Diet is correlated with otolith shape in marine fish

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Abstract :

Previous studies have shown that food amount influence fish otolith structure, opacity and shape and that diet composition has an effect on otolith chemical composition. This study investigated the potential correlation between diet and otolith shape in 5 wild marine fish species by addressing 4 complementary questions. First, is there a global relationship between diet and otolith shape? Second, which prev categories are involved in this relationship? Third, what are the respective contributions of food quantity and relative composition to diet-otolith shape co-variation? Fourth, is diet energetic composition related to otolith shape? For each species, we investigated how otolith shape varies with diet. These questions were tackled by describing diet in the analysis in 4 different ways, while also including individual-state variables to remove potential confounding effects. First, besides the strong effect of individual-state, a global relationship between diet and otolith shape was detected for 4 out of 5 fish species. Second, both main and secondary prey categories were related to variability in otolith shape. Otolith outline reconstructions revealed that both otolith global shape and its finer details co-varied with these prey categories. Third, the contribution of relative diet composition to diet-otolith shape co-variation was much higher than that of ingested food quantity. Fourth, the energetic composition of diet was related to otolith shape of only one species. These results suggest that diet in marine fish species may influence the quantity and composition of saccular endolymph proteins which play an important role in otolith biomineralization and their resulting 3D structure.

Keywords : Ellipitic Fourier analysis, English Channel, Interspecific, Morphometric analysis, Otolith growth, Saccular otolith, Stomach contents

49 Introduction

Otoliths are calcified structures found in the inner ear of teleostean fish. They are organised 50 into 3 pairs and assist with auditory and balance functions of fish. They are critical tools in 51 fisheries science and management. Their structure allows aging individual fish and determining 52 population age structure for stock assessment (e.g. Worthington et al. 1995, Caldow & 53 Wellington 2003). Their morphology can be used for individual assignment to (sub-54)populations and to infer population structure (e.g. Castonguay et al. 1991, Stransky et al. 2008). 55 The *sagittae* (the most studied otolith pair because of their large size) are mainly composed of 56 calcium carbonate in aragonite form deposited on an organic matrix which represents 0.1 to 57 10% of total material (Degens et al. 1969). The organic matrix, although present in minute 58 amounts in otoliths, is thought to play a key role in its formation as in all biomineralization 59 processes (Nagasawa 2013). Biomineralization of the sagittal otolith (referred to as "otolith" 60 hereafter) is an acellular process that takes place in the saccule (otic sac). Otoliths grow by 61 accretion and precipitation of organic and ionic precursors contained in the saccular endolymph 62 in which they are bathing. Otolith biomineralization is therefore totally dependent on the 63 endolymph composition and precursors that are either synthesized (organic) or transported 64 (ionic) by secretory cells and ionocytes, respectively, belonging to the saccular epithelium 65 (Pavan et al. 2004). Moreover, the spatial distribution of these cells in the saccular epithelium 66 induces concentration gradients of both ions and organic precursors in the endolymph that are 67 involved in otolith biomineralization processes (Pisam et al. 1998, Payan et al. 1999, Borelli et 68 al. 2001). 69

Otolith biomineralization results from multi-causal processes due to the interaction of many internal (physiological) and external (environmental) factors (Allemand et al. 2007), which generates high morphological variability in otolith shape at both intra- and inter-specific level. First, otolith shape is species-specific (Tuset et al. 2006), reflecting genetic determinism
(L'Abée-Lund 1988, Vignon & Morat 2010).

Second, factors or processes acting on fish metabolism and physiology have an impact on 75 otolith morphology, such as ontogenetic development (size: Hüssy, 2008 and age: Castonguay 76 et al. 1991, sexual maturation (Mérigot et al. 2007) or sex (Castonguay et al. 1991, Bolles & 77 Begg 2000). Third, environmental factors such as water temperature produce otolith growth 78 variation and thus shape variability (Cardinale et al. 2004). Food quantity can also impacts 79 otolith shape both directly and indirectly. It has an indirect effect on global otolith shape through 80 its effect on otolith growth and a direct effect on otolith crenation (Gagliano & McCormick 81 82 2004, Cardinale et al. 2004, Hüssy 2008).

Consequences of fish nutrition on otolith structure and growth, especially the impact of 83 starvation or food restriction and satiation, have been well studied (Molony & Choat 1990, 84 85 Molony & Sheaves 1998, Hüssy & Mosegaard 2004, Fernandez-Jover & Sanchez-Jerez 2015). A decrease in the otolith increments' width and thus in otolith growth was observed after 86 87 reduced feeding periods (Massou et al. 2002). More translucent otolith material is deposited in response to severe (long period and low ration) food restriction, which can lead to otolith 88 structural discontinuities that do not conform to the seasonal opaque and translucent layers of 89 annuli (Høie et al. 2008), referred to as "checks" (Panfili et al. 2002). Such changes in opacity 90 are the consequences of variation in the composition of inorganic and organic otolith 91 compounds (Jolivet et al. 2013) and precursors. A starvation period leads to change in blood 92 plasma composition, which generates a decrease in the acid-base equilibrium in the saccular 93 94 endolymph and thus, induces a reduction of aragonite precipitation rate. As a consequence, a reduction of daily growth rate due to starvation could be observed even if calcium concentration 95 was not affected (Payan et al. 1998). Concerning the organic precursors, only the protein 96 «Factor Retarding Crystallization» (FRC) concentration decreases during starvation periods 97

especially in the proximal zone (Guibbolini et al. 2006). This change may play a key role in the
intensity of aragonite deposition and thus otolith growth. In conclusion, food amounts may
affect otolith growth, opacity (or structure) and biomineralization.

Several papers have also documented a link between energy metabolism and otolith growth. 101 Otolith growth is closely related to standard metabolic rate (Mosegaard et al. 1988, Fablet et al. 102 2011) and otolith accretion appears regulated by feeding-induced thermogenesis (Huuskonen 103 & Karjalainen 1998). Otolith growth in larvae and juveniles is also related to individuals' 104 condition index estimated from fish lipid composition (Amara et al. 2007), which in turn 105 depends on zooplankton biomass (Suthers et al. 1992). Besides the fact that lipid quantity such 106 as triacylglycerol content can be used as a condition index for fish (Fraser 1989), taken together 107 these results suggest that lipid content in diet and energy metabolism may influence otolith 108 growth. Given that lipid content of prey is the primary determinant of their energy density 109 110 (Anthony et al. 2000, Spitz et al. 2010), diet energy content or composition in terms of energetic prey categories is a good candidate for encompassing both effects. 111

Along with food abundance and energy content, diet composition can also affect otoliths, 112 especially their chemical composition (Sanchez-Jerez et al. 2002). For instance, Barium (Ba) 113 and strontium (Sr) concentrations in Pomatomus saltatrix otoliths were related to the 114 concentration of these elements in their prey (Buckel et al. 2004). Here, the authors assumed 115 the diet effect on Ba and Sr concentration in otoliths could be either direct or indirect through 116 diet-based growth rate changes that induce element incorporation rate variation in otoliths. Even 117 if around 80% of Sr and Ba in otoliths come from water (Walther & Thorrold 2006) and not 118 from diet, a trophic transfer may be considered as a potential source of element accumulation 119 in fish otolith. The concentration of manganese (Mn) in the habitat and prey items was also 120 related to its accumulation in otoliths (Sanchez-Jerez et al. 2002). The fact that the Mn:Ca ratio 121 in otoliths is not correlated to the same ratio in water suggests a trophic transfer of metallic 122

elements, such as Mn (Thorrold et al. 1997). Moreover, variations in δ^{13} C otolith values were observed to correlate with variations in muscular δ^{13} C values among diet treatment (Elsdon et al. 2010).

In summary, previous experimental work revealed that the food ration level affects otolith 126 structure, opacity and shape. Laboratory and wild conditions studies have shown that energy 127 metabolism and food energy content influences otolith growth and that diet composition 128 impacts otolith chemical composition. In the present study, we investigated the potential 129 relationship between diet, described as a combination of both food composition and quantity, 130 and the otolith shape at the intra-population level in five marine fish species, including three 131 roundfishes and two flatfish sampled in the wild. More specifically, we addressed four related 132 questions. We first tested for a global relationship between diet (represented by the weight of 133 each taxonomic prey category) and otolith shape. Second, in case of significant diet effect, 134 135 taxonomic prey categories involved in the relationship with otolith shape were identified. Third, we quantified the respective contributions of food quantity and taxonomic composition to diet-136 137 otolith shape co-variation. Fourth, we tested for the relationship between diet composition in terms of energetic prey categories and otolith shape. For all questions, the effect of potential 138 confounding factors, i.e. individual-state variables (age, length, sex and maturity status), on 139 otolith shape was quantified and removed to obtain unbiased estimates of food effects. 140

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142 Materials and methods

143 Sample collection

Five marine fish, three roundfishes and two dextral flatfishes, were sampled in the eastern
English Channel (Fig. 1) : 47 striped red mullets (*Mullus surmuletus*), 28 tub gurnards
(Chelidonichthys lucerna), 32 red gurnards (*Chelidonichthys cuculus*) and 42 European plaices
(*Pleuronectes platessa*) and 36 common soles (*Solea solea*) (Table 1). These species were

chosen because of their commercial interest, of their large sample size, they represent a 148 combination of round and flat fish, and they are among the most abundant ones in the area. For 149 each species, individuals sampled belonged to a single population for each species. All fish 150 were caught during the annual Channel Ground Fish Survey (CGFS) operated on board the R.V. 151 "Gwen Drez" in October 2009. The fishing gear was a Grande Ouverture Verticale bottom trawl 152 with a 10-mm stretched mesh size in the codend, that was towed for 30 min at an average speed 153 of 3.5 knot (Coppin et al. 2002). Following their capture, fish were identified at the specific 154 level and sampled individuals were frozen in liquid nitrogen for their conservation on board. 155 Back in the laboratory, individuals were defrosted, measured (total length, $L_{\rm T}$) to the nearest 156 centimeter and their sex and maturity status were determined by gonads macroscopic 157 observation according to the recommendations of international expert groups (ICES 2014). The 158 digestive tract was extracted and its contents removed and stored in a Petri-dish for analysis. 159 Sagittal otoliths were also removed from each individual, one of them being used to estimate 160 the individual's age by interpreting macrostructures according to accepted standard ageing 161 protocols (ICES 2010, 2012) and the second one for shape analysis, each of them coming 162 163 always from the same side (Table 1). For striped red mullet, age was estimated by reading macrostructures on the sagittal otolith pair. The left otolith was read under transmitted light 164 while the right one was read under reflected light before being burned to confirm the age 165 estimation done previously (ICES 2012). The left otolith (not burned) was then used for shape 166 analysis. Even though recommendations from ICES expert groups do not exist for tub and red 167 gurnards, the same methods were effective when applied to these species. For European plaice, 168 the entire left otolith was used to estimate age as well as for shape analysis (ICES 2010), 169 whereas, for common sole, a transversal section of the left otolith was necessary for age reading 170 (Mahé et al. 2012) so that the right otolith was used for shape analysis. 171

Hereafter, we describe otolith shape analysis, diet analysis and statistical analyses as they wereconducted for each species separately.

174

175 **Otolith shape analysis**

Each otolith was cleaned by an ultrasonic bath in water at room temperature for a duration of 176 10 minutes, then brushed to remove residual tissues and stored dry in tubes. Batches of otoliths 177 were automatically digitized using orthogonal projection at a high resolution (3200 dpi) using 178 a scanner EPSON V750 and individual images were extracted. An Elliptical Fourier analysis 179 was performed on each otolith contour delineated and extracted after image binarization. This 180 181 method reconstructs any type of shape with a closed two dimensional contour (Kuhl & Giardina 1982) using ellipses named harmonics. Each harmonic (H_i) is characterized by 4 coefficients 182 $(A_i, B_i, C_i \text{ and } D_i)$, called Elliptic Fourier Descriptors (EFDs), which correspond to the 183 parameters of the trigonometric equations describing the corresponding ellipse. The number of 184 harmonics n used to reconstruct each otolith outline in the sample was determined as follows 185 using the cumulated Fourier power ($P_F(n_k)$). This parameter was calculated for each otolith 186 k as the sum of the proportion of variation in contour coordinates accounted for by each 187 harmonic and it is equal to: 188

189
$$P_{\rm F}(n_k) = \sum_{i=1}^{n_k} \frac{A_i^2 + B_i^2 + C_i^2 + D_i^2}{2}.$$
 (1)

The number of harmonics n_k was then chosen such that $P_F(n_k)$ reaches 99.99% of variation in contour coordinates or, in other words, such that shape is reconstructed at 99.99% (Lestrel 2008). A majority of studies (e.g. Mérigot et al. 2007, Lestrel 2008) compute the cumulated Fourier power P_F using EFDs averaged across the full sample or part of it, so that the selected harmonics describe the average otolith shape. In this study, $P_F(n_k)$ and n_k were calculated for each individual otolith k in order to ensure that each individual otolith in the sample was reconstructed with a precision of 99.99% The maximum number of harmonics $n = \max_{k}(n_{k})$

197 across all otoliths was then used to reconstruct each individual otolith of the sample.

198 After extracting the n harmonics for each individual otolith, their EFDs were normalized by

199 the first harmonic providing EFDs invariant with respect to size, rotation and starting point

200 (Kuhl & Giardina 1982), and resulting in the degeneration of the first three EFDs (A_i , B_i and

201 C_i), respectively equal to 1, ≈ 0 and ≈ 0 for each individual. EFDs were then gathered in a

202 matrix \mathbf{F} with EFDs as columns and individuals as rows.

All otolith images and EFDs were obtained using the software TNPC 7.0 (<u>www.tnpc.fr</u>).

204

205 **Diet analysis**

For each fish, taxonomic identification of prev items in the stomach content was carried out 206 using a binocular loupe. Prey items were identified to the lowest possible taxonomic level 207 before being weighed (g, wet weight). In view of their high diversity, preys were grouped into 208 209 22 taxonomic categories (Table S1 in Supplementary material) mostly based on their main 210 taxonomic level. Preys were categorized at least according to their Phylum in the taxonomic hierarchy (e.g. annelida, cnidaria). If further taxonomic determination was possible, taxonomic 211 212 prey categories were based on Class (e.g. cephalopoda, gastropoda), Order (e.g. amphipoda, isopoda) or Infra-Order (e.g. brachyoura, anomoura). Teleosts were split into two taxonomic 213 prey categories depending on their energetic value. The energy content of each fish prey (found 214 at http://www.nutraqua.com/) was plotted. Fish species gathered in two main groups (fat and 215 lean) separated by a threshold of 1kcal.g⁻¹. 216

Alternatively, preys were regrouped into three categories based on their energetic content (low/medium/high; Table S1 and Fig. S3 in Supplementary material) estimated from appropriate literature (Norrbin & Båmstedt 1984, Steimle & Terranova 1985, Dauvin & Joncourt 1989, Spitz et al. 2010) and following the three energetic categories proposed by Spitzet al. 2010.

For each studied species, stomach content data were grouped in a diet composition matrix in terms of weight, based either on taxonomic \mathbf{W}_t or energetic prey categories \mathbf{W}_e , with each cell corresponding to the weight $w_{t,ij}$ or $w_{e,ij}$ of prey category *j* (columns) in the digestive tract of individual *i* (rows). In addition, the relative contribution of taxonomic prey categories to diet composition by weight $(\% W_{t,j} = \sum_i w_{t,ij} / \sum_i \sum_{j'} w_{t,ij'})$ and the relative frequency of occurrence $(\% F_{t,j})$ of each taxonomic prey category (Godfriaux 1969), were computed for each studied species (Fig.2).

229

230 Statistical analyses

A principal component analysis (PCA) combined with broken stick principal component 231 selection (Borcard et al. 2011, Chapter 5) was performed on the EFDs matrix F. The aim was 232 to decrease the number of dimensions used to describe otolith shape variability while avoiding 233 collinearity between them and ensuring that the main sources of shape variation were kept 234 235 (Rohlf & Archie 1984). The selected principal components were gathered to construct the otolith shape matrix **S** with principal components of EFDs as columns and individuals as rows. 236 The otolith shape matrix \mathbf{S} was modelled using redundancy analysis (RDA) as depending on 237 three explanatory matrices: an individual matrix I grouping individual-state variables and a 238 diet matrix **D** derived from the diet composition: 239

240

$$\mathbf{S} \sim \mathbf{I} + \mathbf{D} \quad (2a)$$

The matrix **I** was included in the model to disentangle and remove the effect of individualstate as possible confounding factors on otolith shape. It was composed of fish age *A* as a factor and total length $L_{\rm T}$ as a continuous effect to represent the ontogenetic effect on otolith shape, sex S_e and maturity status M of the individual as factors potentially affecting fish physiology and metabolism, and thus indirectly otolith biomineralization. The resulting model was:

$$S \sim A + L_{\mathbf{T}} + S_{\mathbf{e}} + M + \mathbf{D}$$
(3a)

Alternatively, the potential confounding effect of environmental factors was also accounted for
by including an environmental matrix E grouping external environmental factors in model 2:

$$\mathbf{S} \sim \mathbf{I} + \mathbf{E} + \mathbf{D} \ . \tag{2b}$$

Matrix E contained four variables to describe environmental conditions that may also affect otolith biomineralization: temperature T and salinity S_a that were extracted from the hydrodynamic model MARS 3D (Lazure & Dumas 2008) and averaged over the month of October 2009, depth D_p that was measured at each sampling station during the survey, and longitude and latitude ($L_0 \times L_a$) of the sampling station. The resulting model was:

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$$\mathbf{S} \sim A + L_{\rm T} + S_{\rm e} + M + T + S_{\rm a} + D_{\rm p} + L_{\rm o} \times L_{\rm a}$$
. (3b)

The complete model described by Eq.3 (be it its version without 3a or with environmental 256 variables 3b) was reduced by stepwise selection based on significance (p-values) of the effects 257 258 determined by permutation tests (Borcard et al. 2011). Potential collinearity between explanatory variables was checked by computing their Variance Inflation Factors (VIF) before 259 and after model reduction (Borcard et al. 2011). No strong collinearity (VIF<10) was detected 260 after mode reduction. Then, a variation partitioning was performed to estimate the percent 261 contribution of the two (I and D) or three (I E and D) reduced matrices to otolith shape 262 variation. The strict contribution of each reduced matrix to variation was tested using partial 263 redundancy analysis (pRDA) followed by a permutation tests, with the matrix for which the 264 contribution was estimated as an explanatory matrix and the other matrix or matrices depending 265

on model version (3a or 3b) as covariables. Standard deviation was computed for all fractions
of variation by bootstrapping. 500 bootstrap samples (random sampling with replacement) were
enough to obtain stable standard deviation estimates in all cases.

In order to answer the four main questions of the study, the previously described analysis was performed with the diet matrix **D** constructed in four different ways (Fig. 3) as described below.

271 Global relationship between diet and otolith shape (model 1, Fig. 3A)

272 In order to estimate the potential global relationship between diet and otolith shape, matrix **D** was composed of a number of selected correspondence axes resulting from a correspondence 273 analysis (CA) applied to the diet composition matrix based on taxonomic prev categories \mathbf{W}_{t} . 274 Correspondence axes were selected according to the broken stick method. As for the PCA 275 276 applied to EDFs, this analysis was chosen to decrease the number of dimensions used to describe fish diet variation and to remove collinearity between prey categories. Moreover, CA 277 is a method adapted to the analysis of species abundance data without pre-transformation 278 because abundance data within taxonomic prey categories are not normally distributed (Borcard 279 et al. 2011). Model reduction was performed while considering variables of matrix I (and E) 280 separately and matrix **D** as a whole. Hence, matrix **I** (and **E**) used in variation partitioning 281 was (were) reduced, while matrix **D** was not when kept in the reduced model. 282

Prey categories involved in the relationship between diet and otolith shape (model 2, Fig. 3B)

In this analysis, matrix **D** was simply set equal to the diet composition matrix based on taxonomic prey categories W_t and model reduction was directly performed on Eq.3. Hence, matrices **I** (, **E**) and **D** used in variation partitioning were all reduced. In order to identify the main prey categories involved in diet-otolith shape co-variation, permutation tests were performed for each selected prey category to test their significance. Moreover, to illustrate the

relationship between the prev categories selected and otolith shape, 8 predicted otolith outlines 290 291 were produced for each species in the following way .: A pRDA was performed on the otolith shape matrix S with the selected prey categories as explanatory variables and the selected 292 individual-state (and environmental variables) as covariables. From this pRDA, 8 sets of 293 coordinates in the matrix **S** space were predicted at the 8 combinations of ± 1 standard deviation 294 (sd) along the two first axes of the pRDA $\{(+sd_1,0), (-sd_1,0), (+sd_1,+sd_2), (-sd_1,+sd_2), (-sd_1,+sd_2$ 295 $(+sd_1,-sd_2),(-sd_1,-sd_2),(0,+sd_2),(0,-sd_2)\}$ representing variation in linear combinations 296 297 of the selected prey categories. Predictions in the matrix **S** space were then projected back to the matrix \mathbf{F} space to produce predicted *EFDs* that were then used to draw predicted otolith 298 shapes on the pRDA biplot. 299

300 Contribution of diet relative composition *vs* food quantity to diet-otolith shape co-301 variation (model 3, Fig. 3C)

302 In this analysis, matrix **D** was decomposed into a matrix representing the relative diet composition based on taxonomic prey categories \mathbf{C} and a vector representing food quantity \mathbf{Q} 303 . The relative diet composition matrix \mathbf{C} was obtained by performing a CA on the matrix of 304 relative contribution of taxonomic prey categories to diet composition $\% W_{t,j}$ and selecting 305 correspondence axes according to the broken stick method. The vector **Q** gathered the total 306 weight of the stomach content of each individual, in other words the sums along rows $\sum_{i} w_{t,ij}$ 307 of the diet composition matrix \mathbf{W}_t . In order to ensure that matrices C and Q were kept in the 308 reduced model (with the ultimate aim to estimate their relative contribution to otolith shape 309 variation), model reduction was based on a pRDA where the otolith shape matrix S was 310 explained by matrix I (and E) while matrices C and Q were considered as covariables. 311 Hence, matrix I (and E) used in variation partitioning were reduced, while matrices C and 312 **Q** were not. 313

Relationship between diet energy composition and otolith shape (model 4, Fig. 3D)
In this last analysis, matrix D was set equal to the diet composition matrix based on energetic
prey categories W_e. Model reduction and variation partitioning were then performed as for

317 model 1.

All statistical analyses were performed using the package *vegan* (Oksanen et al. 2013) in the statistical environment R.3.1.1 (R Core Team 2014). The R codes used in this study are available from the authors upon request.

- 321
- 322

323 **<u>Results</u>**

Only results based on models without environmental confounding factors (Eq. 3a) are presented 324 in details in this section. The rationale is that considering environmental variables at sampling 325 site as related to otolith shape implies assuming that these environmental conditions are 326 representative of those experienced by individuals during a substantial part of their life, which 327 328 is subject to controversy for mobile organisms such as fish (see Discussion section). Only important differences between the results without and with environmental factors will be 329 highlighted here. Detailed results when accounting for environmental factors (Eq.3b) can be 330 found in Tables S2-S4-S5 and Figures S1-S2 in Supplementary material. In addition, the effects 331 of individual-state variables on otolith shape have already been studied in detail (Hüssy 2008, 332 Capoccioni et al. 2011). They were accounted for in the analyses to avoid potential confounding 333 effects but were not the main focus of this study. Consequently, their effects are not detailed 334 here but can be found in Tables S3-S4 in Supplementary material. 335

336

337 Global relationship between diet and otolith shape (model 1)

The reduced models explained between 11% and 26% of otolith shape variability for roundfish 338 species. For flatfish species, percentages of explained variation were higher: 14% and 38% for 339 plaice and sole, respectively (Table 2). Variation partitioning revealed that the individual matrix 340 I explained the greatest part of variation in otolith shape for all species, between 19% and 27%, 341 except for red gurnard and European plaice for which it was not significant (Fig.4, first column). 342 For all species, a significant diet contribution was detected at an alpha threshold of 5%, except 343 for tub gurnard and European plaice for which it was significant at an alpha threshold of 10% 344 only. Matrix **D** explained between 10% and 16% of otolith shape variability (Fig.4). When 345 including the environmental matrix \mathbf{E} in the analysis, a significant diet contribution was 346 detected at an alpha threshold of 5% for European plaice that accounted for 13% of variation 347 348 (Fig.S1, first column; Table S2).

349

350 Prey categories involved in the relationship between diet and otolith shape (model 2)

Between 2 to 7 taxonomic prey categories were selected in the reduced model according to 351 species (Table 2) except for tub gurnard for which no taxonomic prey category was selected 352 and hence no reduced model was tested. Explained variation by model 2 varied between 25% 353 and 35% according to species. As in model 1, the individual matrix I had a significant effect 354 on otolith shape for all species (Fig.4, second column). It explained between 14% and 23% of 355 shape variability. Concerning taxonomic prey categories, a significant contribution to otolith 356 357 shape variation was detected for all species except one, tub gurnard (see above). The selected categories explained between 11% and 201% of otolith shape variability, which was slightly 358 higher than the global effect of diet in model 1. According to species, the taxonomic prey 359 categories contributing significantly differed in terms of relative frequency of occurrence $\% F_j$ 360 and relative contribution of prey categories to diet W_i . For striped red mullet, the significant 361 taxonomic prey categories (Fig. 5) were either primary ones, i.e., characterized by a high $\% F_{t,i}$ 362

and high $W_{t,i}$ such as *annelida*, or intermediary ones, i.e., characterized by a small W_{i} 363 with respect to $\%F_j$ such as *caridea*, or secondary ones, i.e., with a low $\%F_j$ and small $\%W_j$ 364 such as bivalvia, brachyoura, and decapoda larvae (Fig.2). Similarly for red gurnard, influential 365 taxonomic prey categories were either primary ones such as *caridea* or secondary ones such as 366 gastropoda. For European plaice, only a primary taxonomic prey category was related to otolith 367 shape, namely Echinodermata, contrary to common sole, for which only a secondary 368 taxonomic prey category, cnidaria, was linked to otolith shape. When including the 369 environmental matrix **E** in the analysis, the contribution of taxonomic prev categories to otolith 370 shape variation increased to 40% for red gurnard but was relatively stable for the other species 371 (Fig.S1, second column; Table S2). 372

Predicted otolith shapes as reconstructed in Fig. 5 revealed that diet was related to global otolith
shape through the length/width ratio and thus otoliths' ellipticity, but also to finer details.
Variations occurred in the otolith crenations, the width of the *excisura major* (the indentation
between the rostrum and the antirostrum (Panfili et al. 2002), the length of the rostrum and the
antirostrum, and the posterior part of the otolith shape.

378

379 Contribution of relative diet composition *vs* food quantity to diet-otolith shape co-380 variation (model 3)

For tub gurnard, model 3 was not estimated given the absence of diet effect in model 1 (and subsequently model 2). For the other species, model 3 explained between 9% and 37% of otolith shape variability (Table 2). Variation partitioning gave similar results in terms of individual effects to those obtained with model 1 except for European plaice for which the explained variation by the individual matrix **I** increased strongly (Fig.4, first and third columns, fourth line). Regarding diet, relative composition **C** contributed significantly to otolith shape variation for striped red mullet, red gurnard and common sole. Its effect explained 12% to 16% of variation. No significant contribution of **C** was found for European plaice even if variation partitioning attributed 8% of otolith shape variation to this matrix. In contrast, when the environmental matrix **E** was added in the model, a significant contribution of **C** was detected for European plaice while significance disappeared for common sole despite the slight decrease in percentage of variation explained (Fig.S1, third column; Table S2). Contrary to diet relative composition **C**, food quantity **Q** did not contribute significantly to otolith shape variation whatever the species, including and excluding the environmental matrix **E** in the modele.

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Relationship between diet energy composition and otolith shape (model 4)

The reduced models explained between 5% and 28% of otolith shape variation (Table 2). Variation partitioning revealed that the individual matrix **I** explained the greatest part of variation in otolith shape for all species, between 5% and 27 (Fig.4, fourth column). A significant contribution of diet energetic composition was detected for tub gurnard and European plaice only and at an alpha threshold of 5% and 10%, respectively. Matrix **D** explained 12% and 8% of otolith shape variation, respectively (Fig.4, fourth column).

403

404 **Discussion**

In this study, we found that individual-state variables contributed the largest fraction of otolith 405 shape variation in most cases. This result was expected given the already well described effect 406 of individual-state variables on otolith shape and we will not discuss it here as there is ample 407 literature on the subject (Cardinale et al. 2004, Hüssy 2008, Capoccioni et al. 2011). Besides 408 this known effect, we showed an intra-population relationship between diet and otolith shape 409 410 for all fish species studied, although the relationship was less robust for tub gurnard. For the latter, only the relationship between diet energetic composition and otolith shape was 411 significant at an alpha threshold of 5%, the global relationship between diet weight composition 412

and otolith shape being significant at an alpha threshold of 10% only. Small sample size of this 413 species compared to the others may explain a lower power of signal detection. Then we were 414 able to relate either primary, intermediary or secondary prey categories to otolith shape 415 variations. Moreover, otolith reconstructions suggest that these variations could affect both 416 global shape and its finer details. Then, by comparing the contributions of food composition 417 and quantity, we showed that food composition contributed more largely to otolith shape 418 variation than the quantity of food ingested by fish. Finally, for only two species, a diet 419 420 influence based on energetic content categories was detected significant.

421

422 The role of organic matrix composition in otolith biomineralization

Although the organic matrix of sagittal otoliths represents a minor fraction of the total material 423 (Carlström 1963, Degens et al. 1969), it plays an important role in otolith formation. It actually 424 425 controls the nucleation, the crystallization, the orientation and the morphology as well as the polymorphism of crystal units the otolith is composed of (Nagasawa 2013). The organic matrix 426 427 is mainly composed of proteins, amino acids (AAs), collagens and proteoglycans, which precursors are secreted by the saccular epithelium in the endolymph (Payan et al. 2004). 428 However, only 3 major proteins are present in their definite form both in the endolymph and 429 the otolith. This suggests that the organic matrix is not directly composed of compounds present 430 in endolymph but also of proteins derived from the modification of precursors during their 431 deposition onto the otolith (Borelli et al. 2001). McMahon et al. (2010) observed that AAs' 432 δ^{13} C values in fish muscle and in their diet co-varied, with significant differences diet 433 treatments. Moreover, they showed that AAs' δ^{13} C values in muscles and in otoliths were 434 correlated with a slope around 1 and thus recorded an identical dietary information (McMahon 435 et al. 2011). Consequently, the AAs found in otolith proteins come from the food consumed by 436 fish. 437

Otolith shape is determined by its crystalline architecture (calcium carbonate CaC0₃). Several 438 proteins are known to control the CaC0₃ polymorphism (aragonite, calcite or vaterite) and the 439 morphology of its crystal units. Starmaker (Söllner et al. 2003) and Otolith Matrix 440 Macromolecule-64 (OMM-64) (Tohse et al. 2009) are water-soluble and acidic (due to a 441 calcium-binding region rich in glutamate) glycoproteins involved in the control of crystal 442 polymorphism (Nagasawa 2013). The Otolith Matrix Protein-1 (OMP-1) is another water-443 soluble protein required for normal otolith growth and for the deposition of another otolith 444 protein, otolin-1. The latter is a collagenous protein that makes up the structural network for 445 subsequent calcification, and thus stabilizes the otolith's mineral and organic fractions and 446 insures the correct arrangement of otoliths on the sensory epithelium (Murayama et al. 2005). 447

448

449 Potential mechanisms underlying the relationship between diet composition and otolith 450 shape

In the present study, a significant relationship between diet taxonomic composition and otolith 451 452 shape was detected for all species except for one. According to the taxonomic prey categories consumed, otolith shape presented some variations in both global shape, such as the degree of 453 ellipticity, and finer details, such as otolith crenation or the width of the excisura major. Two 454 hypotheses, or a combination of both, could explain the correlation between otolith shape and 455 diet taxonomic composition. First, the total quantity of proteins in the saccular endolymph could 456 vary according to the quantity of proteins in the prey consumed, which would affect the rate of 457 organic matrix synthesis and thus CaCO₃ deposition and ultimately otolith growth. Protein 458 459 consumption has been known to have the highest regulatory impact on protein synthesis (Houlihan et al. 1988). Consequently, diet taxonomic composition could influence "global" 460 otolith shape through effects on otolith growth. Secondly, the proteic composition of the organic 461 matrix, i.e. the relative quantity of water-soluble, water-insoluble and insoluble proteins, may 462

change according to food composition, which would impact the crystal structure (orientation, 463 morphology, and polymorphism) of precipitated CaCO₃ and, thus, otolith shape. More 464 precisely, food composition varies in terms of proteins or even AAs, whether essential (e.g. 465 leucine) or not (e.g. glutamic acid), that are necessary for the synthesis of some otolith matrix 466 proteins involved in the control of crystal structure (Asano & Mugiya 1993, Davis et al. 1995, 467 Sasagawa & Mugiya 1996, Nagasawa 2013). Consequently, food proteic composition could 468 have a direct contribution to variations in otolith crenation or/and an indirect contribution 469 through its effect on otolith growth, which impacts global otolith shape. In addition, some 470 proteoglycan and polysaccharide are present in both the saccular endolymph and the organic 471 matrix (Murayama et al. 2005). Even if their role in otolith biomineralization is unknown, 472 variability in their quantity and composition in prey could also impact otolith shape in the same 473 474 way as proteins.

475 Diet energetic composition was significantly related to otolith shape in two species only. Contrary to proteins and glucids, lipids are not components of the otolith organic matrix, which 476 477 could explain the absence of a strong relationship between the diet energetic composition and otolith shape. Lipids are indeed the main determinant of prey energetic content as energy per 478 unit of mass in prey is positively correlated to their lipid content and generally negatively 479 correlated to their protein content (Spitz et al. 2010). The fact that diet taxonomic composition 480 was better correlated with otolith shape variation than diet energetic composition suggests that 481 prey lipid versus protein content is less related to otolith shape variation than prey composition 482 (in opposition to amount) in terms of proteins and carbonates. This result seems rather logical 483 given the composition of the otolith and its precursors when thinking about a direct effect on 484 otolith shape through its organic matrix. In contrast, it may seem surprising when envisaging 485 an indirect effect on otolith shape through otolith growth. High dietary lipid levels can improve 486 body size growth (Vergara et al. 1999, Boujard et al. 2004). Diet lipid content is thus likely to 487

be related to otolith growth and thus shape. The lack of strong relationship could result from 488 several aspects. First, high dietary protein levels also favour faster growth. Given that lipid and 489 protein levels in diet are oppositely correlated to diet energy content (Spitz et al. 2010), the two 490 effects could cancel each other out when considering the effect of diet energetic composition. 491 Second, some of the reduced models included a size effect that could absorb the indirect effect 492 of diet energetic composition through growth. Third, diet energetic composition was based on 493 3 qualitative, relatively coarse, energetic prey categories, which may not be precise enough to 494 detect a relationship. Studies based on a proper quantification of diet energy content, through 495 bomb calorimetry of stomach contents for instance, or on the lipid composition of prey would 496 allow to investigate further the potential relationship between diet energy content and otolith 497 shape. 498

In this study, locations of variation in otolith shape related to food composition were identified 499 500 from reconstructed shapes. Although these reconstructions were "caricatures" predicted from a statistical model limited to individuals from the eastern English Channel and to our observations 501 502 in terms of individual-state, they highlighted the large number of otolith shape areas co-varying 503 with food composition suggesting the importance of understanding otolith biomineralization 3D processes. Otolith shape variation could be also explained by variations of spatial 504 distribution of precursors due to some physical constraints on the saccule which would impact 505 the otolith shape. However, the current lack of knowledge regarding such processes prevents 506 from clearly evaluating the likelihood of this hypothesis. 507

508

509 Absence of relationship between food quantity and otolith shape

No significant relationship between food quantity and otolith shape was detected in this study.
This result contrasts with several works that showed experimentally that food quantity impacted
otolith shape both indirectly via variation in otolith growth creating variation in "global" otolith

shape and directly on otolith crenations (Gagliano & McCormick 2004, Cardinale et al. 2004, 513 Hüssy 2008). We could raise the assumption that in the present study, the quantity of ingested 514 food did not differ sufficiently between individuals in order to observe a significant influence 515 on otolith shape. Likewise, Hüssy (2004) did not observed any effect of food quantity on otolith 516 opacity and on the ratio between water-soluble and water- insoluble proteins in the organic 517 matrix whereas, under more severe food restriction for a longer period, Høie et al (2008) 518 observed that more translucent otolith material was deposited. Such apparent discrepancies are 519 well reconciled under the light of temperature and food effect interactions (either synergetic or 520 antagonistic) on otolith opacity (Fablet et al. 2011). Moreover, here food quantity was measured 521 as the sum of the weights of all prey items found in an individual's stomach. However, prey 522 items in stomach contents are digested at varying degrees according to individuals, which can 523 introduce a bias in the estimation of inter-individual differences in ingested food quantity 524 525 (Gannon 1976).

526

527 Limitations of the study

The imprecision of food quantity measure highlights a potential, more general, limitation of 528 stomach content analysis that only provides a snapshot of fishes' diet, and in this precise case 529 at a single season as all fish in this study have been sampled in October. The interpretation of 530 the results in the present study rely on the assumption that observed inter-individual differences 531 in diet are consistent other a sufficiently long time period to be related to inter-individual otolith 532 shape differences. It should be noted here that the assumption is concerned with the 533 representativity of inter-individual differences, i.e. individuals' specialization, and not of 534 individuals' diet itself. In other words, the assumption is that diet difference at a given time 535 gives an index of dietary specialization even though individuals' diet may vary through time. 536 To our knowledge, such an assumption has never been directly confirmed nor invalidated in 537

fish given that no longitudinal study on fish diet, i.e. with repeated observations of prev 538 selectivity or stomach content on the same individuals, was performed for testing. Although the 539 possibility that this hypothesis does not hold cannot be totally ruled out, several arguments can 540 be brought in its support. There is ample literature on the importance and prevalence of 541 individual diet specialization (see reviews in Bolnick et al. 2003; Araújo et al. 2011), notably 542 long-term trophic specialization in freshwater and marine vertebrates (e.g. Bearhop et al. 2006, 543 Newsome et al. 2009, Hückstädt et al. 2011, Rosenblatt et al. 2015) including fish (e.g. 544 Beaudoin et al. 1999, Svanbäck & Persson 2004, Matich et al. 2011), that support this 545 assumption based on isotopic data. Consistent inter-individual differences in several 546 behavioural traits that may affect diet have also been documented in fish (see review in 547 Mittelbach et al. 2014) such as habitat use and movements (e.g. Matich & Heithaus 2015) or 548 boldness (e.g. Ward et al. 2004, Harcourt et al. 2009). A more technical argument is that the 549 550 presence of multiple prey items per stomach ensures that cross-sectional samples of individuals' diet are relevant to estimate individual diet specialization (Araújo et al. 2011). An additional 551 552 argument in support of our assumption comes from the relative stability of our results across the three different analyses based on taxonomic prey categories for each species and the relative 553 low standard deviations of fractions in variation partitioning obtained from bootstrapping 554 analyses (Table 3, Table.S5). It should also be noted that, despite its limitations, stomach 555 556 content analysis is the only way to obtain an indication of ingested food quantity in natural condition. In contrast, carbon stable isotope ratios could provide a temporally-integrated view 557 of individuals' diet composition and account for seasonal changes in diet, but without allowing 558 the quantification of the amount of food ingested. Additionally, the precise identification of the 559 consumed prey items from carbon stable isotope ratios by using so-called mixing models 560 561 requires knowledge of the isotopic ratios of all potential preys and of the isotopic fractionation between preys and consumers (Post 2002, Fry 2007). Still, variation of carbon stable isotope 562

ratio (in muscles and/or otolith) across individuals could be used to describe variability in individual diet composition with the aim of linking it to the otolith shape variability. This would complement the results obtained in this study.

Likewise, the environmental variables considered in our supplementary analyses (see 566 Supplementary material Fig.S1-S2 and Tables S2-S4), i.e. temperature, depth, salinity, 567 longitude and latitude, were a snapshot of the environment experienced by individuals as they 568 were measured at sampling site and averaged over a single month. Similarly to stomach 569 contents, their use in the analyses (Eq. 2b and 3b) relies on the assumption that they are 570 representative of inter-individual differences in the environment experienced over a sufficiently 571 long-time period to be related to otolith shape. Such an assumption may seem unlikely for a 572 majority of fish given their mobility, which could explain the fact that for a majority of the 573 studied species, the environmental matrix was not significantly related to otolith shape (Fig.S1). 574 575 However, for European plaice, the inclusion of the environmental matrix in the analysis has allowed describing a supplementary part of otolith shape variation that, it seems, was obscuring 576 577 the diet signal since the diet matrix also became significant. This result may be linked to the supposedly lower mobility of benthic flatfish such as plaice. In order to have a temporally-578 integrated view of the environment experienced by individuals possibly accounting also for 579 seasonality, otolith chemistry such as the variation of oxygen isotopic ratios as an index for 580 temperature (Kalish 1991) or the ratio Sr/Ca as an index for the salinity (Secor 1992) could be 581 used in future studies. Moreover, all fish in this study have been sampled in October, i.e. in a 582 single season. It would be interesting to consider the implication of seasonality on the 583 relationship between diet and environment on the one hand and otolith shape on the other. 584

585

In summary, an intra-population relationship between diet and otolith shape was detected for
several roundfish and flatfish species from the eastern English Channel. Detailed analyses

revealed that both main and secondary prey categories were involved in this relationship and 588 that variations influenced both the otolith's global shape and some finer details. The 589 contribution of relative diet taxonomic composition to otolith shape variation was much higher 590 than that of ingested food quantity represented by the weight of prev items. Finally, diet 591 energetic composition was correlated with otolih shape of only one species and marginally for 592 another. Gagliano and McCormick (2004) had suggested that otolith shape could be used to 593 discriminate fine scale events, such as the magnitude and periodicity of feeding in wild fish 594 populations, in addition to the discrimination of stocks and populations based on coarser aspects 595 such as life-history differences. The present study shows that diet composition may also be a 596 source of otolith shape variability within populations through direct and/or indirect (via otolith 597 growth) processes. This introduces a novel potential interpretation of three classically known 598 effects on otolith shape. First, otolith shape variation across age and size is generally assigned 599 600 to ontogenetic changes in metabolism and physiology (Campana & Casselman 1993, Mérigot et al. 2007). Ontogenetic changes in diet composition could also contribute directly to otolith 601 602 shape variation, thereby acting as a confounding factor (Morat et al. 2012, Vignon 2012). 603 Likewise, sexual dimorphism in otolith shape is generally attributed to physiological differences between sexes. However, sexual dimorphism in diet composition, especially at the 604 time of mating, has been documented in several fish species (Casselman & Schulte-Hostedde 605 2004, Tsuboi et al. 2011) and could thus also explain otolith shape dimorphism. Finally, 606 environmental abiotic factors, such as temperature and salinity, are also known to influence 607 otolith shape variation (Lombarte & Lleonart 1993) and spatial variation in otolith shape are 608 609 often interpreted as resulting from habitat differentiation (Morat et al. 2012). However, such variation in abiotic factors is generally related to differences in prev categories available to 610 611 individual predator, such that geographical variations in diet composition could also generate geographical variation in otolith shape (Vignon 2012). Such applied consequences call for 612

- further investigations of the sources of otolith shape variation and their mechanistic effect on
- 614 biomineralization, notably those related to diet.
- 615

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Fig. 1: Map of sampling areas in the eastern English Channel according to species. Each circle represents a fishing site and circle size gives the relative sampling abundance.

Fig. 2: Contribution of taxonomic prey categories to species specific diet, measured in terms of relative weight ($%W_t$, black triangle) and relative frequency of occurrence ($%F_t$, grey open circle).

Fig. 3: Schematic representation of the sequential steps of the four RDA statistical analyses performed to investigate the four questions of the study: (A) the global relationship between diet and otolith shape (model 1), (B) the prey categories involved in this relationship (model 2), (C) the relative contributions of diet relative composition and quantity to diet-otolith shape co-variation (model 3) and (D) the relationship between diet energy composition and otolith shape (model 4).

Fig. 4: Variation partitioning between diet and individual-state for the four questions investigated for each species. Questions investigated are organized into columns whereas species are organized into lines. Each circle corresponds to one matrix: diet matrix $D_{,:}$ individual-state variable matrix I, diet relative composition matrix C, and food quantity Q. The number in the non-overlapping part of each circle represents the unique contribution in percentage of variation of the corresponding matrix. The number in the overlapping parts of the circles represent the joint contribution in percentage of variation of the corresponding matrices. Standard deviations obtained by bootstrapping are given for unique contributions only for ease of reading. All contribution fractions are indicated by the following symbols: <10%†,<5%*,<1%**,<0.1 %***.

Fig. 5: pRDA biplot of otolith shape constrained by selected taxonomic prey categories and conditioned by selected individual variables (model 3) according to species. Explanatory variables with a significant effect (permutation test) on otolith shape are in red, the corresponding P-value being indicated by the following symbols: <5%*, <1%**, <0.1 %***. Each circle represents an individual and its size represents the individual total length. For each species, eight otolith shapes have been reconstructed from model predictions illustrating the relationship between diet and otolith shape.

Fig. S1: Variation partitioning between diet and individual-state for the four questions investigated for each species. Questions investigated are organized into columns whereas species are organized into lines. Each circle corresponds to one matrix: diet matrix **D**, environmental matrix **E**, individual-state variable matrix **I**, diet relative composition matrix **C**, and food quantity **Q**. The number in the non-overlapping part of each circle represents the unique contribution in percentage of variation of the corresponding matrix. The number in the overlapping parts of the circles represent the joint contribution in percentage of variation of the corresponding matrices. Standard deviations obtained by bootstrapping are given for unique contributions only for ease of reading. All contributions and their standard deviations are given in Table S5 for more details. P-values of contribution fractions are indicated by the following symbols: $<10\%^+, <5\%^*, <1\%^{**}, <0.1\%^{***}$.

Fig. S2: pRDA biplot of otolith shape constrained by selected taxonomic prey categories and conditioned by selected individual variables and environmental variables (model 3) according to species. Explanatory variables with a significant effect (permutation test) on otolith shape are in red, the corresponding P-value being indicated by the following symbols: <5%*, <1%**, <0.1 %***. Each circle represents an individual and its size represents the individual total length. For each species, eight otolith shapes have been reconstructed from model predictions illustrating the relationship between diet and otolith shape.

Fig. S3: Contribution of enegetic prey categories (\mathbf{o} high, \mathbf{o} medium, \mathbf{o} low) to species specific diet, measured in terms of relative weight (%W_e).





Relative weight (Wt) and relative frequency (Ft) of occurrence (%)

A. Global relationship between diet and otolith shape (model 1)



B. Taxonomic prey categories involved in the relationship between diet and otolith shape (model 2)



C. Contribution of diet relative composition vs food quantity to diet-otolith shape co-variation (model 3)



D. Relationship between diet energy composition and otolith shape (model 4)















Table 1. Characteristics of the samples studied. Number of samples analyzed (N), number of females (N_F), number of males (N_M), number of individuals with undetermined sex (N_U), proportion of mature individuals (% Mat), age and total length distributions of the samples.

Species	N	$N_F / N_M / N_U$	% Mat	Age (years) Mean ± SD Min-Max	Total length (cm) Mean ± SD Min-Max
Striped red mullet	47	08/16/23	48.94	0.62 ± 0.79 0-3	16.51 ± 5.60 9-32
Tub gurnard	28	10/18/00	32.14	1.75 ± 0.84 0-3	25.86 ± 6.61 16-40
Red gurnard	32	12/19/01	37.50	$\begin{array}{c} 2.69 \ \pm 0.74 \\ 1-4 \end{array}$	24.91 ± 2.85 20-31
European plaice	42	26/14/02	76.19	1.81 ± 1.38 0-7	27.33 ± 7.45 9-43
Common sole	36	18/17/01	91.67	2.44 ± 1.61 1-6	25.94 ± 5.81 17-38

Table 2. Results of the three RDA models (as detailed in figure 3) for the five studied fish species. "Otolith shape" gives the number of principal components (N PCs) in the response matrix **S** used to describe otolith shape and the percentage of variance in Elliptical Fourier Descriptors they explain (%). "Individual" and "Diet" correspond to explanatory matrices **I**, and **D** in reduced models. More precisely, "Individual" gives the selected individual-state variables. "Diet" indicates the variables the matrix **D**, i.e. the number of correspondence axes (N CAs) and the percentage of variance they explain (%) in diet composition W_t and relative diet composition $\%W_{t,j}$ in models 1 and 3, respectively, and the selected prey categories in models 2 and 4. "Model selected" gives the degrees of freedom (df), the F statistic, the corresponding P-value and the percentage of variation explained (%) by the reduced model.

Specie	Otolit	h shape S	Individual I	Diet D			Mod	el selected	
	N PCs	%				df	F	P-value	%
Global relationship be (model 1)	etween (liet and oto	olith shape	N CAs	%				
Striped red mullet	4	77.00	Size Sex	10	99.85	13	2.22	0.002	25.61
Tub gurnard	2	70.18	Age Sex	4	90.59	8	2.06	0.016	23.95
Red gurnard	3	77.84	-	4	94.01	4	1.97	0.039	11.11
European plaice	3	74.02	Maturity	4	93.53	5	2.29	0.011	13.56
Common sole	3	78.23	Age Size Sex	8	95.32	16	2.31	0.003	37.50
Taxonomic prey categ	gories in	volved in t	he	Taxono	omic prey				
relationship between	diet and	otolith sha	ape (model 2)	cat	egory				
Striped red mullet	4	77.00	Size Sex	Annelida Bivalvia, Caridea larvae	, Anomura, Brachyura, , Decapod , Isopoda	10	3.49	0.001	35.11
Tub gurnard	2	70.18	-		-	-	-	-	00.00
Red gurnard	3	77.84	Age Maturity	Amp Gastropo	hipoda, da, Caridea	7	2.51	0.003	25.40
European plaice	3	74.02	Age	Amp Echino	hipoda, odermata	8	2.94	0.004	27.51
Common sole	3	78.23	Age Size	Anomura Gel	a, Cnidaria, biidea	11	2.64	0.002	34.05

			Sex						
Contribution of diet r quantity to diet-otolit	n vs food on (model 3)	N CAs	%						
Striped red mullet	4	77.00	Size Sex	10	99.87	14	2.19	0.001	26.66
Tub gurnard	2	70.18	-	-	-	-	-	-	00.00
Red gurnard	3	77.84	-	4	94.23	5	1.61	0.012	9.02
European plaice	3	74.02	Age	4	92.64	16	2.12	0.005	30.44
Common sole	3	78.23	Age Size Sex	9	96.78	18	2.12	0.01	36.54
Relationship between	diet er	ergy compo	sition and	Energ	etic prey				
otolith shape (model 4	I)			cat	egory				
Striped red mullet	4	77.00	Size Sex			3	3.94	0.001	16.09
Tub gurnard	2	70.18	Age Size	low/me	dium/high	7	2.53	0.003	28.45
Red gurnard	3	77.84	Size			1	2.53	0.047	4.70
European plaice	3	74.02	Age	low/me	dium/high	9	2.27	0.014	21.76
Common sole	3	78.23	Age			5	2.38	0.007	16.43

Table 3. Percent contribution with bootstrapped standard deviation of the diet matrix (\mathbf{D}), the individual matrix (\mathbf{I}) and residuals (\mathbf{R}), obtained from variation partitioning performed on the reduced model for the four questions investigated and each studied species

Global relationship between diet and otolith shape (model 1)											
Species	L		D&I			I	R				
Striped red mullet	$10 \pm$	8.29	0 ± 7.31		20 ± 8.51		74 ± 10.94				
Tub gurnard	11 ± 1	1.73	$0 \pm$	8.66	19 ±	15.72	76 ± 17.54				
Red gurnard	11 ±	9.71	0 ± 1	9.44	0 ± 1	11.30	89 =	= 13.26			
European plaice	7 ± 9	9.09	4 ± 1	9.54	3 ± 1	10.18	86 =	= 12.95			
Common sole	16 ± 1	10.28	0 ± 1	1.37	27 ±	11.26	62	± 9.69			
Taxonomic prey ca	ategories in	volved in t	the relations	ship betwee	en diet and	l otolith sh	ape (mode	l 2)			
Species	E		Da	&I	-	Ι		R			
Striped red mullet	19 ±	9.30	0 ± 1	7.00	19 ±	8.05	65 =	= 11.64			
Tub gurnard											
Red gurnard	20 ± 1	13.98	0 ± 1	5.25	14 ±	12.76	75 =	= 14.52			
European plaice	14 ± 1	2.41	0 ± 1	0.29	19 ±	19 ± 12.20		72 ± 11.95			
Common sole	11 ± 1	1.30	0 ± 1	4.15	23 ± 11.93		68 ± 10.12				
Contribution of di	et relative o	compositio	n vs food qu	antity to d	liet-otolith	shape co-v	variation (I	model 3)			
Species	С	Q	Ι	C&Q	Q&I	C&I	C&Q&I	R			
Striped red mullet	12 ± 9.46	1 ± 3.54	18 ± 7.78	0 ± 3.44	2 ± 4.89	0 ± 7.07	1 ± 5.54	73 ± 11.39			
Tub gurnard											
Red gurnard	12 ± 10.04	0 ± 4.05	0 ± 11.39	0 ± 3.88	0 ± 4.31	0 ± 10.09	0 ± 4.20	91 ± 13.72			
European plaice	8 ± 8.68	0 ± 3.86	17 ± 10.47	0 ± 4.45	0 ± 3.93	0± 10.12	2 ± 4.75	83 ± 13.53			
Common sole	16 ± 10.50	0 ± 4.31	24 ± 12.10	2 ± 5.34	6 ± 6.55	0± 11.90	0 ± 7.05	63 ± 11.49			
Relationship betw	een diet ene	ergy compo	osition and	otolith shaj	pe (model 4	4)					
Species	E		Da	&I		I		R			
Striped red mullet	0 ± 4	4.34	0 ± 2	2.87	16 ±	7.67	84	± 8.84			
Tub gurnard	12 ± 1	1.73	$0 \pm$	8.66	27 ±	15.72	72 =	17.54			
Red gurnard	0 ± 9	9.18	0 ± 1	0 ± 7.30 5 ±		5 ± 11.78		95 ± 15.01			
European plaice	8 ± 9	9.12	0 ± 1	7.68	18 ±	11.54	78 =	= 11.10			
Common sole	0 ± 6	6.76	0 ± 1	5.96	16 ± 9.00		84 ± 11.08				

Table S1: Prey items found in the stomach contents of the studied species and the corresponding prey categories based on taxonomy (Taxonomic prey category) and on their energy content (Energetic prey category). References used to categorize preys in terms of energetic content are also given. When the energetic value of the prey item was not found, the energetic value of a closer taxon was used.

Prey item	Taxonomic prey category	Energetic prey category	Reference
Algae	Algae	Low	
Amphipoda	Amphipoda	High	Dauvin & Joncourt 1989
Aphroditidae	Annelida	High	Dauvin & Joncourt 1989
Onheliidae	Annelida	High	Dauvin & Joncourt 1989
Nereidae	Annelida	High	Dauvin & Joncourt 1989
Glyceridae	Annelida	High	Dauvin & Joncourt 1989
Glycera sp	Annelida	High	Dauvin & Joncourt 1989
Phyllodocida	Annelida	High	Dauvin & Joncourt 1989
Eunicidae	Annelida	High	Dauvin & Joncourt 1989
Naulteilea			Dauvin & Joncourt 1989
Nephtyidae	Annelida	High	Steimle & Terranova 1985
Spionidae	Annelida	Medium	Dauvin & Joncourt 1989
Chloraemidae	Annelida	Medium	Dauvin & Joncourt 1989
Pectinariidae	Annelida	Medium	Dauvin & Joncourt 1989
Pectinaria koreni	Annelida	Medium	Dauvin & Joncourt 1989
Terebellidae	Annelida	Medium	Dauvin & Joncourt 1989 Steimle & Terranova 1985
Lanice conchilega	Annelida	Medium	Dauvin & Joncourt 1989
Arenicolidae	Annelida	Medium	Dauvin & Joncourt 1989
Galatheoidea	Anomura	Low	Norrbin & Båmstedt 1984
Galathea intermedia	Anomura	Low	Norrbin & Båmstedt 1984
Pisidia longicornis	Anomura	Low	Norrbin & Båmstedt 1984
Porcellana platycheles	Anomura	Low	Norrbin & Båmstedt 1984
Porcellana sp	Anomura	Low	Norrbin & Båmstedt 1984
Paguroidea	Anomura	High	Dauvin & Joncourt 1989 Steimle & Terranova 1985
Pagurus bernhardus	Anomura	High	Dauvin & Joncourt 1989 Steimle & Terranova 1985
Diogenes pugilator	Anomura	High	Dauvin & Joncourt 1989
	A	Law	Steimle & Terranova 1985
Axiidea	Axiidea	LOW	Dauvin & Joncourt 1989
Mytilidae	Bivalvia	Medium	Steimle & Terranova 1985
Mytilus edulis	Bivalvia	Medium	Steimle & Terranova 1985
Mactridae	Bivalvia	Medium	Dauvin & Joncourt 1989 Steimle & Terranova 1985
Arcidae	Bivalvia	Medium	Dauvin & Joncourt 1989 Steimle & Terranova 1985
Arca tetragona	Bivalvia	Medium	Dauvin & Joncourt 1989 Steimle & Terranova 1985
Nuculidae	Bivalvia	Medium	Steimle & Terranova 1985
Nucula sp	Bivalvia	Medium	Steimle & Terranova 1985
Solenidae	Bivalvia	Medium	Dauvin & Joncourt 1989 Steimle & Terranova 1985
Phaxas pellucidus	Bivalvia	Medium	Dauvin & Joncourt 1989 Steimle & Terranova 1985
Ensis sp	Bivalvia	Medium	Steimle & Terranova 1985
Semelidae	Bivalvia	Medium	Dauvin & Joncourt 1989 Steimle & Terranova 1985

Abra alba	Bivalvia	Medium	Dauvin & Joncourt 1989
Cardiidae	Bivalvia	Medium	Dauvin & Joncourt 1989
			Dauvin & Joncourt 1989
Parvicardium sp	Bivalvia	Medium	Steimle & Terranova 1985
Solecurtidae	Bivalvia	Medium	Dauvin & Joncourt 1989 Steimle & Terranova 1985
	D . 1.		Dauvin & Joncourt 1989
Azorinus chamasolen	Bivalvia	Medium	Steimle & Terranova 1985
Donacidae	Bivalvia	Medium	Dauvin & Joncourt 1989 Steimle & Terranova 1985
Donar wittatus	Divolvio	Madium	Dauvin & Joncourt 1989
Donax villalus	Divalvia	Medium	Steimle & Terranova 1985
Pectinidae	Bivalvia	Medium	Steimle & Terranova 1985
Mimachlamys varia	Bivalvia	Medium	Dauvin & Joncourt 1989
			Steimle & Terranova 1985
Portunidae	Brachyura	High	Deuvin & Joncourt 1080
Liocarcinus sp	Brachyura	High	Dauvin & Joncourt 1989
Liocarcinus depurator	Brachyura	High	Dauvin & Joncourt 1989
Liocarcinus pusillus	Brachyura	Hıgh	Dauvin & Joncourt 1989
Leucosiidae	Brachyura	Low	Steimle & Terranova 1985
Fbalia cranchii	Brachvura	Low	Dauvin & Joncourt 1989
Lound crunchii	Drachyura	LOW	Steimle & Terranova 1985
Pinnotheridae	Brachyura	Low	Steimle & Terranova 1985
Pinnotheres pisum	Brachyura	Low	Dauvin & Joncourt 1989
Thiinae	Brachvura	Low	Dauvin & Joncourt 1989
	Druchyuru		Steimle & Terranova 1985
Thia scutellata	Brachyura	Low	Steimle & Terranova 1985
Atelecyclidae	Brachvura	Low	Dauvin & Joncourt 1989
Atticeyendae	Drachyura	LOW	Steimle & Terranova 1985
Inachidea	Brachyura	Low	Steimle & Terranova 1985
Macropodia rostrata	Brachvura	Low	Dauvin & Joncourt 1989
macropoala rostrala	Drachyura	Low	Steimle & Terranova 1985
Inachus dorsettentis	Brachyura	Low	Steimle & Terranova 1985
Crangonidae	Caridaa	High	Dauvin & Joncourt 1989
Clangonidae	Cariuea	Ingn	Spitz et al. 2010
Crangon crangon	Caridea	High	Dauvin & Joncourt 1989 Spitz et al. 2010
Dhilacharas an	Caridaa	Uich	Dauvin & Joncourt 1989
T mocheras sp	Cariuea	Ingn	Spitz et al. 2010
Philocheras fasciatus	Caridea	High	Dauvin & Joncourt 1989
Philocheras sculptus	Caridea	High	Dauvin & Joncourt 1989
Philocheras trispinosus	Caridea	High	Dauvin & Joncourt 1989
Hippolytidae	Caridea	High	Spitz et al 2010
Hinnolyte sn	Caridaa	High	Dauvin & Joncourt 1989
Inppolyte sp	Cariuca	Ingn	Spitz et al. 2010
Eualus gaimardii	Caridea	High	Spitz et al. 2010
Fualus occultus	Caridaa	High	Dauvin & Joncourt 1989
		111511	Spitz et al. 2010
Processidae	Caridea	High	Spitz et al. 2010
Processa sp	Caridaa	High	Dauvin & Joncourt 1989
1 1000350 SP		111511	Spitz et al. 2010
Processa canaliculata	Caridea	High	Spitz et al. 2010

Processa edulis	Caridea	High	Dauvin & Joncourt 1989 Spitz et al. 2010
nondalidaa	Coridoo	Uich	Dauvin & Joncourt 1989
pandandae	Caridea	High	Spitz et al. 2010
Pandalina brevirostris	Caridea	High	Spitz et al. 2010
Palaemonidae	Caridea	High	Spitz et al. 2010
Palaemon sp	Caridea	High	Spitz et al. 2010
Sepiolidae	Cephalopoda	Medium	Spitz et al. 2010
Ommastrephidae	Cephalopoda	Medium	Spitz et al. 2010
Hydrozoa	Cnidaria	Low	Steimle & Terranova 1985
Anthozoa	Cnidaria	Low	Steimle & Terranova 1985
Copepoda	Copepoda	High	Norrbin & Båmstedt 1984
Bodotriidae	Cumacean	High	Norrbin & Båmstedt 1984
Bodotria sp	Cumacean	High	Norrbin & Båmstedt 1984
Bodotria arenosa	Cumacean	High	Norrbin & Båmstedt 1984
Bodotria scorpioides	Cumacean	High	Norrbin & Båmstedt 1984
Vaunthompsonia sp	Cumacean	High	Norrbin & Båmstedt 1984
Pseudocumatidae	Cumacean	High	Norrbin & Båmstedt 1984
Pseudocuma sp	Cumacean	High	Norrbin & Båmstedt 1984
Decapod larvae	Decapod larvae	High	Norrbin & Båmstedt 1984
Echinozoa	Echinodermata	Low	Dauvin & Joncourt 1989
		-	Dauvin & Joncourt 1989
Echinocyamus pusillus	Echinodermata	Low	Steimle & Terranova 1985
Asterozoa	Echinodermata	Low	Dauvin & Joncourt 1989
			Dauvin & Joncourt 1989
Ophiutrix fragilis	Echinodermata	Low	Steimle & Terranova 1985
Ophiuridae	Echinodermata	Low	Dauvin & Joncourt 1989
Mullus surmuletus	Fatty teleostean	High	Spitz et al. 2010
Trachurus Trachurus	Fatty teleostean	High	Spitz et al. 2010
Naticidae	Gastropoda	Medium	Dauvin & Joncourt 1989
Euspira sp	Gastropoda	Medium	Dauvin & Joncourt 1989
Lacunidae	Gastropoda	Medium	Dauvin & Joncourt 1989
Littorinidae	Gastropoda	Medium	Dauvin & Joncourt 1989
Calyptraeidae	Gastropoda	Medium	Dauvin & Joncourt 1989
Crepidula fornicata	Gastropoda	Medium	Dauvin & Joncourt 1989
Buccinidae	Gastropoda	Medium	Dauvin & Joncourt 1989
Gebiidea	Gebiidea	High	Norrbin & Båmstedt 1984
Isopoda	Isopoda	High	Dauvin & Joncourt 1989
Mysida	Mysida	High	Norrbin & Båmstedt 1984
Scaphopoda	Scaphopoda	High	Dauvin & Joncourt 1989
Upogebia deltaura	Tanaidacea	High	Dauvin & Joncourt 1989
Perciformes	Lean teleostean	Medium	Spitz et al. 2010
Callionymus lyra	Lean teleostean	Medium	Spitz et al. 2010
Gobiidae	Lean teleostean	Medium	Spitz et al. 2010
Pleuronectiformes	Lean teleostean	Medium	Spitz et al. 2010
Solea Solea	Lean teleostean	Medium	Spitz et al. 2010

Table S2. Results of the four RDA models (as detailed in figure 3) for the five studied fish species. "Otolith shape" gives the number of principal components (N PCs) in the response matrix **S** used to describe otolith shape and the percentage of variance in Elliptical Fourier Descriptors they explain (%). "Environment", "Individual" and "Diet" correspond to explanatory matrices **E**, **I**, and **D** in reduced models. More precisely, "Environment" and "Individual" give the selected environmental and individual-state variables, respectively. "Diet" indicates the variables in the matrix **D**, i.e. the number of correspondence axes (N CAs) and the percentage of variance they explain (%) in diet composition W_t and relative diet composition $\% W_{t,j}$ in models 1 and 3, respectively, and the selected prey categories in models 2 and 4. "Model selected" gives the degrees of freedom (df), the F statistic, the corresponding P-value and the percentage of variation explained (%) by the reduced model.

Species	Otolith	shape S	Environment E	Individual I	Diet D		-	Model	selected	
	N PCs	%					df	F	P-value	%
Global relationshi	p betwe	en diet an	d otolith shape (model 1	1)	N CAs	%				
Striped red mullet	4	77	-	Size Sex	10	99.85	13	2.22	0.001	25.61
Tub gurnard	2	70.18	Longitude×Latitude	Age Sex	4	90.59	11	1.83	0.041	25.31
Red gurnard	3	77.84	Longitude×Latitude Temperature		4	94.01	8	2.15	0.007	22.89
European plaice	3	74.02	Temperature Salinity	Age Sex Maturity	4	93.53	15	2.28	0.001	31.94
Common sole	3	78.23	-	Age Size Sex	8	95.32	16	2.31	0.003	37.50
Taxonomic prey c	ategorie	s involved	l in the relationship bet	ween diet and	Taxono	omic prey				
otolith shape (mod	lel 2)			Γ	cat	egory				
Striped red mullet	4	77	-	Size Sex	Annelida Bivalvia, Caridea larvae.	, Anomura, Brachyura, , Decapod Isopoda	10	3.49	0.001	35.11
Tub gurnard	2	70.18	-	-	-	-	-	-	-	00.00
Red gurnard	3	77.84	Longitude×Latitude Temperature Depth	Size Age Maturity	Annelida Car Cepha	a, Axiidea, ridea, alopoda,	17	3.28	0.001	55.56

					Gastropoda, Mysida, Teleostean					
European plaice	3	74.02	Depth	Age	Amphipoda, Brachyura, Echinodermata		10	2.85	0.001	31.10
Common sole	3	78.23	Temperature	Age Size Sex	Anomura, Caridea, Cnidaria		12	2.85	0.001	38.85
Contribution of di shape co-variation	iet rela 1 (mode	tive compo el 3)	sition vs food quantity t	o diet-otolith	N CAs	%				
Striped red mullet	4	77	-	Size Sex	10	99.87	14	2.19	0.001	26.66
Tub gurnard	2	70.18	-	-	-	-	-	-	-	00.00
Red gurnard	3	77.84	Longitude×Latitude Temperature	Maturity	4	94.23	10	2.24	0.004	28.63
European plaice	3	74.02	Temperature Salinity	Age Sex Maturity	4	92.64	16	2.12	0.005	30.44
Common sole	3	78.23	Temperature Longitude×Latitude	Size	9	96.78	15	2.04	0.002	30.77
Relationship betw	een die	et energy co	omposition and otolith s	hape (model 4)	Energ cat	etic prey egory				
Striped red mullet	4	77	-	Size Sex			3	3.94	0.001	16.09
Tub gurnard	2	70.18	-	Age Size	low/me	dium/high	7	2.53	0.003	28.45
Red gurnard	3	77.84	Longitude×Latitude	Size			4	2.41	0.006	15.43
European plaice	3	74.02	Salinity Depth	Age	low/me	dium/high	11	2.51	0.004	28.80
Common sole	3	78.23	Temperature Longitude×Latitude Depth	Size Sex	low/me	dium/high	11	2.51	0.001	32.20

Table S3. Individual-state (A: age, L_T : total length, Se: sex, M: maturity) variables acting on otolith shape according to the model and the species considered. For each effect kept in the model reduced by stepwise selection, the *F* statistic (while respecting marginality of the effects, type 2 tests) is given together with the numerator degrees of freedom as exponent and the denominator degrees of freedom as index. The corresponding *P*-value is indicated by the following symbols: $<5\%^*$, $<1\%^{**}$, $<0.1\%^{***}$.

Species	A	L _T	Se	M								
Global relationship	between diet aı	nd otolith shape	e (model 1)									
Striped red mullet		2.98 ¹ / ₃₃ *	4.46 ² ₃₃ ***									
Tub gurnard	2.64 ³ ₁₈ *		5.67 ¹ ₁₈									
Red gurnard												
European plaice	$2.11\frac{6}{26}*$		$3.00\frac{2}{26}*$	$2.40\frac{1}{26}$								
Common sole	2.30 ⁵ ₁₉ *	2.87 ¹ ₁₉ *	2.45 ² ₁₉ *									
Prey categories involved in the relationship (model 2)												
Striped red mullet		4.41 ¹ ₃₆ *	$4.41\frac{2}{36}***$									
Tub gurnard												
Red gurnard	$1.30\frac{3}{16}$	$0.17\frac{1}{16}$		2.54 ¹ ₁₆								
European plaice	2.65 ⁶ ₃₁ **											
Common sole	$1.62\frac{5}{26}$	3.13 ¹ ₂₆ *										
Contribution of diet	relative compo	osition VS food	quantity (model	3)								
Striped red mullet		3.80 ¹ ₃₂ **	4.38 ² ₃₂ ***									
Tub gurnard												
Red gurnard				1.98 ¹ ₂₃								
European plaice	2.02 $\frac{6}{25}$ *		$3.01\frac{2}{25}*$	2.58 ¹ ₂₅								
Common sole		3.87 ¹ ₂₂ *										
Relationship betwee	n diet energy c	omposition and	l otolith shape (n	nodel 4)								
Striped red mullet		3.47 ¹ / ₄₃ *	2.68 ² / ₄₃ **									
Tub gurnard	3.40 ³ / ₂₀ **	$4.03\frac{1}{20}*$										
Red gurnard		$2.53\frac{1}{30}*$										
European plaice	$2.42\frac{6}{32}*$											
Common sole	2.38 $\frac{5}{30}$ **											