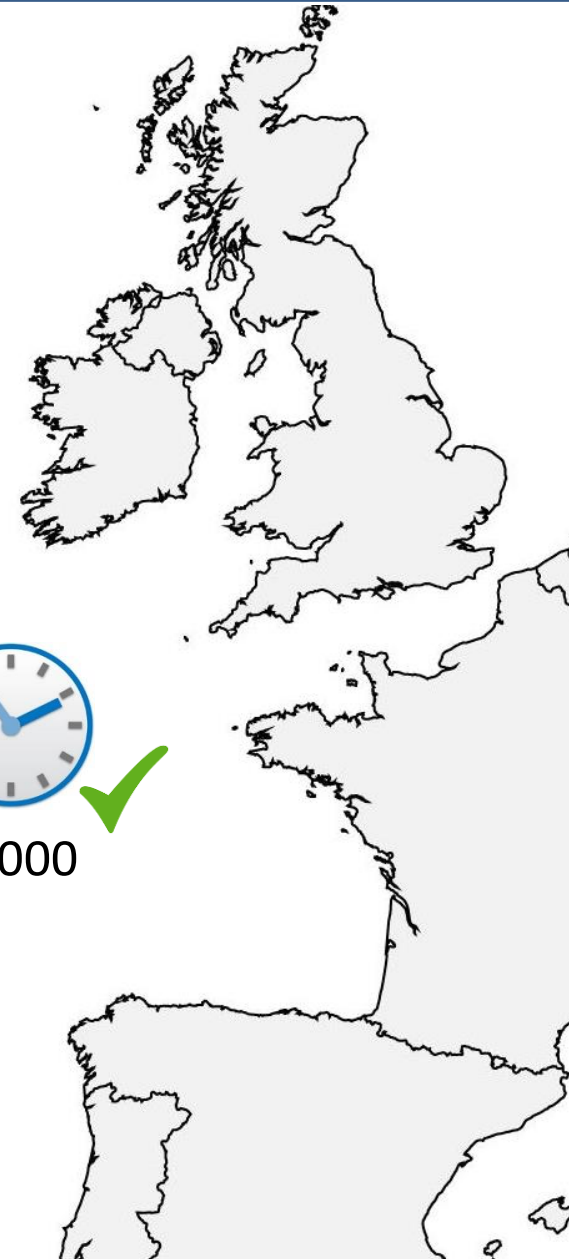
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- Generally, diet matrix are based on information from the literature
- In the case of the current Celtic Sea model, it comes from
 - Few local studies
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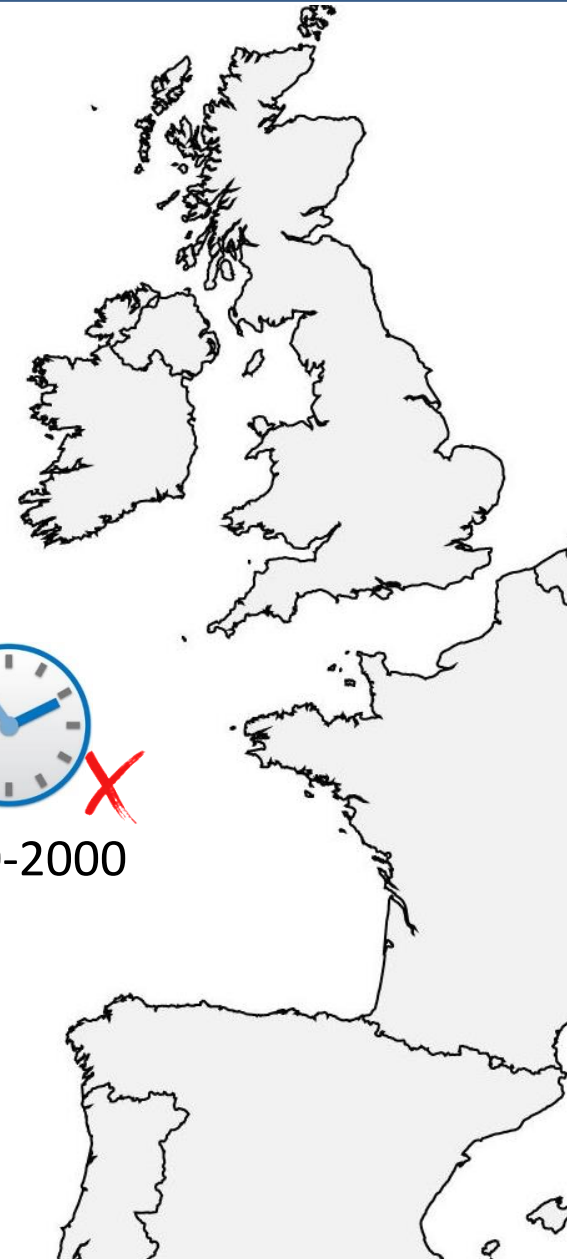


THE DIET MATRIX

- Generally, diet matrix are based on information from the literature
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 - Many studies made somewhere else
 - Some recent studies
 - Many old studies



1960-2000



THE DIET MATRIX

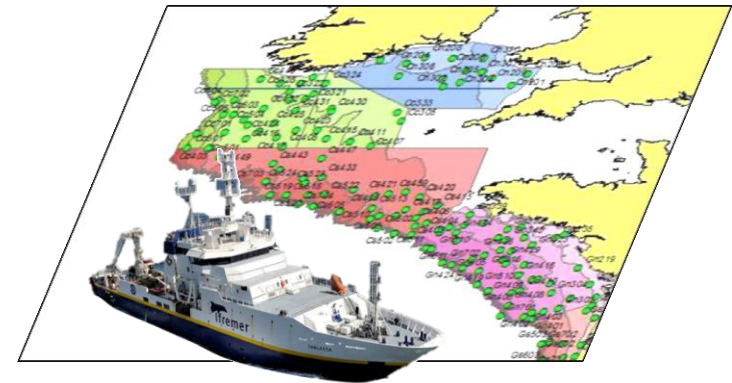
- Generally, diet matrix are based on information from the literature
- In the case of the current Celtic Sea model, it comes from
 - Few local studies
 - Many studies made somewhere else
 - Some recent studies
 - Many old studies

→ NEED OF BETTER INFORMATION
(local and relevant)
ON SPECIES INTERACTIONS

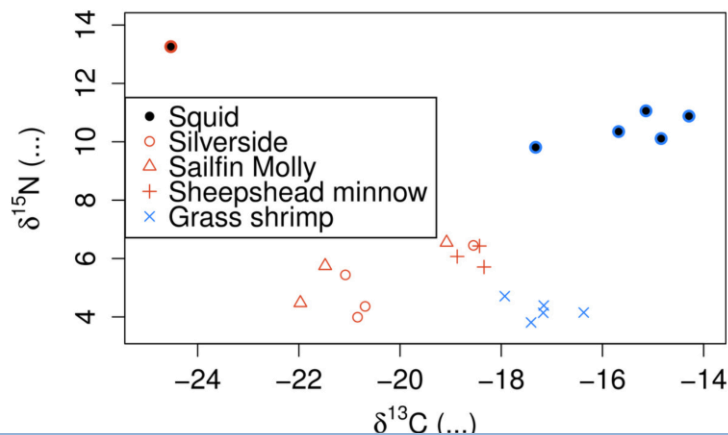


A GREAT OPPORTUNITY FOR TROPHIC MODELING IN THE CELTIC SEA

- EATME Project – IFREMER Lorient
- EVHOE survey 2014-2016 – Celtic Sea
- More than 2000 samples



Stable isotops analysis (SIA)



Stomach contents analysis (SCA)



+

METHODS



CONSIDERATIONS ABOUT THE DATA:

- HOW TO USE EACH TYPE OF DATA?
- EVENTUAL DATA PREPARATION

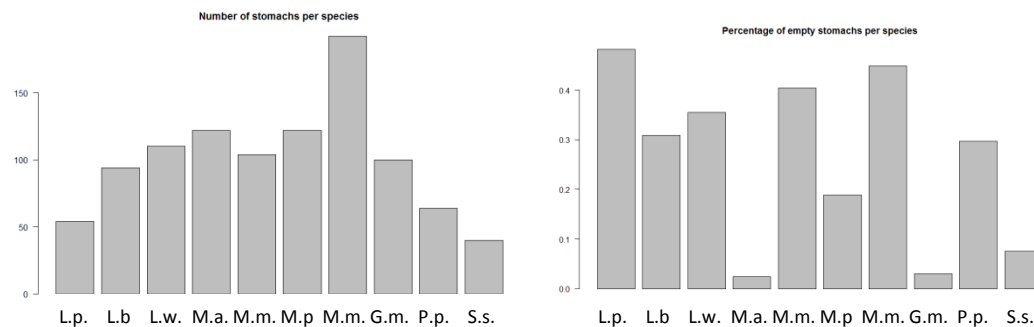
STOMACH CONTENT ANALYSIS 🐟

- 10 main commercial species



- > 1000 stomachs analyzed

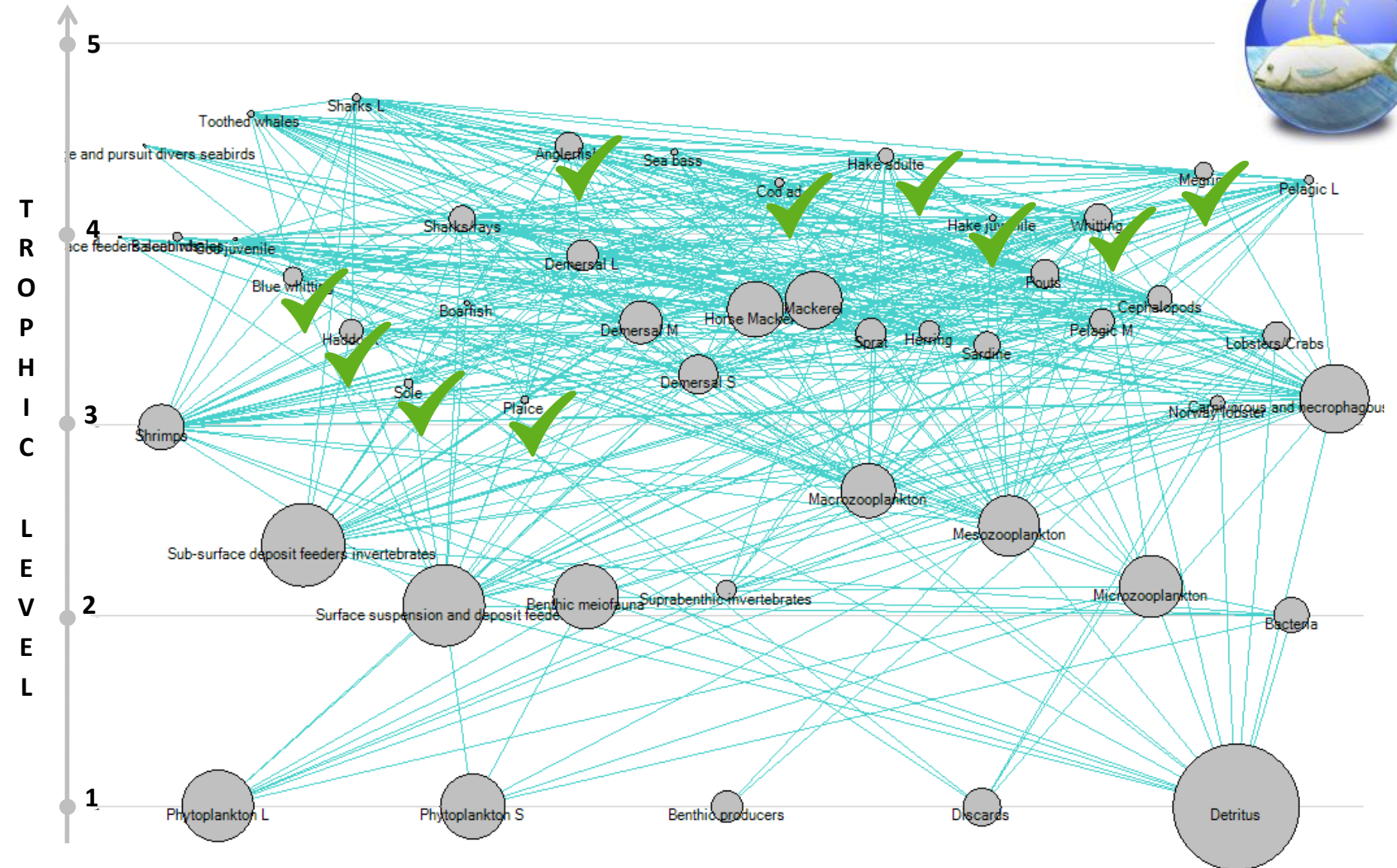
75 % of non empty



- Identification as precise as possible of taxa - 206 different taxa

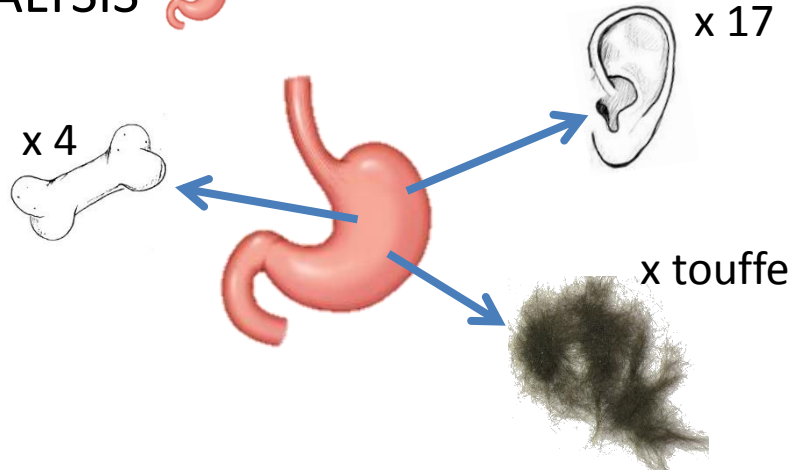
- Occurrence, numerical, ~~gravimetric, volumetric~~ ()

STOMACH CONTENT ANALYSIS



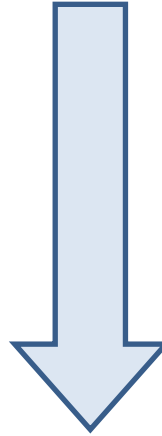
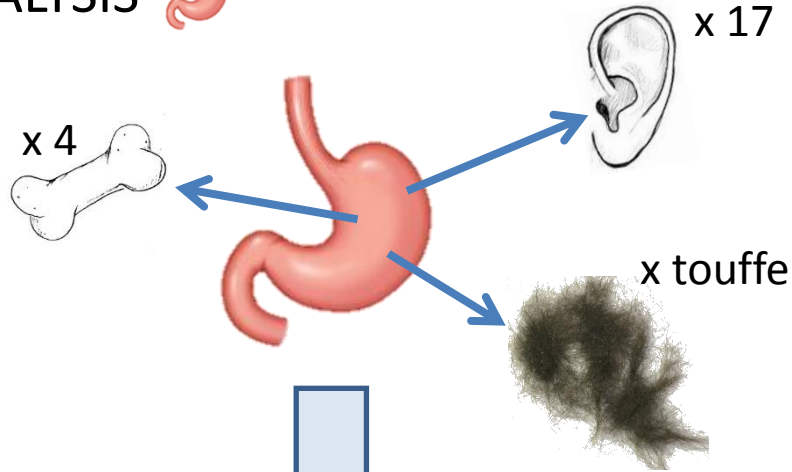
STOMACH CONTENT ANALYSIS 

Number of prey
items per stomach

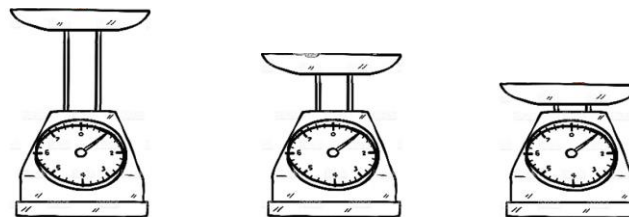


STOMACH CONTENT ANALYSIS 

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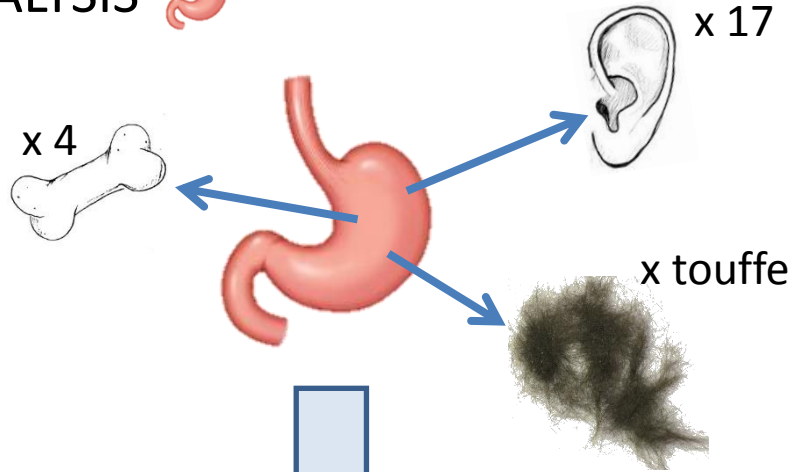


Eaten quantity of each prey type



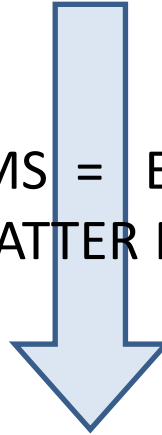
STOMACH CONTENT ANALYSIS 

Number of prey items per stomach

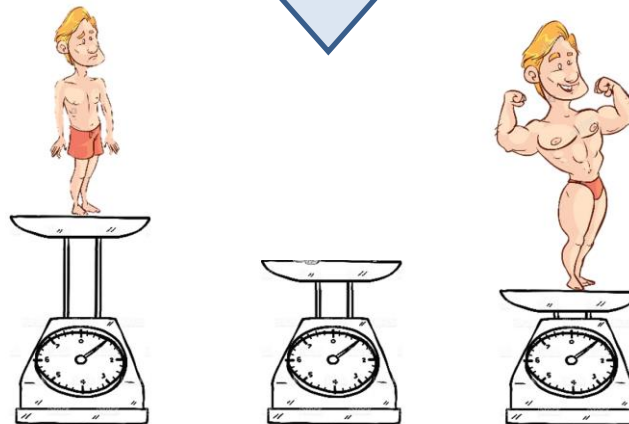


- Number → Weight?
- Question of digestibility

PREY ITEMS = ESTIMATORS OF MATTER FLOWS?

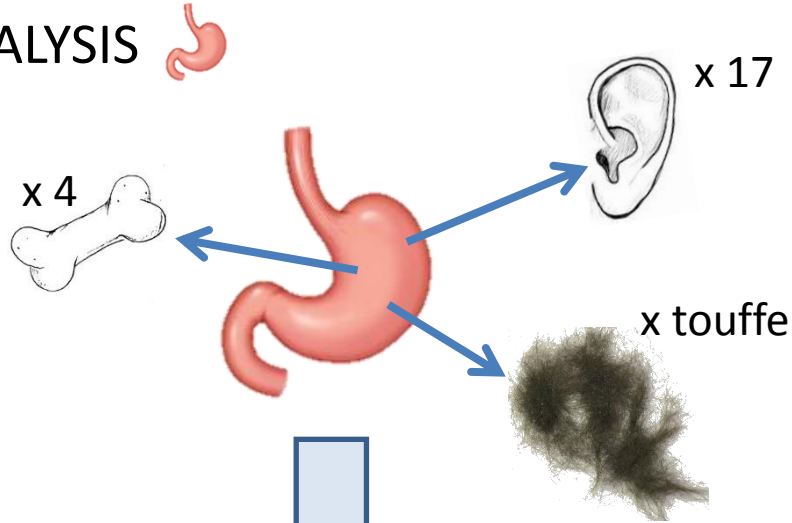


Eaten quantity of each prey type



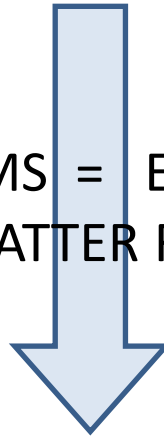
STOMACH CONTENT ANALYSIS 

Number of prey items per stomach

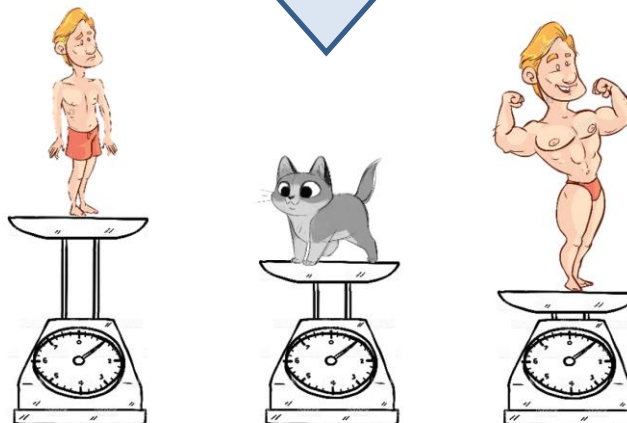


- Number → Weight?
- Question of digestibility
- Compare species...

PREY ITEMS = ESTIMATORS OF MATTER FLOWS?

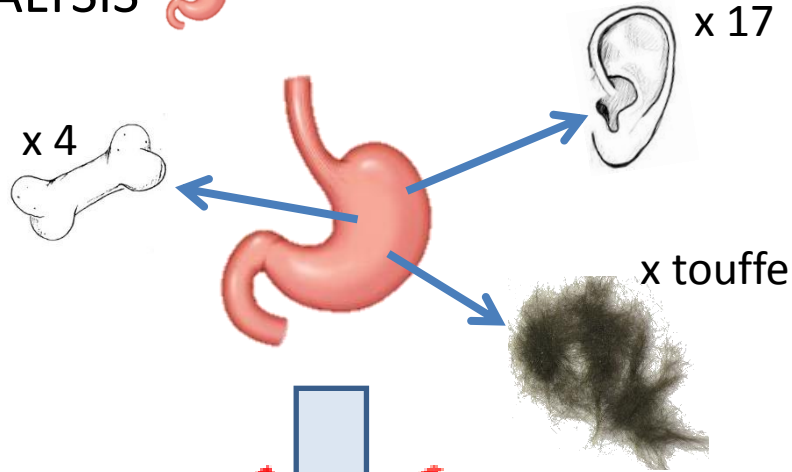


Eaten quantity of each prey type



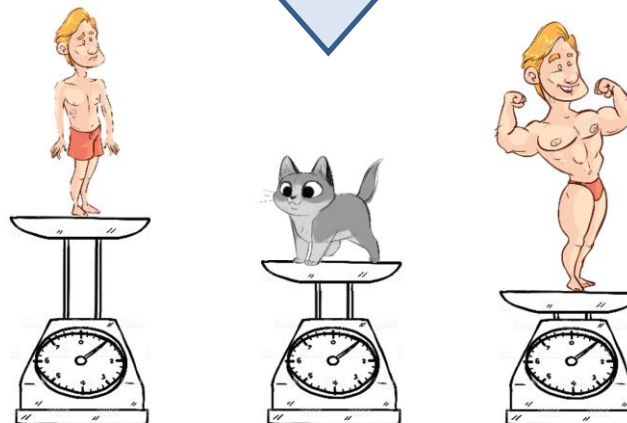
STOMACH CONTENT ANALYSIS 

Number of prey items per stomach



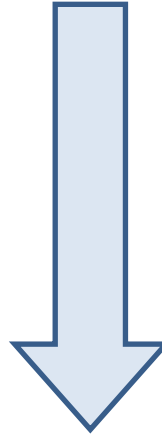
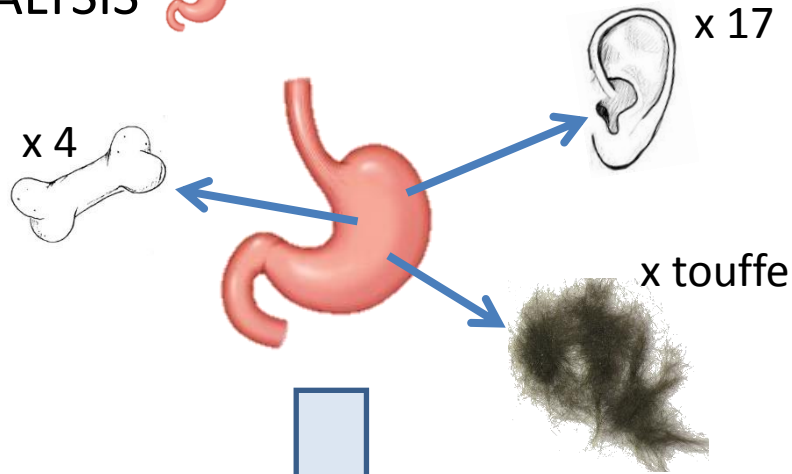
~~PREY ITEMS ESTIMATORS OF MATTER FLOWS?~~

Eaten quantity of each prey type

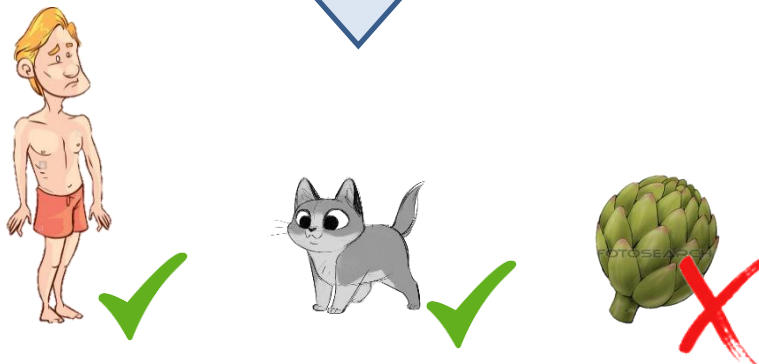


STOMACH CONTENT ANALYSIS 

Number of prey items per stomach

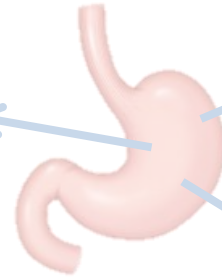


Frequencies of observation



STOMACH CONTENT ANALYSIS 

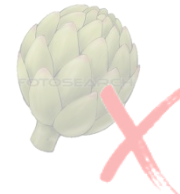
Number of prey items per stomach



SCA will give information on the links to be considered in the diet matrix

→ Topological web

Frequencies of observation



STABLE ISOTOPES ANALYSIS 

- ~ all functional groups in the ecosystem (the 10 commercial species and their potential preys)



- > 1000 samples
- Both carbon and nitrogen stable isotopes

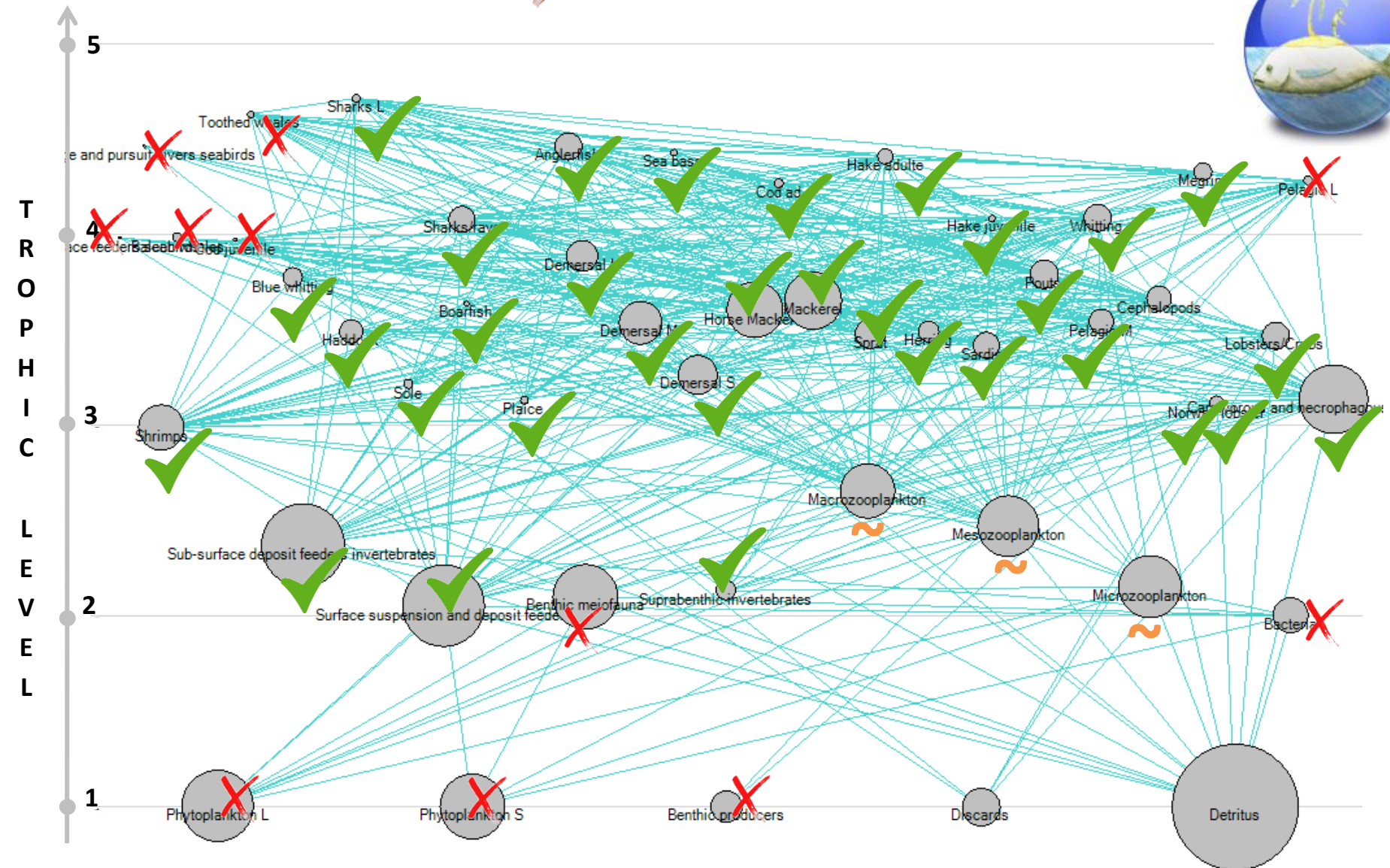
 $\delta^{13}\text{C}$

Identification of the
primary source

 $\delta^{15}\text{N}$

Identification of the
trophic position

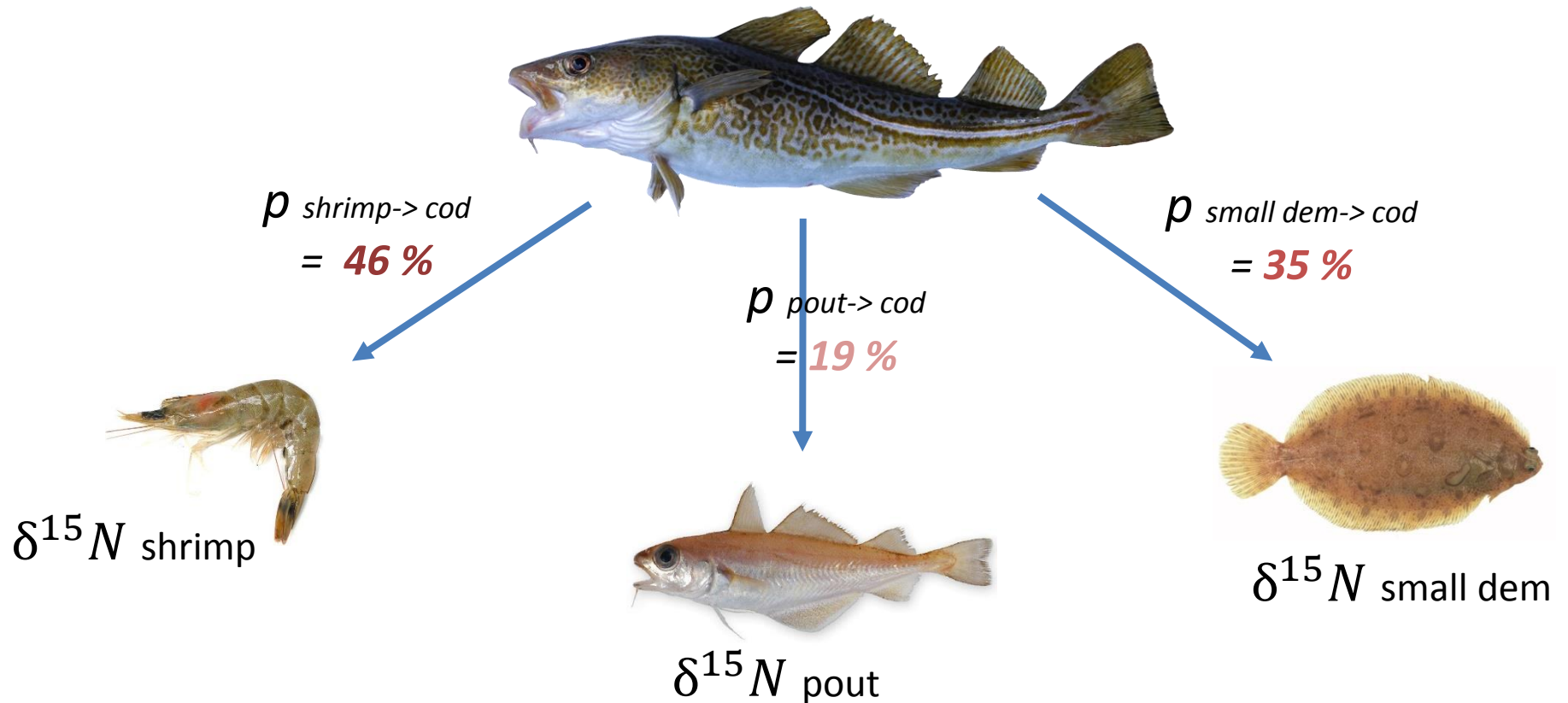
STABLE ISOTOPES ANALYSIS



TROPHIC ENRICHMENT CONCEPT

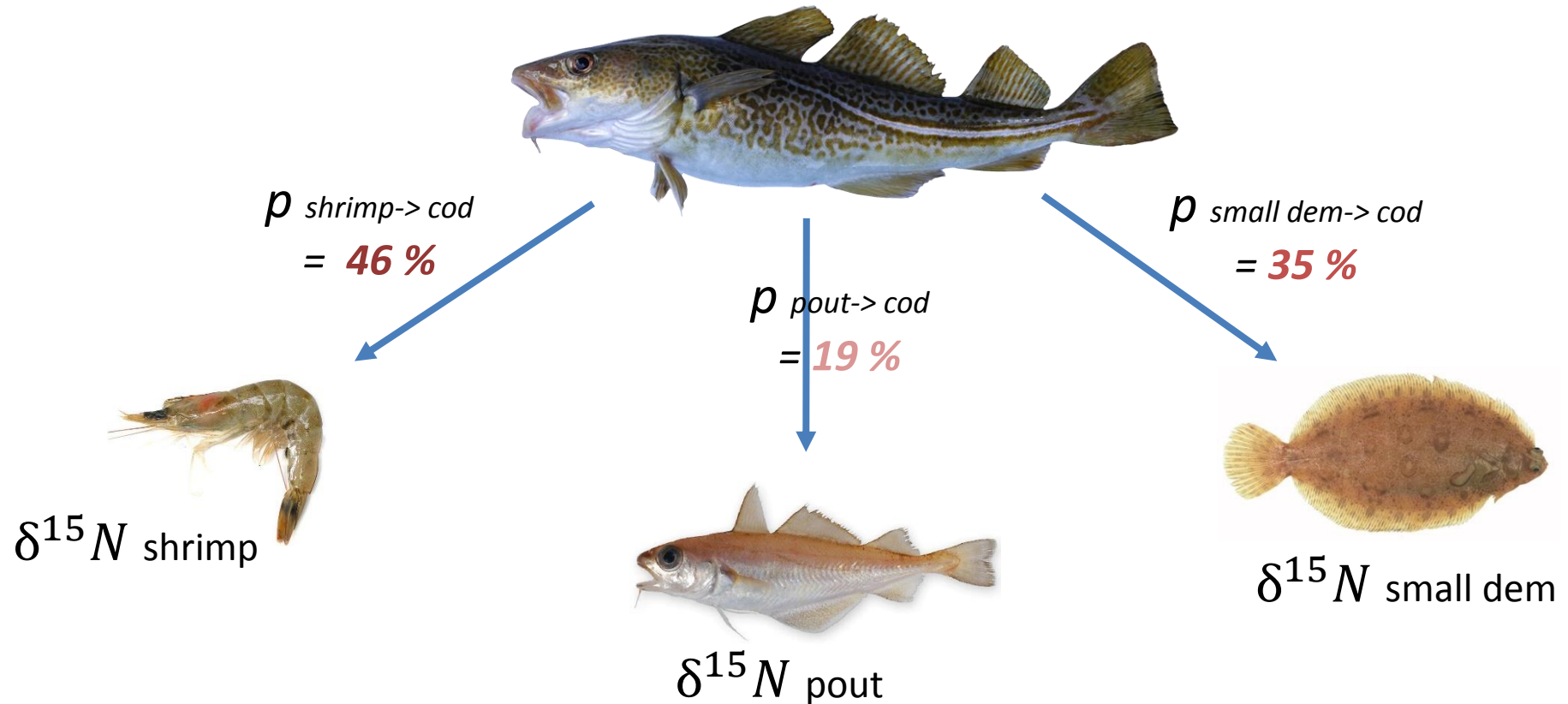
« You are what you eat »

Fry 2006 etc



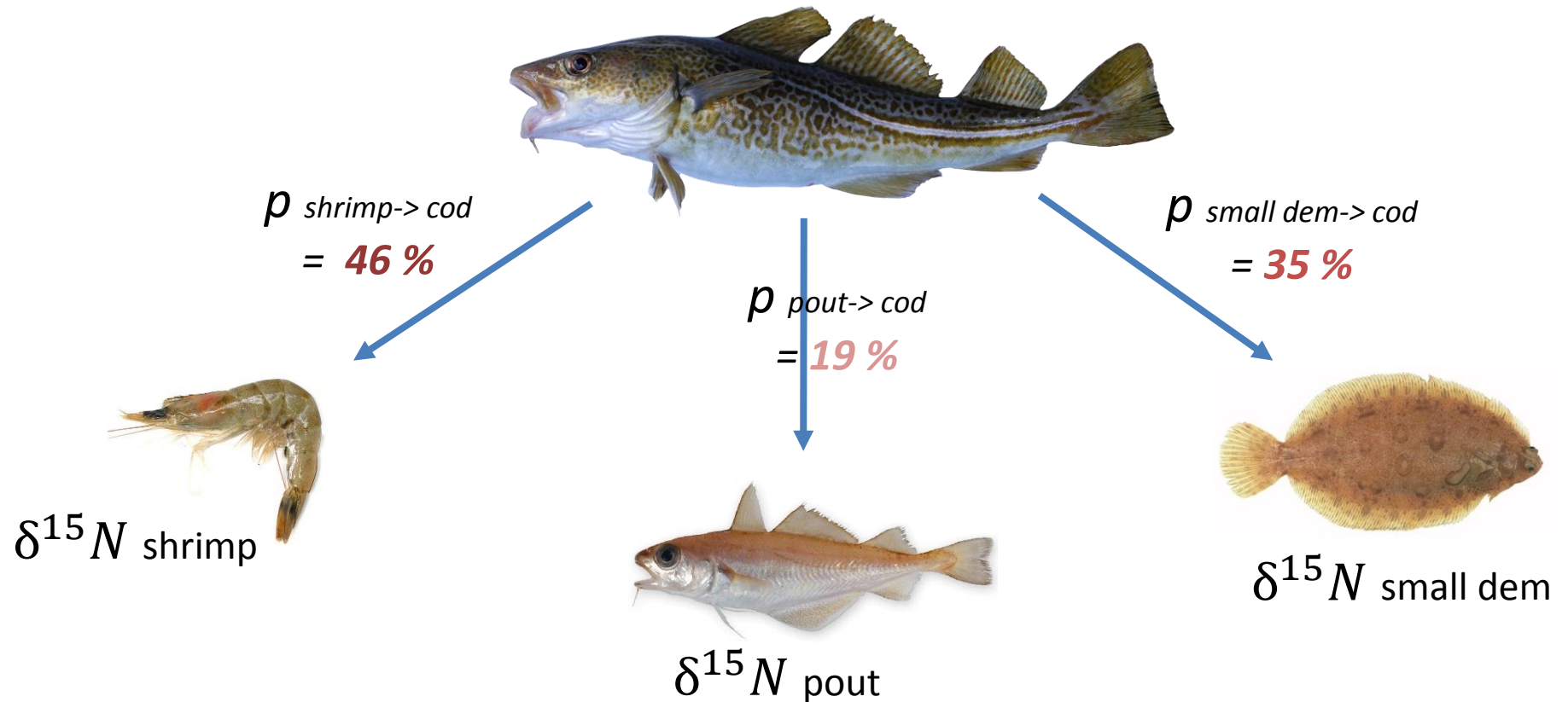
TROPHIC ENRICHMENT CONCEPT 

$$\delta^{15}N_{\text{cod}} = \frac{0.46 * q_{N,\text{shrimp}} * (\delta^{15}N_{\text{shrimp}} + \Delta) + 0.19 * q_{N,\text{pout}} * (\delta^{15}N_{\text{pout}} + \Delta) + 0.35 * q_{N,\text{small dem}} * (\delta^{15}N_{\text{small dem}} + \Delta)}{0.46 * q_{N,\text{shrimp}} + 0.19 * q_{N,\text{pout}} + 0.35 * q_{N,\text{small dem}}}$$



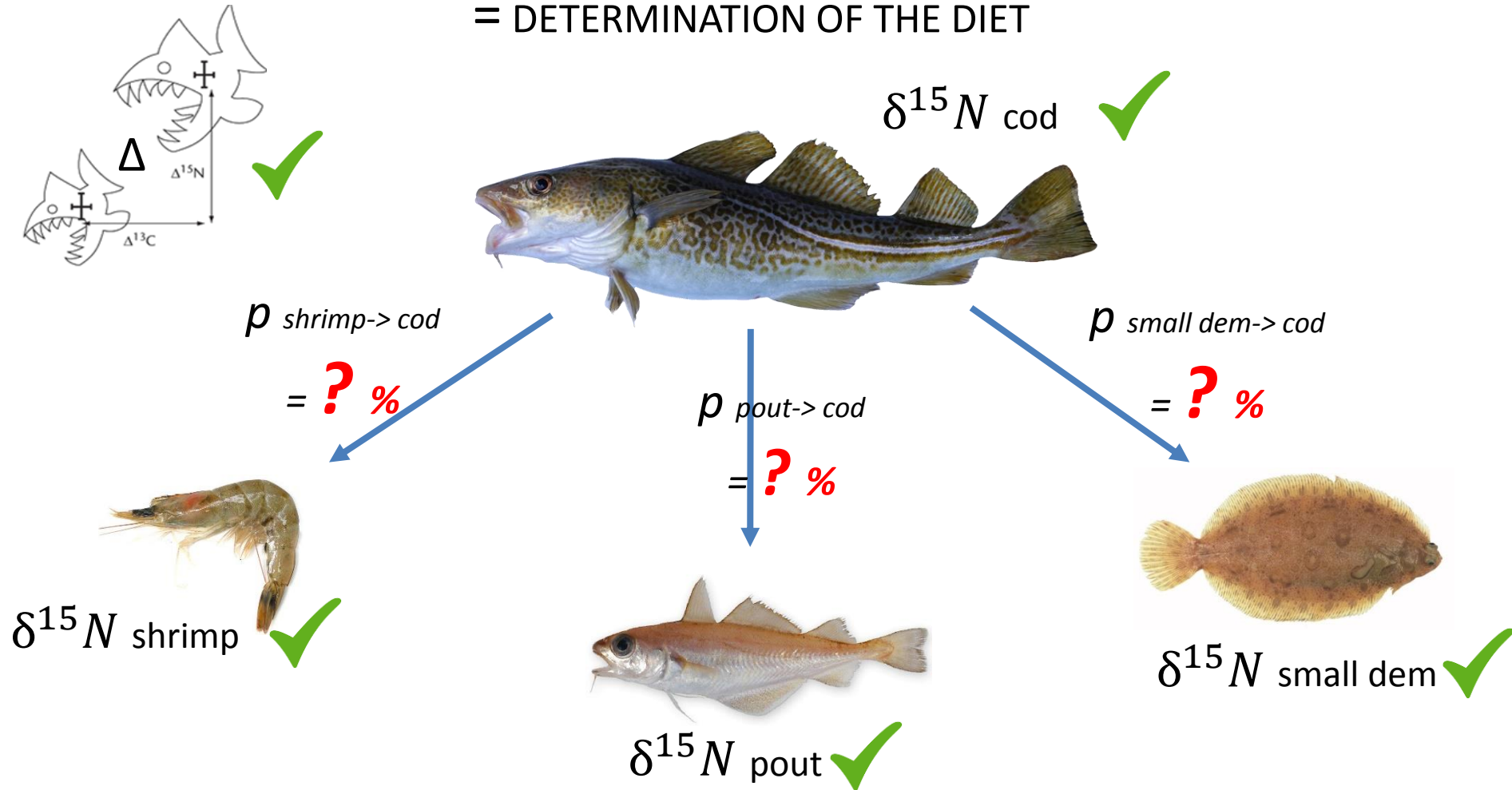
TROPHIC ENRICHMENT CONCEPT

$$\delta^{15}N_{\text{cod}} \sim 0.46 * (\delta^{15}N_{\text{shrimp}} + \Delta) + 0.19 * (\delta^{15}N_{\text{pout}} + \Delta) + 0.35 * (\delta^{15}N_{\text{small dem}} + \Delta)$$



TROPHIC ENRICHMENT CONCEPT 

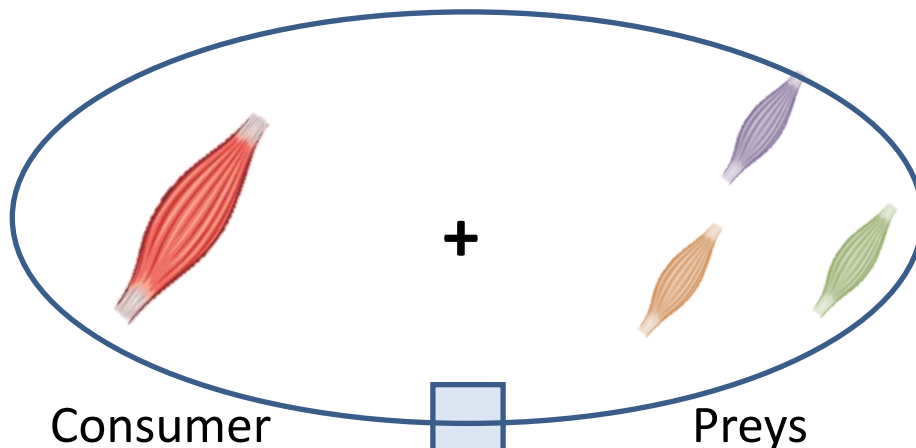
→ ISOTOPIC SIGNATURE of CONSUMER and SOURCES + TROPHIC ENRICHMENT
= DETERMINATION OF THE DIET



STABLE ISOTOPES ANALYSIS

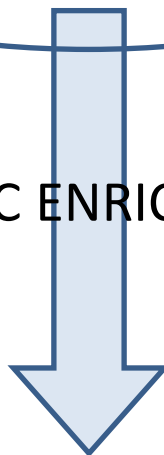


Stable isotopes concentrations

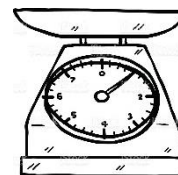
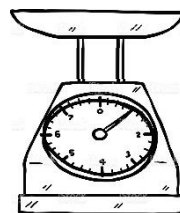
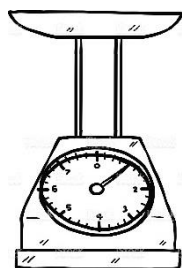


$\delta^{13}\text{C}$
&
 $\delta^{15}\text{N}$

TROPHIC ENRICHMENT

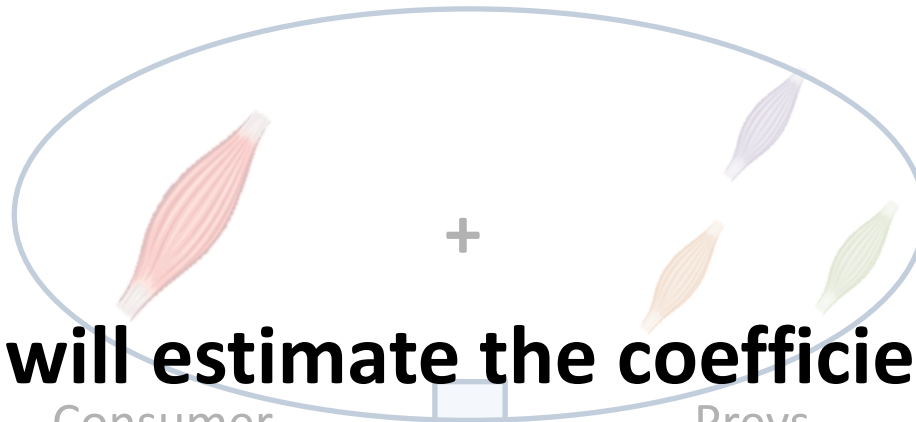


Eaten quantity of each prey type



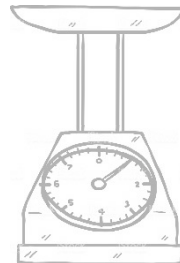
STABLE ISOTOPES ANALYSIS

Stable isotopes concentrations


 $\delta^{13}\text{C}$
 &
 $\delta^{15}\text{N}$

SIA will estimate the coefficients of the diet matrix conditionnally to the topological web

Eaten quantity of each prey type



LITERATURE...because it is still useful!



- Does the predator X eat the prey Y?
 - If we miss something!
 - Because of the temporal coverage of our SCA and SIA data
- Are there estimates of the contributions?

Qualitative or Quantitative studies?
- What about data quality?
 - Local vs Foreign
 - Recent vs Old

LITERATURE...because it is still useful!



- Does the predator X eat the prey Y?
 - If we miss something!
 - Because of the temporal coverage of our SCA and SIA data

Literature can inform on both

- Are there estimates of the contributions?
topological web and contributions

Qualitative or Quantitative studies?

- What about data quality?
 - Local vs Foreign
 - Recent vs Old

OK, SO KNOW WE CAN START MODELLING:
Building EcoDiet

Diversity of data = SIA & SCA
to couple

+

Integrate « a priori » knowledge from the literature

+

Need of taking into account uncertainty related to diet estimates



INTEGRATED BAYESIAN MODEL

=

EcoDiet

SCA

SIA

BAYESIAN NETWORK

Literature





b

STOMACH CONTENT ANALYSIS 

For each consumer: Found vs Not found

N stomachs = N « trials »

						...			Σ
	1 = success	0	1	1	0	...	1	1	= ?
	0 = fail	0	1	1	0	...	0	1	= ?
	0	0	1	0	0	...	0	0	= ?

b

STOMACH CONTENT ANALYSIS 

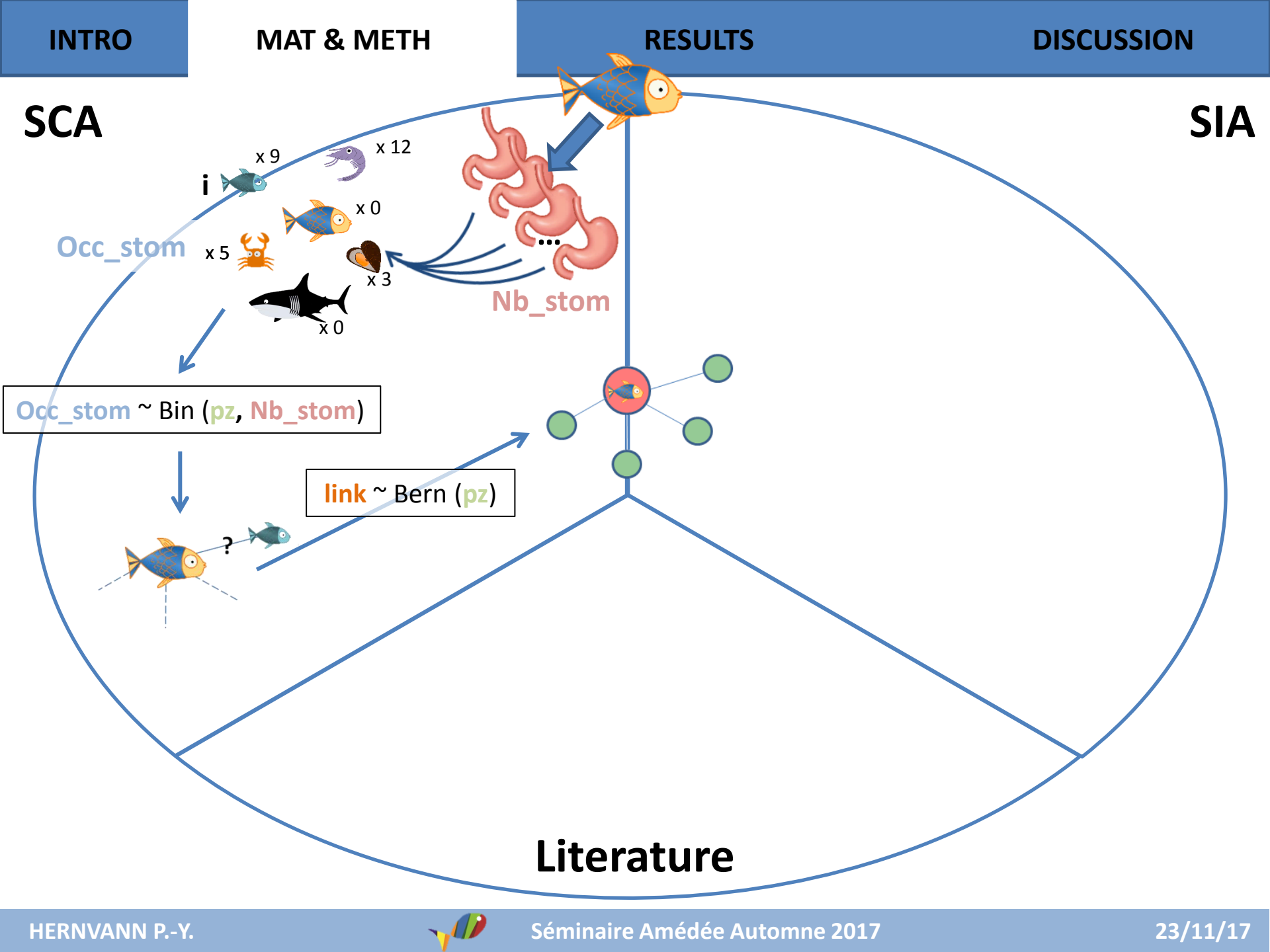
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	0	0	1	0	0	...	0	0	= ?

SCA

SIA



Occ_stom

- i x9
- x12
- x0
- x5
- x3
- x0

Nb_stom

$$\text{Occ_stom} \sim \text{Bin}(pz, \text{Nb_stom})$$

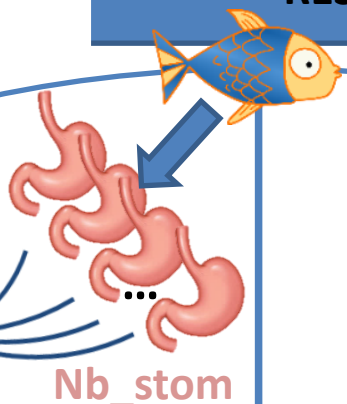
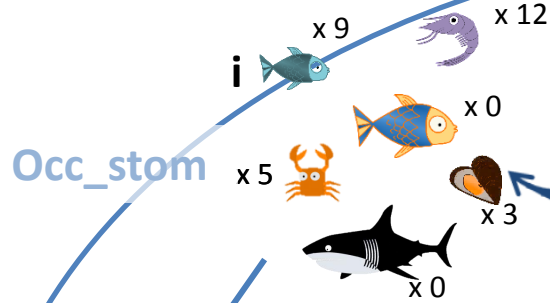
$$\text{link} \sim \text{Bern}(pz)$$

Literature

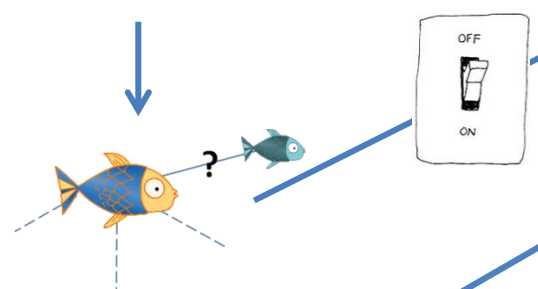


SCA

SIA



$$\text{Occ_stom} \sim \text{Bin}(pz, \text{Nb_stom})$$




Literature



STABLE ISOTOPES ANALYSIS 

- SIA module based on a pre-existing global mixing model

IsoWeb: A Bayesian Isotope Mixing Model for Diet Analysis of the Whole Food Web

Taku Kadoya , Yutaka Osada, Gaku Takimoto



- Main equations

$$X_{ij} \sim N(s_{ij}, \sigma_{ij}^2)$$

$$c_{jk_i[m]} \sim N(\Lambda_j, \tau_{jk_i[m]}^2)$$

$$s_{ij} = \frac{\sum_{m=1}^{M_i} p_{ik_i[m]} Q_{jk_i[m]} (s_{jk_i[m]} + c_{jk_i[m]})}{\sum_{m=1}^{M_i} p_{ik_i[m]} Q_{jk_i[m]}}$$

$$p_{ik_i[1]}, \dots, p_{ik_i[M_i]} \sim \text{Dirichlet}(\alpha_{i1}, \dots, \alpha_{iM_i})$$

Data:

X_{ij} = observed isotope ratio of element j in consumer i ; normally distributed with mean s_{ij} and variance σ_{ij}^2 .

$Q_{jk_i[m]}$ = observed concentration of element j in resource $k_i[m]$.

Estimated:

s_{ij} = mean of isotope ratio of element j in consumer i .

σ_{ij}^2 = residual variances of isotope ratio of element j in consumer i .

$c_{jk_i[m]}$ = trophic enrichment factor of element j for the trophic link from resource $k_i[m]$ to consumer i ($k_i[m]$ is the m th resources of consumer i).

$p_{ik_i[m]}$ = dietary proportion of resource $k_i[m]$ of consumer i .

Priors:

Λ_j and $\tau_{jk_i[m]}^2$ is the mean and variance of prior distribution


$\alpha_{i1} = \dots = \alpha_{iM_i}$ are the parameters of a Dirichlet prior



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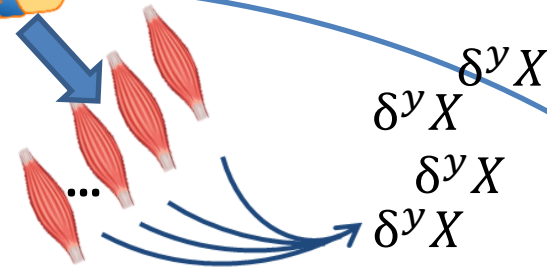
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$\alpha_{i1} = \dots = \alpha_{iM_i}$ are the parameters of a Dirichlet prior



SCA

SIA



$$\delta^y X \sim \text{Norm}(s, \sigma^2)$$

$$s_{\text{pred}} = \sum p_{\text{prey}}^* (s_{\text{prey}} + \Delta)$$

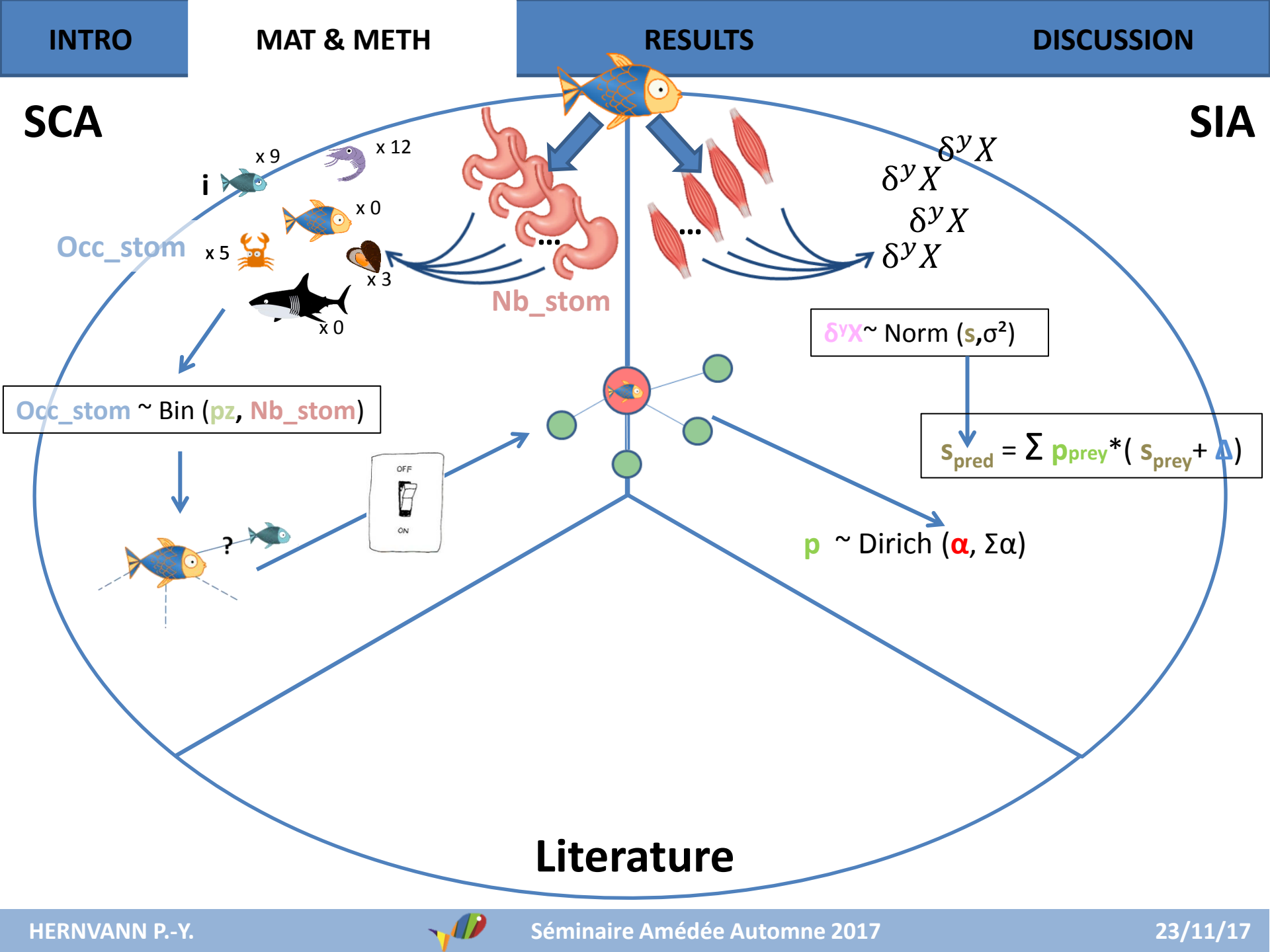
$$p \sim \text{Dirich}(\alpha, \Sigma\alpha)$$

Literature



SCA

SIA





LITERATURE - how to assess the quality of the data

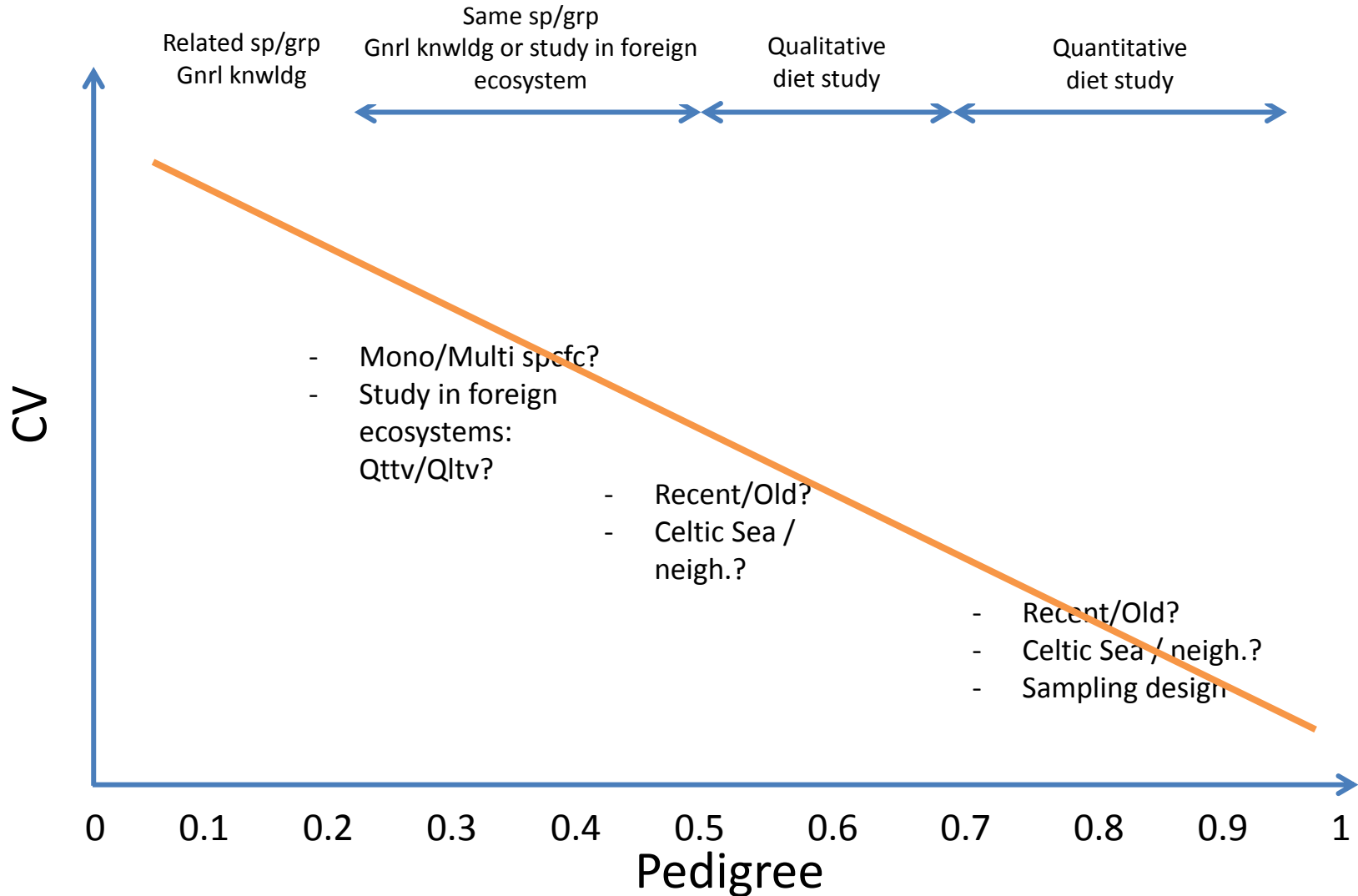
- Consistency with EwE approach: using the Pedigree scores
- = A mark ($\in [0;1]$) that decreases when the data becomes more uncertain

Parameter	Category	Description	Index	Default confidence interval (+/- %)	+ C.V.
Biomass (<i>B</i>)	1	Missing parameter (estimated by Ecopath)	0.0	n.a.	
	2	From other model	0.0	80	
	3	Guesstimates	0.0	80	
	4	Approximate or indirect method	0.4	50-80	
	5	Sampling based, low precision	0.7	40	
	6	Sampling based, high precision	1.0	10	
<i>P/B</i> and <i>Q/B</i>	1	Missing parameter (estimated by Ecopath)	0.0	n.a.	
	2	Guesstimates	0.1	90	
	3	From other model	0.2	80	
	4	Empirical relationships	0.5	50	
	5	Similar group/species, similar system	0.6	40	
	6	Similar group/species, same system	0.7	30	
	7	Same group/species, similar system	0.8	20	
	8	Same group/species, same system	1.0	10	
Diets (<i>DC</i>)	1	General knowledge of related group/species	0.0	80	
	2	From other model	0.0	80	
	3	General knowledge for same group/species	0.2	80	
	4	Qualitative diet composition study	0.5	50	
	5	Quantitative but limited diet composition study	0.7	40	
	6	Quantitative, detailed, diet composition study	1.0	30	
Catches	1	Guesstimates	0.0	>80	
	2	From other model	0.0	>80	
	3	FAO statistics	0.2	80	
	4	National statistics	0.5	50	
	5	Local study, low precision/incomplete	0.7	30	
	6	Local study, high precision/complete	1.0	10	

LITERATURE



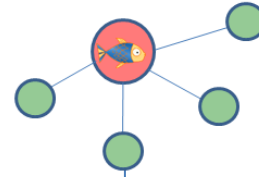
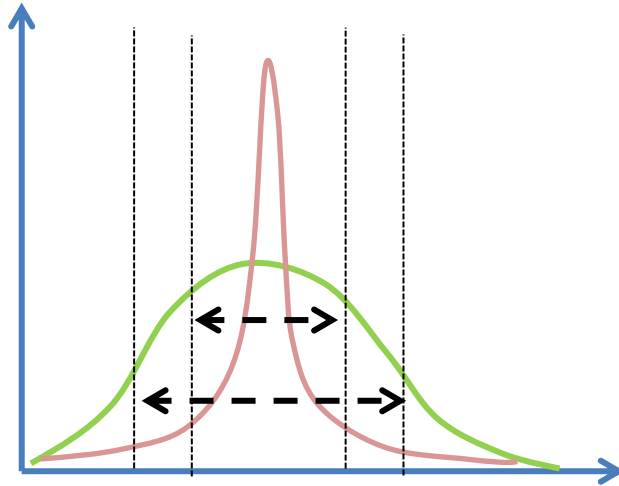
- Pedigree → a target C.V. by consumer



LITERATURE

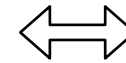


- how to assess the quality of the data

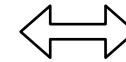


Weight Lit vs Stom:

Pedigree = 1



=



$\Sigma \sim$ Sampling size of



non informative prior :

$$pz[i,j] \sim \text{Beta}(1,1)$$



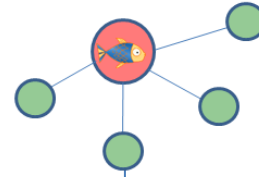
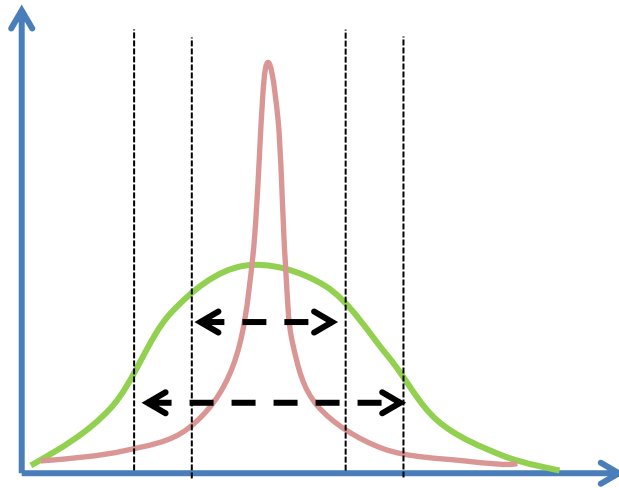
Σ



LITERATURE

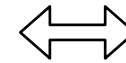


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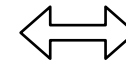


Weight Lit vs Stom:

Pedigree = 1



=



$\Sigma \sim$ *Sampling size of*



informative prior :

$$pz[i,j] \sim \text{Beta}(x,y)$$



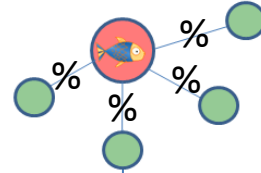
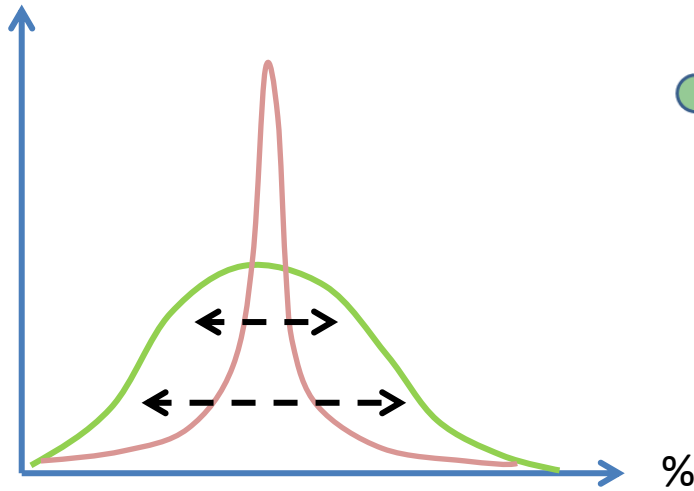
Σ



LITERATURE



- how to assess the quality of the data



	LIT1	LIT2	LIT3	

non informative prior :

$$p [i,j] \sim \text{Beta}(p_{lit},1)$$

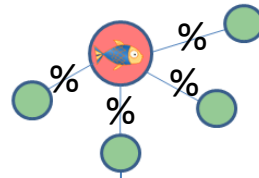
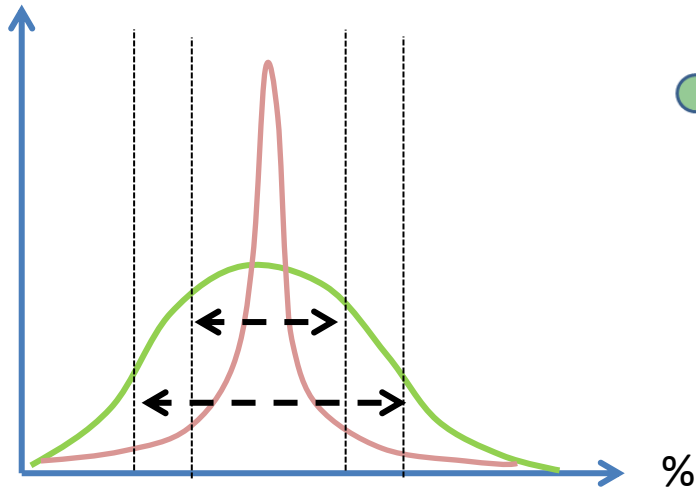
$\Sigma = \text{determined by } CV_{pedigree}$





LITERATURE

- how to assess the quality of the data



	LIT1	LIT2	LIT3	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	
	orange	red	green	

informative prior :

$$p [i,j] \sim \text{Dirich}(\alpha[i,j], \underbrace{\sum \alpha[i,.,)}_{\Sigma})$$

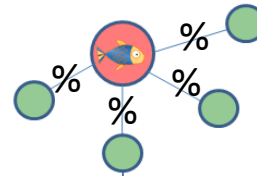
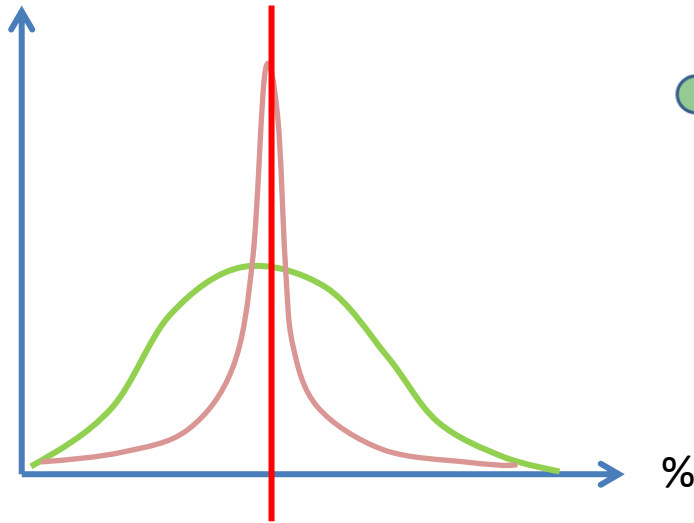
$\Sigma = \text{determined by } CV_{pedigree}$



LITERATURE



- how to assess the quality of the data



	LIT1	LIT2	LIT3	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	
	Orange	Red	Green	

informative prior :

$$p [i,j] \sim \text{Beta}(\alpha[i,j], \sum \alpha[i,])$$

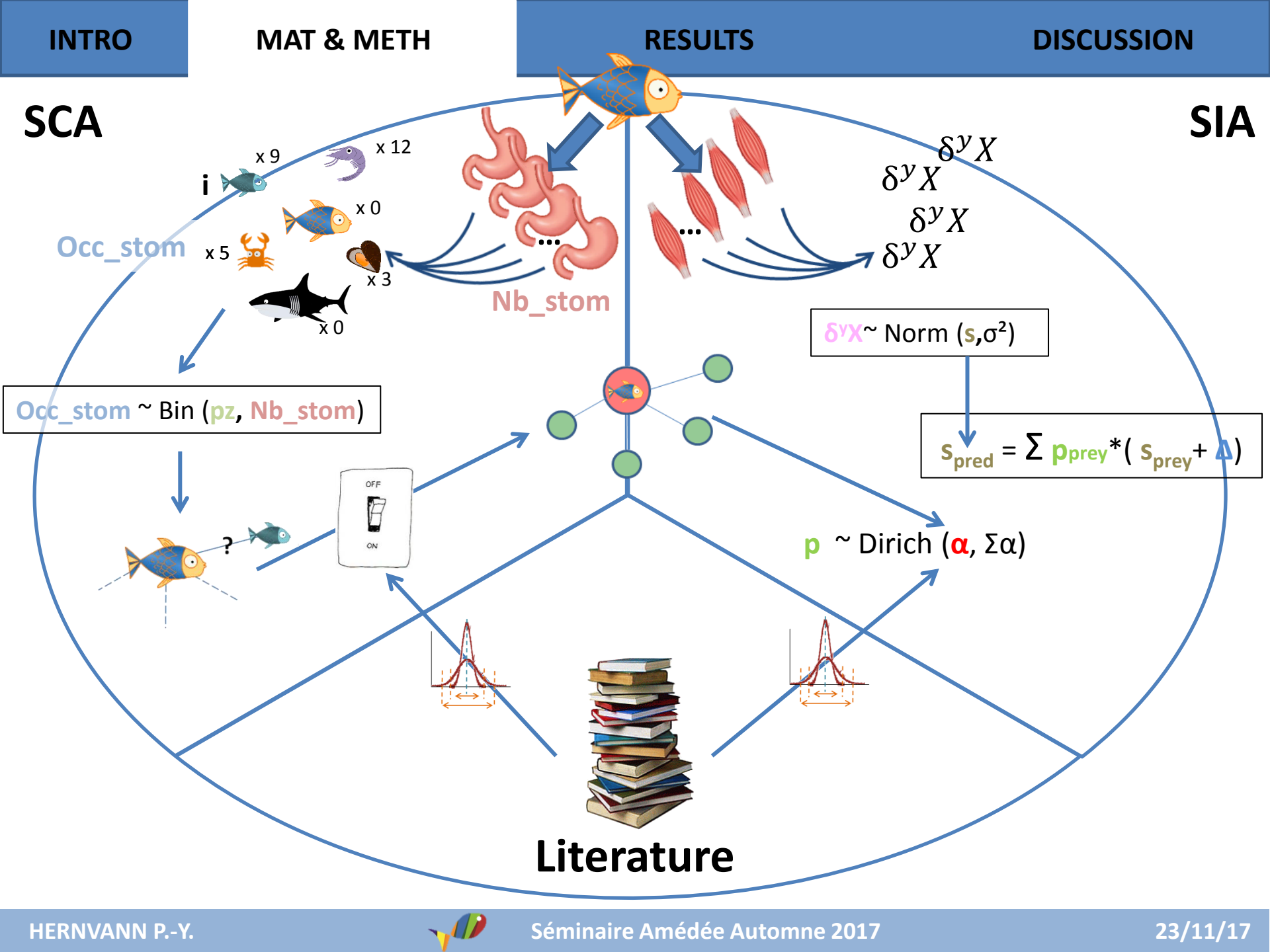
$$\alpha[i,j] / \sum \alpha[i,]$$

\sum = determined by $CV_{pedigree}$



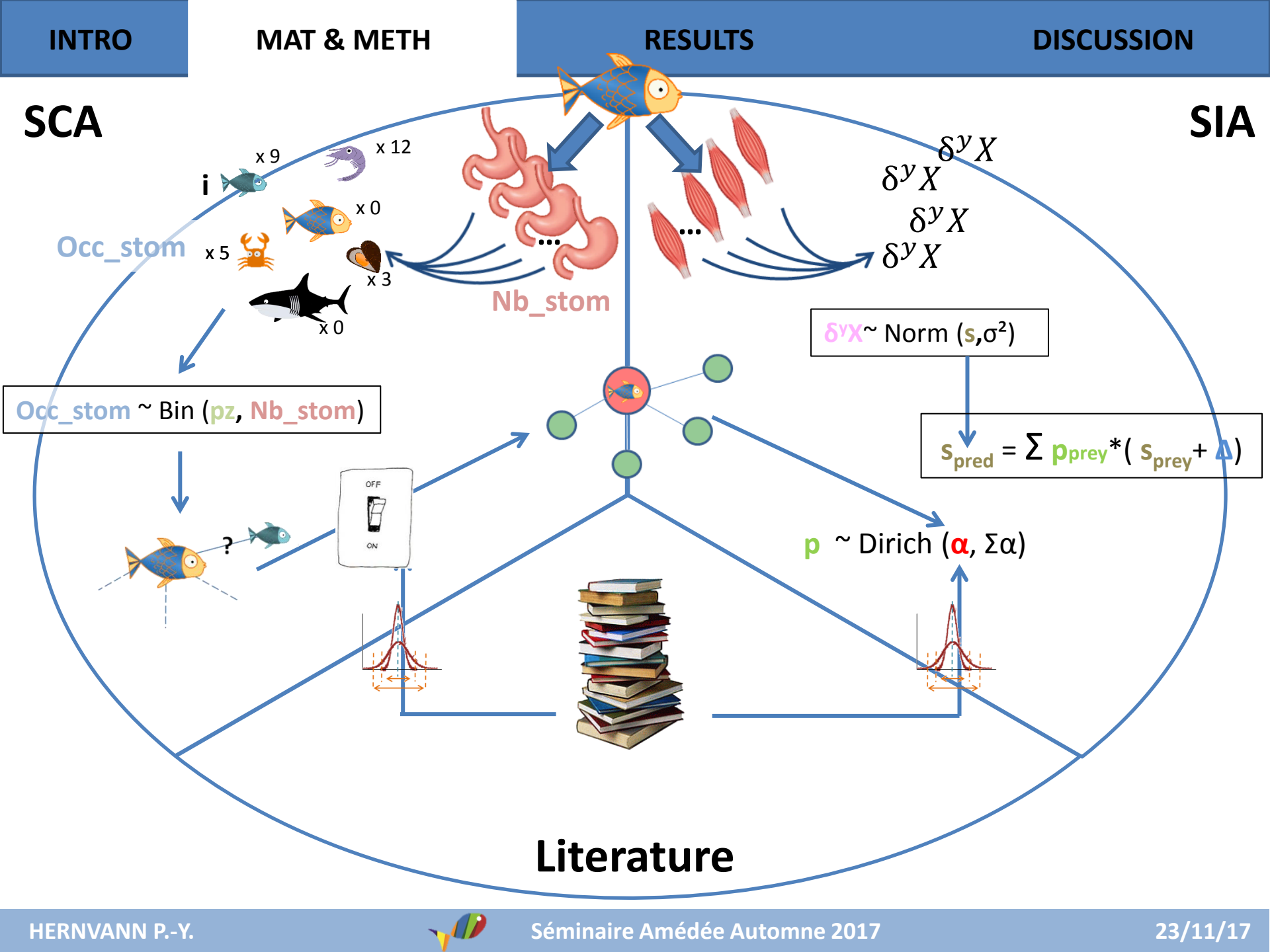
SCA

SIA

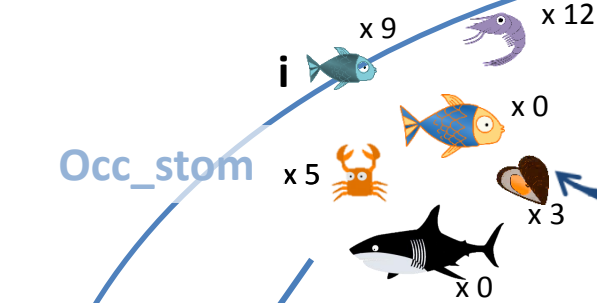


SCA

SIA



Occ_stom



Nb_stom

$\delta^y X$
 $\delta^y X$
 $\delta^y X$

$$\delta^y X \sim \text{Norm}(s, \sigma^2)$$

$$\text{Occ_stom} \sim \text{Bin}(p_z, \text{Nb_stom})$$

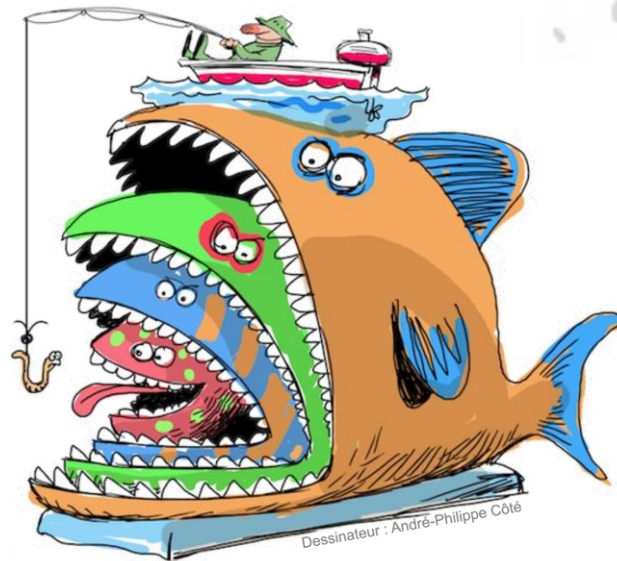
$$s_{\text{pred}} = \sum p_{\text{prej}}^* (s_{\text{prej}} + \Delta)$$

$$p \sim \text{Dirich}(\alpha, \Sigma \alpha)$$

Literature

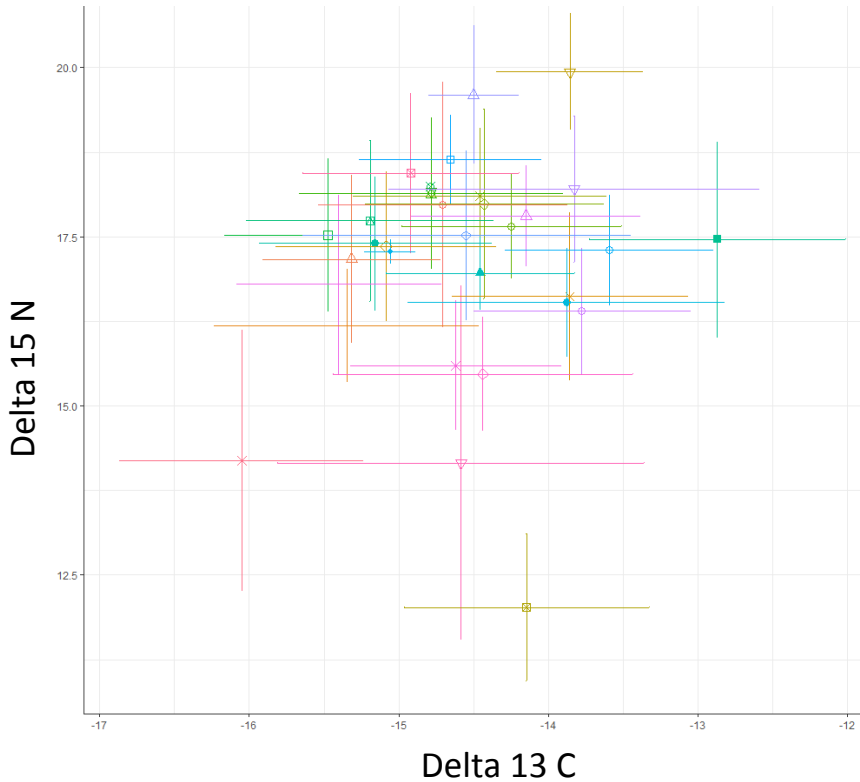


(first)
RESULTS



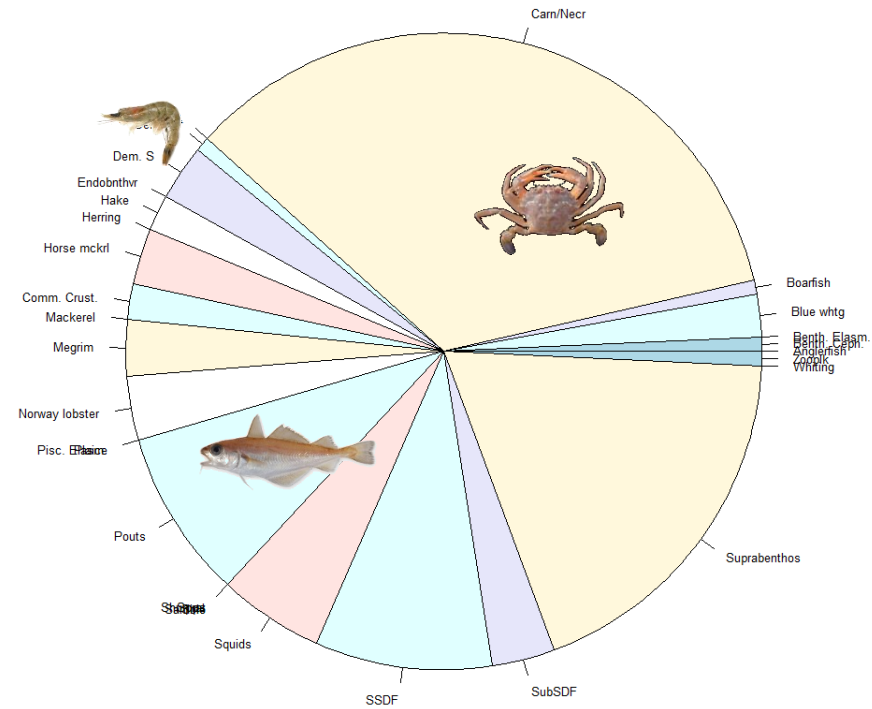
« EASY » RESULTS

SIA for all trophic groups



(Data prep.: baseline correction)

SCA for one species: cod



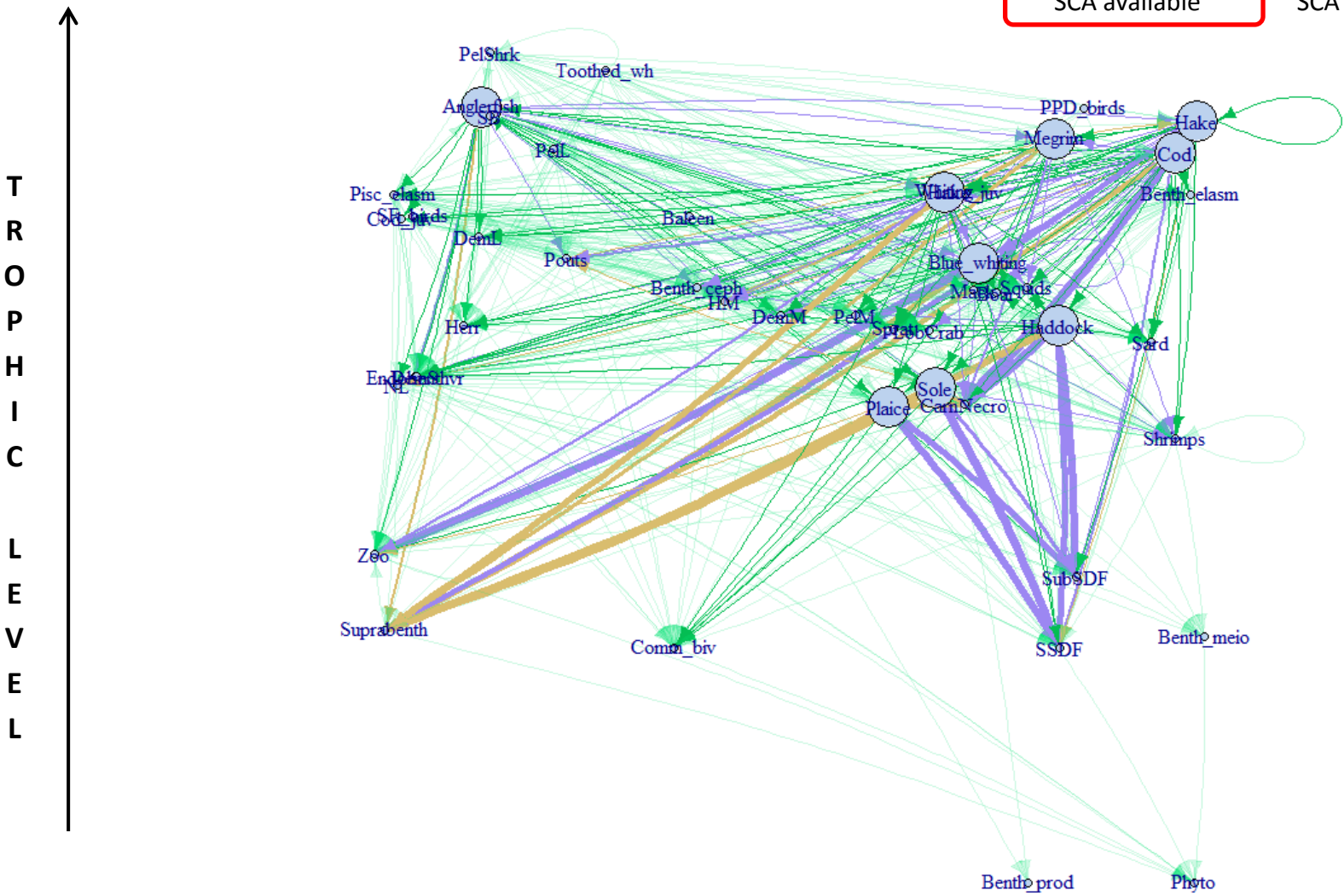
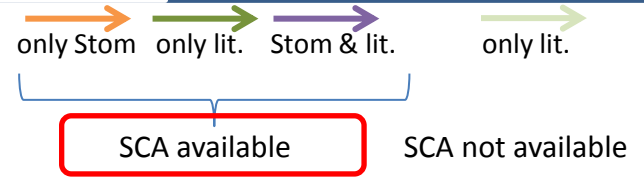
/!\ Occurrences of each prey in separated stomachs

(Data prep.: reassignment of undet. grp)



FIRST RUN OF EcoDiet ON BOTH SIA & SCA DATA IN THE CELTIC SEA

TOPOLOGICAL FOOD-WEB

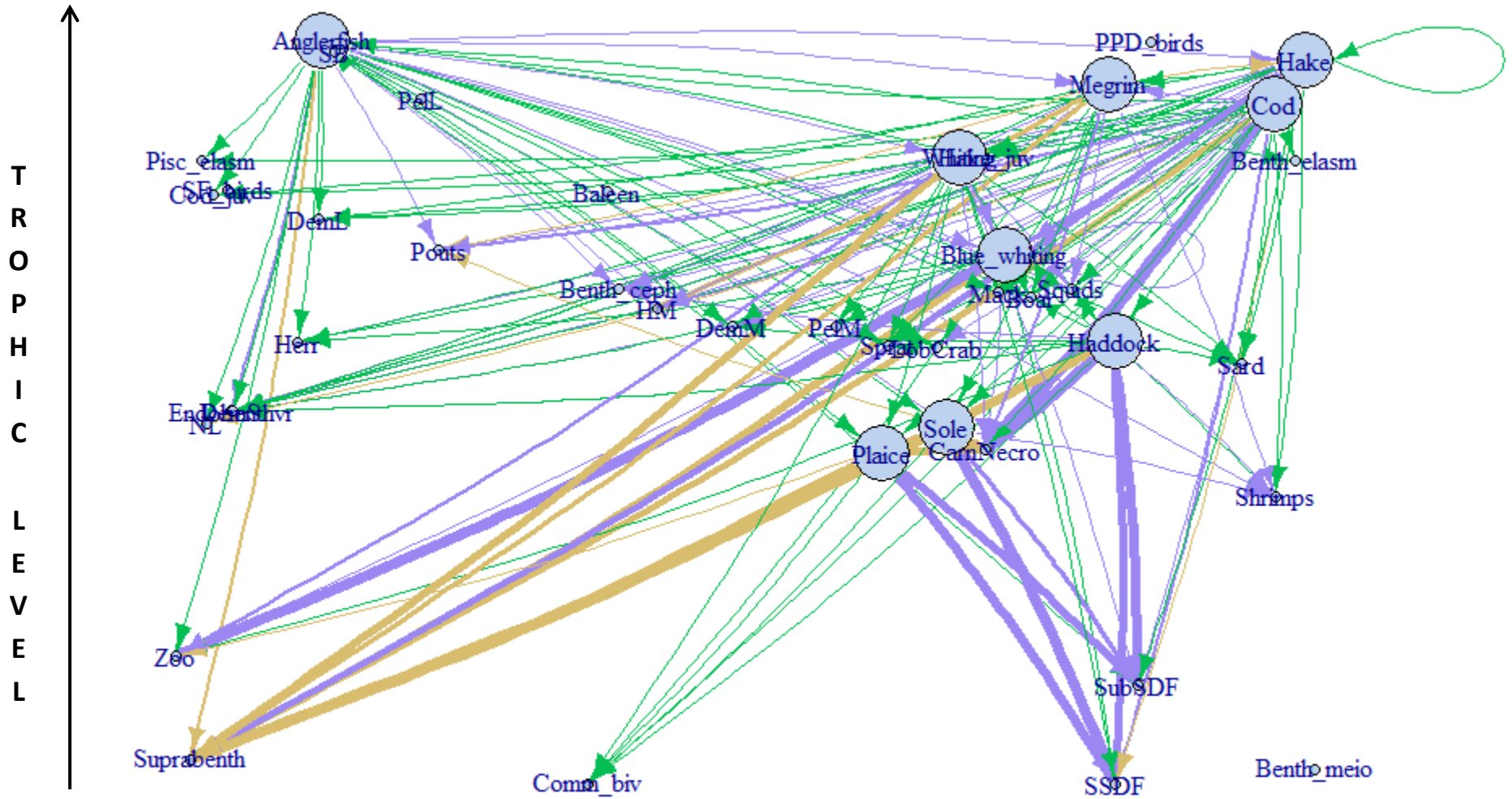


(Width is proportional to the probability that a link exist between two groups)



TOPOLOGICAL FOOD-WEB deduced by SCA

→ only Stom
→ only lit.
→ Stom & lit.



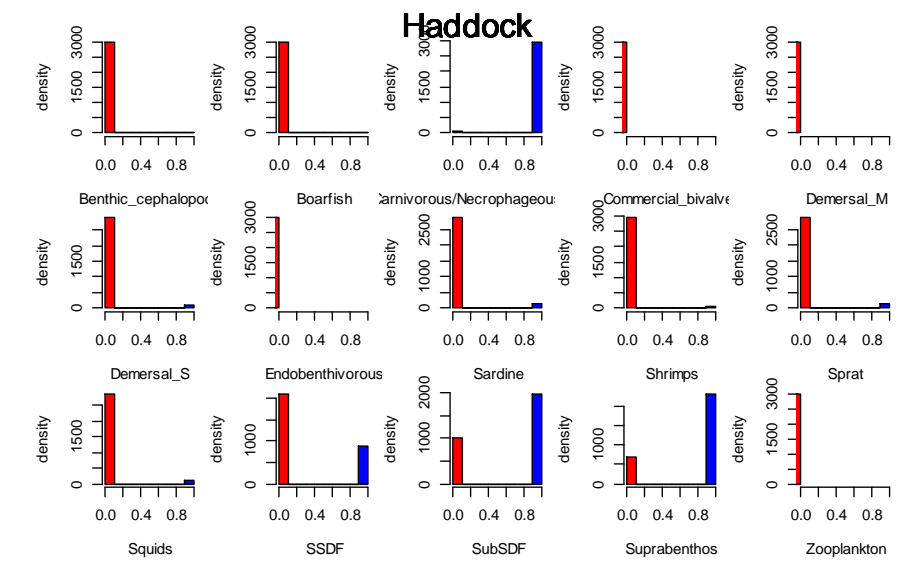
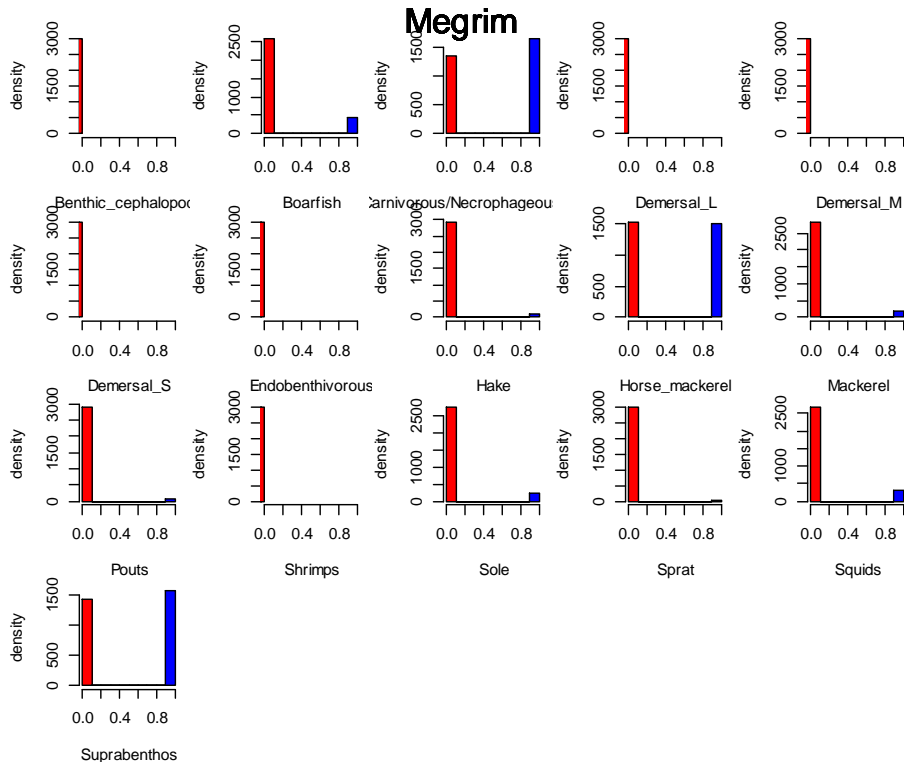
(Width is proportional to the probability that a link exist between two groups)



TOPOLOGICAL FOOD-WEB

Take back posteriors of the several parameters

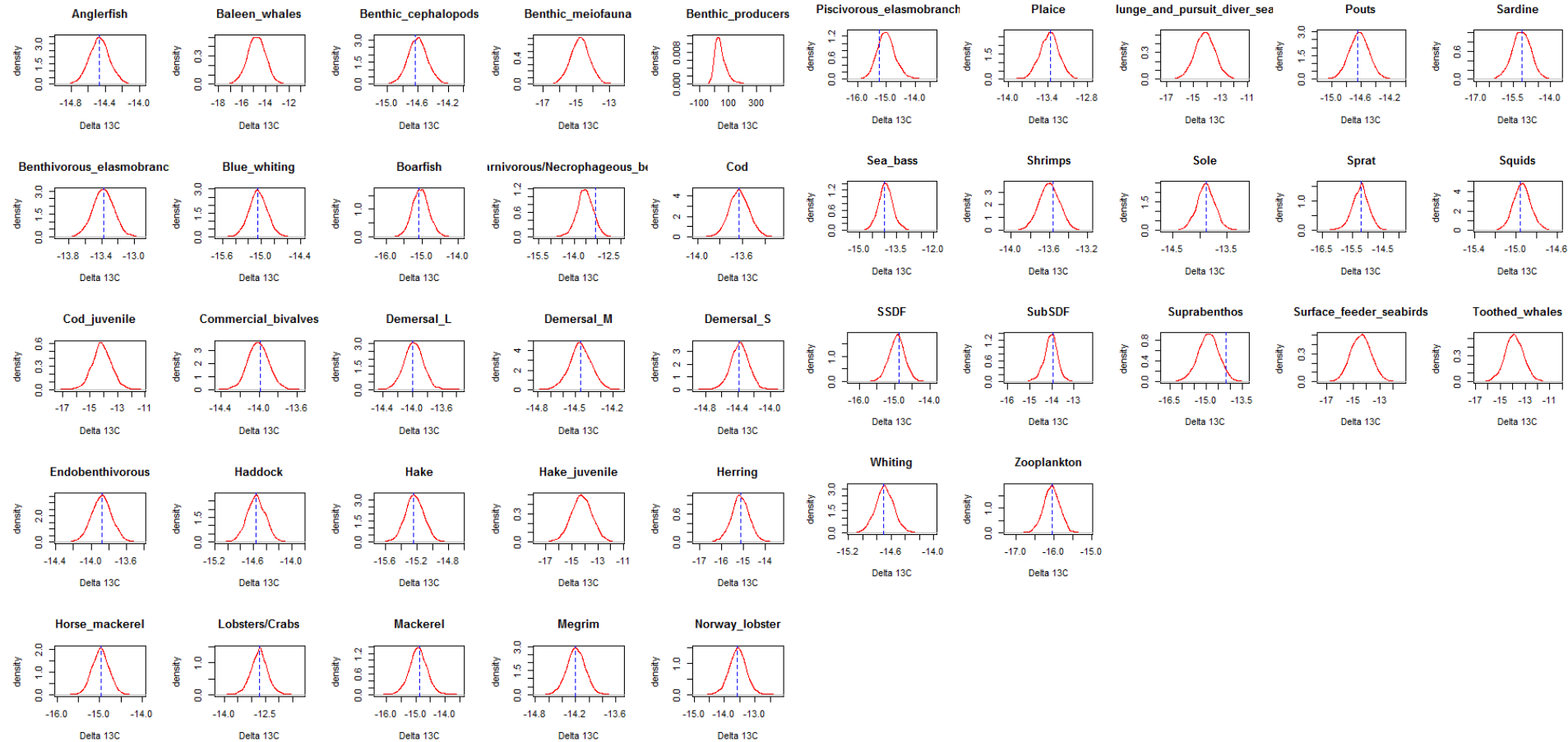
« SWITCHER »



STABLE ISOTOPES MODULE

Take back posteriors of the several parameters

ISOTOPIC SIGNATURES

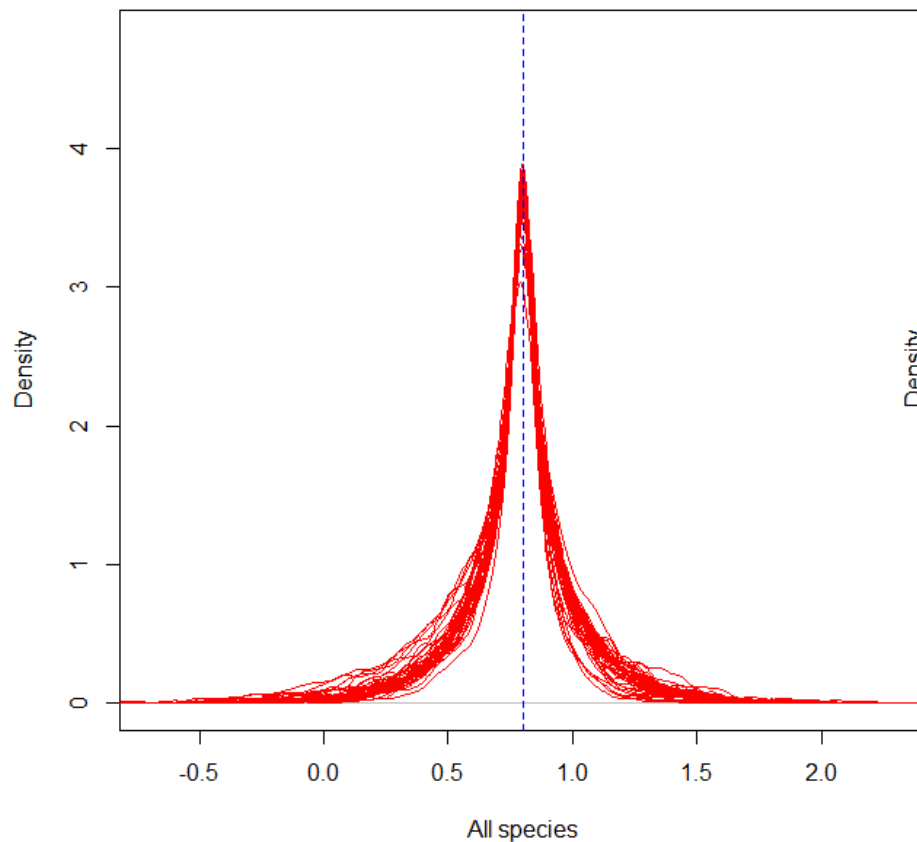


STABLE ISOTOPES MODULE

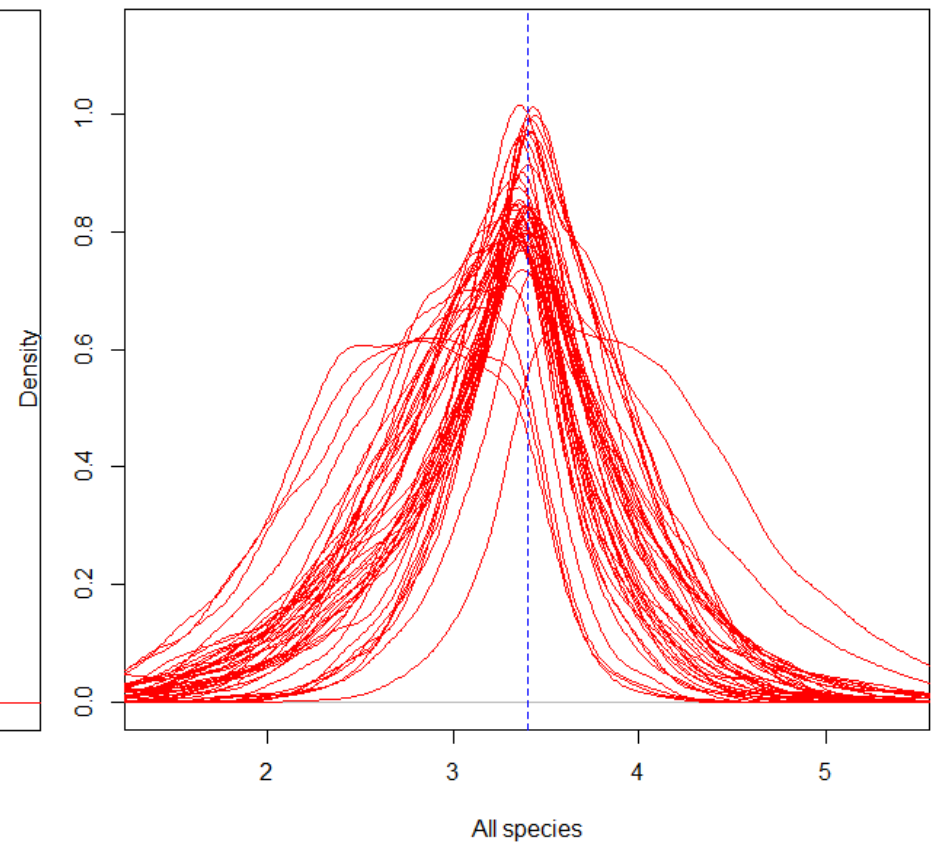
Take back posteriors of the several parameters

TROPHIC ENRICHMENT

Carbon trophic enrichment



Nitrogen trophic enrichment

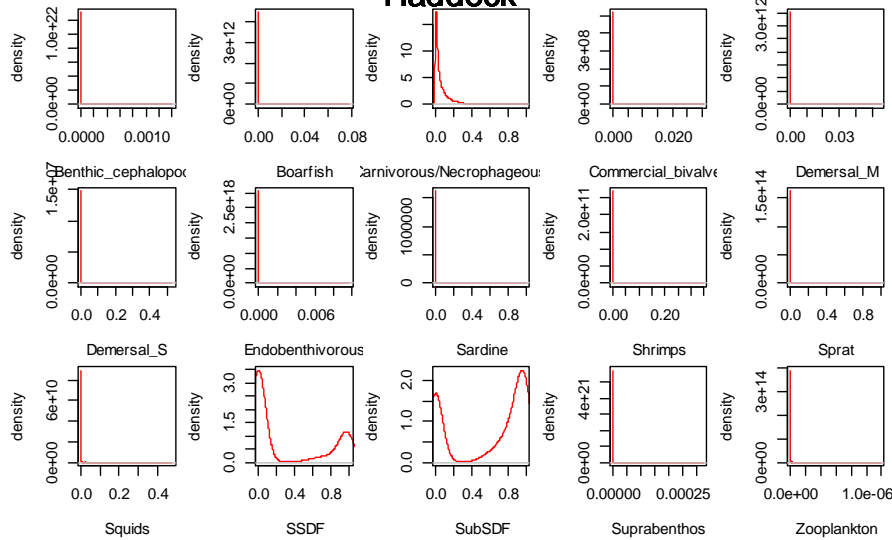


STABLE ISOTOPES MODULE

Take back posteriors of the several parameters



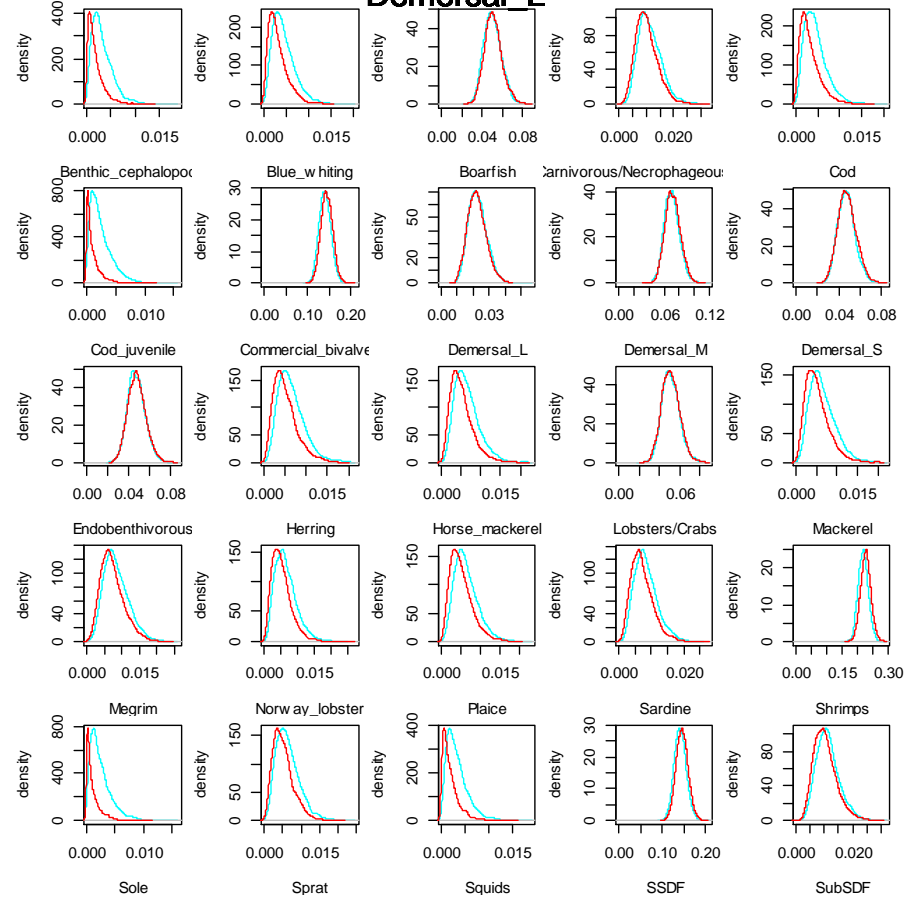
Haddock



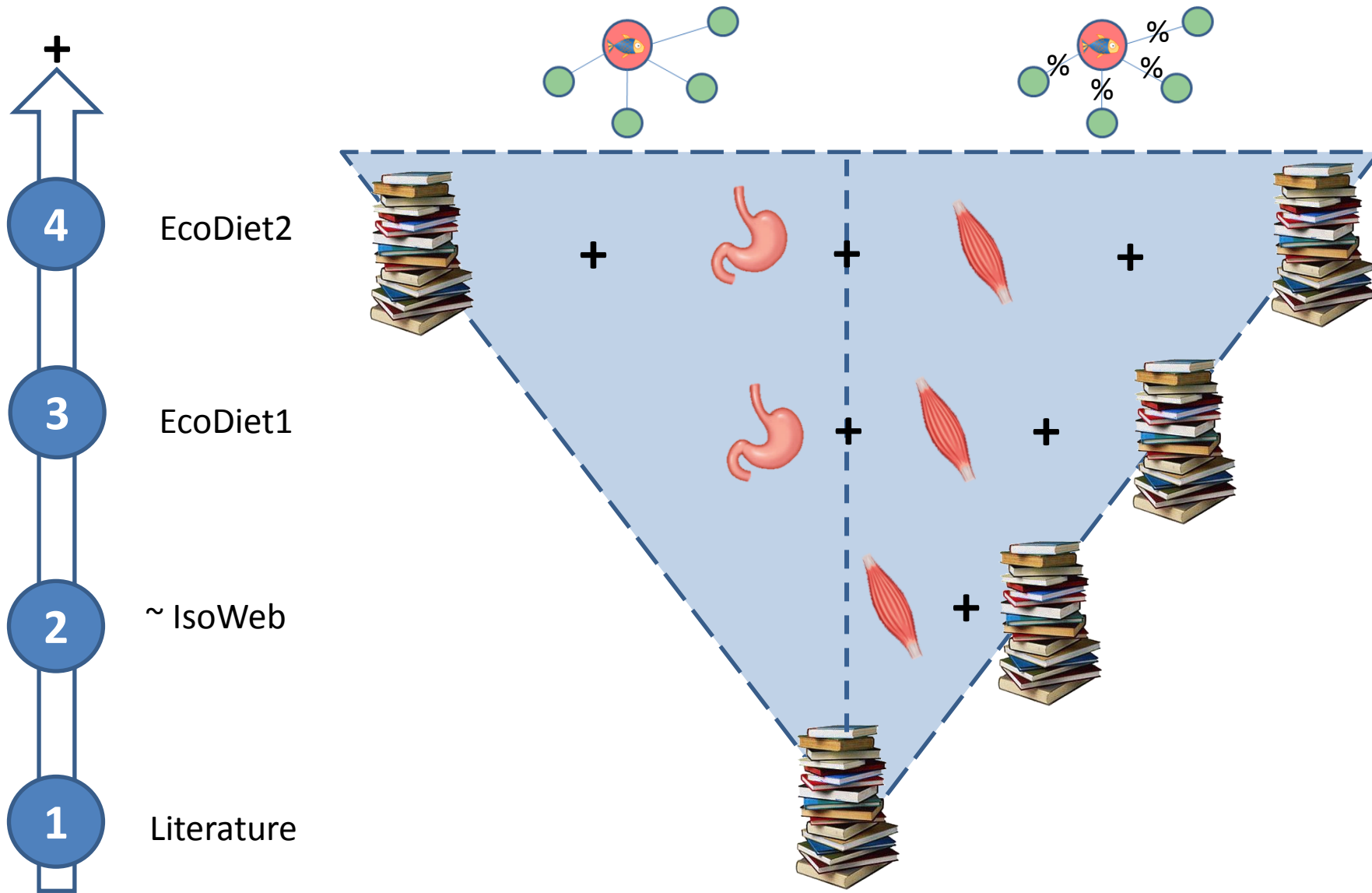
CONTRIBUTIONS



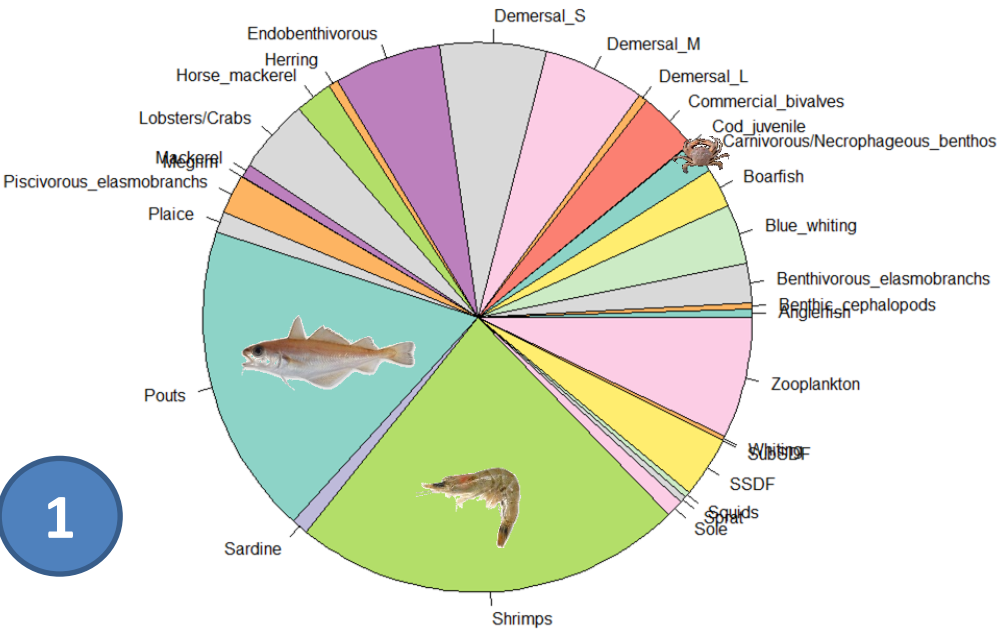
Demersal L



COMPARING THE RESULTS - Strategic design



A NEW VISION OF DIETS IN THE CELTIC SEA – the cod case



1

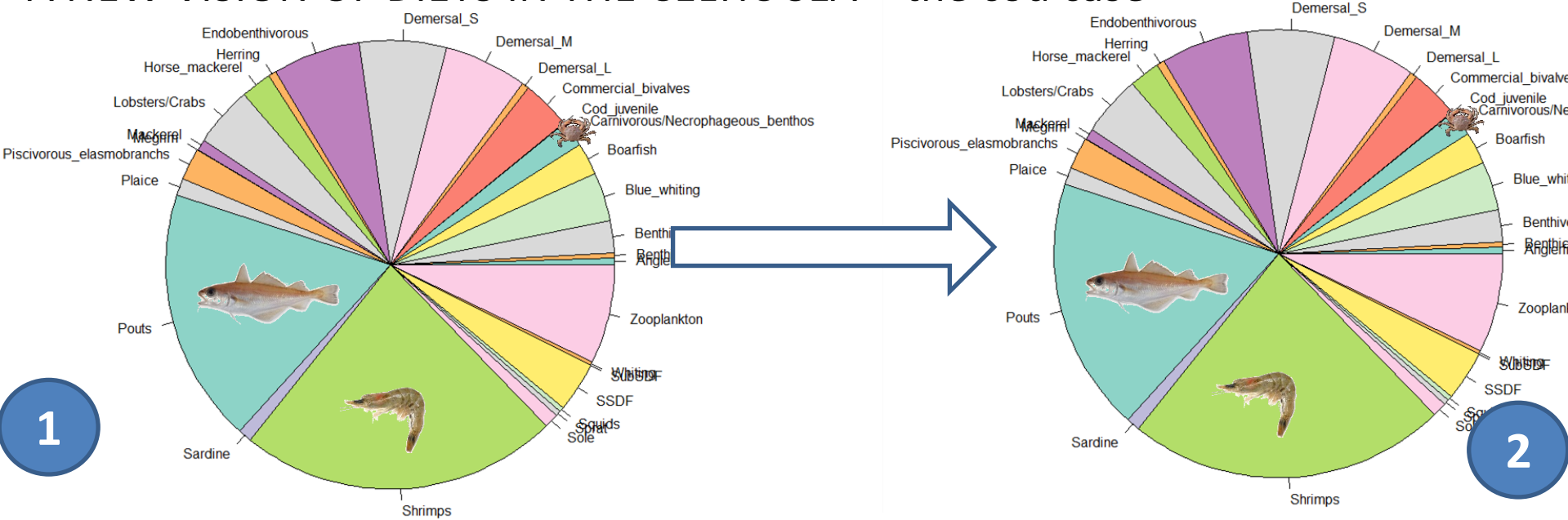
2

4

3



A NEW VISION OF DIETS IN THE CELTIC SEA – the cod case



1

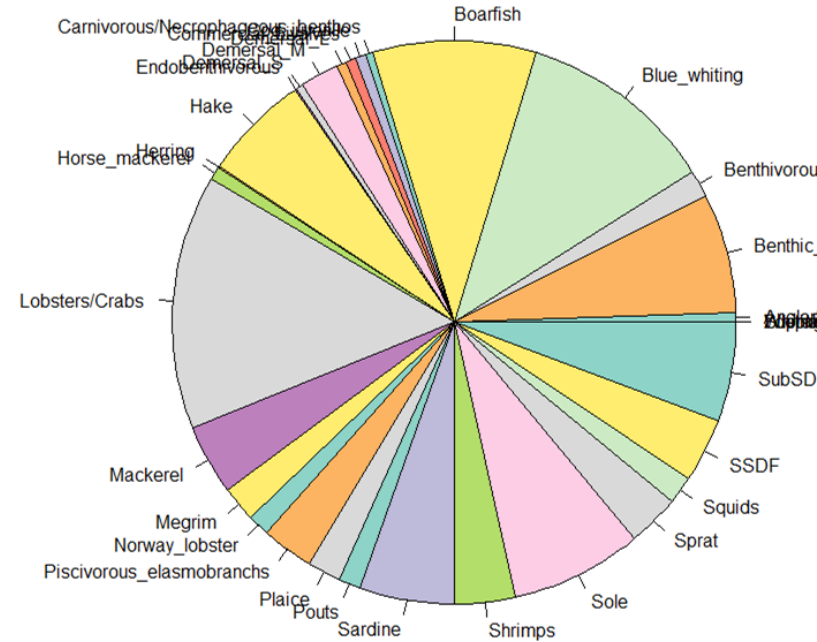
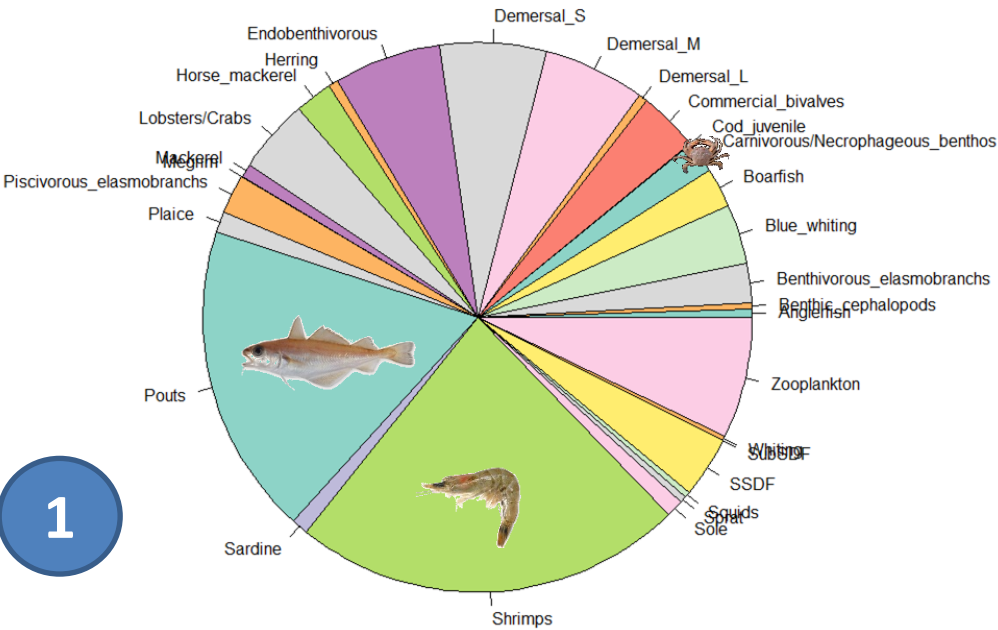
2

4

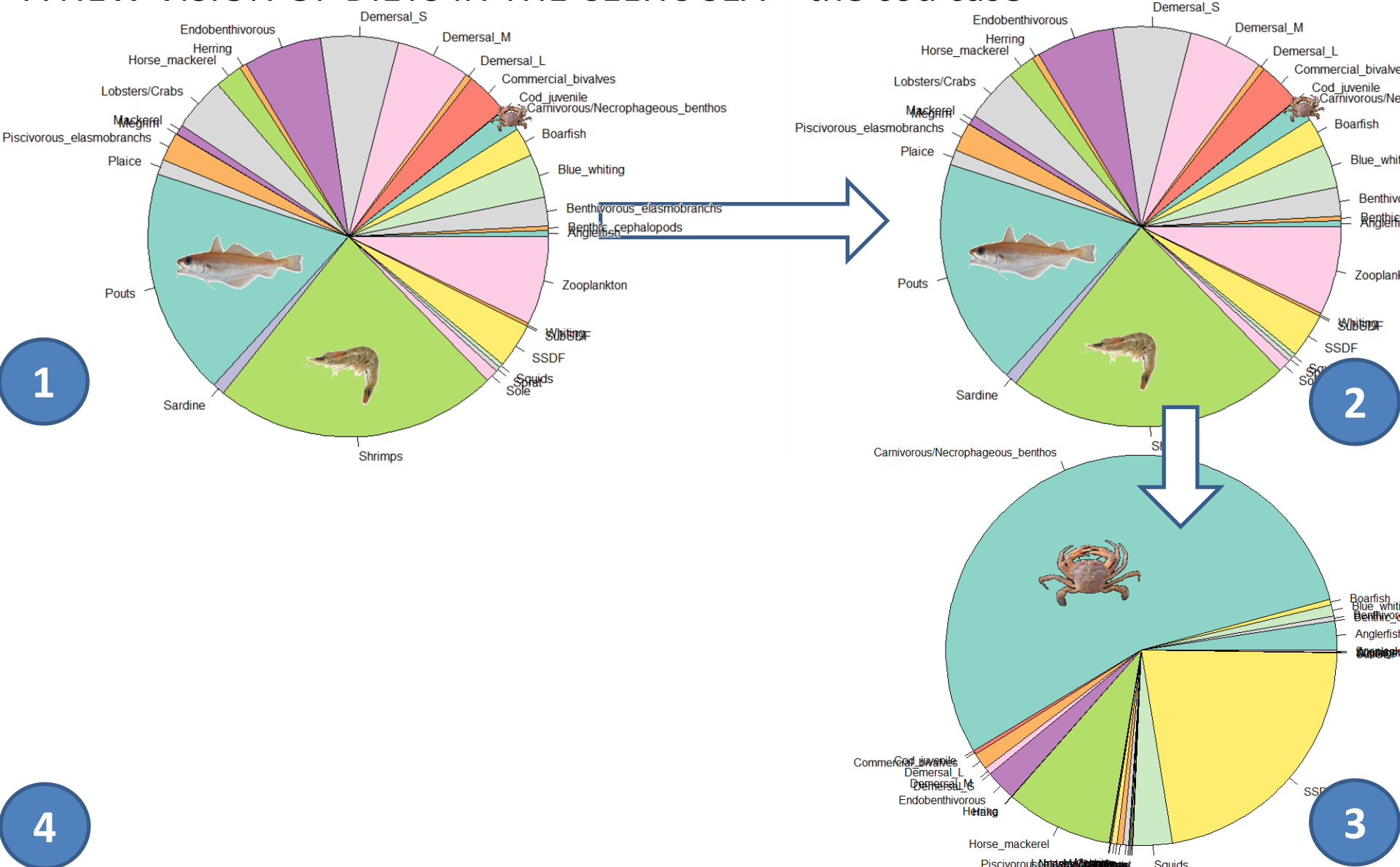
3



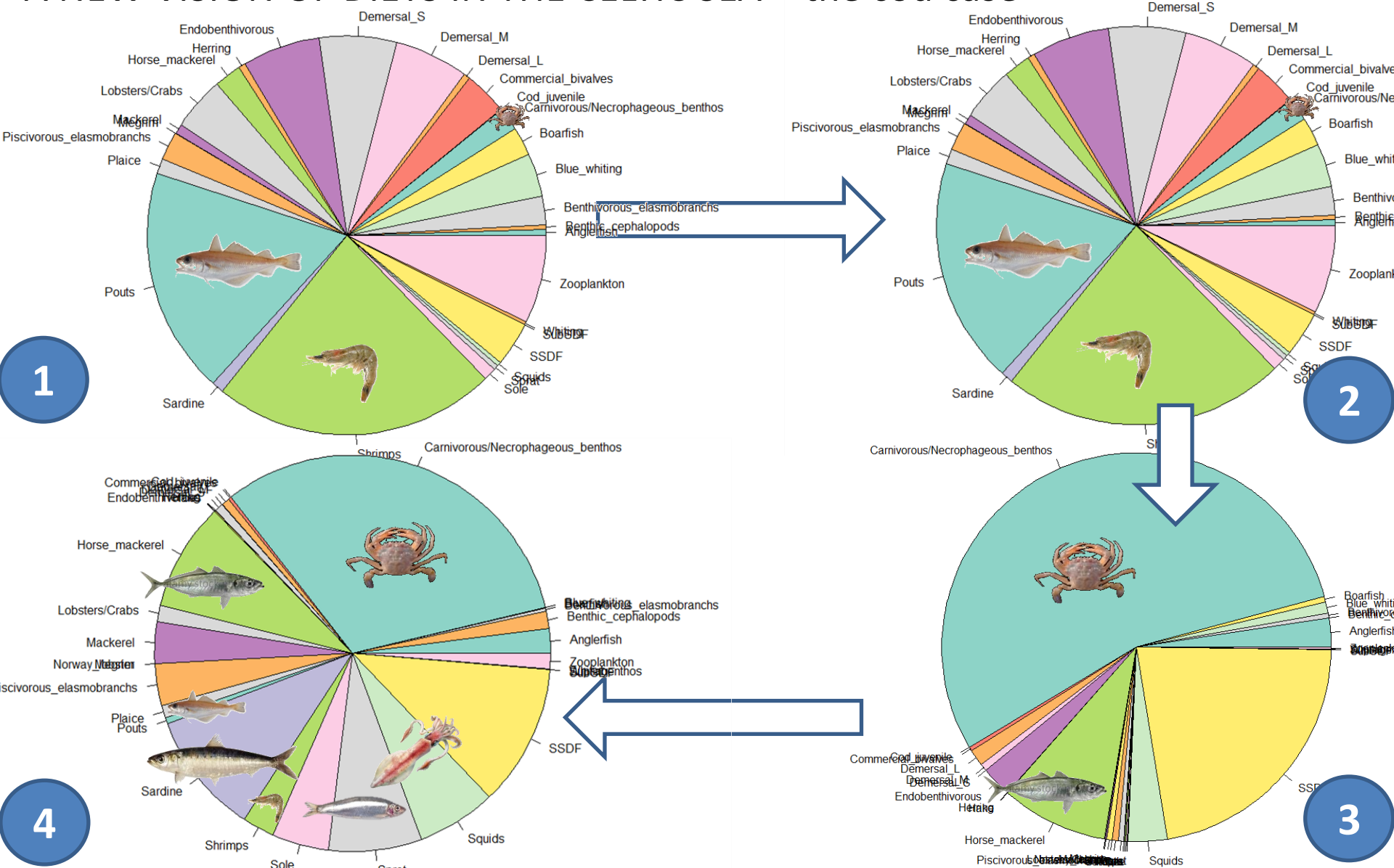
A NEW VISION OF DIETS IN THE CELTIC SEA – the cod case



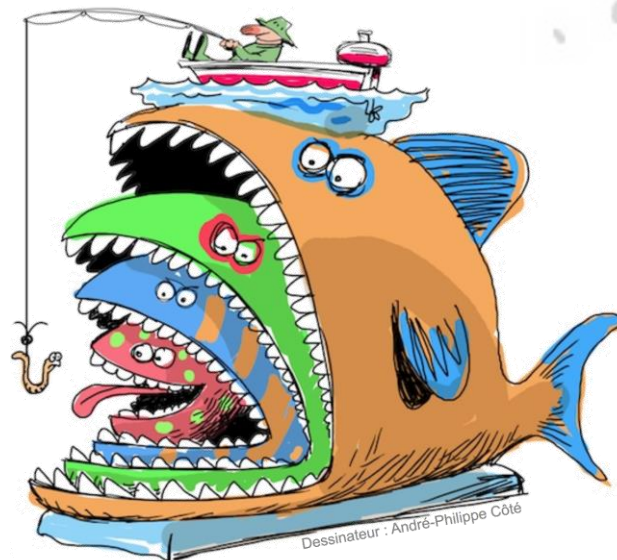
A NEW VISION OF DIETS IN THE CELTIC SEA – the cod case



A NEW VISION OF DIETS IN THE CELTIC SEA – the cod case



DISCUSSION



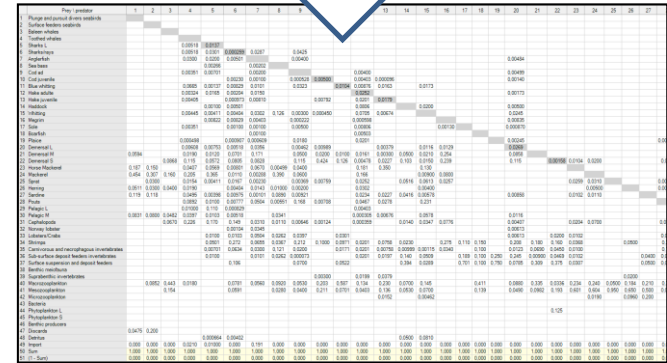
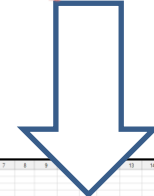
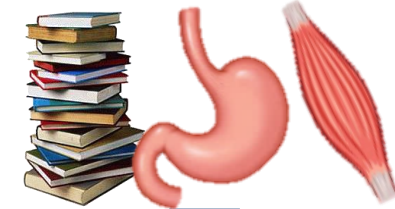
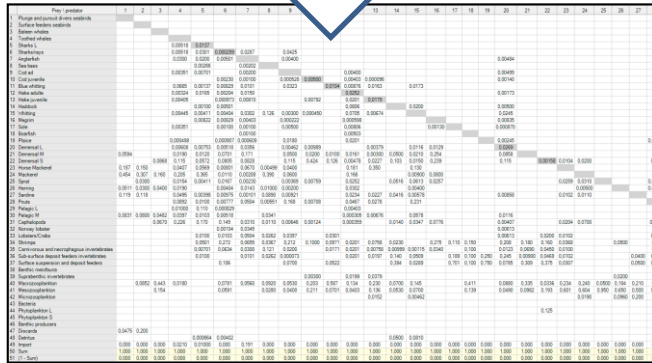
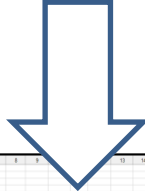
STILL TO DO

- Inclusion of final a « Pedigreed » diet matrix as prior
- Remove variation for the trophic enrichment factor
- Sensitivity analysis on data pretreatment of SIA & SCA

ABOUT EcoDiet

- EcoDiet: an innovative integrated model to couple both SCA and SIA...
....and literature data
- Main strengths:
 - SCA as occurrences = less time-consuming
 - Distinction between preys with similar isotopic signatures
 - Better estimates of contributions since it artificially decrease the number of potential preys
- Promising results: new vision of trophic functioning in the Celtic Sea

Perspectives



???

